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ADVANCING THEORIZING ABOUT FAST-AND-SLOW THINKING

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ABSTRACT

Human reasoning is often conceived as an interplay between a more intuitive and deliberate thought process. In the last 50 years, influential fast-and-slow dual process models that capitalize on this distinction have been used to account for numerous phenomena—from logical reasoning biases, over prosocial behavior, to moral decision-making. The present paper clarifies that despite the popularity, critical assumptions are poorly conceived. My critique focuses on two interconnected foundational issues: the exclusivity and switch feature. The exclusivity feature refers to the tendency to conceive intuition and deliberation as generating unique responses such that one type of response is assumed to be beyond the capability of the fast-intuitive processing mode. I review the empirical evidence in key fields and show that there is no solid ground for such exclusivity. The switch feature concerns the mechanism by which a reasoner can decide to shift between more intuitive and deliberate processing. I present an overview of leading switch accounts and show that they are conceptually problematic—precisely because they presuppose exclusivity. I build on these insights to sketch the groundwork for a more viable dual process architecture and illustrate how it can set a new research agenda to advance the field in the coming years.

Keywords: Dual process; Intuition; Deliberation; Heuristics; Thinking; Reasoning; Decision-Making

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Short abstract: Influential fast-and-slow dual process models that capitalize on the distinction between more intuitive and deliberate thought processes have become increasingly popular in psychology, economics, philosophy, and related fields. This target paper clarifies that despite the popularity there is little empirical and conceptual support for foundational assumptions concerning the capabilities of the

fast-intuitive system and the mechanism that allows us to switch between fast-and-slow thinking. The

paper presents a more viable dual process architecture and illustrates how it can set a new research

agenda to advance our theorizing.

ADVANCING THEORIZING ABOUT FAST-AND-SLOW THINKING

Sometimes thinking can be hard. As majestically portrayed in Rodin's "The Thinker" sculpture, in these cases it will take us laborious inferencing to arrive at a problem solution. At other times, however, thinking can be surprisingly easy. If you ask an educated adult how much half of $100 is, in what city the Statue of Liberty is located, or whether a toddler should be allowed to drink beer, they can answer in a split second. At least since antiquity, such duality in our mental experiences has led to the idea that there are two types of thinking, one that is fast and effortless, and one that is slower and requires more effort (Frankish & Evans, 2009; Pennycook, 2017). This distinction between what is often referred to as a more intuitive and deliberate mode of cognitive processing—or the nowadays more popular "System 1" and "System 2" labels—lies at the heart of the influential "fast-and-slow" dual process view that has been prominent in research on human thinking since the 1960s (Evans, 2008; Kahneman, 2011).

It is presumably hard to overestimate the popularity of dual process models in current-day psychology, economics, philosophy, and related disciplines (Chater & Schwarzlose, 2016; Melnikoff & Bargh, 2018). As De Neys (2021) clarified, they have been applied in a very wide range of fields including research on thinking biases (Evans, 2002; Kahneman, 2011), morality (Greene & Haidt, 2002), human cooperation (Rand et al., 2012), religiosity (Gervais & Norenzayan, 2012), social cognition (Chaiken & Trope, 1999), management science (Achtziger & Alós-Ferrer, 2014), medical diagnosis (Djulbegovic et al., 2012), time perception (Hoerl & McCormack, 2019), health behavior (Hofmann et al., 2008), theory of mind (Wiesmann et al., 2020), intelligence (Kaufman, 2011), creativity (Barr et al., 2015), fake news susceptibility (Bago et al., 2020), and even machine thinking (Bonnefon & Rahwan, 2020). In addition, the dual process framework is regularly featured in the popular media (Lemire, 2021; Shefrin, 2013; Tett, 2021) and has inspired policy recommendations on topics ranging from economic development (World Bank Group, 2015), over carbon emissions (Beattie, 2012), to the Corona-virus pandemic (Sunstein, 2020).

The present paper tries to clarify that despite the popularity, a lot of the current day use of dual process models is poorly conceived. Foundational assumptions are empirically questionable and/or conceptually problematic. I argue that a core underlying problem is the exclusivity feature or the tendency to conceive intuition and deliberation as generating unique responses such that one type of response is exclusively tied to deliberation and is assumed to be beyond the reach of the intuitive system. For example, influential dual process accounts of biases in logical reasoning rely on exclusivity when attributing flawed thinking to a failure to correct an intuitively generated with a deliberate response (Evans & Stanovich, 2013; Kahneman, 2011). Likewise, dual process accounts of moral and prosocial reasoning rely on it to explain how intuitive emotional responses prevent us from taking the consequences of our actions into account (e.g., Greene, 2013; Greene & Haidt, 2002) or to clarify why people behave selfishly rather than cooperate (e.g., Rand et al., 2012). In the first section of the paper I review the empirical evidence in key fields and will show that although the exclusivity assumption might be appealing, there is no solid ground for it.

In a second section, I focus on a conceptual consequence of the exclusivity feature. Any dual process model needs a switch mechanism that allows us to shift between intuitive and deliberate processing. Given that we can use two types of reasoning, there might be cases in which either one will be more or less beneficial. But how do we know that we can rely on an intuitively cued problem solution or need to engage in costly further deliberation? And when do we switch back to the intuitive processing mode once we start deliberating? I review popular traditional dual process accounts for the switch issue and show that they are conceptually problematic—precisely because they presuppose exclusivity. In a third section, I build on this insight and recent theoretical advances to sketch a more viable general dual process architecture that can serve as theoretical groundwork to build future dual process models in various fields. Finally, in a closing section, I use the model to identify new and outstanding questions that should advance the field in the coming years.

Before moving to the main sections, it might be a good idea to clarify my use of the nomenclature. I adopt the fast-and-slow dual process label as a general header to refer to models that posit an interaction between intuitive and deliberate reasoning processes. Dual process theories are sometimes opposed to single model theories. Both single and dual process theories focus on the interaction between intuition and deliberation. But they differ concerning the question as to whether the difference between the two types of processing should be conceived as merely quantitative or qualitative in nature (see De Neys, 2021, for a recent review). My argument here is completely orthogonal to this issue (see section 4.7). My criticism and recommendations equally apply to single and dual process models. I stick to the dual process label simply because it is more widely adopted.

There are also a wide range of labels that are being used to refer to the two types of reasoning that are posited by dual process models (e.g., Type 1/2, System 1/2, Heuristic/Analytic thinking, Associative/Rule-based thinking, Automatic/Reflective, Intuitive/Deliberate, etc.). I will stick here to the traditional labels "intuitive" and "deliberate" processing as well as the nowadays more popular "System 1" and "System 2" processing. The system term can sometimes refer to a specific subtype of dual process models (Gawronski & Creighton, 2013). Here it is used in a generic, general sense. As in Kahneman (2011), System 1 and 2 processing can be interpreted as synonyms for the type of effortless intuiting and effortful deliberating that are traditionally contrasted in dual process theories.

1. EXCLUSIVITY IN DUAL PROCESS MODELS

As briefly introduced, the exclusivity feature refers to the tendency to associate intuitive and deliberate processing with the computation of unique responses. System 1 is believed to be responsible for generating a response X and System 2 is responsible for generating an alternative response Y. Critically,

here is the underlying exclusivity: Generation of the alleged deliberate response is by definition believed to be beyond the capacity of the intuitive System 1.

This simple exclusive dichotomization is appealing. System 1 quickly provides us with one type of response. If we want to generate the alternative response, we will necessarily need to switch to effortful deliberation. By combining this with the human tendency to minimize cognitive effort ("cognitive miserliness", e.g., Stanovich & West, 2000) one has a seemingly simple account of a wide range of mental processes. To illustrate, below I sketch in more detail how popular dual process models in various fields are relying on the exclusivity assumption. I focus on the dual process model of logical, moral, and prosocial reasoning since these have been among the most influential applications and allow me to demonstrate the generality of the findings. I present a brief introduction of the paradigmatic model in each field and then move to a discussion of the empirical evidence.

1.1 LOGICAL, MORAL, AND PROSOCIAL DUAL PROCESS EXCLUSIVITY

1.1.1 Logical reasoning bias

One of the first fields in the cognitive sciences in which dual process models were popularized is research on "biases" in logical reasoning (e.g., Evans, 2016; Kahneman, 2000, 2011; Wason, 1960; Wason & Evans, 1975). Since the 1960s numerous studies started showing that people readily violate the most elementary logical, mathematical, or probabilistic rules when a task cues an intuitive response that conflicts with these principles[1].

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[1] I will use "logical" as a general header to refer to logical, probabilistic, and mathematical principles and reasoning.

For example, imagine that we have two trays with red and white marbles. There's a small tray with 10 marbles of which one is red. There is also a large tray holding 100 marbles of which 9 are red. You can draw one marble from either one of the trays. If the marble is red, you win a nice prize. Which tray should you draw from to maximize your chances of winning? From a logical point of view, it is clear that the small tray gives you a 10% chance of drawing a red marble (1/10) whereas the large tray gives you only a 9% (9/100) chance. However, people often prefer to draw from the large tray because they intuitively tend to use the absolute number of red marbles as a shortcut or "heuristic" to guide their inferences (Epstein, 1994). Obviously, there are indeed more red marbles in the large tray than in the small tray (i.e., 9 vs 1). In case there would be the same number of white marbles in both trays, the simple absolute number focus would lead to a correct judgment. However, in the problem in question, there are also a lot more white marbles in the large tray. If you take the ratio of red and white marbles into account it is crisp clear that you need to draw from the small tray. Unfortunately, the available evidence suggests that in situations in which an intuitive association cues a response that conflicts with more logical considerations (e.g., the role of denominators or ratios), people seem to neglect the logical principle and opt for the intuitively cued conclusion (Kahneman, 2011)[2]. Hence, our intuitions often seem to lead us astray and bias our judgment.

The dual process framework presents a simple and elegant explanation for the bias phenomenon (Evans, 2008; Kahneman, 2011). In general, dual process theorists have traditionally highlighted that taking logical principles into account typically requires demanding System 2 deliberation (e.g., Evans, 2002, 2008; Evans & Over, 1996; Kahneman, 2011; Stanovich & West, 2000). Because human reasoners have a strong tendency to minimize demanding computations, they will often refrain from engaging or completing the slow deliberate processing when mere intuitive processing has already cued a response

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[2] For a recent illustration consider the widespread mistaken believe that Covid-19 vaccines are unsafe because more vaccinated than unvaccinated people are hospitalized (neglecting that the group of vaccinated people is far larger in most Western countries, e.g., Devis, 2021)

(Evans & Stanovich, 2013; Kahneman, 2011). Consequently, most reasoners will simply stick to the intuitive response that quickly came to mind and fail to consider the logical implications. It will only be the few reasoners who have sufficient resources and motivation to complete the deliberate computations and override the initially generated intuitive response, who will manage to reason correctly and give the logical response (Stanovich & West, 2000).

