

Spontaneous giving and calculated greed

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Cooperation is central to human social behaviour^{1–9}. However, choosing to cooperate requires individuals to incur a personal cost to benefit others. Here we explore the cognitive basis of cooperative decision-making in humans using a dual-process framework^{10–18}. We ask whether people are predisposed towards selfishness, behaving cooperatively only through active self-control; or whether they are intuitively cooperative, with reflection and prospective reasoning favouring ‘rational’ self-interest. To investigate this issue, we perform ten studies using economic games. We find that across a range of experimental designs, subjects who reach their decisions more quickly are more cooperative. Furthermore, forcing subjects to decide quickly increases contributions, whereas instructing them to reflect and forcing them to decide slowly decreases contributions. Finally, an induction that primes subjects to trust their intuitions increases contributions compared with an induction that promotes greater reflection. To explain these results, we propose that cooperation is intuitive because cooperative heuristics are developed in daily life where cooperation is typically advantageous. We then validate predictions generated by this proposed mechanism. Our results provide convergent evidence that intuition supports cooperation in social dilemmas, and that reflection can undermine these cooperative impulses.

Many people are willing to make sacrifices for the common good^{5–9}. Here we explore the cognitive mechanisms underlying this cooperative behaviour. We use a dual-process framework in which intuition and reflection interact to produce decisions^{10–15,18}. Intuition is often associated with parallel processing, automaticity, effortlessness, lack of insight into the decision process and emotional influence. Reflection is often associated with serial processing, effortfulness and the rejection of emotional influence^{10–15,18}. In addition, one of the psychological features most widely used to distinguish intuition from reflection is processing speed: intuitive responses are relatively fast, whereas reflective responses require additional time for deliberation¹⁵. Here we focus our attention on this particular dimension, which is closely related to the distinction between automatic and controlled processing^{16,17}.

Viewing cooperation from a dual-process perspective raises the following questions: are we intuitively self-interested, and is it only through reflection that we reject our selfish impulses and force ourselves to cooperate? Or are we intuitively cooperative, with reflection upon the logic of self-interest causing us to rein in our cooperative urges and instead act selfishly? Or, alternatively, is there no cognitive conflict between intuition and reflection? Here we address these questions using economic cooperation games.

We begin by examining subjects’ decision times. The hypothesis that self-interest is intuitive, with prosociality requiring reflection to override one’s selfish impulses, predicts that faster decisions will be less cooperative. Conversely, the hypothesis that intuition preferentially supports prosocial behaviour, whereas reflection leads to increased selfishness, predicts that faster decisions will be more cooperative.

As a first test of these competing hypotheses, we conducted a one-shot public goods game^{5–8} (PGG) with groups of four participants.

We recruited 212 subjects from around the world using the online labour market Amazon Mechanical Turk (AMT)¹⁹. AMT provides a reliable subject pool that is more diverse than a typical sample of college undergraduates (see Supplementary Information, section 1). In accordance with standard AMT wages, each subject was given US\$0.40 and was asked to choose how much to contribute to a common pool. Any money contributed was doubled and split evenly among the four group members (see Supplementary Information, section 3, for experimental details).

Figure 1a shows the fraction of the endowment contributed in the slower half of decisions compared to the faster half. Faster decisions result in substantially higher contributions compared with slower decisions (rank sum test, $P = 0.007$). Furthermore, as shown in Fig. 1b, we see a consistent decrease in contribution amount with

