

# Poverty and Cognitive Function\*

Emma Boswell Dean, Frank Schilbach, and Heather Schofield

May 22, 2017

## Abstract

This paper is a primer for economists interested in the relationship between poverty and cognitive function. We begin by discussing a set of underlying aspects of cognitive function relevant to economic decision-making – attention, inhibitory control, memory, and higher-order cognitive functions – including descriptions of validated tasks to measure each of these areas. Next, we review literature that investigates channels through which poverty might impact cognitive function and economic behavior, by discussing already existing knowledge as well as less well-researched areas that warrant further exploration. We then highlight ways in which the different aspects of cognitive function may impact economic outcomes, discussing both theoretical models and empirical evidence. Finally, we conclude with a discussion of open research questions and directions for future research.

---

\*We thank participants at the NBER Conference on the Economics of Asset Accumulation and Poverty Traps, John Hoddinott, Joshua Dean, and our anonymous referee for insightful comments and suggestions. We are also grateful for excellent research assistance from Jordan Browne, Stephanie Chan, Sarah Quinn, and Alicia Weng. We also thank Emily Gallagher and Lesley Fowler for their meticulous editing and helpful suggestions. All remaining errors are our own.

# Contents

<b>1</b>	<b>Introduction</b>	<b>4</b>
<b>2</b>	<b>Cognitive Functions</b>	<b>6</b>
2.1	Overview of Cognitive Functions . . . . .	6
2.2	Attention . . . . .	8
2.2.1	Definition and Description of Attention . . . . .	8
2.2.2	Measuring Attention . . . . .	9
2.3	Inhibitory Control . . . . .	11
2.3.1	Definition and Description of Inhibitory Control . . . . .	11
2.3.2	Measuring Inhibitory Control . . . . .	11
2.4	Memory . . . . .	13
2.4.1	Definition and Description of Memory . . . . .	13
2.4.2	Measuring Memory . . . . .	15
2.5	Higher-Order Cognitive Functions . . . . .	16
2.5.1	Definition and Description of Higher-Order Cognitive Functions . . . . .	16
2.5.2	Measuring Higher-Order Cognitive Functions . . . . .	18
2.6	Practical Concerns . . . . .	20
2.7	Identifying Alternative Tasks . . . . .	21
<b>3</b>	<b>Impact of Poverty on Cognition and Economic Behavior</b>	<b>21</b>
3.1	Malnutrition . . . . .	22
3.2	Excessive Alcohol Consumption . . . . .	22
3.3	Physical Pain . . . . .	23
3.4	Sleep Deprivation . . . . .	24
3.5	Monetary Concerns . . . . .	25
3.6	Environmental Factors . . . . .	26
3.7	Stress and Depression . . . . .	28
<b>4</b>	<b>Impact of Cognitive Functions on Economic Outcomes</b>	<b>28</b>
4.1	Attention . . . . .	29
4.1.1	Theory . . . . .	29
4.1.2	Empirical Evidence . . . . .	30
4.1.3	Other Potential Pathways . . . . .	31
4.2	Inhibitory Control . . . . .	32
4.2.1	Theory . . . . .	32
4.2.2	Empirical Evidence . . . . .	33
4.2.3	Other Potential Pathways . . . . .	35

4.3	Memory . . . . .	35
4.3.1	Theory . . . . .	35
4.3.2	Empirical Evidence . . . . .	36
4.3.3	Other Potential Pathways . . . . .	37
4.4	Higher-Order Executive Functions . . . . .	38
4.4.1	Theory . . . . .	38
4.4.2	Empirical Evidence . . . . .	38
4.4.3	Other Potential Pathways. . . . .	39
<b>5</b>	<b>Open Questions and Future Research Directions</b>	<b>40</b>
<b>A</b>	<b>Appendix</b>	<b>42</b>
A.1	Summary Table of Cognitive Tasks . . . . .	42

# 1 Introduction

Economic growth has lifted billions out of poverty in the span of a few generations. Despite these positive trends, poverty remains entrenched for millions around the globe. One long-standing explanation for poverty’s persistence is the possibility of poverty traps, or self-reinforcing cycles of poverty. Theoretical models of such poverty traps – often centered on nutrition in the earliest cases – have been central in development literature for over half a century (Leibenstein, 1957; Mirrlees, 1975; Stiglitz, 1976; Bliss and Stern, 1978; Dasgupta and Ray, 1986). This literature has expanded in many directions to consider the varying potential underlying forces such as geographic characteristics, pecuniary externalities, and even cultural forces, as well as both theoretical and policy implications of such traps ranging from inter-generational transmission of poverty to equilibrium unemployment (Jalan and Ravallion, 2002; Sachs, 2005; Fang and Loury, 2005; Currie and Almond, 2011; Barrett and Carter, 2013; Sachs, 2014; Kraay and Raddatz, 2007).

Despite the extensive literature in this area and the policy appeal of potentially instigating virtuous and self-reinforcing cycles of income growth and wealth, the empirical evidence that such traps exist remains mixed (Banerjee and Duflo, 2011; Kraay and McKenzie, 2014; Barrett et al., 2016). Moreover, even in the instances where actual evidence is consistent with such traps, their exact mechanisms remain unclear (Banerjee et al., 2015; Bandiera et al., 2015). This paper focuses on one potential underlying mechanism that has yet to be explored in depth, cognitive function.

Poverty may affect cognitive function in a variety of ways. Evidence is beginning to accumulate that cognitive functions are limited resources which can be strained by living in poverty (Schilbach, Schofield and Mullainathan, 2016). Being forced to make constant trade-offs with limited resources can act as a “load” on cognitive function (Mullainathan and Shafir, 2013). Further, poverty can affect economic behavior via psychological effects including stress and negative affective states, such as depression (Haushofer and Fehr, 2014). In addition to directly capturing individuals’ minds, poverty often entails a number of material deprivations which may further impede cognitive function. Perhaps most well-known among these deprivations is malnutrition. One in seven individuals around the world remain below recommended levels of caloric intake (Food and Agricultural Organization of the United Nations et al., 2011). Moreover, in many settings, the poor are exposed to sleep deprivation, physical pain, and substance abuse at alarming levels. While research is still in progress, to date we have found that the poor in Chennai, India, sleep just over 5 hours per night, with more than 20 disruptions on average, using objective measurements from wristwatch-like actigraphs. Similarly remarkable, a survey of 1,200 low-income informal labor market participants revealed an average pain level of 5 at the end of the workday, on a 0 to 10 scale. Moreover, the majority of male low-income workers in Chennai drink daily, consuming an average of over five standard drinks per day and spending over 20 percent of their daily labor incomes on alcohol (Schilbach, 2017). Each of these correlates of poverty have been shown to tax cognitive resources (Schofield, 2014; Lim and Dinges, 2010; Moriarty et al., 2011; Steele and Josephs, 1990).

The resulting reductions in these cognitive resources may have broad feedback effects on earnings and wealth, ranging from occupational choice to technology adoption, consumption patterns, and risk and time preferences. In other words, the relationship between cognitive function and poverty could be bi-directional, generating the potential for feedback loops, reduced mobility, and—if the resulting effects are large enough—poverty traps. The goal of this paper is to highlight the potential interplay between cognitive function and poverty and, in doing so, to facilitate further study of this potential bi-directional mechanism by providing a “primer for economists” on areas of cognitive function, their measurement, and their potential implications for poverty.

Despite the potential importance of cognitive function in the lives of the poor, there are several challenges for understanding its causes and consequences. First, both the factors impeding cognitive function and the downstream effects of reduced cognitive function are likely to be diffuse, making measurement of channels and feedback effects challenging. Second, while some of the impacts of poverty on cognitive function are immediate (e.g. via acute physical pain), other impacts (e.g. via sleep deprivation or nutrition) are slow-moving and cumulative, making them even more challenging to detect, both for researchers and individuals themselves. Third, existing measurements of many of the channels discussed in this paper are limited. For instance, data on sleeping patterns in developing countries is scarce and often limited to self-reports, which are likely to be inaccurate (Lauderdale et al., 2008). Yet, although these challenges exist, careful design and improved measurement technologies make them surmountable, opening the door to a wide-variety of high-value studies.

Beyond a potential role in creating feedback loops that increase the persistence of poverty, an enhanced understanding of the psychological or cognitive lives of the poor is, in and of itself, of substantial value. Improved understanding of the financial lives of the poor over the previous few decades has generated many insights; for example, the wealth of data from financial diaries has shed light on the incredible complexity of the financial lives of the poor—with those in poverty often balancing a dizzying array of transactions, income streams, and debts. These data have helped to greatly enhance our understanding of financial behaviors among the poor. With cognitive function’s potential to shape virtually every aspect of life, improving our understanding of the psychological lives of the poor has similar potential.

The remainder of this paper is structured as follows. Section 2 begins with a concise overview of cognitive functions for economists, including definitions and descriptions of four key areas with potential importance for economic decision-making. In addition, this section discusses how to measure the different aspects of cognitive function in order to quantify potential effects of poverty and to facilitate further research in this area. Section 3 then summarizes the existing evidence for the potential impact of poverty on cognitive function and economic behavior via various channels, including malnutrition, alcohol consumption, monetary concerns, physical pain, sleep deprivation, environmental factors, stress, and depression. Section 4 shifts focus to the impact of different areas of cognitive function on economic outcomes, and more broadly to future income, wealth, decision-

making, and poverty. Finally, Section 5 concludes by highlighting open questions and high-value areas of future research in the relationship between cognitive function and poverty.

## 2 Cognitive Functions

This section begins with a brief overview of cognitive functions crucial to economic outcomes and decision-making. Following this overview, we will discuss four key aspects of cognitive function in detail as well as canonical tests to measure them. Additional detail on the cognitive functions we consider here can be found in Lyon and Krasnegor (1996), Suchy (2009), and Diamond (2013).

### 2.1 Overview of Cognitive Functions

The brain and its many functions have been studied by researchers in psychology, neuroscience, and other fields for many decades. Each of its roles—e.g. movement, sensory input, and interpretation—is essential to daily life. There is, however, one set of functional areas that is of particular relevance and interest to decision-making and economic life. Termed “cognitive function” or “executive function” in the cognitive psychology literature, these are broadly defined as mental processes that control one’s attention, dictate one’s ability to work with information, and are required for deliberate activity. Cognitive functions are crucial to task performance and decision-making, and carry longer-term impacts such as literacy and school performance (Borella et al., 2010; Duncan et al., 2007).

Cognitive functions are top-down processes, initiated from the pre-frontal cortex of the brain, that are required for deliberate thought processes such as forming goals, planning ahead, carrying out a goal-directed plan, and performing effectively (Lezak, 1983; Miller and Cohen, 2001). Although most researchers agree on this general understanding of cognitive functions, there is a wide array of views on details such as how to categorize its sub-components, which neurological brain circuits are required for different areas of functioning, and whether there exists one unifying mechanism underlying all cognitive functions, also known as the “Theory of Unity” (Kimberg et al., 1997; de Frias et al., 2006; Godefroy et al., 1999; Jurado and Rosselli, 2007).

Although beliefs are wide-ranging, most researchers would agree that there is no one unifying mechanism, and broad classification of sub-components is possible (Miyake et al., 2000). In this paper, we will utilize this classification system of sub-components of functioning, focusing on four aspects of cognitive functions that are both generally agreed upon by cognitive psychologists and that we consider central to understanding economic behavior and outcomes. This list is not fully exhaustive, and the complexity of and overlap in cognitive functions make many categorizations possible, especially for higher-order functions. However, in order to keep this introduction to the topic a tractable reference, we focus on a limited number of sub-components with stronger agreement in their categorization and direct relevance to economic choices.

- (I) **Attention** is the ability to focus on particular pieces of information by engaging in a selection process that allows for further processing of incoming stimuli. This process can happen voluntarily or involuntarily. For instance, attention alerts us to sudden loud noises (involuntarily) or enables us to comprehend a bullet point on a presentation slide (voluntarily).
- (II) **Inhibitory Control** is the ability to control impulses and minimize interference from irrelevant stimuli. It is used to block out distractions, to control impulsive urges, and to override pre-potent responses. For example, an application of inhibitory control is stopping yourself from reaching for a chocolate cookie on the table when you are exhausted after a long day.
- (III) **Memory** is the ability to recall, recognize, and utilize previously learned information. Of particular interest in this paper is working memory, the ability to evaluate new information as it enters, to manipulate the information if necessary, and to delete or update irrelevant existing information. For example, the use of working memory enables us to remember a conversation with another conference attendee, and then to revisit the topic later and update a draft paper.
- (IV) **Higher-Order Cognitive Functions** involve one or more of the basic cognitive functions highlighted above and are therefore considered more complex. This paper will discuss three higher-order cognitive functions: cognitive flexibility, intelligence, and planning.

*Cognitive flexibility* is a higher-order ability that involves switching between tasks, rules, or mental sets (Lezak et al., 2004). For example, if a small business owner decides to implement a new bookkeeping system, adjusting to this change requires a combination of inhibiting existing habits, attending to the old and new rules, and actively adopting the new system—a more involved process compared to one that merely relies on a single cognitive function. Cognitive flexibility is also used inter-personally, helping us to understand others’ perspectives in situations of potential conflict.

*Intelligence* is commonly separated into fluid and crystallized intelligence. The former refers to the ability to solve novel problems, and the latter involves the ability to use learned languages, subjects, skills, and so forth. Both forms of intelligence involve a combination of core functions such as attention and memory, rendering them “higher-order,” i.e. more complex cognitive functions (Cattell and Horn, 1966).

*Planning* —also sometimes known as “sequencing”—is the ability to generate a strategy, including the sequencing of steps, which meets intended goal(s). This function is central to many economic activities. For example, just to open for the day, the manager of a restaurant must anticipate demand, contract with the necessary suppliers, and organize staff schedules—all tasks which involve sequencing steps appropriately to meet an intended goal.

Each of these broad constructs has the potential to help shape our understanding of the relationship between poverty, decision-making, and productivity. Each has direct relevance to a variety of types of economic decision-making, as well as the potential to be shaped by poverty and its correlates. Such effects, if large enough, may in turn lead to reduced socioeconomic mobility or potentially even poverty traps. Before discussing the potential relationship between these areas of cognitive function and economic outcomes, we provide a more thorough description of each area of cognitive function, as well as examples of ways to measure them, in order to facilitate their integration into economic studies. Appendix Table A.1 provides a summary of tasks which can be used to measure cognitive function, including some of their advantages and disadvantages for use in development economics.

## 2.2 Attention

### 2.2.1 Definition and Description of Attention

Given its fundamental nature underlying several other cognitive functions and its relevance to decision-making, attention has garnered exceptional interest among both psychologists and economists (Pashler, 1998). This interest has generated a wide-ranging and deep literature in psychology, with many active debates and disagreements about the precise definition, role, and boundaries of attention. This paper aims to define attention in a manner consistent with the prevailing views in cognitive psychology, while noting some of the most substantial disagreements with that view. Notably, we focus only on *conscious* attention for the purposes of this paper, as opposed to aspects of attention, such as priming, that could happen subconsciously.

At its most basic level, attention is the selection of information for further processing. A key feature of attention is that it is limited (Broadbent, 1958). It is not possible to attend to and encode the millions of stimuli encountered each day. That is, attention filters information into or out of processing mechanisms, enabling us to focus more effectively on the things we care about (Sternberg and Sternberg, 2011; Treisman and Gelade, 1980; Cohen, 2014). Given this filtering role and because one usually attends to a stimulus before being able to retain or recall information, the early and still prevailing view is that attention is a key component of memory (Yates, 1966; Phelps, 2006).

Within the realm of attention, researchers have made significant headway in understanding the mechanisms underlying attention by separating it into categorical types:

**Internal vs. External Attention.** One such categorical distinction is the separation between internal and external attention (Chun et al., 2011). Internal attention is the selection, modulation, and maintenance of internally-generated information. For instance, a use of internal attention would be thinking about the upcoming deadline for a journal submission. In contrast, external attention is the selection and modulation of incoming stimuli from your surroundings, e.g. viewing



images as they appear on a television screen.

**Narrow vs. Broad Attention.** A second categorical distinction of attention is narrow versus broad attention (Wachtel, 1976). In broad attention, a person pays attention to many stimuli or attributes of stimuli simultaneously, whereas in narrow attention, the person excludes irrelevant information, allowing for a limited focus. This categorization of attention is considered to coexist with internal and external attention. The theory of attention developed by Nideffer (1976), and the scale developed from it (the Test of Attention and Interpersonal Style), states that attention is a two-factor process, measured by both breadth (narrow versus broad) *and* direction (internal versus external), and that people use combinations of these two factors of attention depending on the task at hand. For instance, a student solving a math problem on an exam would be using narrow internal attention, whereas that same student might use broad external attention when arriving at a party later that night to scan the room, see who is present, and decide who to begin talking to.

**Simple vs. Complex Attention.** Related to narrow versus broad attention, but less well-known, is the classification of simple versus complex attention, as proposed by Lim and Dinges (2010). Simple attention refers to attending to one stimulus, whereas complex attention refers to attending to multiple stimuli at the same time. While this categorization is not very common among psychologists, tasks devised to measure cognitive functions can be to a large extent related to either simple or complex attention. As such, this categorization provides a straightforward structure to understand attention and, in particular, to study the potential relationship between poverty and cognitive function.

Other classifications are arguably less informative when considering downstream effects such as economic decision-making and productivity. For example, posterior and anterior attention studied in neuroscience focus on the specific neurotransmitters that are active in the brain when attending to different stimuli and investigate in depth the particular brain cells at play (Peterson and Posner, 2012). Due to our focus on the relationship between cognitive function and economic outcomes of interest, these discoveries are not our primary focus; therefore we proceed with the simple versus complex attention categorization. The next section provides examples of tests measuring simple and complex attention.

## 2.2.2 Measuring Attention

One of the areas of attention with potentially significant consequences to human behavior is ‘sustained attention,’ also commonly referred to as “vigilance” or “attentional vigilance” (Egeland et al., 2009). This skill is the general ability to detect a stimulus during times of habituation and/or tiredness (Mackworth, 1968; Robertson et al., 1997). A common example of this skill is

driving, especially while fatigued. In lab and field settings, measuring vigilance usually involves identifying a target signal from a pool of otherwise continuous and repetitive non-target stimuli. This section describes canonical tasks used to measure this skill, in both its simple and complex forms.

**I. Psychomotor Vigilance Task.** Within simple attention, one widely used task to measure attentional vigilance is the Psychomotor Vigilance Task (PVT). The PVT is especially popular among sleep researchers (Basner and Dinges, 2011; Basner et al., 2011; Dinges et al., 1997). In this task, researchers ask participants to press a button when a stimulus, such as a light or a colored dot, appears. The task measures reaction time and accuracy—in other words, how quickly the participant (correctly) presses the button when the stimulus appears, and how often she presses the button when no stimulus appears (a false response). In a review by Basner and Dinges (2011), the most common outcome metric of the PVT is the number of “lapses,” reported by around two-thirds of published studies. Lapses are usually defined as a reaction time of longer than 500 milliseconds and are understood as breaks in one’s attention (Lim and Dinges, 2008). Other commonly used metrics are mean reaction time, inverse reaction time, fastest 10% of reaction times, and median reaction time. The PVT collects extremely granular data, as it is administered on a computer (or other electronic device) and records time on a millisecond scale. Researchers can easily adjust factors such as inter-stimulus interval—the time and regularity of gaps between the appearance of two stimuli, a feature which impacts task difficulty. Participants exhibit limited learning effects in this task, making it ideal for repeated use in within-subject designs (Dorrian et al., 2005). The task does, however, require electronic administration, which can make it inconvenient in certain field settings. Increasing the duration of the task generally increases error rates, especially when implemented along with a battery of other cognitive tasks (Lim et al., 2010).

**II. Concentration Endurance Test.** In contrast to simple attention tasks, complex attention tasks involve more than one stimulus and/or more than one rule. The *Concentration Endurance Test*, also known as the “d2 Test of Attention,” is a task that aims to measure sustained attention (Bates and Lemay, 2004). Participants view a continuous list of letters *p* and *d*, with up to two marks above and up to two marks below each of the letters. The participants then identify and cross out each case of the letter *d* that has two associated marks. Common outcome variables include the total number of correct cancellations, errors, and the distribution of errors. The task requires participants to recognize the letter “d,” making literate participants more easily able to complete the task, but it can be administered using similar shapes as opposed to letters for non-literate participants or participants whose native language does not use the Latin alphabet. Notably, the task requires accurate visual scanning, which can be impeded not only by poor attention, but also by poor eyesight, a common concern in developing countries.

## 2.3 Inhibitory Control

### 2.3.1 Definition and Description of Inhibitory Control

Inhibitory control is a top-down mental process that blocks out distractions, controls impulsive urges, and overrides pre-potent responses (Rothbart and Posner, 1985). It is sometimes used interchangeably with self-control, and is also referred to as “selective attention,” “attentional control,” “attentional inhibition,” and “executive attention” (Lavie et al., 2004; Kane and Engle, 2002; Kaplan and Berman, 2010). The ability to control impulses has been studied extensively in child development (Carlson and Moses, 2001; Diamond and Taylor, 1996; Mischel et al., 1989) as well as among adults (Ward and Mann, 2000; Dempster, 1992). This important aspect of cognitive functioning enables people to perform well socially, physically, at work, and in society. For example, discipline and self-control are required to refrain from eating when on a diet (Shiv and Fedorikhin, 1999), or to inhibit socially inappropriate responses when mentally drained (von Hippel and Gonsalkorale, 2005).