This illustrates how the bias account critically relies on the exclusivity assumption. Taking logical principles in classic reasoning tasks into account is uniquely linked to deliberation. Because this is out of reach of the intuitive system, sound reasoning will require us to switch from System 1 to demanding System 2 processing—something that few will manage to accomplish. To avoid confusion, it is important to stress here that the exclusivity assumption does not entail that System 1 is always biased and System 2 always leads to correct answers. Dual process theorists have long argued against such a simplification (Evans, 2011; Evans & Stanovich, 2013). Clearly, nobody will disagree that educated adults can intuitively solve a problem such as "Is 9 more than 1?" or "How much is 2 + 2?". The hypothesis concerns situations in which the two systems are assumed to be generating conflicting responses. More generally, as any scientific theory, dual process models make their assertions within a specific application context. For the dual process model of logical reasoning, the application context concerns situations in which an intuitively cued problem solution conflicts with a logico-mathematical norm. The classic "Heuristics and Biases" tasks in the field (such as the earlier ratio bias problem with the two trays) all capitalize on such conflict and are designed such that they cue a salient conflicting intuitive heuristic response that is pitted against logical considerations. It is in such conflict cases that avoiding biased thinking is expected to require switching to System 2 deliberation.

1.1.2 Dual process model of moral reasoning

The influential dual process model of moral cognition focuses on situations in which utilitarian and deontological considerations lead to conflicting moral judgments (e.g., is it acceptable to sacrifice one human life to save five others?). From a utilitarian point of view, one focuses on the consequences of an action. Harming an individual can be judged acceptable if it prevents comparable harm to a greater number of people. One performs a cost-benefit analysis and chooses the greater good. Hence, from a utilitarian perspective, it can be morally acceptable to sacrifice someone's life to save others. Alternatively, the moral perspective of deontology focuses on the intrinsic nature of an action. Here harming someone is considered wrong regardless of its potential benefits. From a deontological point of view, sacrificing one life to save others is never acceptable. In a nutshell, the dual process model of moral reasoning (Greene, 2013; Greene & Haidt, 2002) has associated utilitarian judgments with deliberate System 2 processing and deontological judgments with intuitive System 1 processing. The core idea is that giving a utilitarian response to moral dilemmas requires that one engages in System 2 thinking and allocates cognitive resources to override an intuitively cued System 1 response that primes us not to harm others (Greene, 2007; Paxton, Ungar, & Greene, 2012). Hence, here too the exclusivity assumption is key: utilitarian reasoning is assumed to be out of reach of the intuitive system and requires a switch to costly effortful processing.

1.1.3 Dual process model of prosocial reasoning

Finally, the dual process model of prosocial reasoning or human cooperation focuses on situations in which self-interest can conflict with the group interest (e.g., get more money yourself or share more with others). Some authors have claimed that making prosocial choices requires deliberate System 2 control of our intuitive selfish impulses (e.g., DeWall et al., 2008; Knoch et al., 2006; Martinson et al., 2014). Alternatively, others have argued that System 1 cues prosocial choices and it is only after

deliberation that we will seek to maximize our self-interest (e.g., Rand, 2019; Rand et al., 2012; Sanfey et al., 2003). However, despite the differences concerning which behavior is assumed to be favored by deliberation and intuition, both views are built on the same underlying exclusive dual process logic: Intuition will favor one type of behavior whereas making the competing choice will require slow, deliberate System 2 processes to control and correct the initial intuitive impulse (Isler et al., 2021; Wills et al., 2020).

To be clear, just like the dual process model of logical reasoning, dual process models of prosocial (and moral) reasoning also have a specific application context. As with logical reasoning, this context concerns prototypical cases in which the two systems are assumed to be generating conflicting responses. For example, dual process models of prosocial choice focus on anonymous decision settings (i.e., the identity of the decision-maker and recipient are never revealed and they only interact one single time, e.g., Rand et al., 2012). Clearly, even models that posit that prosocial (vs selfish) decisions require System 2 processing would not dispute that the prosocial decision to share with one's offspring, for example, can be made completely intuitively. Similarly, the dual process model of moral reasoning focuses on moral dilemmas that cue a strong moral transgression (e.g., killing). In some cases, the deontological option might be so trivial (e.g., is it acceptable to tell a white lie to save 5 people?) that it will not give rise to a proper conflict. In these non-conflict cases it would not be expected that a utilitarian judgment necessarily requires System 2 processing (Greene et al., 2001).

Note that the empirical evidence I will review in the following section always concerns the prototypical test and application context that the dual process models traditionally envisaged. The fundamental problem I will raise is that—in contrast to widely publicized initial reports—even in these cherished prototypical contexts there is no solid empirical ground for the exclusivity assumption. For completeness, I start by discussing the traditional evidence that has been cited in support of the exclusivity assumption and then move on to a discussion of more recent counter-evidence.

1.2 EMPIRICAL EVIDENCE

Why have dual process models ever assumed the exclusivity feature? What empirical evidence was there to support it? The undisputed starting point here is that deliberation is defined as being more time and effort-demanding than System 1 processing. Hence, if the exclusivity assumption holds, one would expect that the alleged System 2 response will take longer than the intuitive System 1 response. Likewise, generation of the alleged System 2 response should be more likely among those higher in cognitive capacity (and motivation to use this capacity). This would be consistent with the idea that the alleged System 2 response indeed requires slow, effortful deliberation. The introduction of traditional dual process models in various fields has typically been accompanied by correlational studies that supported these predictions (Trémolière et al., 2019). For example, from logical, over moral, to prosocial reasoning, various studies showed that people who give the alleged deliberate response indeed tend to take more time to answer and score higher on standard cognitive ability/disposition tests than people who give the alleged intuitive response (e.g., De Neys, 2006a, 2006b; Greene et al., 2001; Moore et al., 2008; Paxton et al., 2011; Rand et al.,2012; Stanovich & West, 1998, 2000).

In addition to correlational studies, dual process proponents have also pointed to experimental evidence coming from cognitive constraint paradigms in which people are forced to respond under time-pressure or secondary cognitive load (e.g., concurrent memorization). The rationale here is again that deliberation requires more time and cognitive resources than System 1 processing. Consequently, depriving people of these resources by forcing them to respond quickly or while they are performing a capacity demanding secondary task, should make it less likely that the exclusive System 2 response can be generated. Across logical, moral, and prosocial reasoning studies, dual process proponents have indeed shown that these constraints often hinder the production of the alleged deliberate responses (e.g.,

Conway & Gawronski, 2013; De Neys, 2006b; Evans & Curtis-Holmes, 2005; Rand et al., 2012, 2014; Trémolière et al., 2012). In sum, the point of this short overview is that dual process theorists have not made their claims in an empirical vacuum. There are past findings that are consistent with the exclusivity assumption.

However, a first problem is that over the years these initial positive findings have not always been confirmed. Recent studies and large-scale replication efforts have pointed to negative findings and null-effects (e.g., Baron, 2017; Baron & Gurcay, 2017; Bialek & De Neys, 2017; Bouwmeester et al., 2017; Grossman & Van der Weele, 2017; Gurcay & Baron, 2017; Robison & Unsworth, 2017; Tinghög et al., 2016). Available meta-analyses suggest that if there is an effect, it is very small. For example, Rand (2019) found that experimental manipulations that limited deliberation (and/or favored intuition) led on average to an increase of 3.1% prosocial choices (see also Kvarven et al., 2020). Likewise, in one of the largest studies to date on reasoning bias, Lawson et al. (2020) found that experimental constraints on a wide range of classic bias tasks led on average to a 9.4% performance decrease (from 62% to 52% accuracy). As Lawson et al. put it, this suggests that the alleged deliberate response can often be generated intuitively. Even when deliberation is prevented, the alleged deliberate response is still frequently observed. Hence, although there is indeed some evidence that deliberation pushes responses in the expected dual process direction (e.g., more alleged System 2 responses) it is becoming clear—contra the exclusivity assumption—that generation of the alleged unique System 2 response does often not require deliberation and is not uniquely tied to System 2.

Critically, studies adopting new experimental paradigms have presented further direct evidence against the exclusivity assumption (De Neys & Pennycook, 2019). Perhaps most illustrative are studies with the two-response paradigm (Thompson et al., 2011). In this paradigm, participants are asked to give two consecutive answers to a problem. First, they have to answer as quickly as possible with the first response that comes to mind. Immediately afterward, they are shown the problem again and can take all

the time they want to reflect on it and give a final answer. To make maximally sure that the initial answer is generated intuitively, it typically has to be generated under time-pressure and/or cognitive load (Bago & De Neys, 2017; Newman et al., 2017). As with the cognitive constraints paradigms above, the rationale is that this will deprive participants of the very resources they need to engage in proper deliberation. Consequently, the paradigm gives us a good indication of which response can be generated intuitively and deliberately (Bago & De Neys, 2017, 2020; Raoelison et al., 2020; Thompson et al., 2011).

Under the exclusivity assumption, it is expected that people who generate the alleged System 2 response as their final response will initially have generated the System 1 response in the first, intuitive response stage. That is, in the prototypical dual process test situation in which both systems are expected to cue a conflicting response, it is assumed that slow deliberation will need to correct and override the intuitively generated fast System 1 response. For example, in a classic bias task, it is hypothesized that people will initially generate the biased System 1 response but that sound reasoners will consequently be able to correct this once they are allowed to take the time to deliberate. To illustrate, take the infamous Cognitive Reflection Test (e.g., "A bat and ball cost $1.10 together. The bat costs $1 more than the ball. How much does the ball cost?", Frederick, 2005). Here it is expected that sound reasoners will reason correctly precisely because they will take the time to reflect on their first hunch ("10 cents") which allows them to realize that it is incorrect. It is this demanding deliberation or "reflection" that is assumed to be crucial for generation of the correct answer ("5 cents"). However, two-response studies with these and other classic bias tasks have shown that this is typically not the case. Those reasoners who give the correct response as their final response after deliberation often already generate this same correct response at the initial, intuitive response stage (e.g., Bago & De Neys, 2017, 2019a; Buric & Konradova, 2021; Buric & Srol, 2020; Dujmovic et al., 2021; Raoelison et al., 2020; Thompson & Johnson, 2014). Hence, sound reasoners do not need to deliberate to correct an initial response, their initial response is already correct.

This same pattern has been observed during moral (Bago & De Neys, 2019b; Vega et al., 2021) and prosocial (Bago et al., 2021; Kessler et al., 2017) reasoning. People who generate the alleged System 2 response (e.g., utilitarian moral decision or selfish prosocial choice) typically already generate this same decision as their intuitive response in the initial response stage. Hence, pace the exclusivity assumption, the alleged System 2 response is often already generated intuitively.