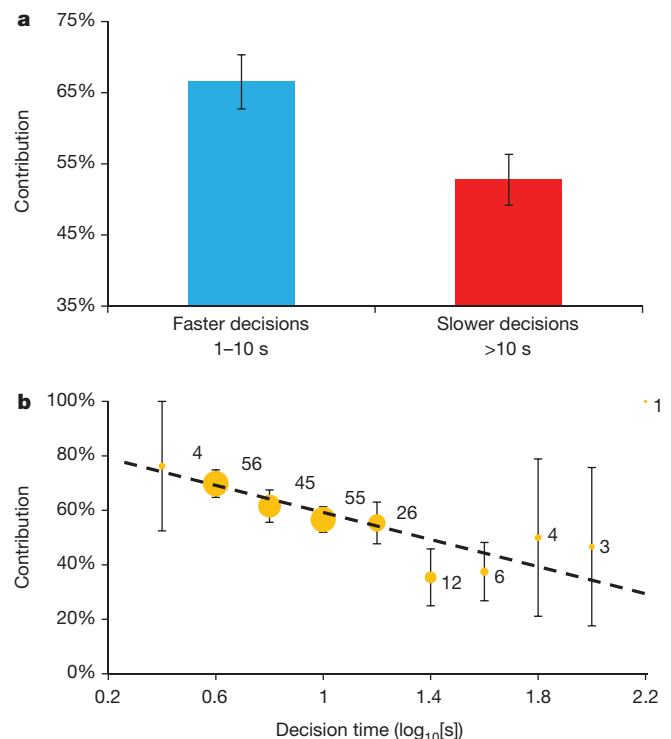


Figure 1 | Faster decisions are more cooperative. Subjects who reach their decisions more quickly contribute more in a one-shot PGG ($n = 212$). This suggests that the intuitive response is to be cooperative. **a**, Using a median split on decision time, we compare the contribution levels of the faster half versus slower half of decisions. The average contribution is substantially higher for the faster decisions. **b**, Plotting contribution as a function of \log_{10} -transformed decision time shows a negative relationship between decision time and contribution. Dot size is proportional to the number of observations, listed next to each dot. Error bars, mean \pm s.e.m. (see Supplementary Information, sections 2 and 3, for statistical analysis and further details).

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increasing decision time (Tobit regression, coefficient = -15.84 , $P = 0.019$; see Supplementary Information, sections 2 and 3, for statistical details). These findings suggest that intuitive responses are more cooperative.

Next we examined data from all of our previously published social dilemma experiments for which decision time data were recorded^{17,20–22}. In these studies, conducted in the physical laboratory with college students, the experimental software automatically recorded decision times, but these data had not been previously analysed. To examine the psychology that subjects bring with them into the laboratory, we focused on play in the first round of each experimental session. In a one-shot prisoner's dilemma ($n = 48$)²⁰, a repeated prisoner's dilemma with execution errors ($n = 278$)²¹, a repeated prisoner's dilemma with and without costly punishment ($n = 104$)²², and a repeated PGG with and without reward and/or punishment ($n = 192$)⁷, we find the same negative relationship between decision time and cooperation (see Supplementary Information, section 4, for details). These results show the robustness of our decision-time findings: across a range of experimental designs, and with students in the physical laboratory as well as with an international online sample, faster decisions are associated with more prosociality.

We now demonstrate the causal link between intuition and cooperation suggested by these correlational studies. To do so, we recruited another 680 subjects on AMT and experimentally manipulated their decision times in the same one-shot PGG used above. In the 'time pressure' condition, subjects were forced to reach their decision quickly (within 10 s). Subjects in this condition have less time to reflect than in a standard PGG, and therefore their decisions are expected to be more intuitive. In the 'time delay' condition, subjects were instructed to carefully consider their decision and forced to wait for at least 10 s before choosing a contribution amount. Thus, in this condition, decisions are expected to be driven more by reflection (see Supplementary Information, section 5, for experimental details).

The results (Fig. 2a) are consistent with the correlational observations in Fig. 1. Subjects in the time-pressure condition contribute significantly more money on average than subjects in the time-delay condition (rank sum, $P < 0.001$). Moreover, we find that both manipulation conditions differ from the average behaviour in the baseline experiment in Fig. 1, and in the expected directions: subjects under time-pressure contribute more than unconstrained subjects (rank sum, $P = 0.058$), whereas subjects who are instructed to reflect and delay their decision contribute less than unconstrained subjects (rank sum, $P = 0.028$), although the former difference is only marginally significant. See Supplementary Information, section 5, for regression analyses.