One notable model of self-control proposes that self-control is governed by a limited resource that can be depleted over time (Baumeister et al., 1998; Muraven et al., 1998). This model, known as the “ego-depletion” model, has been empirically tested, with meta-analyses finding small effect sizes. But more recent replications of the task used to study this phenomena have called this conclusion into question, with a pre-registered trial involving 23 labs and over 2,000 participants finding no significant effect (Hagger et al., 2016).

However, there is better evidence that situational factors can have a significant effect on self-control. In addition to individual differences, variable factors in one’s environment or life circumstances such as fatigue or cognitive load may also affect the availability of this limited mental resource (Inzlicht and Schmeichel, 2012; Muraven and Baumeister, 2000). For example, it is much more difficult to suppress one’s impulses after exposure to stress (Glass et al., 1969) or when working in a crowded space (Sherrod, 1974), both prevalent conditions faced by the urban poor. Empirically, recent prominent work on self-control has focused on exploring the consequences of depleted self-control and ways to overcome this depletion (Baumeister, 2002; Hofmann et al., 2007, 2009).

### 2.3.2 Measuring Inhibitory Control

This section describes a subset of the many cognitive tasks used to measure inhibitory control. Researchers have applied the tests discussed below in a wide range of settings and populations, providing a useful guide for designing future experimental studies related to inhibitory control.

**I. Hearts and Flowers Task.** This task, previously known as the *Dots Task*, shows participants a screen which is divided into two panels where either a heart or a flower appears on one

side of the screen.<sup>1</sup> In the first round, participants are shown only hearts and are asked to click a button on the same side as the heart whenever it appears. In the second round, only flowers appear and participants are asked to click on the opposite side of the screen as the flower. Finally, in the third round, individuals see both hearts and flowers, and the goal is to click on the appropriate side of the screen according to the rule for each stimulus. Round two and in particular round three measure inhibitory control, as they require individuals to override their natural tendency to press on the same side whenever flowers appear on the screen. While this test does require inhibitory control, it has been critiqued as also requiring working memory (Diamond, 2013). A different version of this test, using arrows instead of symbols, is particularly effective at separating inhibitory control from other cognitive functions (Davidson et al., 2006).<sup>2</sup> The test can be made more difficult by decreasing the amount of time individual stimuli appear on the screen. Though this task is most effectively administered electronically, it is well-suited for economic development research. It is quick, easy to explain, and does not require specific background knowledge or a specific education level, making it applicable in a wide range of settings.

**II. Eriksen Flanker Task.** In this task, participants are shown a set of five stimuli, of which they are supposed to respond only to the middle stimulus (Eriksen and Eriksen, 1974; Mullane et al., 2009). A common version of this task uses an arrow as the target (middle) stimulus. Respondents have two buttons—one left and one right—and are asked to press the button corresponding to the direction of the target arrow. The target stimulus can be flanked by congruent stimuli (e.g. arrows pointing in the same direction as the target), incongruent stimuli (e.g. arrows pointing in the opposite direction of the target) or neutral stimuli (e.g. squares flanking the target arrow). Incongruent stimuli require participants to use top-down control to focus on the middle stimulus (Diamond, 2013). Using an arrow as the stimulus for this task minimizes memory requirements from participants, as the arrows indicate where the participant is supposed to respond. This task is best performed electronically, and researchers have limited ability to manipulate its difficulty. When conducted using arrows as described above, however, the test does not require any background knowledge or educational attainment level, and more effectively separates inhibitory control from other cognitive functions such as working memory.

**III. Stroop Test.** While there are a number of versions of the *Stroop Test*, we detail two in this paper: the *Classic Stroop Test* and the *Spatial Stroop Test*.

---

<sup>1</sup> The Hearts and Flowers Task is quite similar to an older task know as *Simon task*. This task has two rules: press left for one stimulus, and press right for a second stimulus. The stimulus can appear on the right or left side of the screen. While the side of the screen on which the stimuli appear is irrelevant, respondents tend to be quicker when the stimuli appear on the same side as their associated response (this is termed the “Simon effect”) (Lu and Proctor, 1995).

<sup>2</sup>As it only requires participants to hold one rule in mind at a time it does not require working memory.

The *Classic Stroop Test* displays a list of words that spell out the names of colors (Stroop, 1935). The congruent condition occurs when the word matches the ink color (e.g. the word “blue” is displayed in blue ink). Conversely, the incongruent condition occurs when the word is displayed in a different color ink (e.g. the word “blue” displayed in green ink). The goal of the task is to name the color of the ink as opposed to the word, for instance, blue in the congruent condition and green in the incongruent condition (MacLeod, 1991).<sup>3</sup> Although it is a common test in developed countries, the Stroop Test has several disadvantages for development researchers. In particular, most versions require literacy, and different educational levels are likely to affect performances. A numeric version of the task can overcome the literacy barrier, although it may still be problematic if numeracy is also low. The test is also typically conducted electronically (though it can be done with paper and a stopwatch), and there is little researchers can do to manipulate its difficulty other than shorten the response time.

The *Spatial Stroop Test* relies on the same basic concept as the Classic Stroop Test but measures spatial rather than verbal and visual incompatibility. Researchers show participants both relevant and irrelevant dimensions of a stimulus, which are similar and can influence responses. For example, in one variant, participants are shown an arrow that points left or right (in another variant they are shown the words “LEFT” or “RIGHT”) and that is displayed on either the left or right side of the computer screen. Participants are asked to press the button on the side the arrow is pointing to, ignoring the location of the arrow on the computer screen. While the side of the screen on which the stimuli appear is irrelevant, respondents tend to be quicker when the stimuli appear on the same side as their associated response. This version of the task has an advantage over the Classic Stroop Test in that it does not require literacy when using the arrow stimuli. Though generally administered electronically, this task is otherwise well-suited to field settings, as it is both quick and easy to explain. Researchers can also alter the difficulty of the task easily by adjusting its speed.

## 2.4 Memory

### 2.4.1 Definition and Description of Memory

Memory is the ability to encode, store, retain, and retrieve information and previous experiences (Kandel et al., 2000). This ability to retain and use previous knowledge supports relationship building and is essential to learning. Memory has multiple components; for instance, auditory memory is the ability to process and retain oral information (information given “out-loud”), whereas visual memory is the ability to remember what one has seen. Short-term memory describes the

---

<sup>3</sup>Although the classic Stroop Test is a prototypical test of inhibitory control (Miyake et al., 2000), MacLeod et al. (2003) argue that the “Stroop effect” or “Stroop interference”— a delayed response when ink color differs from that of the displayed word— may not measure inhibition.

brain’s ability to retain information for a short amount of time. Information can then be stored for long-term usage via rehearsal or active processing. Closely connected to short-term memory is working memory, which describes a person’s ability to simultaneously store and manipulate (work with) information. More information on short-term, long-term, and working memory follows.

**Short-Term Memory and Long-Term Memory.** Research on memory has explored the relationship and interactions between what we commonly and intuitively refer to as “short-term memory” and “long-term memory” (James, 1890). Short-term memory is defined as information that enters into conscious memory through a sensory registry such as through the eyes or sense of touch. Information then resides for a short period of time in the conscious memory but will be forgotten if not deliberately rehearsed or managed. Scientists generally agree that the capacity of short-term memory is limited, with 7 plus or minus 2 considered to be the typical number of items one can hold in short-term memory at the same time (Miller, 1956). Following extensive rehearsal and active processing, information solidifies and moves into long-term memory, where it is retained for future use. When people’s actions, decisions, and speech require them to retrieve information from long-term memory, the memory or information moves back into short-term memory for active use. Compared with the limited capacity in the short-term store, researchers hypothesize that the capacity of the long-term store is unlimited (Cowan, 2008).

**Working Memory.** Research in recent decades has largely replaced the concept of short-term memory with an integrated, multi-component classification known as working memory (Baddeley and Hitch, 1974). Working memory refers to the set of cognitive processes involved in the temporary storage *and* manipulation of information (Diamond, 2013). For example, a waitress taking orders at a dining table could use working memory to remember all the orders without writing anything down. She might also manipulate the “data” in her mind by grouping all the appetizers, all the drink orders, and so on. This combination of temporary storage and manipulation is the core of working memory. As with short-term memory capacity, individuals’ working memory capacity is limited. There is some disagreement among researchers in psychology about how working memory fits into the broader category of cognitive function. In particular, working memory and inhibitory control are often difficult to parse completely. One possibility, which is popular within computational modeling, is to group inhibitory control with working memory (Hasher and Zacks, 1998, 2006), (Miller and Cohen, 2001; Munakata et al., 2011). However, although there is some overlap, here we treat working memory and inhibitory control as distinct due to their differential impacts on economic outcomes, as we will outline in Section 4.

## 2.4.2 Measuring Memory

Cognitive psychologists have devised numerous tasks to measure short-term and working memory. We discuss four such tasks, including their relevant variations.

**I. Digit Span Tasks.** To measure short-term memory, researchers often use the *Forward Digit Span Task*, in which participants are read a list of numbers and then asked to repeat these numbers in the same order (Daneman and Carpenter, 1980, 1983). Participants with a lower level of numeracy may be at a disadvantage in this task, so researchers can substitute simple items or words in place of numbers as needed. One also can modify this task to have participants listen to and repeat non-numerical items and reorganize them. For instance, modifications might include providing participants with a series of letters to list back in alphabetical order (requires literacy) or a series of objects to list back in order of size (requires background knowledge of items, which may differ across settings). This task is easy to implement in the field—it does not require any equipment other than what is needed to record participants’ responses. Outcomes for this study are accuracy and the longest correctly remembered span. It is easy to make this test more challenging by increasing the number of digits or objects the participants are asked to remember. Closely related to the Forward Digit Span Task is the *Reverse Digit Span Task*. Intuitively, the task asks participants to listen to a list of numbers and repeat them in reverse order. Similar to the modifications of the task discussed above, this version of the task is commonly used as a measure of working memory because it requires some manipulation of information instead of mere repetition. This task has the same implementation challenges as the Forward Digit Span Task, but similar modifications can be implemented. Both the forward and reverse digit span tasks are sometimes implemented asking the participant to re-order the digits numerically. However, this version of the task is less desirable in contexts where numeracy is low.

**II. Corsi Block Test.** The Corsi Block Test (Corsi, 1972) is well suited to measure visual-spatial memory (Lezak, 1983). Participants view a series of spatially-separated blocks which individually change colors in a random sequence. They then tap or click the series of blocks in the order in which they changed color. In an alternative version of this task, a researcher will tap individual blocks and participants are then asked to tap these blocks in the same order as the researcher. The sequence typically starts out with a small number of blocks (e.g. each series will consist of two flashing blocks) and then becomes more and more difficult as the number of blocks in the series increases. As initially designed, the *Corsi Block Test* does not require mental manipulation, which categorizes it as a short-term memory test rather than a working-memory test. However, the Reverse Corsi Block Test, in which participants reverse the order of the indicated blocks, measures working memory. The Corsi Block Test is also relatively easy to implement in the field; it can be administered on paper or electronically, and a tablet version, eCorsi, has been developed (Brunetti

et al., 2014). The task also does not require any particular background (such as numeracy), making it particularly well-suited for research in development economics. Furthermore, researchers can easily increase the test’s difficulty by increasing the number of blocks respondents must remember.

**III. N-Back.** The N-Back Task is a commonly used test of working memory. In this task, participants are presented with a series of stimuli. They are then asked to press a button or otherwise indicate if the current stimuli matches the stimuli presented  $n$  stimuli prior (Kirchner, 1958). Both accuracy and speed are measured as outcomes of interest. This task can take a visual form, in which a series of objects are shown on a screen, or an auditory form, where a participant listens to a series of words. A third variant of the task, the “dual-task” version, uses a similar framework but presents two independent, simultaneous sequences - typically one visual and one auditory, to which respondents must respond (Jaeggi et al., 2003). While N-Back is widely used, its validity as a test of working memory has been questioned by studies finding that its results are only weakly correlated with other well-accepted measures of working memory (Jaeggi et al., 2010; Kane et al., 2007). In its general form, the test generally does not require literacy or numeracy, unless words, letters, or numbers are used as stimuli. It can be made more or less difficult by adjusting the  $n$  parameter or speed of the stimuli.

**IV. Self-Ordered Pointing Task.** This test measures non-spatial or spatial working memory (Petrides et al., 1993; Petrides and Milner, 1982). Participants are shown three to twelve objects (in the form of boxes with line drawings or other identifiable stimuli), and are then asked to touch one item at a time, without repeating items, until each object has been touched. However, the test randomly scrambles the locations of the objects in between turns. A modification of this task which measures spatial working memory has an identical set of objects that remain stationary throughout the task (Diamond et al., 2007; Wiebe et al., 2010). One can manipulate the difficulty by increasing the number of items. The task can be carried out either electronically or using physical objects (or paper drawings). It does not require participants to have a specific background or a certain level of education, making it appropriate in a wide range of settings.

## 2.5 Higher-Order Cognitive Functions

### 2.5.1 Definition and Description of Higher-Order Cognitive Functions

In the previous sections we presented attention, inhibitory control, and memory as uni-dimensional cognitive functions because researchers attempting to understand the human mind typically focus on one specific aspect of functioning while controlling for or mitigating the influence of unrelated areas in order to obtain the cleanest results. However, as described previously, attention, inhibitory control, and memory are all interrelated and difficult to fully disentangle, because they utilize the



same region in the brain (Stuss and Alexander, 2000).<sup>4</sup>

In fact, real-life human behavior rarely relies on one cognitive domain alone and instead usually requires a combination of these underlying functions. For example, think about the seemingly simple act of crossing a road, an activity most of us do every day. All of the core cognitive functions are at play here. First, you pay attention to the traffic light and the passing vehicles on the road. Looking at the cars, you use working memory to calculate their speed and distance and contemplate whether jaywalking seems safe enough. However, you decide to suppress your impulse to jaywalk because the young child next to you is patiently waiting for the green light and you want to set a good example; you exert inhibitory control. This example illustrates the complexity involved in almost every decision or action we take. Instead of using a uni-dimensional cognitive function, our actions and decisions typically require a multi-dimensional approach, combining several of the cognitive functions discussed so far. In this section, we discuss the more advanced types of cognitive functions, which we refer to as “higher-order cognitive functions,” focusing on cognitive flexibility, intelligence, and planning, three key areas with the potential to greatly impact economic outcomes.

**Cognitive Flexibility.** The ability to adapt to changing circumstances is referred to as cognitive flexibility (Friedman et al., 2006; Andrewes, 2001). This mental process is used when a situation is altered and there is a need to adapt to the new context by updating procedures to reflect new circumstances, rules, or environments. Cognitive psychologists hypothesize that cognitive flexibility is composed of three steps (Martin and Rubin, 1995; Martin and Anderson, 1998). The first is an awareness that there are options and alternatives available in a given situation. The second is a willingness to be flexible and adapt to a given situation. The third is the decision to make the switch and modify behavior or beliefs given the situation. Researchers argue that all three steps are critical because one cannot adapt to a new rule without an awareness of it, and similarly, one would not successfully adapt to the new rule without the willingness and ability to change. Cognitive flexibility is also referred to as set shifting, task or attention switching/shifting, cognitive shifting, and mental flexibility (Tchanturia et al., 2012; Canas et al., 2002).

**Fluid and Crystallized Intelligence.** General intelligence is typically considered to have two components: fluid intelligence and crystallized intelligence (Horn and Cattell, 1967). *Fluid intelligence* refers to the ability to solve novel problems and to adapt to new situations. Frequently abbreviated as *gF* in the literature, researchers believe fluid intelligence exists independently of acquired skills and knowledge (Cattell, 1963). Individuals who use logic such as deductive reasoning to solve a puzzle or think about problems abstractly employ fluid intelligence. As a higher-order cognitive function, it is most often associated with memory, in particular, working memory, which involves updating and manipulating information. In contrast, *crystallized intelligence*, commonly abbreviated as *gC*, relies on acquired skills and knowledge from one’s schooling and/or upbringing.

---

<sup>4</sup>Diamond (2013) Figure 4 is an excellent summary of the interrelation of cognitive functions.

Crystallized intelligence can be formed from experience or information and also relies on memory, in particular, long-term memory (Knox, 1997). Notably, intelligence measures are often used interchangeably with other decision-making activities. For example, many researchers view reasoning and problem solving as synonymous with fluid intelligence (Diamond, 2013); others group reasoning and crystallized intelligence together as a closely-related construct (Lim and Dinges, 2010).

**Planning** is a higher-order construct which captures the ability to think strategically about how best to sequence steps in order to obtain a goal. In order to plan well, individuals must consider multiple hypothetical sequences of events and actions which could be used to reach an intended outcome and then assess which will most efficiently and effectively help them reach the intended outcome (Carlin et al., 2000). This construct is also sometimes referred to as “sequencing.” There is less direct agreement on how to categorize and define planning given the large number of underlying aspects of cognitive function required, including some higher-order functions, but its direct relevance to economic choices and actions make it worthwhile to consider nonetheless (Miyake et al., 2000; Beshears et al., 2016). In the context of this paper—considering both psychological approaches and economic approaches—it is important to note that there is a key distinction between the ability to plan and the act of undertaking planning. The psychological approach to planning focuses more on planning *ability*. We will follow this approach here as a useful first step. However, the economic approach to planning would also want to consider whether an individual chooses to make a plan and follow through on it. Since those choices also draw on other domains, we will limit our discussion to measuring planning ability for the purposes of this paper.

## 2.5.2 Measuring Higher-Order Cognitive Functions

This section describes tasks used to measure higher-order cognitive functions. We divide the tests into four categories: (i) cognitive flexibility, (ii) fluid intelligence, (iii) crystallized intelligence, and (iv) planning.

**I. Wisconsin Card Sorting Task.** Measuring cognitive flexibility often involves a series of set-shifting tasks. A prominent example is the Wisconsin Card Sort Task, in which participants are provided with a deck of cards, each of which can be sorted by color, shape, or number (Berg, 1948; Grant and Berg, 1948). The objective here is for participants to learn the correct sorting criterion based on feedback provided by the experimenter as to whether they have sorted the card correctly. In this task, however, the rules change periodically and without notification, such that participants must learn to change the sorting rule based on the feedback they receive, which requires cognitive flexibility. In its standard form, the task requires the ability to read and understand numbers. However, it can be adjusted to only include color and shape.<sup>5</sup> On the other

---

<sup>5</sup>See, for instance, “Berg’s Card Sorting Test,” the Psychology Experiment Building Language (PEBL) comput-

hand, it is easy to explain and can be conducted electronically or with paper cards, making it practical in field settings.

**II. Raven’s (Progressive) Matrices Test.** The most common and universally-accepted measure of fluid intelligence (and a frequent component of IQ tests) is the Raven’s Matrices Test, developed by the British psychologist John Raven almost eighty years ago (Raven, 1936, 2000). In this test, researchers ask participants to consider a main figure that is missing a section. The goal of the task is to choose the missing piece that will complete the figure with a logical pattern, from a set of (typically 8) options. Easier versions of Raven’s Matrices involve simple matching tasks such as identifying the shape that matches the other shapes in the figure, while more difficult puzzles require participants to solve an analytical problem or apply multiple logical rules (Prabhakaran et al., 1997). While the traditional Raven’s Matrices set contains 60 such trials, more recent studies which use this task as part of a larger battery of tests use fewer trials (Mani et al., 2013; Raven, 2000). Researchers can alter the difficulty of a Raven’s Matrices task by increasing the number of multiple-choice options available or the complexity of the rules participants must deduce to complete the puzzle.

**III. Wechsler Adult Intelligence Tests (WAIS).** Researchers frequently use this test to measure both fluid and crystallized intelligence. Composed of 11 subtests, the WAIS consists of both a ‘verbal’ and a ‘performance’ component (Lichtenberger and Kaufman, 2009; Wechsler, 2008). The verbal sections include vocabulary, digit span, comprehension, and arithmetic. The performance sections include picture completion and arrangement, object assembly, etc. There are three variants of *Wechsler Intelligence Tests*, designed for: i) adults; ii) young children; iii) older children, each of varying difficulty. As described above, tasks that measure crystallized intelligence rely on previous knowledge. As a result, performance on subtests that involve vocabulary or sentence completion can be limited by language skills, making implementation and interpretation difficult in many developing-country settings. The test has been translated into over twenty languages to date.

**IV. Tower of London Task.** The Tower of London Task is among the most common tasks used to measure planning ability. In this task, participants are presented with two configurations of three stacks of small colored disks arranged on pegs. The first configuration of the disks is the target or goal arrangement and the second configuration of the disks is the starting arrangement. The participant’s task is to reach the goal arrangement from the starting arrangement in the fewest possible moves of disks (Banich, 2009). To complete the task by moving the disks from the starting arrangement to the goal arrangement, participants must follow a number of different rules. The specifics of the rules may vary to alter the difficulty of the task, but typically fall into

---

erized version of the task Wisconsin Card Sorting Task (, PEBL).

three categories: (i) The number of disks that can be moved at one time – typically just one disk can be moved at a time; (ii) Which disks can be moved – typically only the top disk in the stack; and (iii) Limits on the number of disks that can be placed on a single peg – typically either the same across all pegs or descending with the height of the peg (e.g., three disks on the tallest peg, two on the peg of intermediate height, and only one on the shortest peg).