Related evidence comes from studies with the conflict detection paradigm (e.g., De Neys & Pennycook, 2019). This paradigm focuses specifically on those participants who give the alleged System 1 response. The studies contrast people's processing of classic prototypical problems (i.e., "conflict problems") in which System 1 and 2 are expected to cue different responses and control "no-conflict" problems in which both systems are expected to cue the same response. For example, in a logical reasoning task such as the introductory ratio bias problem, a control problem could be one in which participants have to choose between a small tray with one red marble and a large tray with 11 (instead of 9) red marbles. In this case both the absolute number of red marbles (9 vs 1) and the ratios (11/100 vs 1/10) favor the large tray. In a moral reasoning study, a no-conflict control problem could ask whether it is acceptable to kill 5 people to save the life of 1 person (instead of killing 1 to save 5). Both utilitarian and deontological considerations will converge here in that the action is not permissible.

By and large, conflict detection studies have found that on various processing measures, reasoners who give the alleged System 1 response typically show sensitivity to the presence of conflict with the alleged System 2 response. For example, they take longer and are less confident when solving classic "conflict" vs control "no-conflict" problems (e.g., Bialek & De Neys, 2016; Frey et al., 2017; Gangemi et al., 2015; Mata, 2020; Srol & De Neys, 2019; Vartanian et al., 2018; see De Neys, 2017, for a review but also Travers et al., 2016, or Mata et al., 2017, for negative findings). Hence, even people who give the alleged System 1 response seem to be processing the alleged System 2 response. Critically, this conflict sensitivity is also observed when potential System 2 processing is knocked out with experimental

constraints manipulations (e.g., Bago & De Neys, 2017; 2019b; Bialek & De Neys, 2017; Buric & Srol, 2020; Buric & Konradova, 2021; Johnson et al., 2016; Pennycook et al., 2014; Thompson & Johnson, 2014). In line with the two-response findings, this indicates that the alleged unique System 2 response is also being processed intuitively.

In sum, although the idea that intuitive and deliberate processing are cueing unique responses is appealing in its simplicity, taken together, the empirical evidence reviewed here indicates that there is no strong empirical ground for it. In the most influential dual process applications, the alleged System 2 response does not seem to be out of reach of the intuitive System 1. Rather than positing unique responses in System 1 and System 2, it appears that System 1 can often handle both responses.

To avoid confusion, it is important to stress here that the above conclusion does not argue against the idea that deliberation *can* lead to generation of the alleged system 2 response. For example, the meta-analyses I referred to often suggest that there is evidence for a small effect in the expected dual process direction (i.e., more alleged System 2 responses after deliberation). Also, the two-response data consistently indicate that there are cases in which an initial, intuitively generated response is replaced with the alleged System 2 response after deliberation. The point is that this is rare. More often than not, the alleged deliberate response tends to be generated intuitively. Exclusive deliberate generation of the alleged System 2 response seems to be the exception rather than the rule. This implies that any model in which generation of this response is exclusively or predominantly tied to the operation of the deliberate system will have poor empirical fit.

A possible general argument against the reviewed empirical evidence contra the exclusivity assumption is that we can never be sure that the study designs prevented all possible deliberation. For example, it might be that the two-response studies still allowed some minimal deliberation during the initial response generation. It might be this minimal deliberation that drives the generation of the "alleged" System 2 response during the initial response stage. Here it should be noted that the two-

response studies adopted the same constraint methodology and logic as the initial studies that were used to argue in favor of the exclusivity assumption. Moreover, whereas traditional studies used either time-pressure or load manipulations, the two-response studies have combined both to further restrict potential deliberate intrusion (e.g., Bago & De Neys, 2017). In addition, control studies indicate that making the constraints even more challenging by increasing the load and decreasing the deadlines typically does not alter the results (e.g., Bago & De Neys, 2017, 2019b; Bago et al., 2021), suggesting that deliberation was successfully minimized in the design. Nevertheless, the point still stands that no matter how challenging the test conditions might be, we can never be completely sure that participants did not deliberate. The problem here is that the dual process framework does not give us an unequivocal threshold (i.e., longer than x seconds or less than x amount of load implies deliberation) that allows us to universally demarcate intuition and deliberation (Bago & De Neys, 2019a; De Neys, 2021). Ultimately, this implies that exclusivity cannot be empirically falsified. As long one keeps on observing alleged System 2 responses under constraints, one can always argue that the constraints were not challenging enough. The general point is that the cognitive constraint evidence needs to be interpreted within practical, relative boundaries (Bago & De Neys, 2019a). In sum, although empirical evidence can question exclusivity and can point to a lack of strong supporting evidence, it can never rule it out completely. Therefore, in the next section, I will focus on a conceptual critique that underscores that positing exclusivity is fundamentally problematic for a dual process model.

2. THE SWITCH ISSUE

Although it might not be necessary to generate the alleged "System 2 response" per se, we sometimes clearly do engage in deliberation. Given that we can use two types of reasoning, there might be cases in which either one will be more or less beneficial. For example, in situations in which intuitive

and deliberate processing are expected to cue the same response (e.g., the "no-conflict" problems I referred to earlier), there is no need to waste precious resources by engaging in costly deliberation. But how do we know that we can rely on an intuitively cued problem solution or need to revert to deliberation? And when we do decide to engage in deliberation, at what point do we decide it is safe to switch back to the mere intuitive processing mode?

Of course, there are some situations in which this is straightforward. One concerns cases in which we are faced with an entirely new problem we haven't seen before and our intuitions are not cueing a response. Here, all we can do to arrive at an answer is to engage in deliberation. Likewise, there will be cases in which the decision is made for us. That is, in some situations we get external feedback that indicates that an intuitively cued response is problematic. Generally speaking, these are cases of expectancy violations. For example, imagine your superior told you that you are getting a new colleague named Sue. Given their name, you'd readily expect that Sue is female. If your officemate subsequently tells you that the new colleague is a man, you'll presumably be surprised. Your System 1 has built up an expectation that is not met in the face of feedback. This expectancy violation will cue deliberation (Did you mishear the name? Was your colleague mistaken? Are Sue's parents Johnny Cash fans[3]? Etc.). Unfortunately, the expectancy violation mechanism only works in case you're actually getting feedback. In many situations this will not be available or we want reasoners to operate (and avoid mistakes) without external supervision. Hence, reasoners need an internal mechanism that signals a need to switch between mere intuitive and deliberate processing.

My point is that traditional dual process models have failed to present a viable internal switch mechanism. Popular accounts are conceptually problematic and this can be directly tied to the exclusivity assumption. I'll clarify that as long as we posit exclusivity, it will always be hard for a dual process model to explain how reasoners can ever reliably determine whether there is a need to switch between intuitive

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[3] See the legendary Johnny Cash song "A boy named Sue" (Cash, 1969)

System 1 and deliberate System 2 processing. I start by giving an overview of the dominant traditional switch views to clearly illustrate the problem.

2.1 TRADITIONAL SWITCH ACCOUNTS

2.1.1 The conflict monitoring System 2

Dual process models are typically—what is being referred to as—"default-interventionist" in nature (Evans & Stanovich, 2013; Kahneman, 2011). This implies that they posit a serial processing architecture. The idea is that we rely on System 1 by default and only turn on the costly deliberate system to intervene when it is needed. It is this feature that brings about the switch question, of course. The traditional solution is to assume that System 2 is monitoring the output of System 1 and will be activated in case of conflict between the two systems (Kahneman, 2011; Stanovich & West, 2000). Hence, System 2 will intervene on System 1 whenever the System 1 output conflicts with more deliberate System 2 considerations. This idea is appealing in its simplicity. However, on second thought it is clear that it readily leads to a paradox (De Neys, 2012; Evans, 2019). To detect that our System 1 intuition conflicts with unique deliberate System 2 considerations, we would already need to engage System 2 first to compute the System 2 response. Unless we want to posit an all-knowing homunculus, System 2 cannot activate itself. Hence, the decision to activate System 2 cannot rely on the activation of System 2. The prototypical conflict monitoring System 2 account simply begs the question here (De Neys, 2012).

2.1.2 Low effort deliberation

A popular variant of the simple conflict monitoring System 2 position—or a workaround—is to posit that the monitoring relies on low-effort deliberation and not on full-fledged demanding System 2 processing (De Neys & Glumicic, 2008; Kahneman, 2011). Whenever System 1 is cueing a response it will be passed on to System 2 which is by default in this non-demanding, low effort mode. If the low effort deliberation detects a conflict between System 1 and 2 processing, it will trigger deeper, high-effort deliberation (De Neys & Glumicic, 2008; Kahneman, 2011). Unfortunately, this simply pushes the explanatory burden one step forward. Clearly, if the low-effort mode suffices to generate a response against which the intuitive response can be contrasted, there is no need to postulate a unique high-effort deliberation (and to assume that the alleged System 2 response can only be computed by those highest in cognitive capacity, for example). In this case, everyone—even those lowest in cognitive capacity— should be able to generate the non-demanding deliberate response and it should not be considered unique to System 2. However, in case we assume that generating the deliberate response does require proper demanding System 2 processing, we are back at square one and we cannot explain how the low-effort System 2 processing detects conflict with the high-effort deliberate response in the first place. Hence, although it might sound appealing, the low-effort deliberation position does not present a viable processing mechanism.

2.1.3 System 3

One of the core problems of the conflict monitoring System 2 account is that System 2 is assumed to both generate a unique deliberate response and monitor for conflict between System 1 and 2 to make the switch decision. It serves multiple functions: response generation and monitoring/switching. One suggested solution is to attribute the monitoring and switch decision to a third type of System or process (i.e., System 3 or Type 3 processing, e.g., Evans, 2009; Houdé, 2019). Hence, System 2 computes a

deliberate response and System 3 compares the output of System 1 and 2. System 3 itself operates automatically and does not require the limited cognitive resources that System 2 needs. In case System 3 detects an output conflict, it will intervene, call for more deliberation and block the System 1 response. However, this solution still begs the question and leads to an infinite regression. To decide whether the System 1 output conflicts with the System 2 output, System 2 needs to be activated to compute a response, of course. Even an automatically operating System 3 cannot know whether there is a conflict between System 1 and 2 without engaging System 2 first.

2.1.4 Parallel solution

A radically different solution to explain how we know that our intuition can be trusted or we need to engage in deliberation is to simply assume that System 1 and System 2 operate in parallel (Epstein, 1994; Sloman, 1996). In contrast to the dominant serial view, parallel dual process models assume that intuitive and deliberate thought processes are always activated simultaneously when we are faced with a reasoning problem. Hence, just like intuitive processing, System 2 is always on. We always activate both reasoning systems from the start. Consequently, we also do not need a mechanism to decide whether or not we need to engage in deliberation and switch System 2 on.