Additionally, we recruited 211 Boston-area college students and replicated our time-constraint experiment in the physical laboratory with tenfold higher stakes (Fig. 2b). We find again that subjects in the time-pressure condition contribute significantly more money than subjects in the time-delay condition (rank sum, $P = 0.032$). We also assessed subjects' expectations about the behaviour of others in their group, and find no significant difference across conditions (rank sum, $P = 0.360$). Thus, subjects forced to respond more intuitively seem to have more prosocial preferences, rather than simply contributing more because they are more optimistic about the behaviour of others (see Supplementary Information, section 6, for experimental details and analysis).

We next used a conceptual priming manipulation that explicitly invokes intuition and reflection²³. We recruited 343 subjects on AMT to participate in a one-shot PGG experiment. The first condition promotes intuition relative to reflection: before reading the PGG instructions, subjects were assigned to write a paragraph about a situation in which either their intuition had led them in the right direction, or careful reasoning had led them in the wrong direction. Conversely, the second condition promotes reflection: subjects were asked to write about either a situation in which intuition had led them in the wrong

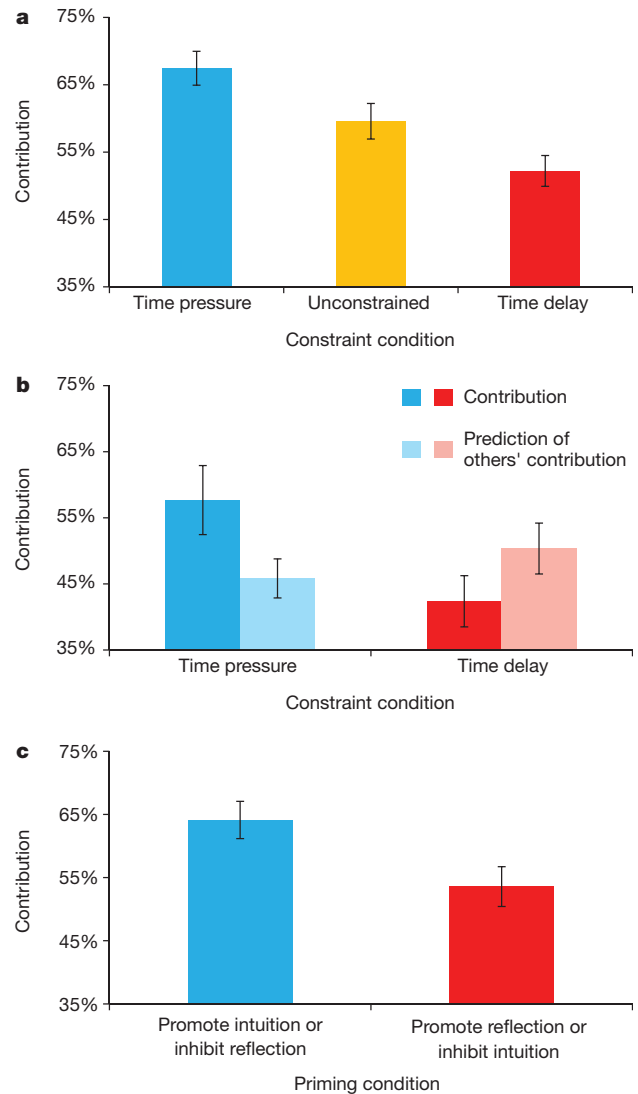


Figure 2 | Inducing intuitive thinking promotes cooperation. **a**, Forcing subjects to decide quickly (10 s or less) results in higher contributions, whereas forcing subjects to decide slowly (more than 10 s) decreases contributions ($n = 680$). This demonstrates the causal link between decision time and cooperation suggested by the correlation shown in Fig. 1. **b**, We replicate the finding that forcing subjects to decide quickly promotes cooperation in a second study run in the physical laboratory with tenfold larger stakes ($n = 211$). We also find that the time constraint has no significant effect on subjects' predictions concerning the average contributions of other group members. Thus, the manipulation acts through preferences rather than beliefs. **c**, Priming intuition (or inhibiting reflection) increases cooperation relative to priming reflection (or inhibiting intuition) ($n = 343$). This finding provides further evidence for the specific role of intuition versus reflection in motivating cooperation, as suggested by the decision time studies. Error bars, mean \pm s.e.m. (see Supplementary Information, sections 5–7, for statistical analysis and further details).

direction, or careful reasoning had led them in the right direction. Consistent with the seven experiments described above, we find that contributions are significantly higher when subjects are primed to promote intuition relative to reflection (Fig. 2c; rank sum, $P = 0.011$; see Supplementary Information, section 8, for experimental details and analysis).