As the goal of the task is to capture planning ability, the participants are asked to plan ahead mentally before carrying out the task physically. Participants typically undertake a large (e.g. 20) number of trials of varied difficulty to more precisely capture the individual’s ability. The complexity of the task can be increased by: 1) increasing the number of colored disks used in the trial or, 2) by increasing the required number of moves to correctly complete the puzzle with a fixed number of disks. Outcome measures include the total number of moves, the number of trials solved in the fewest possible moves (considered to be “correct”), the time taken to plan in advance of starting to move the disks, and time taken to move the disks (Unterrainer et al., 2004).

## 2.6 Practical Concerns

Most of the tasks described above exhibit several useful features which promote ready utilization across a variety of domains. These features include ease of administration, broad applicability, and ease of instruction, as described in more detail in Schilbach et al. (2016). Yet, important caveats remain in order to successfully integrate these tasks into randomized trials or surveys. First among these is the importance of careful piloting of the task in the relevant population. As described above, there are often a variety of ways to adjust the difficulty of each task and piloting provides the opportunity to make appropriate adjustments for the population of interest. Selection of the task settings which are most appropriate for the context will help the researcher to avoid both floor and ceiling effects. In addition, integrating at least one and sometimes several practice rounds before starting the actual post-treatment trials to be used as outcome measures will reduce the variance unrelated to the treatment across participants. Piloting the task is typically necessary to identify the appropriate number of practice rounds to provide accurate measures and ensure comprehension of the task. Finally, piloting also provides an opportunity to fine-tune instructions in the local language and ensure that surveyors are providing complete and accurate instruction both via direct observation and via analysis of pilot data for variation in performance by the surveyor conducting the test.

Another important consideration in utilizing these tasks is the selection of appropriate outcome measures. In contexts with repeated measurement, participants increase proficiency, potentially leading to a significant fraction of participants reaching the maximal performance. This issue is particularly likely to arise for measures with a natural maximum (e.g., accuracy rates). It is possible to avoid this concern by considering measures without a natural maximum and with greater potential variation, such as reaction times. Some researchers have also used even more

granular measurements of speed and accuracy such as fastest 10% reaction times (Basner and Dinges, 2011). Alternatively, another approach which can be effective in avoiding such concerns is to design the task to include multiple rounds of increasing difficulty.

## 2.7 Identifying Alternative Tasks

The tasks described here provide merely an overview of a few potential tasks which can be used to capture different elements of cognitive function. Many other tasks can also be used to measure these (and other) aspects of cognitive functions but were omitted for brevity. A number of websites provide resources to implement additional tasks, though they vary in the areas of cognitive functions targeted, as well as in flexibility and quality of implementation, instructions, and outcome data. A few such examples are provided below. In addition, although not yet finalized, the authors will post software and instructions for a number of the tasks described above to their websites shortly. This software is free of charge and is intended specifically for use in research, with flexible settings and comprehensive data collection.

### Additional Resources for Cognitive Tasks

1. **ICAR:** <http://icar-project.org/>. See also: <http://icar-project.org/papers/ICAR2014.pdf>.
2. **Kikolabs:** <https://www.kikolabs.com/>
3. **Cognitive Fun!:** [cogfun.net](http://cogfun.net)

## 3 Impact of Poverty on Cognition and Economic Behavior

Although it may seem counter-intuitive that a person's fundamental cognitive "capacity" can be altered by his or her circumstances, there is a small but growing literature that demonstrates poverty can and does impact cognitive function in a variety of ways. This section briefly discusses some of the factors associated with poverty that have been shown to impact cognitive function and economic behaviors. Moreover, it provides a non-exhaustive introduction to other aspects of life in poverty for which the evidence is more limited but suggestive of potential negative impacts and which warrant further investigation. For each of the factors described below, a growing body of evidence of its impact on cognitive function and economic behaviors exists. However, much more evidence is needed to fully understand such impacts. Moreover, we have only very limited evidence regarding individuals' awareness of these potential effects.

### 3.1 Malnutrition

Throughout history, malnutrition has been associated with poverty. This relationship is still present today. One-seventh of the world’s population is below the level of caloric intake recommended by health professionals, and the vast majority of these individuals are among the poor in developing countries (Food and Agricultural Organization of the United Nations et al., 2011). Economists have studied this relationship for over 60 years, modeling nutrition as both consumption and an input into physical productivity (Leibenstein, 1957; Bliss and Stern, 1978; Stiglitz, 1976; Dasgupta and Ray, 1986). However, in recent years, the possibility of such traps has been discounted due to good evidence that liquidity is unlikely to constrain investment in calories. Hence, a revealed preference argument suggests that despite the apparently low consumption, any productivity gains from additional caloric intake are likely to be relatively small — less than the discount rate. Yet, there are both behavioral and structural reasons why this argument may not hold and, to date, a potentially critical aspect of this relationship may have been overlooked: too little food may impact not only physical function, but also mental function: thoughts may become lethargic, attention difficult to sustain, and temptations harder to resist (Fonseca-Azevedo and Herculano-Houzel, 2012; Gailliot et al., 2007; Danziger et al., 2011; Baumeister and Vohs, 2007; US Army Institute of Environmental Medicine, 1987).

Schofield (2014) tests this idea with a randomized trial which examines the impact of additional calories on measures of cognitive function among low-BMI cycle-rickshaw drivers in India over a five-week period. Study participants undertook a battery of both physical and cognitive tasks at the beginning and end of the study, in addition to reporting their labor supply and earnings daily throughout the study. The increased caloric intake improved not only labor-market outcomes, but also cognitive outcomes; treated individuals showed a 12 percent improvement in performance on the laboratory-based cognitive tasks. This gain occurred almost immediately and was sustained at the fifth week. In addition, these changes also manifested in a real-world effort discounting task in which participants could choose to provide no labor and earn nothing, to take a journey with a lighter load today, or to take a journey with a heavier load tomorrow, with both trips earning the same payment tomorrow. In this decision, treated participants were 25 percent more likely to opt to take the journey today instead of delaying at the cost of a more difficult trip tomorrow, suggesting a meaningful reduction in discount rates for effort in their work.

### 3.2 Excessive Alcohol Consumption

Excessive alcohol consumption has been associated with poverty at least since Fisher (1930), yet the underlying causal channels of this relationship remain largely unknown. Some aspects of poverty such as physical or mental pain might increase individuals’ demand for alcohol by enhancing its short-term benefits. However, poverty might also be caused or deepened by excessive alcohol consumption. By impeding mental and physical function, alcohol consumption might

distort decision-making and lower productivity. More specifically, Steele and Josephs (1990) posit in their “alcohol myopia” theory that alcohol’s narrowing effect on attention causes individuals to focus on simple, present, and salient cues, which may in turn lead to short-sighted behaviors.

In a three-week randomized field experiment in Chennai, India, Schilbach (2017) tests whether such cognitive effects can translate into economically-meaningful real-world consequences. In this study, financial incentives reduced daytime drinking among low-income workers in Chennai, India. Higher sobriety due to the incentives caused a large increase in individuals’ daily savings as measured by their daily deposits into a personal savings box at the study office. Since the incentives for sobriety caused only minor changes in alcohol expenditures and labor market earnings, the impact of increased sobriety on savings behavior appears to be due to changes in myopia rather than due to purely mechanical effects via increased income net of alcohol expenditures. Similarly, in a completely different context, Ben-David and Bos (2017) provide complementary evidence on the negative impact of alcohol availability on credit-market behavior in Sweden.

Many open questions regarding the role of alcohol consumption in the lives of the poor remain. First, much more work is needed to understand the causal impact of alcohol consumption on individuals and their families, including labor market behaviors, family resources, decision-making, violence, and well-being among women and children. Second, the underlying determinants of the demand for alcohol remain largely unknown. In particular, we do not know whether factors associated with poverty such as physical and mental pain, depression, or sleep deprivation contribute to the demand for alcohol. Third, little is known about the effectiveness of different interventions to curb undesired drinking in developing countries. Of particular interest could be the evaluation of government policies such as increased taxes or even prohibition on consumption of alcohol and its substitutes as well as on potential downstream consequences of heavy drinking including poverty levels.

### **3.3 Physical Pain**

Heavy physical labor, uncomfortable living conditions, and limited access to adequate health care and pain-management tools all contribute to a disproportionate burden of physical pain in the lives of the world’s poor (Poleshuck and Green, 2008; Case and Deaton, 2015). This inequality may be further compounded by disparate perceptions of pain; recent evidence suggests that economic insecurity in itself may increase perceived physical pain and lead to reduced pain tolerance (Chou et al., 2016). Not surprisingly to those who have experienced physical pain, pain has been shown to negatively affect various cognitive domains including attention, learning, memory, speed of information processing, psychomotor ability, and capacity to self-regulate (Moriarty et al., 2011; Nes et al., 2009). Interference with one’s thought process at inopportune moments can also make it difficult for individuals to focus, potentially competing for limited cognitive resources (Eccleston and Crombez, 1999).

Such impacts on cognitive function have the potential to also affect economic decision-making, labor supply, and earnings. However, to date, few studies have investigated such effects. In one study, Kuhnen and Knutson (2005) found that people make more sub-optimal financial decisions and are more risk averse after the anterior insula, the part of the brain that reacts to pain, is activated. Further, acute pain has been shown to increase short-sighted behavior as well as risk-seeking when conditions involve potential gains (Koppel et al., 2017). Kilby (2015) considers the impact of changes in policies regarding prescription opioid pain relievers and finds increases in missed days for injured and disabled individuals. These studies underline the potential importance of a better understanding of the role of physical pain in the lives of the poor. However, much more evidence is needed to learn about the impact of physical pain on economic behavior and well-being among the poor as well as about potential policies to help individuals to alleviate their pain in a sustainable way.

### 3.4 Sleep Deprivation

While inadequate sleep is a widespread problem across the globe, the poor in particular may not sleep well (Patel et al., 2010; Center for Disease Control, 2015). Urban environments and developing countries are particularly prone to interfere with individuals' sleep due to the higher prevalence of ambient noise, heat, light, mosquitoes, stress, overcrowding, and overall uncomfortable physical conditions (Grandner et al., 2010; Patel et al., 2010). Moreover, suboptimal sleeping conditions may also hinder deep sleep, which is essential to cognitive functioning (Sadeh et al., 2002; Roehrs et al., 1994). Although not yet published, our data collected using small wristwatch-like actigraphs (which accurately measure sleep) worn by over 200 individuals for two weeks per person among the poor in Chennai, India, supports this idea. Individuals in our sample sleep just over 5 hours per night. This limited sleep may be further exacerbated by poor sleep quality, with more than 20 disruptions per night on average. Further, because the impacts of sleep deprivation increase with the cumulative extent of the deprivation, these impacts may be especially far-reaching among those with few options for "catching up" on sleep given poor sleep environments (Van Dongen et al., 2003; Basner et al., 2013).

A robust body of evidence demonstrates that sleep deprivation and low-quality sleep impair cognitive function, including reduction in attention and vigilance and impairments to memory and logical reasoning (Lim and Dinges, 2010; Killgore, 2010; Philibert, 2005; Scott et al., 2006). Moreover, Baumeister and coauthors hypothesize that willpower is replenished overnight via sleep (Baumeister, 2002). Similar to the literature on pain, much less work has been done to document the impact of these cognitive changes on economic decision-making and labor market outcomes. Notable exceptions include a series of papers by Dickinson and co-authors that demonstrate that acute sleep deprivation (such as a full night without sleep) has mixed effects on risk preferences (McKenna et al., 2007), reduces trust and trustworthiness (Dickinson and McElroy, 2016), and re-



duces iterative reasoning in a p-beauty game in US populations (Dickinson and McElroy, 2010). In addition, although the channels through which the effects operate are not explored, research utilizing shift work, shifts in sunset time, and child sleep quality as sources of quasi-exogenous variation in sleep find significant negative impacts of limited sleep on productivity (Gibson and Shrader, 2016; Czeisler et al., 1982; Costa-Font and Flèche, 2017). However, much work remains to fully understand the productivity and decision-making consequences of sleep deprivation, particularly in developing-country contexts.

### 3.5 Monetary Concerns

One obvious consequence of being poor is having less money to buy things and improve one’s environment. Less obviously, being poor also means having to spend more of one’s cognitive resources managing what little money is available. The poor must manage sporadic income and constantly make difficult trade-offs between expenses. Even outside of financial decision-making, preoccupation with money and budgeting can act as a distraction, in effect taxing mental resources.

Mani et al. (2013) use two distinct but complementary research designs to establish the causal link between poverty and mental function. In the first study, the authors experimentally induce participants to think about everyday financial demands. For the rich participants, these thoughts are not worries. Yet for the poor, inducing these thoughts can trigger concern and distraction, with corresponding negative impacts on cognitive performance. Complementing this more “laboratory-style” study, the second study uses quasi-experimental variation in actual wealth over time among Indian farmers. Agricultural income is highly variable, with sugarcane farmers receiving income just once a year at harvest time. Because it is difficult to smooth their consumption across the year, these farmers experience cycles of poverty – poorer before harvest and richer after – generating the opportunity to compare the cognitive capacity of a given individual across both “rich” and “poor” states (the authors rule out competing explanations, such as nutrition or work effort). Both studies produce consistent effects, with large and direct negative impacts of poverty on cognitive function; when living in poverty, economic challenges also manifest as cognitive challenges.

While the effects found in Mani et al. (2013) are striking, they are yet to be replicated in other settings. In fact, in the US context Carvalho et al. (2016) find no changes in cognitive function or decision-making around paydays among low-income workers using a pre-post design. For both studies, important identification concerns remain, which emphasizes the need for additional well-identified studies. Moreover, the existing work has not considered real-world economic behaviors. As a result, it remains an open question whether poverty impedes cognitive function in ways that translate into meaningfully large effects on economic outcomes such as labor supply, productivity, or savings behavior.

### 3.6 Environmental Factors

A variety of environmental factors including noise, heat, and air pollution may also tax cognitive function. These environmental irritants may have direct and indirect impacts on the poor, especially in the developing world and in particular in urban areas where exposure to these environmental irritants is often high (World Bank, 2015). While we focus only on specific noise and air pollution below, other types of pollution, such as water contaminants, could also potentially have an impact on cognitive function and decision-making either through direct chemical channels or through other channels such “disgust.”<sup>6</sup>

**Noise Pollution.** In urban and developing environments, frequent noise pollution from car horns honking, dogs barking, or crowds chattering can make it difficult to focus and perform any given task at hand. Studies of noise levels in cities in developing countries have found noise levels significantly above WHO-recommended levels (Jamir et al., 2014; Jamrah et al., 2006; Zannin et al., 2002; Oyedepo and Saadu, 2009; Mehdi et al., 2011). In lab and field settings, increases in noise may not only induce anxiety and affect mood, but may also impair performance on cognitive tasks, particularly those that require attention and memory (Szalma and Hancock, 2011; Hygge et al., 2003; Boman et al., 2003; Enmarker et al., 2006). Noise can increase the mental workload needed for a particular situation by acting as an annoyance or stressor, in effect limiting the available cognitive resources (Becker et al., 1995). Children are at an additionally increased risk of the negative impact of noise exposure and show impairments in reading comprehension, attention, and memory when exposed to noise (Stansfeld et al., 2005; Clark and Stansfeld, 2007; Hygge et al., 2002). Though rigorous evidence on the effects of long-term exposure to noise pollution is scarce, there are a few studies which suggest that impacts may continue to exist despite individuals becoming accustomed to this noise. Irgens-Hansen et al. (2015) find increased noise is associated with slower response times to a visual attention task among employees on board Royal Norwegian Navy vessels, where noise exposure levels are consistently higher than recommended levels. Stansfeld et al. (2005) study the effect of chronic exposure to aircraft and road traffic noise on cognitive function in children and find associations between long-term exposure to aircraft noise and reading comprehension and recognition memory impairments, though they find no association with sustained attention. Further, there is suggestive evidence that prolonged exposure to noise may impact working memory (Hockey, 1986; Szalma and Hancock, 2011). However, lab evidence suggests that with longer exposure to continuous noise, agents can develop coping strategies which allow them to mitigate the effects of this noise (Szalma and Hancock, 2011). Despite the above indications of impacts on cognitive function, there is a dearth of evidence regarding the potential downstream impacts of noise pollution on decisions and productivity.

---

<sup>6</sup>Emotions, such as disgust, can impact decision-making. For example, disgust has been shown in lab studies to decrease risk taking (Fessler et al., 2004) and reduce both sale and choice prices (Lerner et al., 2004).

**Heat.** Similarly, excessive heat has the potential to impede cognitive function and impair motivation. However, evidence to this effect is mixed (Gaoua, 2011). This factor and its potential impacts are particularly relevant to life in developing countries, where the tropical environments and the lack of air conditioning make oppressive heat a near constant for many individuals.<sup>7</sup> Existing evidence suggests that when exposed to an uncomfortably high temperature, reaction time and accuracy on attention, vigilance, and inhibitory control tasks are compromised (Simmons et al., 2008; Mazloumi et al., 2014). Moreover, exposure to excessive heat can impact productivity in manual work when the body is unable to maintain the appropriate core temperature (Kjellstrom et al., 2009). At the macro level, countries in hot climates have lower total agricultural output and economic growth, which could be partially explained by workers' reduced cognitive functioning (Dell et al., 2012). As global climate shifts continue to occur, studying these causal impacts will become even more central, with the majority of the burden borne by those in developing countries (Intergovernmental Panel on Climate Change, 2014). Although few studies to date map the entire causal chain from extreme heat to economic decisions and outcomes, recent research explores the effects of oppressive heat on downstream effects such as reduced worker productivity in developing-country settings (Adhvaryu et al., 2016; Burke et al., 2015; Dell et al., 2012; Jones and Olken, 2010; Hsiang, 2010) and to an extent in developed-country settings as well (Deryugina and Hsiang, 2014; Cachon et al., 2012).

**Air Pollution.** The prevalence of less energy-efficient technologies and the lack of strong enforcement mechanisms for pollution regulations make high levels of air pollution common for many individuals living in urban developing environments (McGranahan and Murray, 2003). Not only do pollutants harm physical health (Seaton et al., 1995; Pope, 2000; Ghio et al., 2000) and decrease life expectancy (Greenstone et al., 2015; World Health Organization, 2014; Lim et al., 2012), but there is also suggestive evidence that air pollution may be linked to reduced worker productivity (Chang et al., 2016a,b; Adhvaryu et al., 2014; Graff Zivin and Neidell, 2012) and cognitive impairments in domains including attention, processing speed, and memory (Tzivian et al., 2015; Lavy et al., 2014; Weuve et al., 2012; Power et al., 2011; Franco Suglia et al., 2008). Air pollution has also been shown to decrease performance on high-stakes academic tests (Ebenstein et al., 2016; Ham et al., 2011). Though further research needs to be conducted to establish a causal link, recent research studies have also found a correlation between exposure to air pollution and rates of dementia and Alzheimer's disease (Cacciottolo et al., 2017; Chen et al., 2017).

---

<sup>7</sup>Given the long-term exposure to heat among those living in tropical regions, individuals do acclimatize to heat, which improves their physiological responses to heat exposure (Cheung and McLellan, 1998; Fox et al., 1967). Radakovic et al. (2007) found that acclimation to heat did not improve performance on attention tasks, however it did improve performance on more complex tests of cognitive function.

### 3.7 Stress and Depression

While other channels are likely operating as well, poverty might also affect cognitive function and economic behavior via its impacts on stress and depression. Stress and depression are widely prevalent across the globe. An estimated that 350 million people globally suffer from depression (World Health Organization, 2016). Moreover, there is reason to believe that the poor are disproportionately likely to suffer from these ailments. Income and socioeconomic status have well-known correlations with stress and anxiety (Chen et al., 2010; Fernald and Gunnar, 2009; Evans and English, 2002; Lupien et al., 2001), with levels of the stress hormone cortisol (Cohen et al., 2006; Li et al., 2007; Saridjana et al., 2010), and with depression (Lund et al., 2010; WHO, 2001). Recent research using both natural experiments and randomized field experiments provides evidence that this relationship is causal, i.e. low income increases stress levels. For instance, using random rainfall shocks in Kenya, Chemin et al. (2016) find that negative income shocks raises stress levels as measured by increases in the stress hormone cortisol. RCTs support these findings showing that a reduction in poverty caused by cash transfers reduces both stress and depression (Haushofer and Shapiro, 2016; Baird et al., 2013; Ozer et al., 2011; Fernald and Gunnar, 2009).

A growing body of evidence considers the role of mental health in the lives of the poor. Among them, a number of studies show that inducing stress in laboratory settings can increase risk aversion (Kandasamy et al., 2013; Mather et al., 2009; Porcelli and Delgado, 2009; Cahliková and Cingl, 2016; Lighthall et al., 2009). In contrast, the evidence on stress's impact on time discounting is mixed (Cornelisse et al., 2014; Haushofer et al., 2013, 2015). Furthermore, chronic stress in childhood is inversely related to working memory in adults (Evans and Schamberg, 2009). Researchers have only recently begun to study the effects of depression on economic decision-making, with several studies currently in the field. While these initial results focused primarily on short-run impacts of stress and depression are interesting, much more evidence is needed to understand the how these factors affect economic outcomes outside of laboratory settings. Moreover, most research to date considers the impact of short-term changes in stress. However, individuals often live in poverty for extended periods, suggesting that studies to understand the longer-term impact of chronic stress and depression on economic outcomes are particularly promising avenues of research.