The key problem is that the parallel account throws out the cognitive advantage of a dual process model (De Neys, 2012). That is, nobody contests that System 1 will often converge with System 2 and can cue sound decisions. Hence, in these cases there is no need to burden our precious cognitive resources with demanding System 2 activation. Consequently, a parallel model will often be wasting scarce resources in situations where it is not needed. From a cognitive economy point of view, this is highly implausible. Furthermore, in case the parallel System 1 and 2 computations do lead to conflicting responses, the fast System 1 will need to wait until the slow System 2 has computed its response to

register the conflict and decide which response to favor. But if the fast System 1 always waits for System 2, we lose the capacity to reason and act fast. On the other hand, if the fast System 1 does not wait for System 2, how are we to know that the System 1 response is valid and does not conflict with System 2? Hence, just like its serial competitors, the parallel account leads to conceptual inconsistencies and fails to present a working processing account.

To avoid confusion, note that the problem for the parallel account is not the parallel activation of System 1 and 2 per se but the postulated *continuous* parallel activation of both systems. That is, the serial default-interventionist account also assumes that once System 2 is activated, System 1 remains activated and that the two systems will be running in parallel at this point. The key difference is that the serial model posits that there needs to be an initial phase in which people do not deliberate yet—and it is this feature that brings about the switch problem. One might be tempted to argue that a parallel model does not necessarily need to assume that System 2 is always on. When there is no longer a need for deliberation, System 2 could be switched off to avoid wasting resources and it may be turned on again whenever it is needed. But at this point, one will have re-introduced the switch issue and will need to explain how this decision is made. That is, such a "parallel" model throws out its conceptual advantage over the serial model (i.e., no need for a switch mechanism) and faces the same difficulties as its rivals.

Relatedly, one may argue that even if System 2 is always on, it doesn't always have to run to completion. Maybe it only provides some quick partial computations that suffice to generate a response and check whether it conflicts with the cued System 1 answer. Note that under this reading, the parallel model boils down to the low-effort-deliberation account (see 2.1.2 above) and will face the same problems: If low-effort or partial System 2 processing already allows generating an accurate proxy of the complete System 2 response, there is no need to assume that computation of the alleged unique System 2 response is demanding and necessarily requires time and effort. But if more extensive System 2 processing is necessary, it is not clear how the partial deliberations may ever reliably signal conflict.

2.1.5 Stuck-in-System-1 or No Switch account

Finally, a last alternative possibility is to assume that people do not detect there is a need to engage System 2 and always stay in System 1 mode. In this "no switch" model, reasoners simply never internally switch from System 1 to System 2 themselves. People can use System 2 but only in case System 1 does not cue a response or they are externally told to do so. Whenever System 1 cues a response they are bound to blindly rely on the intuitively cued problem solution. Hence, the account solves the switch question by positing that reasoners never switch. Such a model can explain why people often give the alleged System 1 response (e.g., why they are biased in the case of logical reasoning): They simply fail to detect there is a need to activate System 2 (e.g., Kahneman, 2011; Evans & Stanovich, 2013; Morewedge & Kahneman, 2010; Stanovich & West, 2000). Note that although the account might be questioned on empirical grounds (e.g., see the conflict detection findings in section 1), in contrast to the other accounts I reviewed it is at least conceptually coherent. It does not beg the question or introduce a homunculus. The problem, however, is that it only models half the story.

The "no switch " model allows us to account for the behavior of people who give the alleged System 1 response, but it turns a blind eye to those who do give the alleged System 2 response. Indeed, although it might be rarer, there are always reasoners who arrive at the alleged System 2 response themselves. In general, the fact that there are two types of responses is a key motivation to posit an (exclusive) dual process model in the first place. Hence, one still needs to explain how these "System 2" responders managed to detect there was a need to engage System 2. Consequently, even in the Stuck-in-System 1 account, the switch issue inevitably rears up its head again.

2.2 TOWARDS A WORKING SWITCH SOLUTION

The overview pointed to the fundamental conceptual problems that plague popular switch accounts in traditional dual process models. How can we avoid this conceptual muddle and arrive at a viable switch account? Any solution will have two necessary core components. First, we need to postulate that the internal switch decision is itself intuitive in nature. The switch decision needs to rely on mere System 1 processing. System 1 decides whether System 2 is activated or not. This avoids the paradox of assuming that to decide whether to engage in costly System 2 deliberation you already need to engage System 2 (De Neys, 2012; Evans, 2019; Stanovich, 2018). Second, and more controversially, we will need to discard the exclusivity feature. If we agree that System 1 takes the switch decision, the billion-dollar question then becomes how exactly it does this. What informs the decision within System 1? My point is that solving this puzzle forces us to get rid of exclusivity. Instead of allocating unique responses to each system, we need to assume that the alleged System 2 response can also be cued by System 1. Hence, System 1 will be generating different types of responses or intuitions. One of these will be the traditional alleged System 1 response (e.g., a biasing heuristic, deontological, or prosocial intuition), the other one will be the traditional alleged System 2 response (e.g., logical, utilitarian, or selfish intuition). In case both intuitions cue the same response, the response can be given without further System 2 deliberation. In case the two intuitions cue conflicting responses, System 2 will be called upon to intervene.

With these building blocks in hand, it is possible to present a conceptually coherent switch account. It will be conflict between competing intuitions within System 1 that will function as the trigger to switch on System 2. But clearly, by definition, the account can only work if the alleged System 2 response is not exclusively calculated by System 2. If exclusivity is maintained, there is no way for System 1 to be reliably informed about potential conflict with the exclusive System 2 response. An exclusive model is bound to fall prey to the same conceptual pitfalls that plague the traditional switch accounts.

To avoid confusion, the point is not that exclusivity is impossible per se. Non-exclusivity is not a necessary prerequisite for a dual process model. The point concerns the necessary conceptual coupling between the exclusivity and switch features. A dual process model may posit exclusivity, but it will pay the price at the switch front. To remain coherent, a dual process model that posits exclusivity will also need to postulate that reasoners have no internal mechanism that allows them to switch from System 1 to System 2 themselves (i.e., the Stuck-in-System-1 position). One cannot have their exclusive cake and eat it here.

The good news is that the empirical evidence reviewed in section 1 indicates that the elementary conditions for the above switch mechanism may often be met. In key dual process applications there is evidence that the alleged System 2 response can indeed be processed more intuitively. Hence, the required building blocks for a coherent switch mechanism seem to be in place. However, although positing non-exclusivity might provide the building blocks, it clearly does not suffice to arrive at a workable model. For example, one may wonder why reasoners often still opt for the alleged System 1 response if the alternative response is also intuitively available? Relatedly, what exactly determines System 2 engagement? Does the mere generation of two conflicting intuitions suffice per se? Does the amount of conflict matter? Furthermore, we do not only need to explain when reasoners will engage System 2 but also when they will stop doing so. That is, once we have activated System 2 it doesn't stay activated forever. At what point does a reasoner decide it is safe to revert back to System 1 processing then? In the following section, I sketch a general architecture that allows us to address these issues.

3. A WORKING MODEL

The model I develop here builds on emerging ideas from various authors working in a range of dual process application fields (e.g., Bago et al., 2021; Bago & De Neys, 2019b, 2020; Baron & Gurcay,

2017; De Neys & Pennycook, 2019; Evans, 2019; Pennycook et al., 2015; Reyna et al., 2017; Stanovich, 2018; Thompson & Newman, 2017; Trippas & Handley, 2017[4]). Because these ideas often entail some revision of traditional dual process models they are sometimes collectively referred to as a Dual Process Theory 2.0 (De Neys, 2017). The current model presents a personal integration and specification of what I see as key features. I focus on a general, field-independent specification that can serve as a basic architecture for future models across various fields.

The model has four core components which I will introduce in more detail below. Figure 1 presents a schematic illustration.

3.1 Intuitive activation

The first component (illustrated in Figure 1.1) reflects the starting point that System 1 can be conceived as a collection of intuitively cued responses. For convenience, I focus on the critical case in which two competing intuitions are being cued. These are labeled as intuition 1 (I1) and intuition 2 (I2). These can be the alleged System 1 and alleged System 2 responses but in general, they can be any two intuitions that cue a different response. Each intuition is simply identified by the response it cues.

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[4] This does not imply that these authors agree with or can be held accountable for the claims made here. I simply want to acknowledge that my theorizing does not come out of the blue and was inspired by the thinking of multiple scholars.
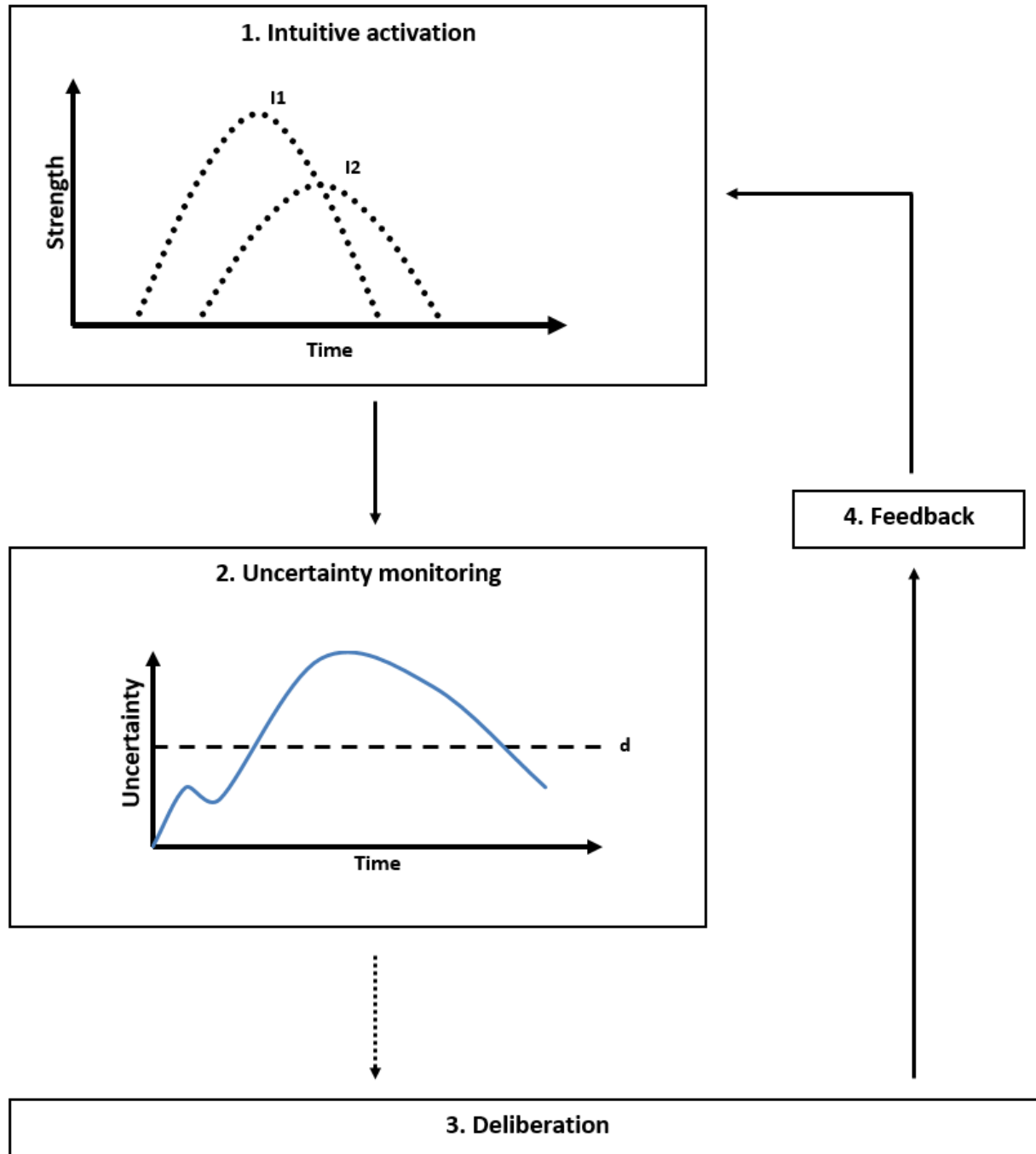
1. Intuitive activation

I1
I2
Strength
Time

2. Uncertainty monitoring

Uncertainty
d
Time

4. Feedback

3. Deliberation

Figure 1. Schematic illustration of the working model's core components. I1 = Intuition 1, I2 = Intuition 2, d = deliberation threshold. The dashed arrow indicates the optional nature of the deliberation stage.