These results therefore raise the question of why people are intuitively predisposed towards cooperation. We propose the following mechanism: people develop their intuitions in the context of daily life, where cooperation is typically advantageous because many important interactions are repeated^{1,2,21,22}, reputation is often at

stake^{3,5,6,20} and sanctions for good or bad behaviour might exist^{4,6-8}. Thus, our subjects develop cooperative intuitions for social interactions and bring these cooperative intuitions with them into the laboratory. As a result, their automatic first response is to be cooperative. It then requires reflection to overcome this cooperative impulse and instead adapt to the unusual situation created in these experiments, in which cooperation is not advantageous.

This hypothesis makes clear predictions about individual difference moderators of the effect of intuition on cooperation, two of which we now test. First, if the effects described above result from intuitions formed through ordinary experience, then greater familiarity with laboratory cooperation experiments should attenuate these effects. We test this prediction on AMT with a replication of our conceptual priming experiment. As predicted, we find a significant interaction between prime and experience: it is only among subjects naive to the experimental task that promoting intuition increases cooperation (Fig. 3a; see Supplementary Information, section 9, for experimental details and statistical analysis).

This mechanism also predicts that subjects will only find cooperation intuitive if they developed their intuitions in daily-life settings in which cooperation was advantageous. Even in the presence of repetition, reputation and sanctions, cooperation will only be favoured if enough other people are similarly cooperative^{2,3}. We tested this prediction on AMT with a replication of our baseline correlational study. As predicted, it is only among subjects that report having mainly cooperative daily-life interaction partners that faster decisions are

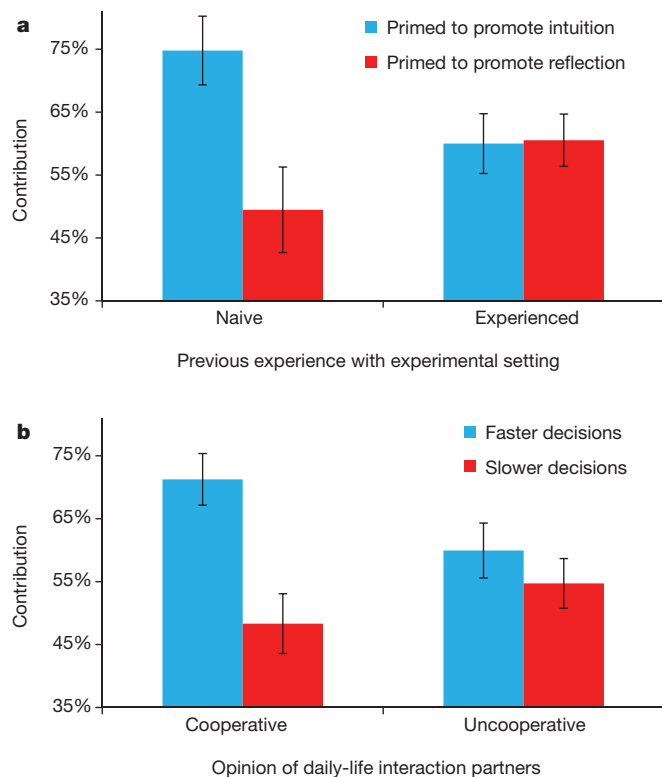


Figure 3 | Evidence that cooperative intuitions from daily life spill over into the laboratory. Two experiments validate predictions of our hypothesis that subjects develop their cooperative intuitions in the context of daily life, in which cooperation is advantageous. **a**, Priming that promotes reliance on intuition increases cooperation relative to priming promoting reflection, but only among naive subjects that report no previous experience with the experimental setting where cooperation is disadvantageous ($n = 256$). **b**, Faster decisions are associated with higher contribution levels, but only among subjects who report having cooperative daily-life interaction partners ($n = 341$). As in Fig. 1a, a median split is carried out on decision times, separating decisions into the faster versus slower half. Error bars, mean \pm s.e.m. (see Supplementary Information, sections 9 and 10, for statistical analysis and further details).

associated with higher contributions (Fig. 3b; see Supplementary Information, section 10, for experimental details and statistical analysis).