## 4 Impact of Cognitive Functions on Economic Outcomes

This section discusses the relationship between cognitive function and economic outcomes, with subsections dedicated to each of the areas of cognitive function covered in Section 2. In each subsection, we begin by discussing the existing evidence, both theoretical and empirical, for such impacts. Then we provide conceptual background on how changes in that area of cognitive function may impact economic outcomes in ways which have yet to be studied. Importantly, these discussions are not exhaustive; the number of potential pathways is sufficiently vast that we can

only highlight a select set of illustrative examples in each area.

## 4.1 Attention

Attention, and its role in economic life, has generated growing interest in recent years. Economists have recognized that attention is a scarce resource, creating very real trade-offs. We first briefly review four modeling approaches of attention in economics as examples of this literature and discuss the existing empirical evidence bearing on the predictions each model. We then outline other outcomes that may be the result of attentional constraints, making them particularly promising directions for future research.

### 4.1.1 Theory

Four main strands of research modeling the role of attention in shaping economic behaviors have been developed. To the best of our knowledge, however, direct tests of these models—e.g. by considering the impact of increases or decreases in attention on the outcomes of interest—have not been conducted to date.

#### **I. Rational Inattention.**

Consistent with evidence from cognitive psychology research, the rational inattention literature considers attention to be a limited resource. Optimizing agents subject to attentional constraints allocate their available attention among competing sources of differing value. Most prominent in this literature, Sims (1998, 2003) proposes a model of limited attention as an information flow with a bound, where information is quantified as a reduction in uncertainty that comes at a cost. This model has widespread applicability to many decisions. Among other topics, Sims’s rational inattention model has been applied to price setting (Woodford, 2012; Maćkowiak and Wiederhol, 2009; Matějka, 2016), consumption versus savings problems with constant (Sims, 2006; Luo, 2008) and variable interest rates (Maćkowiak and Wiederhol, 2015), portfolio management (Van Nieuwerburgh and Veldkamp, 2009; Mondria, 2010), political campaigns (Gul and Pesendorfer, 2012), and discrimination (Bartoš et al., 2016).

**II. Sparsity.** Gabaix (2014, 2016) presents a model of bounded rationality in which individuals “sparsely maximize” or only pay attention to certain attributes. In this framework, an agent faces a choice of actions and must choose among them to maximize her utility, with her optimal action dependent on multiple variables. The agent uses a two-step algorithm to choose her utility-maximizing action. First, she chooses a “sparse” model of the world by ignoring many of the variables that could affect her optimal action. Second, she chooses a boundedly-rational action with this endogenously-chosen sparse model of the world. For each decision a person faces, there may be hundreds of relevant attributes, and it would be difficult, if not impossible, to take each of

these into account. While there are likely other factors at play as well, one potential consequence of a consumer choosing a “sparse” model of the world is the “stickiness” of choices and individuals’ propensity to follow default options, for instance, in organ donation (Johnson and Goldstein, 2003) or retirement savings decisions (Madrian and Shea, 2001; Choi et al., 2006; Beshears et al., 2009), and in insurance markets (Handel, 2013; Handel and Kolstad, 2015; Bhargava et al., 2015), even when other, potentially dominating options become available.

**III. Salience.** A third strand of theory directly models the salience of different attributes (prices, product characteristics, etc.) for different options in an agent’s choice set and environment. In these models, salient attributes are defined as attributes that consumers disproportionately focus on and therefore overweight in their decision-making process. The key questions in such models are then what influences which attributes individuals focus on, and which attributes are salient in different environments. Three approaches of modeling salience have been proposed to date (Bordalo et al., 2012, 2013; Kőszegi and Szeidl, 2013; Bushong et al., 2016). However, the empirical literature is yet to provide conclusive evidence testing the predictions of these theories against each other.

**IV. Selective Attention.** In a fourth strand of the economics literature on inattention, Schwartzstein (2014) details how selective attention can have *persistent* effects on belief formation and learning. Underlying Schwartzstein’s model is the idea that what an agent attends to today is dependent on his or her current beliefs. Following from this, what the agent attends to today will then also affect his/her beliefs in the future. Accordingly, given an agent’s incorrect initial beliefs or model of the world, this attentional strategy can lead to a failure to recognize important predictors or patterns (those outside the agent’s existing model of the world), leading individuals to overlook key factors in their decision-making consistently and over long periods.

#### 4.1.2 Empirical Evidence

To date, there is only limited empirical evidence directly testing the predictions of the above models, and in particular, evidence which can help to distinguish between the predictions of these models. As a result, it is likely too early to clearly predict how decreases in attentional constraints affect individuals’ choices. However, one natural hypothesis is that an increase in attention (e.g. due to improved sleep) reduces biases in choice that the models discussed above predict and hence improves decision-making.

Empirical evidence for models centered on the role of attention can be found in a number of realms. We provide a few illustrative examples, but these effects are likely to apply much more broadly to areas such as savings, education, and health choices as well.

**Technology Adoption.** Hanna et al. (2014) apply Schwartzstein’s model to technology adoption in seaweed farming and demonstrate that even when people have repeated experience with a decision they may fail to notice important product attributes, and thus may fall continuously away from the production frontier. Similarly, Datta and Mullainathan (2014) note that programs to encourage the adoption of technology often fail and that it is essential that new users are attentive to certain features of the technology to use it effectively. Further, the selective attention model has been used to explain low usage or non-adoption of technology or best practices. For instance, historically, there was delayed recognition of the importance of sterilizing operating rooms to prevent infections despite access to relevant data (Gawande, 2004; Nuland, 2004). Doctors had false beliefs about other causes of infection that prevented them from considering, or paying attention to, a simple, effective intervention such as hand washing. In a similar manner, Bloom et al. (2013) show that managers failed to adopt best practices in the Indian textile industry despite natural variation which should permit learning about the importance of the attributes that contribute to best practices. However, to the best of our knowledge, there is no direct evidence linking changes in attention to changes in technology adoption.

**Shrouded Attributes and Salience.** A number of studies find that consumers pay only limited attention to taxes or certain product characteristics, often referred to as “shrouded attributes” (Gabaix and Laibson, 2006). Accordingly, increasing or decreasing salience of these attributes can significantly affect sales (Chetty et al., 2009; Gallagher and Muehlegger, 2011), labor supply, and earnings behavior (Chetty and Saez, 2013). In a study of commodity tax salience, Chetty et al. (2009) find that a small increase in tax that is included in posted prices reduces demand more than when that tax is added to the price at the register. Although consumers are aware that the taxes exist (based on survey data), they fail to attend fully to these less-salient taxes at the time of purchase.

### 4.1.3 Other Potential Pathways

Despite the fact that attention receives more focus in the economics literature than most areas of cognitive function, there remain many unexplored ways in which constraints on attention may impact the lives of the poor.

**Productivity.** Existing theoretical work also links attention to poverty traps. Banerjee and Mullainathan (2008) present a model of poverty and attention based on the idea of attention scarcity. They authors note that wealthier individuals are likely to have access to goods that can reduce the attention required at home – for instance, water piped into their home or reliable child-care. The poor, who do not have access to distraction-limiting goods, are therefore more distracted at work, whereas the wealthier are able to devote more attention to work with less worry about

problems at home, and thus the rich are more productive than the poor. While this is an intriguing hypothesis, direct empirical evidence of such effects is scarce.

**Workplace and Traffic Accidents.** Accidents are substantial concerns among the poor and are potentially driven in part by lapses in attention. The consequences of such attentional lapses may be larger for the poor, who often lack the safety nets or precautions that exist in more developed economies. Imagine a worker on a factory assembly line monotonously operating a machine, whose mind wanders off for a split second at the wrong moment. In many resource-poor settings, such a lapse often results in a serious accident. Similarly, consider the dire consequences of a driver who loses focus on a highway after hours of commuting every day. In fact, 41% of car crashes in the US are estimated to be the result of recognition errors, including inattention (USDT, 2008). Yet these lapse rates are likely to be significantly higher in developing countries where factors causing lapses, such as sleep deprivation or noise, are more prevalent and where the mechanisms to prevent accidents or mitigate their impacts, such as rumble strips, are less likely to be present.

**Home Production and Childcare.** Inattention to matters at home can have enormous consequences – for instance, not realizing a child is becoming sick or that a household good, such as water or kerosene, is running low. Lapses in attention can also cause more subtle and long-term consequences. For example, consider attending to one’s children to ensure that they complete their homework, or that they stay healthy and safe. Although a single lapse may not have significant consequences, the effects are likely to compound and may have severe long-run welfare effects for the child, including increasing the likelihood of inter-generational transmission of poverty.

## 4.2 Inhibitory Control

An important aspect of inhibitory control is self-control—the ability to regulate one’s behavior when faced with impulses and temptations in order to follow through on an intended plan. The study of self-control problems continues to receive enormous attention in the economics literature, including both theoretical and empirical work. Several excellent reviews survey this large body of work (Frederick et al., 2002; DellaVigna, 2009; Bryan et al., 2010).

### 4.2.1 Theory

To date, the two main strands of theoretical work on self-control that have been most influential are hyperbolic discounting and dual-self models.

**Quasi-Hyperbolic Discounting.** Quasi-hyperbolic discounting theory is based on empirical findings that discounting is not time-invariant: individuals tend to put more weight on the immediate present than on the future (Frederick et al., 2002). Laibson (1997) and O’Donoghue and



Rabin (1999) formalize quasi-hyperbolic discounting models of these observed preferences, building on work by Strotz (1956), Phelps and Pollak (1968), and Akerlof (1991). These models have two parameters governing intertemporal preferences— $\delta$ , the standard long-run discount factor, and  $\beta$ , the short-run parameter which represent the desire for immediate gratification. When  $\beta < 1$ , discounting between the present and future periods is higher than between future time periods and the agent’s preferences are time-inconsistent. A decision-maker’s awareness of his or her future preferences can have important effects on behavior. O’Donoghue and Rabin (1999, 2001) model expectations of future time preferences, and define three types of agents: (i) sophisticated agents who know they will exhibit present bias in the future, (ii) naïve agents, who falsely believe their future self is not present-biased, and (iii) partially naïve agents who know that they exhibit self-control issues, but underestimate the extent of the bias, causing these agents to be overconfident about their future level of self-control.

**Dual-Self Models.** The other prominent strand of theoretical work on self-control focuses on dual-self models (Fudenberg and Levine, 2006; Gul and Pesendorfer, 2001, 2004). Dual-self models differ in structure, but they all include a short-run self and a long-run self, which often find themselves in conflict. The short-run doer is myopic and mostly concerned with the present, while the long-run planner is concerned with lifetime utility (Thaler and Shefrin, 1981). The long-run planner can exert influence over the short-run doer, but this comes at a cost (Fudenberg and Levine, 2006). In a different type of dual-self model, the temptation-preference model of Gul and Pesendorfer (2001, 2004), agents consider preferences among choice sets. While most models of intertemporal choice assume that options not chosen are irrelevant to utility, Gul and Pesendorfer’s model posits that agents experience disutility from not choosing the most tempting current option. Thus agents can avoid temptation, but there is an associated cost to this avoidance. Therefore, agents can benefit when they remove tempting options from their choice sets.

#### 4.2.2 Empirical Evidence

A large empirical literature has considered how self-control problems influence economic behavior. However, cleanly identified evidence of the causal impact of income, wealth, or other factors that affect bandwidth on self-control and time preferences is scarce. More generally, we only have a limited understanding of the underlying determinants of self-control problems and causes of differences in self-control across people and within people over time. Moreover, to the best of our knowledge, no studies to date have considered the underlying determinants of individuals’ naïvete regarding future self-control problems.

**Borrowing, Saving, and Investing.** A body of evidence suggests that self-control prob-

lems interfere with low-income individuals' intertemporal choices.<sup>8</sup> A number of studies detail instances in which the poor fail to take advantage of small and divisible high-return investment opportunities. Moreover, the poor are more likely to borrow at high interest rates, taking out loans routinely rather than only for emergencies (Aleem, 1990; Karlan and Mullainathan, 2010; Banerjee and Mullainathan, 2010). Several studies find evidence that self-control impacts individuals' consumption-savings choices. Ashraf et al. (2006) report high take-up rates and significantly increased savings due to a commitment savings product in the Philippines, revealing a causal impact of self-control problems on savings behavior. Dupas and Robinson (2013) find that study participants in a field experiment in Kenya increase savings and benefit from access to simple, safe, savings accounts, as well as from earmarked savings accounts and Rotating Savings and Credit Associations (ROSCAs). However, among study participants with time-inconsistent preferences, access to a simple savings account and earmarked savings account did not increase savings, while access to ROSCAs did. This evidence suggests that providing access to safe savings technologies may not be sufficient to increase savings. Other factors – external societal pressure or commitment devices – might aid those with time-inconsistent preferences in achieving their desired long-run savings goals.

**Consumption Choices.** Beyond distortions in intertemporal choice, there is also evidence that self-control problems interfere with individuals' consumption choices across periods. Such evidence exists in particular for addictive goods. In line with Gruber and Kőszegi (2001), Giné et al. (2010) find demand for a voluntary commitment product for smoking cessation in the Philippines, which produced moderate improvements in long-term smoking cessation. In a field study among low-income workers in India, Schilbach (2017) finds that about half of study participants exhibit demand for commitment to increase their sobriety, again revealing self-control problems. Moreover, about a third of participants were willing to give up at least ten percent of their daily incomes in order to receive incentives to remain sober.

**Productivity.** People who recognize that they suffer from self-control problems may seek commitment devices to improve their productivity. Ariely and Wertenbroch (2002) run experiments in which students are allowed to preemptively set due dates for school assignments, and find that students are willing to self-impose costly deadlines. While these self-imposed deadlines did improve overall performance, these deadlines weren't set optimally. In a real-world work setting, Kaur et al. (2015) find evidence that self-control problems interfere with worker productivity. Employees at a data-entry firm were offered weakly dominated "commitment" contracts, which paid less than the standard piece rate if a production target was not met, and the standard piece rate if the production target was met. The authors find substantial demand for commitment among the workers. Moreover, workers who were *offered* such commitment contracts were significantly more productive and enjoyed higher earnings.

---

<sup>8</sup>See Haushofer and Fehr (2014) for a discussion of poverty and time discounting.

### 4.2.3 Other Potential Pathways

While the study of self-control in poverty is already extensive, there are many ways in which potential cognitive changes that alter self-control can impact the lives of the poor. Health, education, and crime are potential channels that could be explored further. First, in addition to refraining from addictive substances that can harm health, self-control is essential for other health factors, such as attending yearly check-ups at the doctor or maintaining a healthy weight. Rates of overweight and obesity are rising rapidly in many developing countries. As calories become less expensive and more readily and consistently available, individuals will require substantial self-control in order to regulate intake and maintain a healthy weight. Second, self-control might have important implications for educational attainment. Students need to exercise self-control to be able to get up in the morning to attend class, pay attention to the teacher, study new material, and complete homework assignments. Deficiencies in self-control are likely to impact academic attendance, performance, and eventual achievement. Third, one prominent theory on crime, the “self-control” or “general” theory of crime, posits that low levels of individual self-control are the main factor driving criminal behavior (Gottfredson and Hirschi, 1990). This view has received empirical support in the criminology literature (Pratt and Cullen, 2000) as well as from recent research on cognitive behavior therapy (CBT) in Liberia (Blattman and Sheridan, 2017).

As in the case of attention, lapses in self-control could be more costly for those living in poverty. Splurging on a tasty snack item or a new item of clothing is hardly a life-changing event for the wealthy. Among the poor, however, lapses in self-control can have far-reaching consequences, such as expensive cycles of debt as described above. Moreover, the self-control available might be systematically different for poorer individuals if they are exposed to more temptations in their everyday lives than the rich. However, while intriguing, there is no direct causal evidence of this hypothesis. Much more work in this area is needed.

## 4.3 Memory

There is a small, but growing theoretical literature on the relationship between memory and economic outcomes. After briefly reviewing this literature, we discuss the related empirical evidence, which mainly focuses on memory’s impacts on health and savings.

### 4.3.1 Theory

While economic theory on memory is less developed than the literature on attention or inhibitory control, a number of models do exist. We discuss three of these approaches.

**Rehearsal and Associativeness.** Mullainathan (2002) provides an economic model of memory limitations that can explain certain biases and empirical puzzles (e.g. over- or under-reaction

to news in financial markets). In doing so, Mullainathan (2002) draws on two constructs from the psychological and biological literatures on memory: *rehearsal*, the idea that it is easier to remember an event after having remembered it once before, and *associativeness*, the idea that it is easier to recall an event that is similar to current events. Both of these concepts affect how accessible a given memory is and can thus be explanations for observed behavioral biases.

**The Cost of Keeping Track.** Haushofer (2015) shows that keeping track of incomplete tasks generates costs to the agent in the form of financial consequences (e.g. late fees) and/or psychological consequences of keeping the task in mind. Haushofer models these costs as a lump sum, and shows that such costs can lead people to “pre-crastinate,” or incur a loss in the present rather than in the future. Haushofer provides empirical support for his model using experimental evidence from Kenya. Haushofer notes that this model of memory can be valuable in many settings within development economics—for example, by providing options that do not require people to pay the cost of keeping track—such as providing chlorine at the place where water is collected rather than in the home, which has been shown to improve usage (Kremer et al., 2009).

**Memory and Procrastination.** Ericson (2017) describes how reminders can have significant effects on actions, yet deadlines – which should prompt agents to overcome present bias and act – are often ignored, even when such actions lead to substantial losses.<sup>9</sup> Ericson shows that the interaction of present bias and memory can explain these phenomena. His model suggests that anticipated reminders, such as deadlines, can induce procrastination, while unexpected reminders might bring welfare-inducing actions to the top of mind, spurring action.

#### 4.3.2 Empirical Evidence

A relatively large body of evidence demonstrates the importance of memory to economically important outcomes by providing evidence that reminders can effectively alter agents’ behaviors. However, we are not aware of research that considers the direct impact of interventions to improve memory on economic outcomes.

**Health.** A large share of the evidence on reminders stems from the medical literature, in particular the literature on medical adherence (see Haynes et al. (2008) and Vervloet et al. (2012) for overviews). A relatively robust finding from this literature is that reminders typically have a modest but meaningful impact on healthful behaviors including smoking cessation (Free et al., 2011), adherence to medication and treatment regimens (Pop-Eleches et al., 2011; Dulmen et al., 2007; Krishna et al., 2009), and preventive health behaviors such as sunscreen use (Armstrong et

---

<sup>9</sup>For example, King (2004) finds that students fail to apply for financial aid by the deadlines, and Pechmann and Silk (2013) find that people do not submit rebates prior to their expiration.

al., 2009).

**Savings.** Conducting an experiment with commitment savings customers in Bolivia, Peru, and the Philippines, Karlan et al. (2016a) show that reminders can increase savings. The authors vary reminders sent to customers and find that reminders increase savings and that reminders of specific future goals, which often require a high lumpy expense, are particularly effective at increasing savings. This evidence shows that memory and recall are partially responsible for low savings and suggests that reminding people of long-term goals can effectively alter behavior. Significant effects of reminders have also been found for loan repayments (Karlan et al., 2016b; Cadena and Schoar, 2011).

### 4.3.3 Other Potential Pathways

Memory also plays a central role in a wide range of other economic behaviors, as evidenced by the effectiveness of reminders in a wide variety of domains beyond the health applications above. Examples include donations (Damgaard and Gavert, 2014), appointment sign-ups (Altmann and Traxler, 2012) and show-ups (Guy et al., 2012), and rebate claims (Letzler and Tasoff, 2014), among others. However, memory is central to economic outcomes beyond simply remembering to undertake tasks. In particular, working memory plays an important role in understanding language, doing mental math, updating information or actions, and considering alternatives. As such, improving working memory might affect a range of important behaviors and decisions, ranging from technology adoption among small-scale farmers to shopkeepers' inventory choices and low-income workers' decisions to (not) migrate to cities during lean seasons. Moreover, impediments to working memory are associated with higher discount rates and impulsiveness (Hinson et al., 2003). The ability to consider alternatives and make prudent, rather than impulsive, decisions is essential for sound long-run decision-making.

Although to the best of our knowledge unstudied to date, low levels literacy may interact with memory in important ways. On the one hand, individuals with low literacy are forced to rehearse their memory on a daily basis as they are not able to write down instructions, directions, or other key information, which might improve their memory capacity. However, being forced to keep a lot of information in mind ties up a existing mental resources, which in turn may reduce the cognitive capacity available to be devoted to other decisions and tasks. Take, for example, a farmer learning about a new fertilizer or seed variety. Remembering the advice of an agricultural extension agent for a number of months and then recalling it at the appropriate time might drain cognitive resources, which in turn may distort other important choices, or result in a loss of other potentially valuable information. Such burdens are largely shouldered by the poor due to their lower levels of literacy and numeracy.

## 4.4 Higher-Order Executive Functions

Compared to other components of cognitive function, economic theory and empirical evidence on higher-order executive functions are less developed. We posit a number of areas where these functions may play an important role in behavior and decision-making and provide some suggestive empirical evidence on these effects.

### 4.4.1 Theory

Economists would likely all agree with the notion that intelligence and planning affect economic outcomes in important ways. However, the economic theory machinery to map changes in higher-order executive functions into economic behavior is yet to be developed. We therefore focus on existing empirical evidence.

### 4.4.2 Empirical Evidence

Below we outline the existing empirical evidence regarding the role of cognitive flexibility, intelligence, and planning in shaping economic behavior.