At each point in time, an intuition is characterized by its activation level or strength. The strength can change over time. Once an intuition is generated it can grow, peak, and decay. The y-axis in Figure 1.1

represents the intuition strength, the x-axis represents time. The peak activation strength of an intuition reflects how automatized or instantiated the underlying knowledge structures are (i.e., how strongly it is tied to its eliciting stimulus, e.g., Stanovich, 2018). The stronger an intuitive response is tied to its eliciting stimulus, the higher the resulting activation strength. This implies that not all intuitions will be created equal. Some might be stronger than others.

But where do these intuitions and strength differences come from? Although it is not excluded that some intuitive associations might be innate, the working model postulates that intuitive responses primarily emerge through an automatization or learning process. Throughout development, any response might initially require exclusive deliberation but through repeated exposure and practice this response will become compiled and automatized (e.g., Shiffrin & Schneider, 1977). Note that whereas such a claim is uncontroversial for the alleged System 1 response in traditional dual process models (e.g., Evans & Stanovich, 2013; Rand et al., 2012), it is assumed here that it also applies to the alleged System 2 response. The rationale is that in most dual process fields, adult reasoners have typically already been exposed to the System 2 response through education and daily life experience. For example, the ratio principle in the introductory ratio bias task is explicitly taught during elementary and secondary education (e.g., fractions). Likewise, children will have had many occasions to experience that selfish behavior has often negative consequences (e.g., if you don't share with your little brother your mom and dad will be mad, your brother will be less likely to share with you in the future, etc.). Hence, through repeated exposure and practice an original System 2 response may gradually become automatized and will be generated intuitively (De Neys, 2012). But because not every response will have been equally well automatized or instantiated, strength differences may arise, and not every eliciting stimulus will cue the associated response equally well in System 1.

Note that the eliciting stimulus can be any specific problem feature. For example, when solving the ratio bias problem with the marbles and trays, the absolute number information (e.g., "1 red marble in small tray, 9 red in large tray") might give rise to one intuition (e.g. "pick large") and the ratio information (e.g., "1 out of 10 red vs 9 out of 100 red") might give rise to a conflicting one (e.g., "pick small"). In a moral reasoning problem, the information that an action will result in harm (e.g., a person will die) can cue a deontological intuition (e.g., "action not acceptable") and the subsequent information that it may prevent more harm (e.g., "if nothing done, 5 people will die") an utilitarian one (e.g., "action acceptable). Hence, the intuition 1 (I1) and intuition 2 (I2) labels in the illustration simply refer to the temporal order in which the intuitions accidentally happened to be cued. They bear no further implications concerning the nature of the intuition per se.

3.2 Uncertainty monitoring

The second component of the model is what we can refer to as an uncertainty monitoring process. The idea is simply that System 1 will continuously calculate the strength difference between activated intuitions. This results in an uncertainty parameter U. The more similar in strength the competing intuitions are, the higher the resulting experienced uncertainty. Once the uncertainty reaches a critical threshold (represented by d in Figure 1.2), System 2 will be activated. However, in case one intuition clearly dominates the other in strength, the resulting uncertainty will be low and the deliberation threshold will not be reached. In that case, the reasoner will remain in System 1 mode and the dominant intuition can lead to an overt response without any further deliberation.

This explains why postulating non-exclusivity and assuming that the traditionally alleged System 2 response can also be generated intuitively does not imply that reasoners will always opt for the alleged System 2 response. For different individuals and situations, the strength of the competing intuitions can

differ. Sometimes the alleged System 1 intuition will dominate. Consequently, although the presence of a competing intuition that cues the alleged System 2 response will result in some uncertainty, this may not be sufficient to engage System 2. In the case of logical reasoning bias, for example, this explains why some reasoners may detect that their dominant intuitive answer is questionable but nevertheless will fail to engage in further deliberation to double-check and correct it.

A possible mathematical representation of the uncertainty parameter is: $U = 1 - |I1 - I2|$. U stands for uncertainty and can range from 0 to 1. I1 and I2 represent the strength of the respective intuitions. The strength can also range between 0 and 1. The vertical bars (|) denote we calculate the absolute difference. Hence, the more similar the activation strength, the smaller the absolute difference and the higher the uncertainty will be.

A simple analogy might clarify the basic idea. Imagine that as part of a lunch combo, a local cafeteria offers its customers a choice between two desserts: ice cream or a cupcake. John is fond of ice cream but really dislikes cupcakes. Hence, John will readily choose the ice cream without giving it any further reflection. Steve, however, likes both equally well. When presented with the two options, Steve's decision will be harder and require deeper deliberation. For example, he might try to remember what he had last time he ate at the cafeteria and decide to give the other option a try. Or he might try to look for arguments to help him make a decision (e.g., "The cupcake has blueberries in it this week. Blueberries are healthy. Better take the cupcake."). Just like the strength of our food preferences, the activation strength of our intuitions will similarly determine whether or not we will deliberate about our response.

Note that although I focus on two competing intuitions, the monitoring also applies in case there is only one or no intuition cued. For example, if a reasoner is being faced with an entirely new problem for which System 1 does not cue a response, the absolute difference factor will equal 0 (i.e., the intuition strength equals 0), the resulting uncertainty will be maximal (e.g., $U = 1 - 0$), and System 2 will be called upon to compute and answer. If a problem only cues one single intuition (or both intuitions cue the same

response), the difference factor will equal its strength (e.g., .8). Consequently, if the strength is high, the uncertainty will be low (e.g., U = 1 - .8) and the cued response can be selected without further deliberation. Conversely, a weaker intuition will result in a higher uncertainty, which increases the likelihood that the deliberation threshold is crossed, System 2 is activated and the reasoner engages in additional deliberation about the problem. Finally, one may also envisage cases in which more than two intuitions are simultaneously activated. If there is one intuition that clearly dominates, the strength difference will be high and no further deliberation will be engaged. In case the differences are more diffuse, deliberation will likewise be triggered.

It is important to recap that uncertainty monitoring is a core System 1 process. It operates effortlessly without any System 2 supervision. For illustrative purposes, it is represented as a separate box in Figure 1. It can be functionally isolated but at an implementation level there is no need to postulate a different type of system or processing. It should also be clear that deliberation is always optional; it will only be engaged when the uncertainty monitoring deliberation threshold is reached. This is represented in Figure 1 by the dashed arrow between the uncertainty monitoring and deliberation component.

3.3 Deliberation

The third component is System 2 activation. It is at this stage (and this stage only) that the reasoners will engage in slow, demanding deliberation. Deliberation can take many forms. For example, one classic function is its role as response inhibitor (e.g., De Neys & Bonnefon, 2013; Evans & Stanovich, 2013). Here attentional control resources will be allocated to the active suppression of one of the competing intuitions. In addition, some authors have pointed to the algorithmic nature of deliberation and its role in the generation of new responses (e.g., Houdé, 2019). In this case System 2 allows us to retrieve and execute a stepwise sequence of rules. For example, when we have to multiply multiples of

10 (e.g., "How much is 220 * 30?"), we can use a multiplication algorithm (e.g., multiply the non-zero part of the numbers, i.e., 22 * 3 = 66; count the zeros in each factor, i.e., 2; add the same number of zeros to the product, i.e., 6600) to calculate an answer. While we're executing each step we need to memorize the results of the previous steps which will burden our attentional resources. When System 1 does not readily cue an intuitive response, such algorithmic System 2 deliberation allows us to generate an answer.

Likewise, some authors have also pointed to the role of deliberation in a justification or rationalization process (Bago & De Neys, 2020; Evans, 2019; Evans & Wason, 1976; Pennycook et al., 2015; see also Mercier & Sperber, 2011; Cushman, 2020). In this case we will deliberate to look for an explicit argument to support an intuition. This explains why engagement of System 2 does not imply that the alleged System 2 response will be generated. Reasoners can also use their cognitive resources to look for a justification for the alleged System 1 intuition (e.g., the incorrect "heuristic" intuition in logical reasoning tasks). More generally, this underscores the argument that System 2 engagement does not "magically" imply that the resulting response will be "correct", "rational", or "normative" (De Neys, 2020; Evans, 2009, 2019). It simply implies that a reasoner will have taken the time and resources to explicitly deliberate about their answer.

Clearly, none of these roles need to be mutually exclusive. Deliberation might entail a combination of response suppression, generation, justification, or additional processes. Whatever the precise nature of deliberation may be, what is critical for the current purpose is the outcome or result. The key point is that deliberation will always operate on System 1 in that it will modulate the strength of the different activated intuitions in System 1 (or generate a new intuitive response altogether). Consequently, although it is possible to have System 1 activation without System 2 activation, the reverse is not true. During deliberation, the effortless System 1 remains activated and deliberation will operate on its strength representations. As I will explain in more detail below, it is this feature that provides us with a mechanism to stop System 2.

3.4 Feedback

A last component of the model is what we can refer to as a feedback loop. A reasoning process does not stop at the point that one starts to deliberate. Traditionally, dual process models have mainly focused on the question as to how we can know when to engage System 2. The question as to how we know we can stop System 2 engagement has received far less attention. Clearly, a viable switch account requires us to address both questions. When we activate the effortful System 2, at some point we will need to revert back to System 1. Hence a working dual process model needs to specify when System 2 will be switched on *and* off. Put bluntly, we not only need to know what makes us think (Pennycook et al., 2015) but also what makes us stop thinking.