Thus, there are some people for whom the intuitive response is more cooperative and the reflective response is less cooperative; and there are other people for whom both the intuitive and reflective responses lead to relatively little cooperation. But we find no cases in which the intuitive response is reliably less cooperative than the reflective response. As a result, on average, intuition promotes cooperation relative to reflection in our experiments.

By showing that people do not have a single consistent set of social preferences, our results highlight the need for more cognitively complex economic and evolutionary models of cooperation, along the lines of recent models for non-social decision-making^{17,24-26}. Furthermore, our results suggest a special role for intuition in promoting cooperation²⁷. For further discussion, and a discussion of previous work exploring behaviour in economic games from a dual-process perspective, see Supplementary Information, sections 12 and 13.

On the basis of our results, it may be tempting to conclude that cooperation is 'innate' and genetically hardwired, rather than the product of cultural transmission. This is not necessarily the case: intuitive responses could also be shaped by cultural evolution²⁸ and social learning over the course of development. However, our results are consistent with work demonstrating spontaneous helping behaviour in young children²⁹. Exploring the role of intuition and reflection in cooperation among children, as well as cross-culturally, can shed further light on this issue.

Here we have explored the cognitive underpinnings of cooperation in humans. Our results help to explain the origins of cooperative behaviour, and have implications for the design of institutions that aim to promote cooperation. Encouraging decision-makers to be maximally rational may have the unintended side-effect of making them more selfish. Furthermore, rational arguments about the importance of cooperating may paradoxically have a similar effect, whereas interventions targeting prosocial intuitions may be more successful³⁰. Exploring the implications of our findings, both for scientific understanding and public policy, is an important direction for future study: although the cold logic of self-interest is seductive, our first impulse is to cooperate.

METHODS SUMMARY

Across studies 1, 6, 8, 9 and 10, a total of 1,955 subjects were recruited using AMT¹⁹ to participate in one of a series of variations on the one-shot PGG, played through an online survey website. Subjects received \$0.50 for participating, and could earn up to \$1 more based on the PGG. In the PGG, subjects were given \$0.40 and chose how much to contribute to a 'common project'. All contributions were doubled and split equally among four group members. Once all subjects in the experiment had made their decisions, groups of four were randomly matched and the resulting payoffs were calculated. Each subject was then paid accordingly through the AMT payment system, and was informed about the average contribution of the other members of his or her group. No deception was used.

In study 7, a total of 211 subjects were recruited from the Boston, Massachusetts, metropolitan area through the Harvard University Computer Laboratory for Experiment Research subject pool to participate in an experiment at the Harvard Decision Science Laboratory. Participation was restricted to students under 35 years of age. Subjects received a \$5 show-up fee for arriving on time and had the opportunity to earn up to an additional \$12 in the experiment. Subjects played a single one-shot PGG through the same website interface used in the AMT studies, but with tenfold larger stakes (maximum earnings of \$10). Subjects were then asked to predict the average contribution of their other group members and had the chance to win up to an additional \$2 based on their accuracy.

These experiments were approved by the Harvard University Committee on the Use of Human Subjects in Research.

For further details of the experimental methods, see Supplementary Information.

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1. Online recruitment procedure using Amazon Mechanical Turk

Subjects for many of the experiments in this paper were recruited using the online labor market Amazon Mechanical Turk (AMT)¹⁻³. AMT is an online labor market in which employers can employ workers to complete short tasks (generally less than 10 minutes) for relatively small amounts of money (generally less than \$1). Workers receive a baseline payment and can be paid an additional bonus depending on their performance. This makes it easy to run incentivized experiments: the baseline payment is a 'show-up fee,' and the bonus payment is determined by the points earned in the experiment.