**Optimization Behavior.** Traditional economic theory posits that agents optimize their choices based on their preferences, beliefs, and constraints. Therefore, given the same choice set with the same preferences and information, agents should make the same utility-optimizing choices. However, research shows that this is not always the case and that in certain situations decision-making is inconsistent (Famulari, 1988; Sippel, 1997; Février and Visser, 2004). Recent research shows that cognitive ability, measured using a variation of the Raven’s matrices test and the Cognitive Reflection Test (Frederick, 2005), may also be related to inconsistent or seemingly random decision-making (Andersson et al., 2016). Choi et al. (2014) test for consistency in utility maximization and find that consistency scores vary significantly within and across socioeconomic groups, with consistency particularly strongly related to wealth. Poorer individuals exhibit lower consistency even when controlling for unobserved constraints, preferences, and beliefs. However, we do not know whether this relationship is causal. There exists no direct evidence that increasing income or wealth (for instance, via cash transfers) improves choice consistency.

**Innovation and Creativity.** Psychologists widely regard cognitive flexibility to be an important aspect of both innovation and creativity (Chi, 1997; Jaušovec, 1991, 1994; Runco and Okuda, 1991; Thurston and Runco, 1999; Torrance, 1974). Cognitive flexibility can facilitate creativity, and thereby increase innovation by helping individuals see a problem from a new perspective and shift strategies to more efficiently solve a problem (Thurston and Runco, 1999; Okuda et al., 1991). Higher-order thinking can also enable individuals to switch between conceptual ideas and

thus avoid getting stuck on one piece of a problem.

**Labor Market Outcomes.** There is a wide body of literature that highlights the importance of cognitive skills, often measured by intelligence scores, in predicting wages (Murnane et al., 1995), on-the-job performance and training success (Bishop, 1991), and schooling (Cawley et al., 2001). Assessing the effects of general intelligence on future labor market success is difficult given that it is so strongly and inextricably correlated with educational attainment, making measurement of the separate effects of these factors difficult or impossible (Cawley et al., 2001; Heckman and Vytlačil, 2001). However, even controlling for educational attainment, Judge et al. (2009) find that general mental ability (as measured by a battery of tests including Raven’s matrices and the Wechsler Intelligence Test) has a significant direct effect on income levels. Further, the authors find that general mental ability has significant indirect effects on income through its impact on education and self-esteem. Results from developing countries are more mixed. Psacharopoulos and Velez (1992) find that intelligence—as measured by Raven’s matrices test—accounts for a small portion of the return to education on wages in Colombia. Fafchamps and Quisumbing (1999) find that, controlling for education, intelligence as measured by the Raven’s matrices test, has an insignificant effect on earnings from crops, livestock, and non-farm labor in rural Pakistan. Vogl (2014) studies the height premium on wages in Mexico—the additional wages associated with being taller— and finds that cognitive ability, as measured by the Raven’s matrices test, accounts for only a small share of the height premium, while educational attainment and occupational selection account for approximately half this premium. However, Vogl suggests that cognitive ability may play an important role through its indirect effects on educational attainment and occupational sorting.

#### 4.4.3 Other Potential Pathways.

In addition to the empirical evidence outlined above, we hypothesize that higher-order executive functions may play a role in other areas of economic interest.

**Technology Adoption.** To be willing to adopt a given technology, agents must be willing and able to see themselves and their surroundings in other states of the world. For instance, a farmer considering the adoption of a new crop must foresee and plan how to sell the crop in the subsequent season. Such flexibility and planning is essential as the investment needed to adopt a new technology generally takes place prior to the realization of benefits. In short, it is necessary to be able to imagine the potential costs and benefits of the technology prior to adopting it. Moreover, the ability to accurately learn about the costs and benefits of new technologies likely directly depends on higher-order cognitive functions and, in particular, fluid intelligence.

**Resilience.** Cognitive flexibility is a key component of resilience. It allows individuals to

reframe or reappraise a situation instead of getting stuck in a particular mindset, providing more potential solutions to a problem. Further, cognitive flexibility enables individuals to reevaluate and adjust their perceptions of difficult and traumatic events, which can help them to understand the trauma and recover from it. For example, after surviving a traumatic event, cognitive flexibility can enable an individual to maintain the belief that he or she will prevail despite the difficulties of life.

**Cooperation.** Cognitive flexibility even has the potential to effect cooperation and interpersonal relationships. Consider interpersonal disagreements or conflicts—the ability to see the world through the eyes of others is often helpful in order to resolve conflict when there are different preferences or opinions. This, in turn, could have potential implications in models of household bargaining, social cohesion and trust, and workplace relationships.

## 5 Open Questions and Future Research Directions

Cognitive function and its implications for human behavior and economic outcomes are not poverty-specific—they are applicable in a much broader range of settings and across many income levels. However, understanding the relationship between cognitive function and economic behavior is particularly relevant to the study of economic development and poverty because poverty may be both a cause and a consequence of changes in cognitive function. An adult’s cognitive ability is traditionally considered fixed. However, recent evidence shows that it is variable and can be affected by circumstances. Poverty has associated hardships—lack of nutritious food, limited access to medical care, difficult working conditions, and the stress of paying bills—which all have the potential to impair cognitive ability. Shifts in cognitive ability, in turn, can lead to diminished productivity and impaired decision-making, thus potentially deepening poverty and creating a feedback loop that may even generate the potential for poverty traps.

Although some evidence of this potential exists, much remains unknown regarding the exact nature of the bi-directional relationships between areas of cognitive function and poverty. This relative paucity of knowledge generates an open and valuable area of research to pursue. How do poverty and environment shape cognitive function, and how does cognitive function shape economic outcomes? There are specific components of poverty that have already been studied and shown to affect cognitive ability, such as scarcity (Mani et al., 2013) and poor nutrition (Schofield, 2014). Yet numerous other components and correlates of poverty may affect cognitive function in ways that are not yet well understood, such as lack of sleep, chronic pain, or noise and air pollution. Beyond these relationships, there are many other valuable directions of inquiry in this area to understand these relationships comprehensively, and in doing so, potentially inform both basic knowledge and policy. For example, does long-run exposure to aspects of poverty (e.g. chronic physical pain or sleep deprivation) increase or decrease the associated impacts on cognitive function and economic



behavior? Are there important interaction effects between different aspects of life in poverty? Are individuals aware of the effects of poverty and do they adjust their behavior accordingly (e.g. by avoiding to make important choices while being tired or in pain)? What is the correlation of different aspects of cognitive function between and within individuals?

Seeking a deeper, more nuanced understanding of cognitive function has enormous potential to help us understand the causes and consequences of poverty. Although a broad topic with many overlapping aspects, cognitive function does consist of measurable and reasonably distinct components. In this paper we have outlined four components of cognitive function that are important to economics—attention, inhibitory control, memory and working memory, and higher-order executive functions, which include cognitive flexibility, fluid and crystallized intelligence, and planning. While we know a fair amount about how to measure cognitive function, we know far less about its influence on productivity and decision-making. Now that the tools are available, there is a lot more to be learned.

# A Appendix

## A.1 Summary Table of Cognitive Tasks

Task Name	Description	Background Needed	Manipulation of Difficulty	Modes of Administration
<b>Simple Attention</b>				
Psychomotor Vigilance Task (PVT)	A task that measures the accuracy and reaction time of participants responding to a stimulus.	No	Yes	Electronic Only
<b>Complex Attention</b>				
Concentration Endurance Test	A task that requires participants to view a continuous list of letters p and d, with up to two markings above and/or two markings below the letter. The participant has to cross out d's which are surrounded by exactly two markings. Can be adjusted for respondents who are illiterate or whose native language does not use the Latin alphabet.	In some forms affected by literacy	No	Paper or electronic
<b>Inhibitory Control</b>				
Hearts and Flowers Task	This task requires participants to learn two rules, and then switch between them flexibly. Specifically, the screen is divided into two panels and either a heart or a flower is flashed onto one side of screen. Participants are first shown only hearts and are asked to click on the same side of the screen as the heart. They are then only shown flowers and are asked to click on the opposite side of the screen as the flowers. In a third trial, they are shown both hearts and flowers and must click on the appropriate side according to the stimulus.	No	Yes	Electronic Only
Eriksen Flanker Task	Participants are shown stimuli and are asked to only respond to the central stimuli, ignoring the stimuli surrounding it.	In certain forms, literacy is required	Limited	Electronic Only
Classic Stroop Task	A task in which participants see the name of a color printed in a different ink color, and the participant is asked to name the ink color (e.g. the word "green" is written in red ink and the participant is expected to reply with "red").	Literacy required	No	Paper or electronic
Spatial Stroop Task	Participants are shown stimuli with both relevant and irrelevant dimensions, and are told only to respond to the relevant dimension. One common version has participants respond to arrows shown on different sides of a screen, and press in the direction the arrow is pointing.	No	Yes	Electronic Only

Task Name	Description	Background Needed	Manipulation of Difficulty	Modes of Administration
<b>Short-Term Memory</b>				
Forward-Digit Span Task	Participants are asked to listen to a list of numbers and repeat them back in the same order. Can be modified for subjects without numeracy to include objects in place of numbers.	Numeracy required in traditional version	Yes	Verbal or electronic
Corsi Block Task	Participants are shown a series of blocks, which are indicated one at a time by a change of color or pointing in a random sequence. Participants are then asked to click on or point to the blocks in the sequence just shown. A modified version of this task requires subjects to reorder the blocks, which measures working memory.	No	Yes	Paper or electronic
<b>Working Memory</b>				
Backward-Digit Span Task	Participants are asked to listen to a list of numbers and repeat them in numerical or reverse-numerical order. Can be modified for subjects without numeracy to include objects in place of numbers.	Numeracy required in traditional version	Yes	Verbal or electronic
N-Back	Participants are shown a series of stimuli and asked to respond if the current stimuli matches the stimuli shown 'n' steps previously. This task can be presented orally, visually, or as both modes simultaneously.	No	Yes	Electronic and/or auditory.
Self-Ordered Pointing Task	Participants are shown a number of items (e.g. physical items or different drawings or symbols) and asked to touch one item at a time, in any order, without repeating a choice while the items are scrambled in between turns.	No	Yes	Using physical items, paper, or electronic
<b>Cognitive Flexibility</b>				
Wisconsin Card Sorting Task	Participants are provided with a deck of cards, each of which can be sorted by color, shape or number. Participants attempt to learn the correct sorting criterion based on feedback and are expected to switch sorting rules if they receive feedback that the rules have changed. The task can be modified for subjects without numeracy.	Numeracy required in traditional form	No	Paper or electronic
<b>Fluid Intelligence and Crystallized Intelligence</b>				
Raven's (Progressive) Matrices	Participants are shown visual geometric designs missing one piece and are given six to eight choices and asked to pick the one that represents the missing piece.	No	Yes	Paper or electronic
Wechsler Adult Intelligence Test (WAIS)	Participants complete a verbal section covering vocabulary, digit span, comprehension, and arithmetic, and a performance section including picture completion/arrangement, object assembly, etc.	Literacy & numeracy required, education can affect outcomes	Yes	Paper or electronic
<b>Planning</b>				
Tower of London	Participants are tasked with configuring one stack of colored disks to match a second "goal" configuration in as few moves as possible.	No	Yes	Physical objects or electronic

## References

- Adhvaryu, Achyuta, Namrata Kala, and Anant Nyshadham**, “Management and Shocks to Worker Productivity: Evidence from Air Pollution Exposure in an Indian Garment Factory,” *mimeo*, 2014.
- , —, and —, “The Light and the Heat: Productivity Co-benefits of Energy-Saving Technology,” *mimeo*, 2016.
- Akerlof, George**, “Procrastination and Obedience,” *American Economic Review Papers and Proceedings*, 1991, *81* (2), 1–19.
- Aleem, Irfan**, “Imperfect Information, Screening, and the Costs of Informal Lending: A Study of a Rural Credit Market in Pakistan,” *World Bank Economic Review*, 1990, *4* (3), 329–349.
- Altmann, Steffan and Christian Traxler**, “Nudges at the Dentist,” *IZA Discussion Paper 6699*, 2012.
- Andersson, Ola, Håkan J. Holm, Jean-Robert Tyran, and Erik Wengström**, “Risk Aversion Relates to Cognitive Ability: Preferences or Noise?,” *Journal of the European Economic Association*, 2016, *14* (5), 1129–1154.
- Andrewes, David G.**, *Neuropsychology: From Theory to Practice*, 2nd ed., Psychology Press, 2001.
- Ariely, Dan and Klaus Wertenbroch**, “Procrastination, Deadlines, and Performance: Self-Control by Precommitment,” *Psychological Science*, 2002, *13* (3), 219–224.
- Armstrong, April W., Alice J. Watson, Maryanne Makredes, Jason E. Frangos, Alexandra B. Kimball, and Joseph C. Kvedar**, “Text-Message Reminders to Improve Sunscreen Use A Randomized, Controlled Trial Using Electronic Monitoring,” *Archives of Dermatology*, 2009, *145* (11), 1230–1236.
- Ashraf, Nava, Dean Karlan, and Wesley Yin**, “Tying Odysseus to the Mast: Evidence from a Commitment Savings Product in the Philippines,” *Quarterly Journal of Economics*, 2006, *121* (2), 635–672.
- Baddeley, Alan D. and Graham Hitch**, “Working Memory,” in Gordon H. Bower, ed., *The Psychology of Learning and Motivation*, Vol. 8, Academic Press Inc., 1974, pp. 47–89.
- Baird, Sarah, Jacobus De Hoop, and Berk Özler**, “Income Shocks and Adolescent Mental Health,” *Journal of Human Resources*, 2013, *48* (2), 370–403.
- Bandiera, Oriana, Robin Burgess, Narayan Das, Selim Gulesci, Imran Rasul, and Munshi Sulaiman**, “Labor Markets and Poverty in Village Economies,” *Suntory and Toyota International Centres for Economics and Related Disciplines*, 2015, 58.
- Banerjee, Abhijit and Esther Duflo**, *Poor Economics: A Radical Rethinking of the Way to Fight Global Poverty*, New York: PublicAffairs, 2011.
- and **Sendhil Mullainathan**, “Limited Attention and Income Distribution,” *American Economic Review Papers & Proceedings*, 2008, *98* (2), 489–493.
- and —, “The Shape of Temptation: Implications for the Economic Lives of the Poor,” *NBER Working Paper 15973*, 2010.
- , **Esther Duflo, Nathanael Goldberg, Dean Karlan, Robert Osei, William Parienté, Jeremy Shapiro, Bram Thuysbaert, and Christopher Udry**, “A Multifaceted Program Causes Lasting Progress for the Poor: Evidence from Six Countries,” *Science*, 2015, *348* (6236).
- Banich, Marie T.**, “Executive Function: The Search for an Integrated Account,” *Current Directions in Psychological Science*, 2009, *18* (2), 89–94.
- Barrett, Christopher B. and Michael R. Carter**, “The Economics of Poverty Traps and Persistent Poverty: Empirical and Policy Implications,” *Journal of Development Studies*, 2013, *49* (7), 976–990.

- , **Teevrat Garg**, and **Linden McBride**, “Well-Being Dynamics and Poverty Traps,” *Annual Review of Resource Economics*, 2016, 8, 303–327.
- Bartoš, Vojtěch**, **Michal Bauer**, **Julie Chytilová**, and **Filip Matějka**, “Attention Discrimination: Theory and Field Experiments with Monitoring Information Acquisition,” *American Economic Review*, 2016, 106 (6), 1437–1475.
- Basner, Mathias** and **David F. Dinges**, “Maximizing Sensitivity of the Psychomotor Vigilance Test (PVT) to Sleep Loss,” *Sleep*, 2011, 34 (5), 581–591.
- , **Daniel Mollicone**, and **David F. Dinges**, “Validity and Sensitivity of a Brief Psychomotor Vigilance Test (PVT-B) to Total and Partial Sleep Deprivation,” *Acta Astronautica*, 2011, 69 (1), 949–959.
- , **Hengyi Rao**, **Namni Goel**, and **David F. Dinges**, “Sleep Deprivation and Neurobehavioral Dynamics,” *Current Opinion in Neurobiology*, 2013, 23 (5), 854–863.
- Bates, Marsha E.** and **Edward P. Lemay**, “The d2 Test of Attention: Construct Validity and Extensions in Scoring Techniques,” *Journal of the International Neuropsychological Society*, 2004, 10 (3), 392–400.
- Baumeister, Roy F.**, “Yielding to Temptation: Self-Control Failure, Impulsive Purchasing, and Consumer Behavior,” *Journal of Consumer Research*, 2002, 28 (1), 670–676.
- and **Kathleen D. Vohs**, “Self-regulation, Ego Depletion, and Motivation,” *Social and Personality Psychology Compass*, 2007, 1 (1), 115–128.
- , **Ellen Bratslavsky**, **Mark Muraven**, and **Dianne M. Tice**, “Ego Depletion: Is the Active Self a Limited Resource?,” *Journal of Personality and Social Psychology*, 1998, 74 (5), 1252–1265.
- Becker, Ami B.**, **Joel S. Warm**, **William N. Dember**, and **Peter A. Hancock**, “Effects of Jet Engine Noise and Performance Feedback on Perceived Workload in a Monitoring Task,” *The International Journal of Aviation Psychology*, 1995, 5 (1), 49–62.
- Ben-David, Itzak** and **Marieke Bos**, “Impulsive Consumption and Financial Wellbeing: Evidence from an Increase in the Availability of Alcohol,” *NBER Working Paper 23221*, 2017.
- Berg, Esta A.**, “A Simple Objective Technique for Measuring Flexibility in Thinking,” *Journal of General Psychology*, 1948, 39, 415–422.
- Beshears, John**, **James J. Choi**, **David Laibson**, and **Brigitte C. Madrian**, “The Importance of Default Options for Retirement Saving Outcomes: Evidence from the United States,” in Gary Burtless, ed., *Social Security Policy in a Changing Environment*, University of Chicago Press, 2009, pp. 167–195.
- , **Katherine L. Milkman**, and **Joshua Schwartzstein**, “Beyond Beta-Delta: The Emerging Economics of Personal Plans,” *The American Economic Review*, 2016, 106 (5), 430–434.
- Bhargava, Saurabh**, **George Loewenstein**, and **Justin Sydnor**, “Do Individuals Make Sensible Health Insurance Decisions? Evidence from a Menu with Dominated Options,” *NBER Working Paper 21160*, 2015.
- Bishop, John H.**, “The Impact of Academic Competencies on Wages, Unemployment and Job Performance,” *mimeo*, 1991.
- Bliss, Christopher** and **Nicholas Stern**, “Productivity, Wages, and Nutrition: Part I: The Theory,” *Journal of Development Economics*, 1978, 5 (4), 331–362.
- Bloom, Nicholas**, **Benn Eifert**, **Aprajit Mahajan**, **David McKenzie**, and **John Roberts**, “Does Management Matter? Evidence from India,” *Quarterly Journal of Economics*, 2013, 128, 1–51.
- Boman, Eva**, **Ingela Enmarker**, and **Staffan Hygge**, “Strength of Noise Effects on Memory as a Function of Noise Source and Age,” *Noise & Health*, 2003, 7 (27), 11–26.

- Bordalo, Pedro, Nicola Gennaioli, and Andrei Shleifer**, “Salience Theory of Choice Under Risk,” *Quarterly Journal of Economics*, 2012, *127* (3), 1243–1285.
- , —, and —, “Salience and Consumer Choice,” *Journal of Political Economy*, 2013, *121* (5), 803–843.
- Borella, Erika, Barbara Carretti, and Santiago Pelegrina**, “The Specific Role of Inhibition in Reading Comprehension in Good and Poor Comprehenders,” *Journal of Learning Disabilities*, 2010, *43* (6), 541–552.
- Broadbent, Donald**, *Perception and Communication*, London, England: Pergamon Press, 1958.
- Brunetti, Riccardo, Claudia Del Gatto, and Franco Delogu**, “eCorsi: Implementation and Testing of the Corsi Block-tapping Task for Digital Tablets,” *Frontiers in Psychology*, 2014, *5*, 1–8.
- Bryan, Gharad, Dean Karlan, and Scott Nelson**, “Commitment Devices,” *Annual Review of Economics*, 2010, *2*, 671–698.
- Burke, Marshall, Solomon M. Hsiang, and Edward Miguel**, “Global Non-linear Effect of Temperature on Economic Production,” *Nature*, 2015, *527*, 235–239.
- Bushong, Ben, Matthew Rabin, and Josh Schwartzstein**, “A Model of Relative Thinking,” *mimeo*, 2016.
- Cacciottolo, Mafalda, Xinhui Wang, Ira Driscoll, Nicholas Woodward, Arian Saffari, Jeanette Reyes, Mark L. Serre, William Vizuete, Constantinos Sioutas, Todd E. Morgan, Margaret Gatz, Helena C. Chui, Sally A. Shumaker, Susan M. Resnick, Mark A. Espeland, Caleb E. Finch, and Jiu-Chuan Chen**, “Particulate Air Pollutants, APOE Alleles and their Contributions to Cognitive Impairment in Older Women and to Amyloidogenesis in Experimental Models,” *Translational Psychiatry*, 2017, *7*, 1–8.
- Cachon, Gerard P., Santiago Gallino, and Marcelo Olivares**, “Severe Weather and Automobile Assembly Productivity,” *mimeo*, 2012.
- Cadena, Ximena and Antionette Schoar**, “Remembering to Pay? Reminders vs. Financial Incentives for Loan Payments,” *NBER Working Paper 17020*, 2011.
- Cahlíková, Jana and Lubomir Cingl**, “Risk Preferences under Acute Stress,” *Experimental Economics (forthcoming)*, 2016.
- Canas, Jose J., Jose F. Quesada, Adoracion Antoli, and Inmaculada Fajardo**, “Cognitive Flexibility and Adaptability to Environmental Changes in Dynamic Complex Problem-Solving Tasks,” *Ergonomics*, 2002, *46* (5), 482–501.
- Carlin, Danielle, Joy Bonerba, Michael Phipps, Gene Alexander, Mark Shapiro, and Jordan Grafman**, “Planning Impairments in Frontal Lobe Dementia and Frontal Lobe Lesion Patients,” *Neuropsychologia*, 2000, *38* (5), 655–665.
- Carlson, Stephanie M. and Louis J. Moses**, “Individual Differences in Inhibitory Control and Children’s Theory of Mind,” *Child Development*, 2001, *72* (4), 1032–1053.
- Carvalho, Leandro, Stephan Meier, and Stephanie Wang**, “Poverty and Economic Decision-Making: Evidence from Changes in Financial Resources at Payday,” *American Economic Review*, 2016, *106* (2), 260–284.
- Case, Anne and Angus Deaton**, “Rising Morbidity and Mortality in Midlife Among White Non-Hispanic Americans in the 21st Century,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2015, *112* (49), 15078–15083.
- Cattell, Raymond A. and John L. Horn**, “Refinement and Test of the Theory of Fluid and Crystallized General Intelligence,” *Journal of Educational Psychology*, 1966, *57* (5), 253–270.
- Cattell, Raymond B.**, “Theory of Fluid and Crystallized Intelligence: A Critical Experiment,” *Journal of Educational Psychology*, 1963, *54* (1), 1–22.