The simple idea I put forward here is that of a feedback loop. System 2 operates on the strength representations in System 1 such that the outcome of System 2 processing is fed back into System 1. Hence, because deliberation will act on the strength representations, it will also affect the uncertainty parameter. For example, if we deliberately suppress one of two competing intuitions, this will decrease its activation level. Because of this decrease, the activation difference with the non-suppressed intuition will increase. As a result, the uncertainty parameter will decrease. At the point that the uncertainty falls below the deliberation threshold, System 2 deliberation will be switched off and the reasoner will return to mere System 1 processing.

In other words, in essence, the critical determinant of System 2 engagement is the uncertainty parameter. As soon as it surpasses the deliberation threshold, the reasoner will start deliberating. System 2 deliberation will extend for as long as the uncertainty remains above the threshold. As soon as the uncertainty drops below the threshold, deliberation stops, and the reasoner will revert to mere System 1 processing. Hence, it is the uncertainty parameter that determines the extent of deliberation. Figure 2

tries to illustrate this core idea. The figure sketches a situation in which initially only System 1 is activated

and two intuitions are generated, a first intuition (I1) and slightly later a second intuition (I2). The

activation strength of the two intuitions gradually increases. Initially, there is a large activation difference
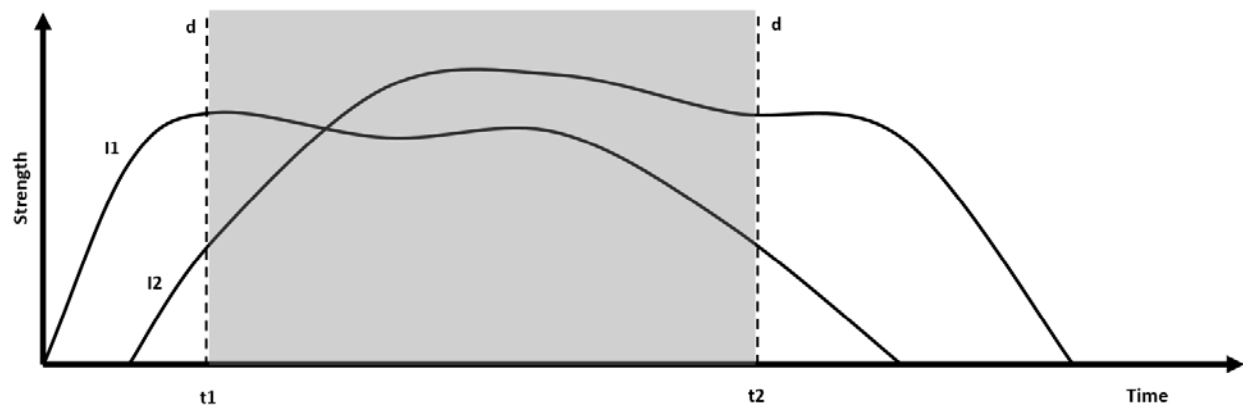

Figure 2. Illustration of the idea that the strength interplay of conflicting intuitions determines uncertainty and the extent of deliberation. I1 = Intuition 1, I2= Intuition 2, d = deliberation threshold, t1 & t2 = time points at which the deliberation threshold is crossed. The gray area represents the time during which System 2 deliberation will be engaged.

between I1 and I2 and consequently, the U parameter will be low. However, at a certain point I1 plateaus

whereas I2 is still increasing. Consequently, their activation strength becomes more similar, U will

increase, and the deliberation threshold will be crossed. At this point (t1), System 2 will be activated. This

activation will modulate the strength through deliberate suppression, rationalization, etc. This may

decrease or increase the activation strengths and uncertainty parameter. As long as the uncertainty

parameter remains above the threshold, System 2 activation will be extended (represented by the grey

bar in Figure 2). At a certain point (t2 in the figure), the activation difference will be sufficiently large again

such that the uncertainty falls below the threshold and the reasoner switches back to pure System 1

processing.

To avoid confusion, it is important to stress that deliberation does not necessarily need to lead to a decreased uncertainty (or "conflict resolution") per se. Deliberation can also increase uncertainty and lead to more deliberation. For example, one can think of a situation in which initially a single weak intuitive response is cued. This leads to high uncertainty and System 2 engagement. Subsequently, algorithmic processing leads to the generation of a new, competing response. This response will also be represented in System 1 and have a specific strength. Depending on the specific activation levels, the net result might very well be more rather than less uncertainty which will lead to further deliberation. Alternatively, imagine that during logical reasoning on a classic bias task, a reasoner generates both a logically correct and incorrect ("heuristic") intuition. The heuristic intuition is only slightly stronger than the logically correct one and the resulting uncertainty triggers System 2 deliberation. During deliberation the reasoner looks for a justification for the heuristic intuition but does not find one. As a result, its strength will decrease making it even more similar to the logical intuition. Consequently, the uncertainty will increase and deliberation will be boosted rather than stopped. These are illustrative examples but they underscore the core point that there is no necessary coupling between deliberation and uncertainty reduction or resolution per se. The point is that the feedback mechanism guarantees that deliberation *can r*educe uncertainty and thereby stop System 2 engagement.

In the full model sketch in Figure 1, the feedback component—just like the uncertainty monitoring component—is represented in a separate box. Just as with the uncertainty monitoring component, it can be functionally isolated but there is no need to postulate a different type of system or type of processing. Feedback results from System 2 processing but the critical updating of the System 1 representations itself occurs automatically and does not require additional cognitive resources. In this sense it is a System 1 process. At the same time, the feedback component also underscores that in practice, thinking always involves a continuous interaction between System 1 and System 2 activation. At a specific isolated point in time we'll be either in System 2 mode or not but this split-up is always somewhat artificial. In practice,

reasoning involves a dynamic interaction between the two systems. System 1 can call for System 2 activation which will operate on System 1 which can lead to more or less System 2 operation which will further affect System 1 operations. This dynamic interaction is represented by the flow arrows in Figure 1.

3.5 Working guidelines

The combined intuitive activation, uncertainty monitoring, deliberation, and feedback components sketch the basic architecture of a dual process model that can explain how people switch between System 1 and System 2 thinking. The model sketch also allows us to delineate some more general principles that a working dual process model needs to respect: First, the model needs to be default-interventionist in nature. The idea of a parallel model in which System 1 and 2 are always activated simultaneously is both empirically and conceptually problematic. A dual process model should not assume that System 2 is always on. There will always need to be a processing stage in which the reasoner remains in mere System 1 mode. Second, because System 2 cannot always be on, the model needs to specify a switch mechanism that allows us to decide when System 2 will be turned on (and off). Third, while it is critical that there is a state in which System 1 is activated without parallel System 2 activation, the reverse does not hold. During System 2 activation, System 1 always remains activated. System 2 necessarily operates on the System 1 representations. This modulation ultimately allows us to stop deliberating. Fourth, a viable internal switch account implies that the model will be non-exclusive. As soon as we posit exclusive responses that are out of reach of the intuitive system, it will be impossible for the reasoner to accurately determine whether there is a need to generate the exclusive deliberate response when they are in the intuitive processing mode. In case exclusivity is nevertheless maintained, the model necessarily posits that there is no reliable internal switch mechanism.

If these features or principles are not met, the model will not "work" and cannot qualify as a proper dual process model that allows us to explain how intuition and deliberation interact. As such, the model sketch may help to separate the wheat from the chaff when evaluating future dual process accounts.

4. PROSPECTS

I referred to the architecture I presented as a working model. This label serves two goals. On one hand, it stresses that the model "works" in that it presents a viable account that avoids the conceptual pitfalls that plague traditional dual process models. However, on the other hand, the "working" also refers to its preliminary status—the model is a work-in-progress. The current specification is intended as a first, high-level verbal description of the core processes and operating principles. Clearly, the model will need to be further fleshed out, fine-tuned, and developed at a more fine-grained processing level. In this section I point to critical outstanding questions that will need to be addressed. These queries have remained largely neglected in the dual process field. As such, the section can also illustrate the models' potential to identify and generate new research questions and set the research agenda in the coming years.

4.1 Uncertainty parameter specification

The working model specifies the uncertainty parameter U as the absolute strength difference between competing intuitions (i.e., $U = 1 - |I1 - I2|$). This is most likely an oversimplification. For example, the current model does not take the absolute activation level into account. That is, two weak intuitions that have the same strength level (e.g., both have activation level 0.1 out of 1) are assumed to result in the same level of uncertainty as two strong intuitions that have the same strength level (e.g., both have

activation level .9 out of 1). If two intuitions have trivially small activation levels, one may wonder whether potential conflict requires or warrants deliberation. It is not unreasonable to assume that we would primarily allocate our precious cognitive resources to the most highly activated or most intense conflicts. One way to account for this feature would be to incorporate the absolute strength level into the U parameter. For example, by multiplying the absolute difference with the individual strength levels such that $U = (1 - |I1 - I2|) * I1 * I2$. Under this specification, conflict between stronger intuitions will be weighted more heavily and result in more uncertainty.

Likewise, one may wonder whether the variability of the strength levels is taken into account. Imagine two situations in which upon generation of competing intuitions the uncertainty parameter reaches the deliberation threshold after one second. In the first case, the intuition strength levels gradually change such that the U parameter gradually increases until the deliberation threshold is reached. With every unit of time, the uncertainty smoothly increases. Contrast this with a case whereby the strength levels are highly variable and constantly shoot up and down. For example, imagine that initially the uncertainty steeply rises but after a couple of milliseconds it steeply drops, then rises again, drops, and then rises again before it ultimately crosses the threshold. In theory, this variability may be informative. Strength instability might signal an increased need for deliberation. Such a feature could be integrated into the model by factoring strength variability into the U parameter such that, for example, $U = (1 - |I1 - I2|) * V(I1) * V(I2)$. The V factor then simply reflects the variability of the strength level over an elapsed period of time (e.g., standard signal deviation). Consequently, more variability will result in more uncertainty and faster deliberation engagement.

In the same sense, in theory, the uncertainty may be impacted by the intuition rise time or strength slope. That is, imagine two intuitive responses that have the exact same peak strength level at a certain point in time. However, it took the first response twice as long to reach that level as the second response. In other words, the slope of the strength function of the first intuition will be much lower than

that of the second intuition (i.e., the second one is steeper). Is this factored into the uncertainty equation? Or is the slope simply invariant (i.e., intuitive strength always rises at a fixed rate)? These are open queries but illustrate how the working model generates new research questions that have hitherto remained unexplored in the dual process field.

Currently, these suggestions or hypotheses remain purely speculative. The absolute strength level, strength variability, slope, and other factors might or might not affect the uncertainty parameter. This remains to be tested and empirically verified. The point is that, in theory, the model can be updated to account for these refinements, and pinpointing the precise signal or strength characteristics that affect the experienced uncertainty should be a promising avenue for further research.