- Cawley, John, James Heckman, and Edward Vytlačil**, “Three Observations on Wages and Measured Cognitive Ability,” *Labour Economics*, 2001, 8 (4), 419–442.
- Center for Disease Control**, “QuickStats: Percentage of Adults Who Average  $\leq 6$  Hours of Sleep, by Family Income Group and Metropolitan Status of Residence — National Health Interview Survey, United States, 2013,” <http://www.cdc.gov/mmwr/preview/mmwrhtml/mm6412a10.htm> 2015. Accessed: 2016-09-05.
- Chang, Tom, Joshua Graff Zivin, Tal Gross, and Matthew Neidell**, “The Effect of Pollution on Worker Productivity: Evidence from Call-Center Workers in China,” *NBER Working Paper 22328*, 2016.
- , —, —, and —, “Particulate Pollution and the Productivity of Pear Packers,” *American Economic Journal: Economic Policy*, 2016, 8 (3), 141–169.
- Chemin, Matthieu, Joost de Laat, and Johannes Haushofer**, “Negative Rainfall Shocks Increase Levels of the Stress Hormone Cortisol Among Poor Farmers in Kenya,” *mimeo*, 2016.
- Chen, Edith, Sheldon Cohen, and Gregory E. Miller**, “How Low Socioeconomic Status Affects 2-Year Hormonal Trajectories in Children,” *Psychological Science*, 2010, 21 (1), 31–37.
- Chen, Hong, Jeffrey C. Kwong, Ray Copes, Karen Tu, Paul J. Villeneuve, Aaron van Donkelaar, Perry Hystad, Randall V. Martin, Brian J. Murray, Barry Jessiman, Andrew S. Wilton, Alexander Kopp, and Richard T. Burnett**, “Living Near Major Roads and the Incidence of Dementia, Parkinson’s Disease, and Multiple Sclerosis: A Population-based Cohort Study,” *The Lancet*, 2017, 389 (10070), 718—726.
- Chetty, Raj, Adam Looney, and Kory Kroft**, “Salience and Taxation: Theory and Evidence,” *American Economic Review*, 2009, 99 (4), 1145—1177.
- and **Emmanuel Saez**, “Teaching the Tax Code: Earnings Responses to an Experiment with EITC Recipients,” *American Economic Journal: Applied Economics*, 2013, 5 (1), 1–31.
- Cheung, Stephen S. and Tom M. McLellan**, “Heat Acclimation, Aerobic Fitness, and Hydration Effects on Tolerance During Uncompensable Heat Stress,” *Journal of Applied Physiology*, 1998, 84 (5), 1731–1739.
- Chi, Michelene T. H.**, “Creativity: Shifting Across Ontological Categories Flexibly,” in Thomas B. Ward, Steven M. Smith, and Jyotsna Vaid, eds., *Creative Thought: An Investigation of Conceptual Structures and Processes*, Washington, DC: American Psychological Association, 1997, pp. 209–234.
- Choi, James, David Laibson, Brigitte Madrian, and Andrew Metrick**, “Saving for Retirement on the Path of Least Resistance,” in Edward McCaffrey and Joel Slemrod, eds., *Behavioral Public Finance*, Russell Sage, 2006, pp. 304–352.
- Choi, Syngjoo, Shachar Kariv, Wieland Müller, and Dan Silverman**, “Who Is (More) Rational?,” *American Economic Review*, 2014, 104 (6), 1518–1550.
- Chou, Eileen Y., Bidhan L. Parmar, and Adam D. Galinsky**, “Economic Insecurity Increases Physical Pain,” *Psychological Science*, 2016, 27 (4), 1–12.
- Christopher, Julian C. Jamison Blattman and Margaret Sheridan**, “Reducing Crime and Violence: Experimental Evidence from Cognitive Behavioral Therapy in Liberia,” *American Economic Review*, 2017, 107 (4), 1165–1206.
- Chun, Marvin M., Julie D. Golomb, and Nicholas B. Turk-Browne**, “A Taxonomy of External and Internal Attention,” *Annual Review of Psychology*, 2011, 62 (1), 73–101.
- Clark, Charlotte and Stephen A. Stansfeld**, “The Effect of Transportation Noise on Health and Cognitive Development: A Review of Recent Evidence,” *International Journal of Comparative Psychology*, 2007, 20 (2), 145–158.
- Cohen, Ronald A.**, *The Neuropsychology of Attention*, 2nd ed., New York: Springer US, 2014.

- Cohen, Sheldon, William J. Doyle, and Andrew Baum**, “Socioeconomic Status Is Associated With Stress Hormones,” *Psychosomatic Medicine*, 2006, 68 (3), 414–420.
- Cornelisse, Sandra, Vanessa van Ast, Johannes Haushofer, Maayke Seinstra, and Marian Joëls**, “Time-Dependent Effect of Hydrocortisone Administration on Intertemporal Choice,” *mimeo*, 2014.
- Corsi, Philip M.**, “Human Memory and the Medial Temporal Region of the Brain,” *Dissertation Abstracts International*, 1972, 34, 819B.
- Costa-Font, Joan and Sarah Flèche**, “Parental Sleep and Employment: Evidence from a British Cohort Study,” *Centre for Economic Performance Discussion Paper 1467*, 2017.
- Cowan, Nelson**, “What are the Differences between Long-Term, Short-Term, and Working Memory?,” *Progress in Brain Research*, 2008, 169, 323–338.
- Currie, Janet and Douglas Almond**, “Human Capital Development Before Age Five,” *Handbook of Labor Economics*, 2011, 4, 1315–1486.
- Czeisler, Charles A., Martin C. Moore-Ede, and Richard H. Coleman**, “Rotating Shift Work Schedules that Disrupt Sleep are Improved by Applying Circadian Principles,” *Science*, 1982, 217.4558, 460–463.
- Dangaard, Mette and Christina Gavert**, “Now or Never! The Effect of Deadlines on Charitable Giving: Evidence from a Natural Field Experiment,” *mimeo*, 2014.
- Daneman, Meredyth and Patricia A. Carpenter**, “Individual Differences in Working Memory and Reading,” *Journal of Verbal Learning and Verbal Behavior*, 1980, 19 (4), 450–466.
- and —, “Individual Differences in Integrating Information Between and Within Sentences,” *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 1983, 9 (4), 561–584.
- Danziger, Shai, Jonathan Levav, and Liora Avnaim-Pesso**, “Extraneous Factors in Judicial Decisions,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2011, 108 (7), 6889–6892.
- Dasgupta, Partha and D. Ray**, “Inequality as a Determinant of Malnutrition and Unemployment: Theory,” *Economic Journal*, 1986, 96 (384), 1011–1034.
- Datta, Saugato and Sendhil Mullainathan**, “Behavioral Design: A New Approach to Development Policy,” *Review of Income and Wealth*, 2014, 60 (1), 7–35.
- Davidson, Matthew C., Dima Amso, Loren C. Anderson, and Adele Diamond**, “Development of Cognitive Control and Executive Functions from 4 to 13 Years: Evidence from Manipulations of Memory, Inhibition, and Task Switching,” *Neuropsychologia*, 2006, 44 (11), 2037–2078.
- de Frias, Cindy M., Roger A. Dixon, and Esther Strauss**, “Structure of Four Executive Functioning Tests in Healthy Older Adults,” *Neuropsychology*, 2006, 20 (2), 206–214.
- Dell, Melissa, Benjamin F. Jones, and Benjamin A. Olken**, “Temperature Shocks and Economic Growth: Evidence from the Last Half Century,” *American Economic Journal: Macroeconomics*, 2012, 4 (3), 66–95.
- DellaVigna, Stefano**, “Psychology and Economics: Evidence from the Field,” *Journal of Economic Literature*, 2009, 47 (2), 315–372.
- Dempster, Frank N.**, “The Rise and Fall of the Inhibitory Mechanism: Toward a Unified Theory of Cognitive Development and Aging,” *Developmental Review*, 1992, 12 (1), 45–75.
- Deryugina, Tatyana and Solomon M. Hsiang**, “Does the Environment Still Matter? Daily Temperature and Income in the United States,” *NBER Working Paper 20750*, 2014.
- Diamond, Adele**, “Executive Functions,” *Annual Review of Psychology*, 2013, 64, 135–168.



- **and Colleen Taylor**, “Development of an Aspect of Executive Control: Development of the Abilities to Remember What I Said and to ‘Do as I Say, Not as I Do,’” *Developmental Psychobiology*, 1996, *29* (4), 315–334.
- , **W. Steven Barnett, Jessica Thomas, and Sarah Munro**, “Preschool Program Improves Cognitive Control,” *Science*, 2007, *318*, 1387–1388.
- Dickinson, David L. and Todd McElroy**, “Rationality Around the Clock: Sleep and Time-of-Day Effects on Guessing Game Responses,” *Economics Letters*, 2010, *108* (2), 245–248.
- **and** — , “Sleep Restriction and Time-of-Day Impacts on Simple Social Interaction,” *mimeo*, 2016.
- Dinges, David F., Frances Pack, Katherine Williams, Kelly A. Gillen, John W. Powell, Geoffrey E. Ott, Caitlin Aptowicz, and Allan I. Pack**, “Cumulative Sleepiness, Mood Disturbance, and Psychomotor Vigilance Performance Decrements During a Week of Sleep Restricted to 4-5 Hours per Night,” *Sleep*, 1997, *20* (4), 267–277.
- Dorrian, Jillian, Naomi L. Rogers, and David F. Dinges**, “Psychomotor Vigilance Performance: A Neurocognitive Assay Sensitive to Sleep Loss,” in Clete Kushida, ed., *Sleep Deprivation: Clinical Issues, Pharmacology and Sleep Loss Effects*, New York, N.Y.: Marcel Dekker, Inc., 2005, pp. 39–70.
- Dulmen, Sandra, Emmy Sluijs, Liset Dijk, Denise Ridder, Rob Heerdink, and Jozien Bensing**, “Patient Adherence to Medical Treatment: A Review of Reviews,” *BMC Health Services Research*, 2007, *7* (1), 55–68.
- Duncan, Greg J., Chantelle J. Dowset, Amy Claessens, Katherine Magnuson, Aletha C. Huston, Pamela Klebanov, Linda S. Pagani, Leon Feinstein, Mimi Engel, Jeanne Brooks-Gunn, Holly Sexton, Kathryn Duckworth, and Crista Japel**, “School Readiness and Later Achievement,” *Developmental Psychology*, 2007, *43* (6), 1428–1446.
- Dupas, Pascaline and Jonathan Robinson**, “Why Don’t the Poor Save More? Evidence from Health Savings Experiments,” *American Economic Review*, 2013, *103* (4), 1138–1171.
- Ebenstein, Avraham, Victor Lavy, and Sefi Roth**, “The Long-Run Economic Consequences of High-Stakes Examinations: Evidence from Transitory Variation in Pollution,” *American Economic Journal: Applied Economics*, 2016, *8* (4), 36–65.
- Eccleston, Chris and Geert Crombez**, “Pain Demands Attention: A Cognitive-Affective Model of the Interruptive Function of Pain,” *Psychological Bulletin*, 1999, *125* (3), 356–366.
- Egeland, Jens, Susanne Nordby Johansen, and Torill Ueland**, “Differentiating Between ADHD Sub-Types on CCPT Measures of Sustained Attention and Vigilance,” *Scandinavian Journal of Psychology*, 2009, *50* (1), 347–354.
- Enmarker, Ingela, Eva Boman, and Staffan Hygge**, “Structural Equation Models of Memory Performance Across Noise Conditions and Age Groups,” *Scandinavian Journal of Psychology*, 2006, *47*, 449–460.
- Ericson, Keith Marzilli**, “On the Interaction of Memory and Procrastination: Implications for Reminders, Deadlines and Empirical Estimation,” *Journal of the European Economic Association (forthcoming)*, 2017.
- Eriksen, Barbara A. and Charles W. Eriksen**, “Effects of Noise Letters upon the Identification of a Target Letter in a Nonsearch Task,” *Perception and Psychophysics*, 1974, *16* (1), 143–149.
- Evans, Gary W. and Kimberly English**, “The Environment of Poverty: Multiple Stressor Exposure,” *Child Development*, 2002, *73* (4), 1238–1248.
- **and Michelle A. Schamberg**, “Childhood Poverty, Chronic Stress, and Adult Working Memory,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2009, *106* (16), 6545–6549.
- Fafchamps, Marcel and Agnes R. Quisumbing**, “Human Capital, Productivity, and Labor Allocation in Rural Pakistan,” *The Journal of Human Resources*, 1999, *34* (2), 369–406.

- Famulari, Melissa**, “A Household-based, Nonparametric Test of Demand Theory,” *Review of Economics and Statistics*, 1988, 77 (2), 372–382.
- Fang, Hanming and Glenn C. Loury**, “Dysfunctional Identities Can Be Rational,” *American Economic Review*, 2005, 95 (2), 104–111.
- Fernald, Lia and Megan R. Gunnar**, “Effects of a Poverty-Alleviation Intervention on Salivary Cortisol in Very Low-Income Children,” *Social Science & Medicine*, 2009, 68 (12), 2180–2189.
- Fessler, Daniel M. T., Elizabeth G. Pillsworth, and Thomas J. Flanson**, “Angry Men and Disgusted Women: An Evolutionary Approach to the Influence of Emotions on Risk Taking,” *Organizational Behavior and Human Decision Processes*, 2004, 95, 107–123.
- Février, Philippe and Michael Visser**, “A Study of Consumer Behavior Using Laboratory Data,” *Experimental Economics*, 2004, 7 (1), 93–114.
- Fisher, Irving**, *The Theory of Interest, as Determined by Impatience to Spend Income and Opportunity to Invest It*, New York: MacMillan, 1930.
- Fonseca-Azevedo, Karina and Suzana Herculano-Houzel**, “Metabolic Constraint Imposes Tradeoff Between Body Size and Number of Brain Neurons in Human Evolution,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2012, 109 (45), 18571–18576.
- Food and Agricultural Organization of the United Nations, International Fund for Agricultural Development, and World Food Programme**, *The State of Food Insecurity in the World 2011. How does International Price Volatility Affect Domestic Economies and Food Security?*, Food and Agriculture Organization Publications, Rome, 2011.
- Fox, R. H., R. Goldsmith, I. F. G Hampton, and T. J. Hunt**, “Heat Acclimatization by Controlled Hyperthermia in Hot-Dry and Hot-Wet Climates,” *Journal of Applied Physiology*, 1967, 22 (1), 39–46.
- Franco Suglia, Shakira, Charis Gryparis, Robert O. Wright, Joel Schwartz, and R. John Wright**, “Association of Black Carbon with Cognition Among Children in a Prospective Birth Cohort Study,” *American Journal of Epidemiology*, 2008, 167 (3), 280–286.
- Frederick, Shane**, “On the Ball: Cognitive Reflection and Decision-Making,” *Journal of Economic Perspectives*, 2005, 19 (4), 25–42.
- , **George Loewenstein, and Ted O’Donoghue**, “Time Discounting and Time Preference: A Critical Review,” *Journal of Economic Literature*, 2002, XL (2), 351–401.
- Free, Caroline, Rosemary Knight, Steven Robertson, Robyn Whittaker, Phil Edwards, Weiwei Zhou, Anthony Rodgers, John Cairns, Michael G. Kenward, and Ian Roberts**, “Smoking Cessation Support Delivered via Mobile Phone Text Messaging (txt2stop): A Single-Blind, Randomised Trial,” *The Lancet*, 2011, 378 (9785), 49–55.
- Friedman, Naomi P., Akira Miyake, Robin P. Corley, Susan E. Young, John C. DeFries, and John K. Hewitt**, “Not All Executive Functions are Related to Intelligence,” *Psychological Science*, 2006, 17 (2), 172–179.
- Fudenberg, Drew and David K. Levine**, “A Dual-Self Model of Impulse Control,” *American Economic Review*, 2006, 96 (5), 1449–1476.
- Gabaix, Xavier**, “A Sparsity-Based Model of Bounded Rationality,” *Quarterly Journal of Economics*, 2014, 129 (4), 1661–1710.
- , “Behavioral Macroeconomics Via Sparse Dynamic Programming,” *NBER Working Paper 21848*, 2016.
- **and David Laibson**, “Shrouded Attributes, Consumer Myopia, and Information Suppression in Competitive Markets,” *Quarterly Journal of Economics*, 2006, 121 (2), 505–540.

- Gailliot, Matthew T., Roy F. Baumeister, C. Nathan DeWall, Jon K. Maner, E. Ashby Plant, Dianne M. Tice, Lauren E. Brewer, and Brandon J. Schmeichel**, “Self-Control Relies on Glucose as a Limited Energy Source: Willpower is More Than a Metaphor,” *Journal of Personality and Social Psychology*, 2007, *92* (2), 325–336.
- Gallagher, Kelly Sims and Erich Muehlegger**, “Giving Green to Get Green? Incentives and Consumer Adoption of Hybrid Vehicle Technology,” *Journal of Environmental Economics and Management*, 2011, *61* (1), 1–15.
- Gaoua, Nadia**, “The Effects of Heat Exposure on Cognitive Performance,” *Scandinavian Journal of Medicine & Science in Sports*, 2011, *20* (3), 60–70.
- Gawande, Atul**, “On Washing Hands,” *New England Journal of Medicine*, 2004, *350*, 1283–1286.
- Ghio, Andrew J., Chong Kim, and Robert B. Devlin**, “Concentrated Ambient Air Particles Induce Mild Pulmonary Inflammation in Healthy Human Volunteers,” *American Journal of Respiratory and Critical Care Medicine*, 2000, *162* (3.1), 981–988.
- Gibson, Matthew and Jeffrey Shrader**, “Time Use and the Labor Market: The Wage Returns to Sleep,” *mimeo*, 2016.
- Giné, Xavier, Dean Karlan, and Jonathan Zinman**, “Put Your Money Where Your Butt Is: A Commitment Contract for Smoking Cessation,” *American Economic Journal: Applied Economics*, 2010, *2*, 213–235.
- Glass, David C., Jerome E. Singer, and Lucy N. Friedman**, “Psychic Cost of Adaptation to an Environmental Stressor,” *Journal of Personality and Social Psychology*, 1969, *12* (3), 200–210.
- Godefroy, Olivier, Maryline Cabaret, Violaine Petit-Chenal, Jean-Pierre Pruvo, and Marc Rousseaux**, “Control Functions of the Frontal Lobes. Modularity of the Central-Supervisory System?,” *Cortex*, 1999, *35* (1), 1–20.
- Gottfredson, Michael R. and Travis Hirschi**, *A General Theory of Crime*, Stanford, CA: Stanford University Press, 1990.
- Graff Zivin, Joshua and Matthew Neidell**, “The Impact of Pollution on Worker Productivity,” *American Economic Review*, 2012, *102* (7), 3652–3673.
- Grandner, Michael A., Nirav P. Patel, Philip R. Gehrman, Dawei Xie, Daohang Sha, Terri Weaver, and Nalaka Gooneratne**, “Who Gets the Best Sleep? Ethnic and Socioeconomic Factors Related to Sleep Complaints,” *Sleep Medicine*, 2010, *11*, 470–478.
- Grant, David A. and Esta A. Berg**, “A Behavioral Analysis of Degree of Reinforcement and Ease of Shifting to New Responses in Weigl-type Card-Sorting Problem,” *Journal of Experimental Psychology*, 1948, *38*, 404–411.
- Greenstone, Michael, Janhavi Nilekani, Rohini Pande, Nicholas Ryan, Anant Sudarshan, and Anish Sugathan**, “Lower Pollution, Longer Lives: Life Expectancy Gains if India Reduced Particulate Matter Pollution,” *Economic & Political Weekly*, 2015, *1* (8), 40–46.
- Gruber, Jonathan and Botond Köszegi**, “Is Addiction Rational? Theory and Evidence,” *Quarterly Journal of Economics*, 2001, *116*, 1261–1303.
- Gul, Faruk and Wolfgang Pesendorfer**, “Temptation and Self-Control,” *Econometrica*, 2001, *69*, 1403–1435.
- and —, “Self-Control, Revealed Preferences and Consumption Choice,” *Review of Economic Dynamics*, 2004, *7* (2), 243–264.
- and —, “The War of Information,” *Review of Economic Studies*, 2012, *79* (2), 707–734.