4.2 Nature of non-exclusive System 1 and 2 responses

In a non-exclusive model there is no unique, exclusive response in System 2 that can only be generated through deliberation. Any response that can be computed by System 2 can also be computed by System 1. However, it is important that this equivalence is situated at the response or outcome level. Generating a logically correct response in bias tasks, making a utilitarian decision during moral reasoning, or deciding between a selfish or prosocial decision in a cooperation task, can all be done intuitively. But this does not imply that the intuitive and deliberate calculation of the responses is generated through the same mechanism or has the same features. Indeed, given that one is generated through a fast automatic process and one through a slow deliberate process, by definition, the processing mechanisms will differ. To illustrate, consider one is asked how much "3 * 10" is. For any educated adult, the answer "30" will immediately pop up through mere intuitive processing. An eight-year-old who starts learning multiplication will initially use a more deliberate addition strategy (e.g., 3 times 10 equals 10 + 10 + 10; 10 + 10 equals 20, plus 10 is thirty). Both strategies will result in the same answer, but they are generated

differently and do not have the same features. For example, the intuitive strategy might allow the adult to respond instantly but when asked for a justification even adults might need to switch to a more deliberate addition strategy ("well, it's 30 because 10 + 10 + 10 is thirty"). Hence, non-exclusivity does not entail that there is no difference between intuition and deliberation. The point is that intuition and deliberation can cue the same response.

However, it will be important to pinpoint how exactly the non-exclusive System 1 and System 2 responses differ. For example, one of the features that is often associated with deliberation is its cognitive transparency (Bonnefon, 2018; Reber & Allen, 2022). Deliberate decisions can typically be justified; we can explain why we opt for a certain response after we reflected on it. Intuitive processes often lack this explanatory property: People tend to have little insight into their intuitive processes and do not always manage to justify their "gut-feelings" (Marewski & Hoffrage, 2015; Mega & Volz, 2014). Hence, one suggestion is that non-exclusive System 1 and 2 responses might differ in their level of transparency (e.g., De Neys, 2022). For example, in one of their two-response studies on logical reasoning bias, Bago and De Neys (2019a) also asked participants to justify their answers after the initial and final response stage. Results showed that reasoners who gave the correct logical response in the final response stage typically managed to justify it explicitly. However, although reasoners frequently generated the same correct response in the initial response phase, they often struggled to justify it. Bago and De Neys (2019b) observed a similar trend during moral reasoning; although the alleged utilitarian System 2 response was typically already generated in the intuitive response stage, sound justifications of this response were more likely after deliberation in the final response stage. Hence, a more systematic exploration of the role of deliberation in response explicitation or justification seems worthwhile.

Likewise, one may wonder what the exact problem features are that System 1 reasoning exploits to generate the alleged System 2 response. For example, it has been suggested that computation of correct intuitive responses during deductive reasoning may rely on surface features that closely co-vary

with the logical status of a conclusion rather than logical validity per se (Ghasemi et al., 2022; Meyer-Grant et al., 2022; Hayes et al., 2022). In this sense, intuitive logical reasoning would serve to calculate a proxy of logical reasoning but not actual logical reasoning. These questions concerning the precise nature of non-exclusive System 1 intuitions should help to fine-tune the model in the coming years.

4.3 System 2 automatization

The working model posits that the critical emergence of a non-exclusive "alleged System 2" intuition within System 1 typically results from a developmental learning or automatization process. Through repeated exposure and practice, the System 2 response will gradually become automatized and will be elicited intuitively (De Neys, 2012; Stanovich, 2018). The basic idea that an originally deliberate response may be automatized through practice, is theoretically sound (e.g., Shiffrin & Schneider, 1977) and well-integrated in traditional dual process models (e.g., Evans & Stanovich, 2013; Rand et al., 2012).

However, although the automatization idea might not be unreasonable, there is currently little direct evidence to support it (De Neys & Pennycook, 2019). This points to a need for developmental research to test the emergence of these new intuitions (e.g., Raoelison et al., 2021). Likewise, individual differences in the strength of intuitions might be linked to differences in response automatization. People might differ in the extent to which they have automatized the System 2 operations. To test this idea more directly, one may envisage training studies in which the activation level or automatization is further boosted through practice. Although there have been some recent promising findings in this respect (Boissin et al., 2021; Purcell et al., 2020), a more systematic exploration is key. Such work may have critical applied importance. Rather than training people to deliberate better to suppress faulty or unwanted intuitions, we might actually help them to boost the desired intuition directly within System 1 (e.g., Milkman et al., 2009).

Emerging evidence in the logical reasoning field also suggests that spontaneous differences in the strength of sound "logical" intuitions might be associated with individual differences in cognitive capacity (Raoelison et al., 2020; Schubert et al., 2021; Thompson, 2021; Thompson et al., 2018). That is, people higher in cognitive capacity might have automatized the logical operations better and developed more accurate intuitions (Thompson et al., 2018). Consequently, rather than predicting how good one is at deliberately correcting faulty intuitions, cognitive capacity would predict how likely it is that a correct intuition will dominate from the outset in the absence of deliberation (Raoelison et al., 2020). Although promising, this finding will require further testing (e.g., Thompson & Markovits, 2021) and generalization to different fields.

4.3 Deliberation issues

The deliberation component of the working model will also need further development. I noted that deliberation can take many forms. It will be important to specify these and their potential interaction in more detail. For example, one may wonder about the link between suppression and justification. Do we ever suppress an intuitive response without a justification? That is, do we need an explicit argument or reason to discard an intuitive response, or is such justification independent of the suppression process and does it follow (rather than precede) suppression (Evans, 2019)? More critically perhaps, how are deliberative processes instantiated? For example, does the suppression process imply an active suppression of a target intuition per se or rather a boosting of the activation level of the competing intuition? Alternatively, it has been argued that deliberate suppression can be conceived as a mere response delay (Martiny-Huenger et al., 2020). Under this interpretation, the activation level of a dominant intuition automatically decays if it is not acted upon (i.e., does not result in an overt response). Hence, as long as the reasoner refrains from responding, the mere passive passing of time will guarantee

that the activation level of an initially dominant intuition will fall below its competitor. Consequently, it would be the act of refraining from responding rather than the suppression of a dominant intuition itself that would be demanding. This illustrates how more work is needed to specify the precise instantiation of deliberation.

Another question concerns the gradual or discrete nature of deliberation engagement (Dewey, 2021, 2022). In the current model specification, I focused on the extent of deliberation. The longer the uncertainty parameter remains above the threshold, the longer we will remain deliberating. But in addition to the question as to how long we will keep deliberating for, one may also wonder how hard we will deliberate. How much of our cognitive resources do we allocate to the task at hand? Do we always go all-in, in an all-or-nothing manner or do we set the amount of allocated resources more gradually? In theory, the amount of deliberation might be determined by the uncertainty parameter. For example, the higher the uncertainty parameter (above the threshold), the more resources will be allocated. This issue will need to be determined empirically (e.g., see Dewey, 2022) but again illustrates how the current working model leads to new questions and can guide future research.

Finally, one can also question whether the cost of deliberation is factored into our decision to revert to System 1 processing. Imagine that even when we are engaging all our available resources, we still do not manage to resolve a conflict between competing intuitions. What do we do when we do not readily find a solution to a problem? We cannot deliberate forever so at a certain point we need to stop deliberation even when the uncertainty might not have been resolved. Here we presumably need to take the opportunity cost of deliberation into account (e.g., Boureau et al., 2015; Sirota et al., 2022). Although in a typical experimental study participants only need to focus on the specific reasoning task at hand, in a more ecologically valid environment we always face multiple tasks or challenges. Resources spent on one task, cannot be spend on another one. If another task is more pressing or more rewarding, we may deliberately decide to stop allocating cognitive resources to the current target task. In theory, this

opportunity factor may affect the uncertainty parameter. That is, one consequence of not being able to solve a problem is that we may lose interest in it and shift to a different challenge. This may be instantiated by an overall lowering of the activation strength of the intuitions or the inclusion of an opportunity cost factor into the U parameter calculation, for example, which may both decrease the experienced uncertainty. Hence, bluntly put, the longer a deliberation process takes, the less we may bother about it. These suggestions are speculative but they illustrate how research on the opportunity cost of deliberation can be integrated into the model.

4.4 Multiple, one, or no intuitions

The current model focuses on the paradigmatic case in which a reasoner is faced with two competing intuitions. As I noted, in theory, the model can be extended to situations in which no, one, or more than two intuitions are cued. In the latter case, the uncertainty parameter might focus on the absolute difference or strength variability of the different intuitions. The more similar in strength they are, the higher the uncertainty. In case there is no intuitive response cued, its strength will obviously be zero. Consequently, the uncertainty will be maximal and the reasoner will be obliged to look for a deliberate response. However, note that in practice, these cases have received little or no empirical testing in dual process studies. For example, rather than variability per se, uncertainty might be determined by the distance between the strongest intuition and its competitors. Imagine that in a first case three competing intuitions have strength levels .9, .1, .1, and in a second case .9, .9., .1. In both cases the average strength deviation (e.g., standard deviation) will be the same but uncertainty and need for deliberate judication might be higher in the second case. Likewise, although it is generally assumed in the dual process literature that the absence of an intuitive cue will necessarily imply activation of System 2 (e.g., Kahneman, 2011; Evans & Stanovich, 2013; Stanovich, 2011), this activation might also depend on the perceived opportunity

cost of deliberation (Shenhav et al., 2021). Future dual process research will need to pay more empirical attention to these a-typical cases.

Finally, the working model's uncertainty monitoring account also applies when only one intuition is cued. In this case the difference factor will equal the intuition's strength. If the strength is high, the uncertainty will be low and the cued response can be selected without further deliberation. A weaker intuition will result in a higher uncertainty, which increases the likelihood that the deliberation threshold is crossed, and System 2 is called upon. Here the working model fits well with recent accounts that examine the role of metacognition in reasoning (i.e., so-called "metareasoning", e.g., Ackerman & Thompson, 2017; see also Baron, 1985, for a related older suggestion). The basic idea is that an intuitive response is always accompanied by an intuitive confidence judgment (i.e., the so-called "feeling of rightness", Ackerman & Thompson, 2017). This confidence level would then determine deliberation engagement (i.e., the lower the confidence, the higher the deliberation probability). In essence, this process serves the same role as the uncertainty monitoring in the current working model and it might be worthwhile to integrate the accounts further.

4.5 links with other fields

Some of the challenges that the working model tries to address show interesting similarities and connections with ongoing developments in other fields such as work on the automatic triggering of cognitive control (e.g., Algom & Chajut, 2019), mental effort allocation (e.g., Kool & Botvinick, 2018; Shenhav et al., 2021), or computational modeling of changes-of-mind in perceptual decision making (e.g., Stone et al., 2022; Turner et al., 2021). Although these fields have typically focused on lower-level tasks than dual process models of reasoning–and have remained somewhat isolated from this literature–the

working model might allow us to integrate both which can offer some guidance for the further development of dual process models of higher-order cognition[5].

For example, research on the engagement of cognitive control in tasks such as the Stroop (e.g., name the ink color in which a color word is written), has indicated that various processes that had long been considered the hallmark of deliberate controlled processing can also operate automatically (e.g., Desender et al., 2013; Jiang et al., 2018; Linzarini et al., 2017). These findings have resulted in broader theoretical advances that indicate how core control mechanisms can also be achieved through low-level associative mechanisms (Abrahamse et al., 2016; Algom & Chajut, 2019; Braem & Egner, 2018). Hence, as in the dual process literature, there seems to be a tendency to move from an exclusive to a non-exclusive view on elementary control processes (e.g., see also Hassin, 2013, for a related point on conscious and unconscious processing).

Likewise, the field of mental effort allocation has long studied the motivational aspects of deliberate control (e.g., Kool & Botvinick, 2018; Shenhav et al., 2017, 2021). Here, the decision to engage effortful controlled processing in a cognitive task is modeled as a function of the likelihood that allocation of control will result in the desired outcome and the weighing of the costs and benefits of allocating control to the task. Such a framework might be highly relevant for the integration of an opportunity cost factor in dual process models of reasoning (Sirota et al., 2022).

In the same vein, research on so-called "changes-of-mind" (Turner et al., 2021; Evans et al., 2020; van den Berg et al., 2016; Resulaj et al., 2009) can be inspirational. Scholars in this field try to explain when and how participants will revise perceptual decisions (e.g., whether or not a stimulus was perceived). For example, you initially might infer that an "X" was briefly flashed on screen but milliseconds later revise this answer and decide it was a "Y". Various computational models that make differential assumptions

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[5] Vice versa this could also help to scale-up models focusing on more elementary low level cognition tasks to higher-level reasoning about morality, cooperation, and logic, for example.

about whether an increase in the activation level of one decision automatically implies an activation decrease of its competitor or whether such activation necessarily decays over time, have been developed and can be contrasted (e.g., Pleskac & Busemeyer, 2010; Usher & McCLelland, 2001). Integration of this modeling work might be useful for the further fine-grained specification of the intuitive activation component of the working model.

4.6 Computation issues

The present working model is intended to serve as a first, verbal model of core processes and operating principles. It does not present a computational model that specifies how the operations are calculated and what processes ultimately underly System 1 or the generation of intuitions. However, such a specification or integration is not impossible. For example, Oaksford and Hall (2016) showed how a probabilistic Bayesian approach might in theory be used to model conflict between competing intuitions and the generation of "logical" (or alleged System 2) intuitions in classic reasoning tasks. Oaksford and Hall gave the example of a base-rate neglect task in which base-rate information (e.g., a sample with 995 men and 5 women) can conflict with information provided by a stereotypical description (e.g., a randomly drawn individual from the sample is described as someone who likes shopping). Traditionally it is assumed that the description will cue an incorrect intuitive response (i.e., the randomly drawn individual is most likely female) and that taking the base-rate information into account will require System 2 deliberation. Oaksford and Hall demonstrated how both might be done intuitively in System 1 by an unconscious sampling of probability distributions. In a nutshell, probabilities are represented as probability density functions in the model (e.g., Clark, 2013). Different cues in the problem information (e.g., base-rates and the description) will give rise to a probability distribution of possible values. The first cue that is encountered (e.g., base-rates) will give rise to a prior distribution. The second cue (e.g., description) will

modify this to a posterior probability distribution. A decision is then made by sampling values from these

distributions. In essence, this unconscious process of probability distribution sampling would ultimately

underly System 1 processing. Although such an account would need to be generalized to other tasks and

domains, it indicates that a more fine-grained computational account is not a mere promissory note. In

theory, the underlying computational model can be specified and tested. This remains an important

challenge for the current working model. At the same time, it also underscores the value of a verbal

working model. If our theories maintain that a response is out of reach of the intuitive system, there is no

point in trying to model how such a response can be intuitively instantiated either.

4.7 Dual schmosses?

This paper pointed out that there is little empirical and conceptual support for foundational dual

process assumptions and presented a revised working model to address these challenges. However, given

the empirical and conceptual dual process issues, one might be tempted to draw a radically different

conclusion. That is, rather than to try building a more credible version of the framework, shouldn't we

simply abandon the dual process enterprise of splitting cognition into a fast and slow system altogether?

This critique can be read and targeted at multiple levels. First, various scholars have long questioned dual

process models (e.g., Gigerenzer & Regier, 1996; Keren & Schul, 2009; Osman, 2004; Melnikoff & Bargh,

2018). Often this is accompanied by a call to switch to so-called single process models (e.g., Kruglasnki &

Gigerenzer, 2011; Osman, 2004). As I noted in the introduction, both single and dual process models focus

on the interaction between intuition and deliberation. But whereas single process proponents believe

there is only a quantitative difference between intuition and deliberation (i.e., the difference is one of

degree, not kind), dual process theorists have traditionally argued for a qualitative view on this difference

(e.g., see Keren & Schul, 2009, and De Neys, 2021, for review). Bluntly put, whereas the qualitative view

sees intuition and deliberation as running on different engines, the quantitative view entails they run on one and the same engine that simply operates at different intensities. My main argument was orthogonal to this specific issue and I therefore used the fast-and-slow dual process label as a general header that covers both the qualitative and quantitative interpretation. The simple reason is that single process models also differentiate between intuitive and deliberate processing and posit that some responses require more deliberation than others (e.g., Kruglanski & Gigerenzer, 2011). At one point we may be at the intuitive end of the processing scale and will need to decide whether we need to move to the more deliberate end, and invest more time and resources (e.g., whether or not we hit the gas pedal and let the engine run at full throttle). Hence, quantitative single process models face the same switch issue as their qualitative rivals. Any solution will require them to drop exclusivity and postulate that responses that can be computed when we're at the deliberate extreme of the processing scale, can also be computed when we're at the intuitive end. In short, the issues outlined here are not solved by simply moving from a qualitative to a quantitative single process view on intuition and deliberation.

Another possible general critique of the dual process approach has to do with the specific reading of the "System" label (e.g., Oaksford & Chater, 2012). Dual process models are also being referred to as dual system models. These labels are often used interchangeably (as in the present paper) but sometimes they are used to refer to a specific subclass of models. For example, some dual process models are more specific in their scope, others more general (Gawronski & Creighton, 2013). The more specific models are developed to account for specific phenomena or tasks, the more general ones are intended to be more integrative and apply to various phenomena. Some authors use the system label to specifically refer to the latter, more general models (e.g., Smith & Decoster, 2000; Strack & Deutsch, 2004). One critique of dual process models has to do with this general "System" interpretation. One may argue that although intuitive and deliberate processing in various domains might bear some phenomenological family resemblance, they ultimately share no common core. For example, "System 1" processing in moral

reasoning might have nothing to do with "System 1" processing during prosocial decision-making or logical reasoning. Hence, rather than positing a general intuitive and deliberate processing type, we may have subsets of more intuitively and deliberately operating processes that are at play in different tasks. This is a valid point but it is ultimately independent of the issue addressed here. That is, even if there are domain or task-specific intuitive and deliberate processes at play, we still need to explain how we switch from one to the other in the specific task at hand. Hence, the classic "System" view is not the problem here. This does help to underscore that the processing details (e.g., the precise value of the deliberation threshold) of the working model may vary across domains (or even tasks). The point is that its core principles (e.g., non-exclusivity, monitoring, feedback component) will need to apply if we want to account for the switch process in any of these individual domains (or tasks).

Finally, one may also wonder whether the central dual process switch issue is simply an instantiation of the more general challenge of deciding when to stop a calculation. That is, imagine that all human cognition is deliberative in nature. Even in this case where there is never an intuition/deliberation switch decision to make, we would still need to decide whether to keep on calculating or stop and make a stab at the answer in the light of the deliberate calculations we already made. As I noted (4.5), this "stop" question is specifically examined in work on mental effort allocation and might be especially useful to integrate an opportunity cost factor into the working model (e.g., Sirota et al., 2022). However, is this all we need? I believe it is important to highlight that dual process models typically focus on a slightly different situation. That is, rather than deciding whether or not to spend (more) resources to get to an answer per se, they deal with cases in which a plausible, salient answer is intuitively cued from the outset before we spend any effort at all. The question is whether there is a need to go beyond this first hunch. Do we need to start deliberating if we are instantly repulsed by a moral option, feel that it's better to share with others than to make more ourselves, or have a positive first impression of a job candidate? Whether such a switch decision can be accounted for by the same mechanism as the

general calculation or deliberation "stopping" machinery is ultimately an empirical question. At the very least it will require us to examine and account for the switching in the specific situations that dual process models envisage. Developing a revised account that provides a viable specification of the postulated intuition/deliberation switch mechanism should always be useful here. Clearly, if the dual process model doesn't specify a switch account yet, there is no point in contrasting it with other "switch" approaches. Hence, even if one questions the idea that we can distinguish more intuitive and deliberate processing in human cognition and favors an alternative account, it is paramount to request dual process theorists to develop the best possible specification of the core "fast-and-slow" switch mechanism. The point is that this will allow for a more informative contrast with possible rival accounts. Put simply, if we want to know whether NFL players have a better physique than basketball players, we should test them against NBA players rather than players from the local recreational team. To avoid any confusion, my point is not that the current working model provides the best possible dual process specification (or that it's the LeBron James of dual process theory), but that it is sensible to strive for the best possible version of the framework.

5. CONCLUSION

In the last 50 years dual process models of thinking have moved to the center stage in research on human reasoning. These models have been instrumental for the initial exploration of human thinking in the cognitive sciences and related fields (Chater, 2018; De Neys, 2021). However, it is time to rethink foundational assumptions. Traditional dual process models have typically conceived intuition and deliberation as generating unique responses such that one type of response is exclusively tied to deliberation and is assumed to be beyond the reach of the intuitive system. I reviewed empirical evidence from key dual process applications that argued against this exclusivity feature. I also showed how

exclusivity leads to conceptual complications when trying to explain how a reasoner switches between intuitive and deliberate reasoning. To avoid these complications, I sketched an elementary non-exclusive working model in which it is the activation strength of competing intuitions within System 1 that determines System 2 engagement.

It will be clear that the working model is a starting point that will need to be further developed and specified. However, by avoiding the conceptual paradoxes that plague the traditional model, it presents a more viable basic architecture that can serve as theoretical groundwork to build future dual process models in various fields. In addition, it should at the very least force dual process theorists to specify more explicitly how they address the switch issue. In the absence of such specification, dual process models might continue to provide an appealing narrative but will do little to advance our understanding of the interaction between intuitive and deliberate— fast and slow—thinking. It is in this sense that I hope that the present paper can help to sketch the building blocks of a more judicious dual process future.

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7. CONFLICT OF INTEREST

I have no conflict of interest to report.

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