- Guy, Rebecca, Jane Hocking, Handon Wand, Sam Stott, Hammad Ali, and John Kaldor**, “How Effective are Short Message Service Reminders at Increasing Clinic Attendance? A Meta-Analysis and Systematic Review,” *Health Services Research*, 2012, *47* (2), 614–632.
- Hagger, Martin S., Nikos L. D. Chatzisarantis et al.**, “A Multilab Preregistered Replication of the Ego-Depletion Effect,” *Perspectives on Psychological Science*, 2016, *11* (4), 546–573.
- Ham, John C., Jacqueline S. Zweig, and Edward Avol**, “Pollution, Test Scores and the Distribution of Academic Achievement: Evidence from California Schools 2002–2008,” [http://www.iza.org/conference\\_files/TAM2012/ham\\_j1496.pdf](http://www.iza.org/conference_files/TAM2012/ham_j1496.pdf) 2011.
- Handel, Benjamin R.**, “Adverse Selection and Inertia in Health Insurance Markets: When Nudging Hurts,” *American Economic Review*, 2013, *103* (7), 2643–2682.
- **and Jonathan T. Kolstad**, “Health Insurance for Humans: Information Frictions, Plan Choice, and Consumer Welfare,” *American Economic Review*, 2015, *105* (8), 2449–2500.
- Hanna, Rema, Sendhil Mullainathan, and Joshua Schwartzstein**, “Learning Through Noticing: Theory and Evidence from a Field Experiment,” *Quarterly Journal of Economics*, 2014, *129* (3), 1311–1353.
- Hasher, Lynn and Rose T. Zacks**, “Working Memory, Comprehension, and Aging: A Review and a New View,” in G. H. Bower, ed., *The Psychology of Learning and Motivation: Advances in Research and Theory*, San Diego, CA: Academic, 1998, pp. 193–225.
- **and —**, “Aging and Long-Term Memory: Deficits are not Inevitable,” in Ellen Bialystock and Fergus I. M. Craik, eds., *Lifespan Cognition: Mechanisms of Change*, New York: Oxford University Press, 2006, pp. 162–177.
- Haushofer, Johannes**, “The Cost of Keeping Track,” *mimeo*, 2015.
- **and Ernst Fehr**, “On the Psychology of Poverty,” *Science*, 2014, *344* (6186), 862–867.
- **and Jeremy Shapiro**, “The Short-Term Impact of Unconditional Cash Transfers to the Poor: Experimental Evidence From Kenya,” *mimeo*, 2016.
- **, Channing Jang, and John Lynham**, “Stress and Temporal Discounting: Do Domains Matter?,” *mimeo*, 2015.
- **, Sandra Cornelisse, Maayke Seinsträ, Ernst Fehr, Marian Joëls, and Tobias Kalenscher**, “No Effects of Psychosocial Stress on Intertemporal Choice,” *PLOS One*, 2013, *8* (11), e78597.
- Haynes, R. Brian, Elizabeth Ackloo, Navdeep Sahota, Heather Pauline McDonald, and Xiaomei Yao**, “Interventions for Enhancing Medication Adherence,” in “Cochrane Database of Systematic Reviews, Issue 2” 2008.
- Heckman, James and Edward Vytlačil**, “Identifying the Role of Cognitive Ability in Explaining the Level of and Change in the Return of Schooling,” *The Review of Economics and Statistics*, 2001, *83* (1), 1–12.
- Hinson, John M., Tina L. Jameson, and Paul Whitney**, “Impulsive Decision Making and Working Memory,” *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 2003, *29* (2), 298–306.
- Hockey, G. Robert J.**, “Changes in Operator Efficiency as a Function of Environmental Stress, Fatigue, and Circadian Rhythms,” in Kenneth R. Boff, Lloyd Kaufman, and James P. Thomas, eds., *Handbook of Human Perception and Performance: Vol. 2. Cognitive Processes and Performance*, New York, N.Y.: Wiley, 1986, pp. 1–49.
- Hofmann, Wilhelm, Malte Friese, and Fritz Strack**, “Impulse and Self-Control from a Dual-Systems Perspective,” *Perspectives on Psychological Science*, 2009, *4* (2), 162–176.

- , **Wolfgang Rauch**, and **Bertram Gawronski**, “And Deplete us Not into Temptation: Automatic Attitudes, Dietary Restraint and Self-Regulatory Resources as Determinants of Eating Behavior,” *Journal of Experimental Social Psychology*, 2007, *43* (1), 497–504.
- Horn, John L. and Raymond B. Cattell**, “Age Differences in Fluid and Crystallized Intelligence,” *Acta Psychologica*, 1967, *26* (1), 107–129.
- Hsiang, Solomon M.**, “Temperatures and Cyclones Strongly Associated with Economic Production in the Caribbean and Central America,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2010, *107* (35), 15367–15372.
- Hygge, Staffan, Eva Boman, and Ingela Enmarker**, “The Effects of Road Traffic Noise and Meaningful Irrelevant Speech on Different Memory Systems,” *Scandinavian Journal of Psychology*, 2003, *44*, 13–21.
- , **Gary W. Evans**, and **Monika Bullinger**, “A Prospective Study of Some Effects of Aircraft Noise on Cognitive Performance in Schoolchildren,” *Psychological Science*, 2002, *13* (5), 469–474.
- Intergovernmental Panel on Climate Change**, “IPCC, 2014: Summary for Policymakers,” in C. B. Field, V. R. Barros, D. J. Dokken, K. J. Mach, M. D. Mastrandrea, T. E. Bilir, M. Chatterjee, K. L. Ebi, Y. O. Estrada, R. C. Genova, B. Girma, E. S. Kissel, A. N. Levy, S. MacCracken, P.R. Mastrandrea, and L. L. White, eds., *Climate Change 2014: Impacts, Adaptation, and Vulnerability. Part A: Global and Sectoral Aspects. Contribution of Working Group II to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change*, Cambridge, U.K.: Cambridge University Press, 2014, pp. 1–32.
- Inzlicht, Michael and Brandon J. Schmeichel**, “What is Ego Depletion? Toward a Mechanistic Revision of the Resource Model of Self-Control,” *Perspectives on Psychological Science*, 2012, *7* (5), 450–463.
- Irgens-Hansen, Kaja, Hilde Gundersen, Erlend Sunde, Valborg Baste, Anette Harris, Magne Bråtveit, and Bente E Moen**, “Noise Exposure and Cognitive Performance: A Study on Personnel on Board Royal Norwegian Navy Vessels,” *Noise & Health*, 2015, *17* (78), 320–327.
- Jaeggi, Susanne M., Martin Buschkuhl, Walter J. Perrig, and Beat Meier**, “The Concurrent Validity of the N-back Task as a Working Memory Measure,” *Memory*, 2010, *18* (4), 394–412.
- , **Ria Seewer, Arto C. Nirkko, Doris Eckstein, Gerhard Schroth, Rudolf Groner, and Klemens Gutbrod**, “Does Excessive Memory Load Attenuate Activation in the Prefrontal Cortex? Load-Dependent Processing in Single and Dual Tasks: Functional Magnetic Resonance Imaging Study,” *Neuroimage*, 2003, *19* (2), 210–225.
- Jalan, Jyotsna and Martin Ravallion**, “Geographic Poverty Traps? A Micro Model of Consumption Growth in Rural China,” *Journal of Applied Econometrics*, 2002, *17* (4), 329–346.
- James, William**, *The Principles of Psychology*, New York: Henry Holt, 1890.
- Jamir, Limalemla, Baridalyne Nongkynrih, and Sanjeev Kumar Gupta**, “Community Noise Pollution in Urban India: Need for Public Health Action,” *Indian Journal of Community Medicine*, 2014, *39* (1), 8–12.
- Jamrah, Ahmad, Abbas Al-Omari, and Reem Sharabi**, “Evaluation of Traffic Noise Pollution in Amman, Jordan,” *Environmental Monitoring and Assessment*, 2006, *120* (1), 499–525.
- Jaušovec, Norbert**, “Flexible Strategy Use: A Characteristic of Gifted Problem Solving,” *Creativity Research Journal*, 1991, *4* (4), 349–366.
- , *Flexible Thinking: An Explanation for Individual Differences*, Hampton Press, 1994.
- Johnson, Eric J. and Daniel Goldstein**, “Do Defaults Save Lives?,” *Science*, 2003, *302* (5649), 1338–1339.
- Jones, Benjamin F. and Benjamin A. Olken**, “Climate Shocks and Exports,” *American Economic Review*, 2010, *100* (2), 454–459.

- Judge, Timothy A., Charlice Hurst, and Lauren S. Simon**, “Does It Pay to Be Smart, Attractive, or Confident (or All Three)? Relationships Among General Mental Ability, Physical Attractiveness, Core Self-Evaluations, and Income,” *Journal of Applied Psychology*, 2009, *94* (3), 742–755.
- Jurado, María Beatriz and Mónica Rosselli**, “The Elusive Nature of Executive Functions: A Review of Our Current Understanding,” *Neuropsychology Review*, 2007, *17* (3), 213–233.
- Kandasamy, Narayanan, Ben Hardy, Lionel Page, Markus Schaffner, Johann Graggaber, Andrew S. Powlson, Paul C. Fletcher, Mark Gurnell, and John Coates**, “Cortisol Shifts Financial Risk Preferences,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 2013, *111* (9), 3608–3613.
- Kandel, Eric Kandel, James H. Schwartz, and Thomas Jessell**, *Principles of Neural Science*, New York, NY: McGraw-Hill, 2000.
- Kane, Michael J. and Randall W. Engle**, “The Role of Pre-frontal Cortex in Working-Memory Capacity, Executive Attention, and General Fluid Intelligence: An Individual-Differences Perspective,” *Psychonomic Bulletin and Review*, 2002, *9* (4), 637–671.
- , **Andrew R. A. Conway, Timothy K. Miura, and Gregory J. H. Colflesh**, “Working Memory, Attention Control, and the N-Back Task: A Question of Construct Validity,” *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 2007, *33* (3), 615–622.
- Kaplan, Stephen and Marc G. Berman**, “Directed Attention as a Common Resource for Executive Functioning and Self-Regulation,” *Perspectives on Psychological Science*, 2010, *5* (1), 43–57.
- Karlan, Dean and Sendhil Mullainathan**, “Debt Cycles,” *mimeo*, 2010.
- , **Margaret McConnell, Sendhil Mullainathan, and Jonathan Zinman**, “Getting to the Top of Mind: How Reminders Increase Saving,” *Management Science*, 2016.
- , **Melanie Morten, and Jonathan Zinman**, “A Personal Touch: Text Messaging for Loan Repayment,” *Behavioral Science and Policy (forthcoming)*, 2016.
- Kaur, Supreet, Michael Kremer, and Sendhil Mullainathan**, “Self Control at Work,” *Journal of Political Economy*, 2015, *123* (6), 1227–1277.
- Kilby, Angela**, “Opioids for the Masses: Welfare Tradeoffs in the Regulation of in the Prescription of Narcotic Pain Medications,” *mimeo*, 2015.
- Killgore, William D. S.**, “Effects of Sleep Deprivation on Cognition,” *Progress in Brain Research*, 2010, *185*, 105–129.
- Kimberg, Daniel Y., Mark D’Esposito, and Martha J. Farah**, “Cognitive Functions in the Prefrontal Cortex: Working Memory and Executive Control,” *Current Directions in Psychological Science*, 1997, *6* (6), 185–192.
- King, Jacqueline**, “Missed Opportunities: Students Who Do Not Apply for Financial Aid,” *American Council on Education Issue Brief*, 2004.
- Kirchner, Wayne K.**, “Age Differences in Short-Term Retention of Rapidly Changing Information,” *Journal of Experimental Psychology*, 1958, *55* (4), 352–358.
- Kjellstrom, Tord, Ingvar Holmer, and Bruno Lemke**, “Workplace Heat Stress, Health and Productivity – An Increasing Challenge for Low and Middle-Income Countries during Climate Change,” *Global Health Action*, 2009, *2*.
- Knox, Alan B.**, *Adult Development and Learning*, San Francisco: Jossey-Bass Inc., 1997.

- Koppel, Lina, David Andersson, India Morrison, Kinga Posadzdy, Daniel Västfjäll, and Gustav Tinghög**, “The Effect of Acute Pain on Risky and Intertemporal Choice,” *Experimental Economics*, 2017, pp. 1–16.
- Kraay, Aart and Claudio Raddatz**, “Poverty Traps, Aid, and Growth,” *Journal of Development Economics*, 2007, *82* (2), 315–347.
- and **David McKenzie**, “Do Poverty Traps Exist? Assessing the Evidence,” *Journal of Economic Perspectives*, 2014, *28* (3), 127–148.
- Kremer, Michael, Edward Miguel, Sendhil Mullainathan, Clair Null, and Alix P. Zwane**, “Making Water Safe: Price, Persuasion, Peers, Promoters, or Product Design,” *mimeo*, 2009.
- Krishna, Santosh, Suzanne Austin Boren, and E. Andrew Balas**, “Healthcare Via Cell Phones: A Systematic Review,” *Telemedicine and e-Health*, 2009, *15* (3), 231–240.
- Kuhnen, Camelia M. and Brian Knutson**, “The Neural Basis of Financial Risk Taking,” *Neuron*, 2005, *47* (5), 763–770.
- Kőszegi, Botond and Adam Szeidl**, “A Model of Focusing in Economic Choice,” *Quarterly Journal of Economics*, 2013, *128* (1), 53–104.
- Laibson, David**, “Golden Eggs and Hyperbolic Discounting,” *Quarterly Journal of Economics*, 1997, *112* (2), 443–478.
- Lauderdale, Diane S., Kristen L. Knutson, Lijing L. Yan, Kiang Liu, and Paul J. Rathouz**, “Self-reported and Measured Sleep Duration: How Similar are they?,” *Epidemiology*, 2008, *19* (6), 838–845.
- Lavie, Nilli, Aleksandra Hirst, Jan W. de Fockert, and Essi Viding**, “Load Theory of Selective Attention and Cognitive Control,” *Journal of Experimental Psychology*, 2004, *133* (3), 339–354.
- Lavy, Victor, Avraham Ebenstein, and Sefi Roth**, “The Impact of Short Term Exposure to Ambient Air Pollution on Cognitive Performance and Human Capital Formation,” *NBER Working Paper 20648*, 2014.
- Leibenstein, Harvey**, “The Theory of Underemployment in Backward Economies,” *Journal of Political Economy*, 1957, *65* (2), 91–103.
- Lerner, Jennifer S., Deborah A. Small, and George Loewenstein**, “Heart Strings and Purse Strings: Carryover Effects of Emotions on Economic Decisions,” *Psychological Science*, 2004, *15* (5), 337–341.
- Letzler, Robert and Joshua Tasoff**, “Everyone Believes in Redemption: Nudges and Overoptimism in Costly Task Completion,” *Journal of Economic Behavior & Organization*, 2014, *107*, 107–122.
- Lezak, Muriel D.**, *Neuropsychological Assessment*, New York: Oxford University Press, 1983.
- , **Diane B. Howieson, and David W. Loring**, *Neuropsychological Assessment*, 4th ed., New York: Oxford University Press, 2004.
- Li, Leah, Chris Power, Shona Kelly, Clemens Kirschbaum, and Clyde Hertzman**, “Life-Time Socio-Economic Position and Cortisol Patterns in Mid-Life,” *Psychoneuroendocrinology*, 2007, *32*, 824–833.
- Lichtenberger, Elizabeth O. and Alan S. Kaufman**, *Essentials of WAIS-IV Assessment*, Hoboken, NJ: John Wiley, 2009.
- Lighthall, Nichole R., Mara Mather, and Marissa A. Gorlick**, “Acute Stress Increases Sex Differences in Risk Seeking in the Balloon Analogue Risk Task,” *PLOS ONE*, 2009, *4* (7), e6002.
- Lim, Julian and David Dinges**, “Sleep Deprivation and Vigilant Attention,” *Annals of the New York Academy of Sciences*, 2008, *1129* (1), 305–322.

- **and David F. Dinges**, “A Meta-Analysis of the Impact of Short-Term Sleep Deprivation on Cognitive Variables,” *Psychological Bulletin*, 2010, *136* (3), 375–389.
- , **Wen-Chau Wu, Jiongjiong Wang, John A. Detre, David F. Dinges, and Hengyi Rao**, “Imaging Brain Fatigue from Sustained Mental Workload: An ASL Perfusion Study of the Time-On-Task Effect,” *Neuroimage*, 2010, *49* (4), 3426–3435.
- Lim, Stephen S., Theo Vos, Abraham D. Flaxman, Goodarz Danaei, Kenji Shibuya, Heather Adair-Rohani, and Markus Amann**, “A Comparative Risk Assessment of Burden of Disease and Injury Attributable to 67 Risk Factors and Risk Factor Clusters in 21 Regions, 1990-2010: A Systematic Analysis for the Global Burden of Disease Study 2010,” *Lancet*, 2012, *380* (9859), 2224–2260.
- Lu, Chen-Lui and Robert W. Proctor**, “The Influence of Irrelevant Location Information on Performance: A Review of the Simon and Spatial Stroop Effects,” *Psychonomic Bulletin and Review*, 1995, *2* (2), 174–207.
- Lund, Crick, Alison Breen, Alan J. Flisher, Ritsuko Kakuma, Joanne Corrigall, John A. Joska, Leslie Swartz, and Vikram Patel**, “Poverty and Common Mental Disorders in Low and Middle Income Countries: A Systematic Review,” *Social Science & Medicine*, 2010, *71* (3), 517–528.
- Luo, Yulei**, “Consumption Dynamics Under Information Processing Constraints,” *Review of Economic Dynamics*, 2008, *11* (2), 366–385.
- Lupien, Sonia J., Suzanne King, Michael J. Meaney, and Bruce S. McEwan**, “Can Poverty Get Under Your Skin?: Basal Cortisol Levels and Cognitive Function in Children from Low and High Socioeconomic Status,” *Developmental Psychopathology*, 2001, *13*, 651–674.
- Lyon, G. Reid and Norman A. Krasnegor**, *Attention, Memory, and Executive Function*, Baltimore: Paul H. Brookes Publishing, 1996.
- Maćkowiak, Bartosz and Mirko Wiederhol**, “Business Cycle Dynamics Under Rational Inattention,” *Review of Economic Studies*, 2015, *82* (4), 1502–1532.
- **and Mirko Wiederhol**, “Optimal Sticky Prices Under Rational Inattention,” *American Economic Review*, 2009, *99* (3), 769–803.
- Mackworth, Jane F.**, “Vigilance, Arousal, and Habituation,” *Psychological Review*, 1968, *75* (4), 308–322.
- MacLeod, Colin M.**, “Half a Century of Research on the Stroop Effect: An Integrative Review,” *Psychological Bulletin*, 1991, *109* (2), 163–203.
- , **Michael D. Dodd, Erin D. Sheard, Daryl E. Wilson, and Uri Bibi**, “In Opposition to Inhibition,” in Brian H. Ross, ed., *The Psychology of Learning and Motivation*, Vol. 43, Elsevier Science, 2003, pp. 163–214.
- Madrian, Brigitte C. and Dennis F. Shea**, “The Power of Suggestion: Inertia in 401(k) Participation and Savings Behavior,” *Quarterly Journal of Economics*, 2001, *116* (4), 1149–1187.
- Mani, Anandi, Sendhil Mullainathan, Eldar Shafir, and Jiaying Zhao**, “Poverty Impedes Cognitive Function,” *Science*, 2013, *341*, 976–980.
- Martin, Matthew M. and Carolyn M. Anderson**, “The Cognitive Flexibility Scale: Three Validity Studies,” *Communication Reports*, 1998, *11* (1), 1–9.
- **and Rebecca B. Rubin**, “A New Measure of Cognitive Flexibility,” *Psychological Reports*, 1995, *76*, 623–626.
- Mather, Mara, Marissa A. Gorlick, and Nichole R. Lighthall**, “To Brake or Accelerate When the Light Turns Yellow? Stress Reduces Older Adults’ Risk Taking in a Driving Game,” *Psychological Science*, 2009, *20* (2), 174–176.
- Matějka, Filip**, “Rationally Inattentive Seller: Sales and Discrete Pricing,” *Review of Economic Studies*, 2016, *83* (3), 1125–1155.



- Mazloumi, Adel, Farideh Golbabaei, Somayeh M. Khani, Zeinab Kazemi, Mostafa Hosseini, Marzieh Abbasinia, and Somayeh F. Dehghan**, “Evaluating Effects of Heat Stress on Cognitive Function among Workers in a Hot Industry,” *Health Promotion Perspectives*, 2014, 4 (2), 240–246.
- McGranahan, Gordon and Frank Murray**, “Air Pollution and Health in Rapidly Developing Countries,” 2003.
- McKenna, Benjamin, David L. Dickinson, Henry J. Orff, and Sean Drummond**, “The Effects of One-Night Sleep Deprivation on Known-Risk and Ambiguous-Risk Decisions,” *Journal of Sleep Research*, 2007, 16 (3), 245–252.
- Mehdi, Mohammed Raza, Minho Kim, Jeong Chang Seong, and Mudassar Hassan Arsalan**, “Spatio-temporal Patterns of Road Traffic Noise Pollution in Karachi, Pakistan,” *Environment International*, 2011, 37 (1), 97–104.
- Miller, Earl K. and Jonathan D. Cohen**, “An Integrative Theory of Prefrontal Cortex Function,” *Annual Review of Neuroscience*, 2001, 24 (1), 167–202.
- Miller, George A.**, “The Magic Number Seven, Plus or Minus Two: Some Limits on Our Capacity for Processing Information,” *Psychological Review*, 1956, 63 (2), 81–97.
- Mirrlees, James A.**, *A Pure Theory of Underdeveloped Economies, Using a Relationship Between Consumption and Productivity*, New Haven, CT: Yale University Press, 1975.
- Mischel, Walter, Yuichi Shoda, and Monica L. Rodriguez**, “Delay of Gratification in Children,” *Science*, 1989, 244 (4907), 933–938.
- Miyake, Akira, Naomi P. Friedman, Michael J. Emerson, Alexander H. Witzki, Amy Howerter, and Tor D. Wager**, “The Unity and Diversity of Executive Functions and Their Contributions to Complex ‘Frontal Lobe’ Tasks: A Latent Variable Analysis,” *Cognitive Psychology*, 2000, 41 (1), 49–100.
- Mondria, Jordi**, “Portfolio Choice, Attention Allocation, and Price Comovement,” *Journal of Economic Theory*, 2010, 145 (5), 1837–1864.
- Moriarty, Orla, Brain E. McGuire, and David P. Finn**, “The Effect of Pain on Cognitive Function: A Review of Clinical and Preclinical Research,” *Progress in Neurobiology*, 2011, 93 (3), 385–404.
- Mullainathan, Sendhil**, “A Memory-Based Model of Bounded Rationality,” *Quarterly Journal of Economics*, 2002, 117 (3), 735–774.
- and **Eldar Shafir**, *Scarcity: Why Having Too Little Means So Much*, New York: Henry Holt, 2013.
- Mullane, Jennifer C., Penny V. Corkum, Raymond M. Klein, and Elizabeth McLaughlin**, “Interference Control in Children With and Without ADHD: A Systematic Review of Flanker and Simon Task Performance,” *Child Neuropsychology*, 2009, 15 (4), 321–342.
- Munakata, Yuko, Seth A. Herd, Christopher H. Chatham, Brendan E. Depue, Marie T. Banich, and Randall C. O’Reilly**, “A Unified Framework for Inhibitory Control,” *Trends in Cognitive Science*, 2011, 15 (10), 453–459.
- Muraven, Mark and Roy F. Baumeister**, “Self-Regulation and Depletion of Limited Resources: Does Self-Control Resemble a Muscle?,” *Psychological Bulletin*, 2000, 126 (2), 247–259.
- , **Dianne M. Tice, and Roy Baumeister**, “Self-Control as a Limited Resource: Regulatory Depletion Patterns,” *Journal of Personality and Social Psychology*, 1998, 74 (3), 774–789.
- Murnane, Richard J., John B. Willett, and Frank Levy**, “The Growing Importance of Cognitive Skills in Wage Determination,” *Review of Economics and Statistics*, 1995, 2, 251–266.
- Nes, Lise S., Abbey R. Roach, and Suzanne C. Segerstrom**, “Executive Functions, Self-Regulation, and Chronic Pain: A Review,” *Annals of Behavioral Medicine*, 2009, 37 (2), 173–183.

- Nideffer, Robert M.**, “Test of Attentional and Interpersonal Style,” *Journal of Personality and Social Psychology*, 1976, *34*, 394–404.
- Nuland, Sherwin B.**, *The Doctors’ Plague: Germs, Childbed Fever, and the Strange Story of Ignac Semmelweis*, New York: W. W. Norton., 2004.
- Okuda, Shawn M., Mark A. Runco, and Dale E. Berger**, “Creativity and the Finding and Solving of Real-World Problems,” *Journal of Psychoeducational Assessment*, 1991, *9* (1), 45–53.
- Oyedepo, Olayinka S. and Abdullahi A. Saadu**, “A Comparative Study of Noise Pollution Levels in Some Selected Areas in Ilorin Metropolis, Nigeria,” *Environmental Monitoring and Assessment*, 2009, *158*, 155–167.
- Ozer, Emily, Lia Fernald, Ann Weber, Emily Flynn, and Tyler VanderWeele**, “Does Alleviating Poverty Affect Mothers’ Depressive Symptoms? A Quasi-Experimental Investigation of Mexico’s Oportunidades Programme,” *International Journal of Epidemiology*, 2011, *40* (6), 1565–1576.
- O’Donoghue, Ted and Matthew Rabin**, “Doing it Now or Later,” *American Economic Review*, 1999, *89* (1), 103–124.
- and —, “Choice and Procrastination,” *Quarterly Journal of Economics*, 2001, *116* (1), 121–160.
- Pashler, Harold**, *The Psychology of Attention*, Cambridge, MA: MIT Press, 1998.
- Patel, Nirav P., Michael A. Grandner, Dawei Xie, Charles C. Branas, and Nalaka Gooneratne**, “‘Sleep Disparity’ in the Population: Poor Sleep Quality is Strongly Associated with Poverty and Ethnicity,” *BMC Public Health*, 2010, *10*, 1–11.
- (PEBL), Psychology Experiment Building Language**, “Berg’s Card Sorting Test,” [http://pebl.sourceforge.net/wiki/index.php/Berg's\\_Card\\_Sorting\\_Test](http://pebl.sourceforge.net/wiki/index.php/Berg's_Card_Sorting_Test) 2008–2010.
- Pechmann, Cornelia and Tim Silk**, “Policy and Research Related to Consumer Rebates: A Comprehensive Review,” *Journal of Public Policy & Marketing*, 2013, *32* (2), 250–270.
- Peterson, Steven and Michael I. Posner**, “The Attention System of the Human Brain: 20 Years After,” *Annual Review of Neuroscience*, 2012, *35* (1), 73–89.
- Petrides, Michael and Brenda Milner**, “Deficits on Subject-Ordered Tasks After Frontal- and Temporal-Lobe Lesions in Man,” *Neuropsychologia*, 1982, *20*, 249–262.
- , **Bessie Alivisatos, Alan C. Evans, and Ernst Meyer**, “Dissociation of Human Mid-Dorsolateral from Posterior Dorsolateral Frontal Cortex in Memory Processing,” *Proceedings of the National Academy of Sciences USA (PNAS)*, 1993, *90*, 873–877.
- Phelps, Edmund S. and Robert A. Pollak**, “On Second-Best National Saving and Game-Equilibrium Growth,” *Review of Economic Studies*, 1968, *35* (2), 185–199.
- Phelps, Elizabeth A.**, “Emotion and Cognition: Insights from Studies of the Human Amygdala,” *Annual Review of Psychology*, 2006, *57* (1), 27–53.
- Philibert, Ingrid**, “Sleep Loss and Performance in Residents and Nonphysicians: A Meta-Analytic Examination,” *Sleep*, 2005, *28* (11), 1392–1402.
- Poleshuck, Ellen L. and Carmen R. Green**, “Socioeconomic Disadvantage and Pain,” *Pain*, 2008, *136*, 235–238.
- Pop-Eleches, Cristian, Harsha Thirumurthy, James P. Habyarimana, Joshua G. Zivin, Markus P. Goldstein, Damien de Walque, Leslie MacKeen, Jessica Haberer, Sylvester Kimaiyo, John Sidle, Duncan Ngare, and David R. Bangsberg**, “Mobile Phone Technologies Improve Adherence to Antiretroviral Treatment in a Resource-Limited Setting: A Randomized Controlled Trial of Text Message Reminders,” *AIDS*, 2011, *25* (6), 825–834.

- Pope, C. Arden**, “Epidemiology of Fine Particular Air Pollution and Human Health: Biologic Mechanisms and Who’s at Risk?,” *Environmental Health Perspectives*, 2000, 108 (4), 713–723.
- Porcelli, Anthony J. and Mauricio R. Delgado**, “Acute Stress Modulates Risk Taking in Financial Decision Making,” *Psychological Science*, 2009, 20 (3), 278–283.
- Power, Melinda C., Marc G. Weisskopf, Stacey E. Alexeeff, Brent A. Coull, Avron Spiro III, and Joel Schwartz**, “Traffic-Related Air Pollution and Cognitive Function in a Cohort of Older Men,” *Environmental Health Perspectives*, 2011, 119 (5), 682–687.
- Prabhakaran, Vivek, Jennifer A. L. Smith, John E. Desmond, Gary H. Glover, and John D. E. Gabrieli**, “Neural Substrates of Fluid Reasoning: An fMRI Study of Neocortical Activation during Performance of the Raven’s Progressive Matrices Test,” *Cognitive Psychology*, 1997, 33 (1), 43–63.
- Pratt, Travis C. and Francis T. Cullen**, “The Empirical Status of Gottfredson and Hirschi’s General Theory of Crime: A Meta-Analysis,” *Criminology*, 2000, 38 (3), 931–964.
- Psacharopoulos, George and Eduardo Velez**, “Does Training Pay Independent of Education? Some Evidence from Colombia,” *International Journal of Educational Research*, 1992, 17 (6), 629–643.
- Radakovic, Sonja S., Jelena Maric, Maja Surbatovic, Slavica Radjen, Elka Stefanova, Nebojsa Stankovic, and Nikola Filipovic**, “Effects of Acclimation on Cognitive Performance in Soldiers During Exertional Heat Stress,” *Military Medicine*, 2007, 172 (2), 133–136.
- Raven, John C.**, *Mental Tests Used in Genetic Studies: The Performance of Related Individuals on Tests Mainly Educative and Mainly Reproductive*, Master’s Thesis, University of London, 1936.
- , “The Raven’s Progressive Matrices: Change and Stability over Culture and Time,” *Cognitive Psychology*, 2000, 41 (1), 1–48.
- Robertson, Ian H., Tom Manly, Jackie Andrade, Bart T. Baddeley, and Jenny Yiend**, “Oops!’: Performance Correlates of Everyday Attentional Failures in Traumatic Brain Injured and Normal Subjects,” *Neuropsychologia*, 1997, 35 (6), 747–758.
- Roehrs, Timothy, Lori Merlotti, Nancie Petrucelli, Edward Stepanski, and Thomas Roth**, “Experimental Sleep Fragmentation,” *Sleep*, 1994, 17 (5), 438–443.
- Rothbart, Mary K. and Michael I. Posner**, “Temperament and the Development of Self-Regulation,” in Lawrence C. Hartlage and Cathy F. Tezrow, eds., *The Neuropsychology of Individual Differences: A Developmental Perspective*, Springer US, 1985, pp. 93–123.
- Runco, Mark A. and Shawn M. Okuda**, “The Instructional Enhancement of the Flexibility and Originality Scores of Divergent Thinking Tests,” *Applied Cognitive Psychology*, 1991, 5 (5), 435–551.
- Sachs, Jeffrey**, *The End of Poverty: Economic Possibilities for Our Time*, New York, N.Y.: Penguin, 2005.
- , “The Case for Aid,” *Foreign Policy*, 2014.
- Sadeh, Avi, Reut Gruber, and Amiram Raviv**, “Sleep, Neurobehavioral Functioning, and Behavior Problems in School-Age Children,” *Child Development*, 2002, 73 (2), 405–417.
- Saridjana, Nathalie S., Anja C. Huizink, Jitske A. Koetsier, Vincent W. Jaddoe, Johan P. Mackenbach, Albert Hofman, Clemens Kirschbaum, Frank C. Verhulst, and Henning Tiemeier**, “Do Social Disadvantage and Early Family Adversity Affect the Diurnal Cortisol Rhythm in Infants? The Generation R Study,” *Hormones and Behavior*, 2010, 57 (2), 247–254.
- Schilbach, Frank**, “Alcohol and Self-Control: A Field Experiment in India,” *mimeo*, 2017.
- , **Heather Schofield, and Sendhil Mullainathan**, “The Psychological Lives of the Poor,” *American Economic Review Papers & Proceedings*, 2016, 106 (5), 435–440.

- Schofield, Heather**, “The Economic Costs of Low Caloric Intake: Evidence from India,” *mimeo*, 2014.
- Schwartzstein, Joshua**, “Selective Attention and Learning,” *Journal of the European Economic Association*, 2014, *12* (6), 1423–1452.
- Scott, Jonathon P. R., Lars R. McNaughton, and Remco C. J. Polman**, “Effects of Sleep Deprivation and Exercise on Cognitive, Motor Performance, and Mood,” *Physiology and Behavior*, 2006, *87* (2), 396–408.
- Seaton, Anthony, William MacNee, Ken Donaldson, and David Godden**, “Particulate Air Pollution and Acute Health Effects,” *The Lancet*, 1995, *345* (8943), 176–178.
- Sherrod, Drury R.**, “Crowding, Perceived Control, and Behavioral Aftereffects,” *Journal of Applied Social Psychology*, 1974, *4* (2), 171–186.
- Shiv, Baba and Alexander Fedorikhin**, “Heart and Mind in Conflict: The Interplay of Affect and Cognition in Consumer Decision Making,” *Journal of Consumer Research*, 1999, *26* (3), 278–292.
- Simmons, Shona E., Brian K. Saxby, Francis P. McGlone, and David A. Jones**, “The Effect of Passive Heating and Head Cooling on Perception, Cardiovascular Function and Cognitive Performance in the Heat,” *European Journal of Applied Physiology*, 2008, *104* (2), 271–280.
- Sims, Christopher A.**, “Stickiness,” *Carnegie-Rochester Conference Series On Public Policy*, 1998, *49* (1), 317–356.
- , “Implications of Rational Inattention,” *Journal of Monetary Economics*, 2003, *50*, 665–690.
- , “Rational Inattention: Beyond the Linear-Quadratic Case,” *American Economic Review Papers and Proceedings*, 2006, *96* (2), 158–163.
- Sippel, Reinhard**, “An Experiment on the Pure Theory of Consumer’s Behaviour,” *Economic Journal*, 1997, *107* (444), 1431–1444.
- Stansfeld, Stephen A., Birgitta Berglund, Charlotte Clark, Isabel Lopez-Barrio, Peter Fischer, Evy Ohrstrom, Mary M. Haines, J. Head, Staffan Hygge, Irene van Kamp, and Bernard F. Berry**, “Aircraft and Road Traffic Noise and Children’s Cognition and Health: A Cross-National Study,” *Lancet*, 2005, *365* (9475), 1942–1949.
- Steele, Claude M. and Robert A. Josephs**, “Alcohol Myopia: Its Prized and Dangerous Effects,” *American Psychologist*, 1990, *45* (8), 921–933.
- Sternberg, Robert J. and Karin Sternberg**, *Cognitive Psychology*, 6th ed., Boston: Cengage Learning, 2011.
- Stiglitz, Joseph E.**, “The Efficiency Wage Hypothesis, Surplus Labour, and the Distribution of Income in LDCs,” *Oxford Economic Papers*, 1976, *28* (2), 185–207.
- Stroop, John Ridley**, “Studies of Interference in Serial Verbal Reactions,” *Journal of Experimental Psychology*, 1935, *18* (6), 643–662.
- Strotz, Robert**, “Myopia and Inconsistency in Dynamic Utility Maximization,” *Review of Economic Studies*, 1956, *23* (3), 165–180.
- Stuss, Donald T. and Michael P. Alexander**, “Executive Functions and the Frontal Lobes: A Conceptual View,” *Psychological Research*, 2000, *63* (1), 289–298.
- Suchy, Yana**, “Executive Functioning: Overview, Assessment, and Research Issues for Non-Neuropsychologists,” *Annals of Behavioral Medicine*, 2009, *37* (2), 106–116.
- Szalma, James L. and Peter A. Hancock**, “Noise Effects on Human Performance: A Meta-Analytic Synthesis,” *Psychological Bulletin*, 2011, *137* (4), 682–707.

- Tchanturia, Kate, Helen Davies, Marion Roberts, Amy Harrison, Michiko Nakazato, Ulrike Schmidt, Janet Treasure, and Robin Morris**, “Poor Cognitive Flexibility in Eating Disorders: Examining the Evidence Using the Wisconsin Card Sorting Task,” *PLOS ONE*, 2012, 7 (1), e28331.
- Thaler, Richard and Hersh M. Shefrin**, “An Economic Theory of Self-Control,” *Journal of Political Economy*, 1981, 89 (2), 392–406.
- Thurston, Becky J. and Mark A. Runco**, “Flexibility,” in Mark A. Runco and Steven R. Pritzker, eds., *Encyclopedia of Creativity*, San Diego, CA: Academic Press, 1999, pp. 729–731.
- Torrance, E. Paul**, *Torrance Tests of Creative Thinking: Norms and Technical Manual*, Bensenville, IL: Scholastic Test Services, 1974.
- Treisman, Anne M. and Garry Gelade**, “A Feature-Integration Theory of Attention,” *Cognitive Psychology*, 1980, 12, 97–136.
- Tzivian, Lilian, Angela Winkler, Martha Dlugaj, Tamara Schikowski, Mohammad Vossoughi, Kateryna Fuks, Gudrun Weinmayr, and Barbara Hoffmann**, “Effect of Long-Term Outdoor Air Pollution and Noise on Cognitive and Psychological Functions in Adults,” *International Journal of Hygiene and Environmental Health*, 2015, 218 (1), 1–11.
- Unterrainer, Josef M., Benjamin Rahm, Christoph P. Kaller, Rainer Leonhart, C. Meier C. Müller K. Quiske K. Hoppe-Seyler, and U. Halsband**, “Planning Abilities and the Tower of London: Is this Task Measuring a Discrete Cognitive Function?,” *Journal of Clinical and Experimental Neuropsychology*, 2004, 26 (6), 846–856.
- US Army Institute of Environmental Medicine**, *Nutritional Status and Physical and Mental Performance of Special Operations Soldiers Consuming the Ration, Lightweight, or the Meal, Ready-to-eat Military Field Ration During a 30-day Field Training Exercise* 1987.
- USDOT**, “National Motor Vehicle Crash Causation Survey,” (*US Department of Transportation*) *National Highway Traffic Safety Administration*, 2008, *DOT HS 811 059*, 1–31.
- Van Dongen, Greg M., Janet M. Mullington, and David F. Dinges**, “The Cumulative Cost of Additional Wakefulness: Dose-Response Effects on Neurobehavioral Functions and Sleep Physiology From Chronic Sleep Restriction and Total Sleep Deprivation,” *Sleep*, 2003, 26 (2), 117–126.
- Van Nieuwerburgh, Stijn and Laura Veldkamp**, “Information Immobility and the Home Bias Puzzle,” *Journal of Finance*, 2009, 64 (3), 1187–1215.
- Vervloet, Marcia, Annemiek J. Linn, Julia C. M. van Weert, Dinny H. de Bakker, Marcel L. Bouvy, and Liset van Dijk**, “The Effectiveness of Interventions Using Electronic Reminders to Improve Adherence to Chronic Medication: A Systematic Review of the Literature,” *Journal of the American Medical Informatics Association*, 2012, 19, 696–704.
- Vogl, Tom S.**, “Height, Skills, and Labor Market Outcomes in Mexico,” *Journal of Development Economics*, 2014, 107, 84–96.
- von Hippel, William and Karen Gonsalkorale**, “‘That is Bloody Revolting!’ – Inhibitory Control of Thoughts Better Left Unsaid,” *Psychological Science*, 2005, 16 (7), 497–500.
- Wachtel, Paul L.**, “Conceptions of Broad and Narrow Attention,” *Psychological Bulletin*, 1976, 68 (6), 417–429.
- Ward, Andrew and Traci Mann**, “Don’t Mind if I Do: Disinhibited Eating Under Cognitive Load,” *Journal of Personality and Social Psychology*, 2000, 78 (4), 753–763.
- Wechsler, David**, “Wechsler Adult Intelligence Scale (4th Ed.),” Psychological Corporation 2008. San Antonio, TX.

- Weuve, Jennifer, Robin C. Puett, Joel Schwartz, Jeff D. Yanosky, Francine Laden, and Francine Grodstein**, “Exposure to Particulate Air Pollution and Cognitive Decline in Older Women,” *Archives of Internal Medicine*, 2012, 172 (3), 219–227.
- WHO**, *World Health Report 2001: Mental Health: New Understanding, New Hope*, Geneva: World Health Organization, 2001.
- Wiebe, Sandra A., Angela F. Lukowski, and Patricia J. Bauer**, “Sequence Imitation and Reaching Measures of Executive Control: A Longitudinal Examination in the Second Year of Life,” *Developmental Neuropsychology*, 2010, 35, 522–538.
- Woodford, Michael**, “Inattentive Valuation and Reference-Dependent Choice,” 2012. mimeo.
- World Bank**, *World Development Indicators*, World Bank: Washington D.C., 2015.
- World Health Organization**, “Seven Million Premature Deaths Annually Linked to Air Pollution,” <http://www.who.int/mediacentre/news/releases/2014/air-pollution/en/> 2014. Accessed: 2016-09-05.
- , “Fact Sheet on Depression,” <http://www.who.int/mediacentre/factsheets/fs369/en/> 2016. Accessed: 2016-09-05.
- Yates, Frances A.**, *The Art of Memory*, Chicago, IL: University of Chicago Press, 1966.
- Zannin, Paulo Henrique Trombetta, Fabiano Belisário Diniz, and Wiliam Alves Barbosa**, “Environmental Noise Pollution in the City of Curitiba, Brazil,” *Applied Acoustics*, 2002, 63 (4), 351–358.