One major advantage of AMT is it allows experimenters to easily expand beyond the college student convenience samples typical of most economic game experiments. Among American subjects, AMT subjects have been shown to be significantly more nationally representative than college student samples⁴. Furthermore, workers on AMT are from all around the world: in our experiments, 37% of the subjects lived outside of the United States, with more than half of the non-American subjects living in India. In our statistical analyses below, we show that there is no significant difference in the effects we are studying between US and non-US subjects. This diversity of subject pool participants is particularly helpful in the present study, given our focus on intuitive motivations that may vary based on life experience.

Of course, issues exist when running experiments online that do not exist in the traditional laboratory. Running experiments online necessarily involves some loss of control, since the workers cannot be directly monitored as in the traditional lab; hence, experimenters cannot be certain that each observation is the result of a single person (as opposed to multiple people making joint decisions at the same computer), or that one person does not participate multiple times (although AMT goes to great lengths to try to prevent this, and we use filtering based on IP address to further reduce repeat play). Moreover, although the sample of subjects in AMT experiments is more diverse than samples using college undergraduates, we are obviously restricted to people that participate in online labor markets.

To address these potential concerns, recent studies have explored the validity of data gathered using AMT (for an overview, see ref 1). Most pertinent to our study are two quantitative direct replications using economic games. The first shows quantitative agreement in contribution behavior in a repeated public goods game between experiments conducted in the physical lab and those conducted using AMT with approximately 10-fold lower stakes². The second replication again found quantitative agreement between the lab and AMT with 10-fold lower stakes, this time in cooperation in a one-shot Prisoner's Dilemma³. The latter study also conducted a survey on the extent to which subjects trust that they will be paid as described in the instructions (a critical element for economic game experiments) and found that AMT subjects were only slightly less trusting than subjects from a physical laboratory subject pool at Harvard University (trust of 5.4 vs 5.7 on a 7-point Likert scale). A third study compared behavior on AMT in games using \$1 stakes with unincentivized games, examining the public goods game, the dictator game, the ultimatum game and the trust game⁵. Consistent with previous research in the physical laboratory, adding stakes was only found to affect play in the dictator game, where subjects were significantly more generous in the unincentivized dictator game compared to the \$1 dictator game. Furthermore, the average behavior in these games on AMT was within the range of

averages reported from laboratory studies, demonstrating further quantitative agreement between AMT and the physical lab.

In additional studies, it has also been shown that AMT subjects display a level of test-retest reliability similar to what is seen in the traditional lab on measures of political beliefs, self-esteem, Social Dominance Orientation, and Big-Five personality traits⁴, as well as belief in God, age, gender, education level and income^{1,6}; and do not differ significantly from college undergraduates in terms of attentiveness or basic numeracy skills, as well as demonstrating similar effect sizes as undergraduates in tasks examining framing effects, the conjunction fallacy, and outcome bias⁷. The present studies add another piece of evidence for the validity of experiments run on AMT by comparing our AMT studies with decision time data from previous laboratory experiments (Main text Figure 2): Both online and in the lab, subjects that take longer to make their decisions are less cooperative.

2. Log-transforming decision times

In several of our experiments, we predict cooperation as a function of decision times. However, the distribution of decision times (measured in seconds) is heavily right-skewed, as we did not impose a maximum decision time (decision times for the baseline decision time experiment, Study 1, are shown in Figure S1a). Thus linear regression is not appropriate using non-transformed decision times, as the few decision times that are extremely large exert undue influence on the fit of the regression. To address this issue, we log₁₀-transform decision times in all analyses (log₁₀ transformed decision times for the baseline decision time experiment are shown in Figure S1b). As reported below, our main results are qualitatively similar if we instead analyze non-transformed decision times and exclude outliers (subjects with decision times more than 3 standard deviations above the mean decision time).

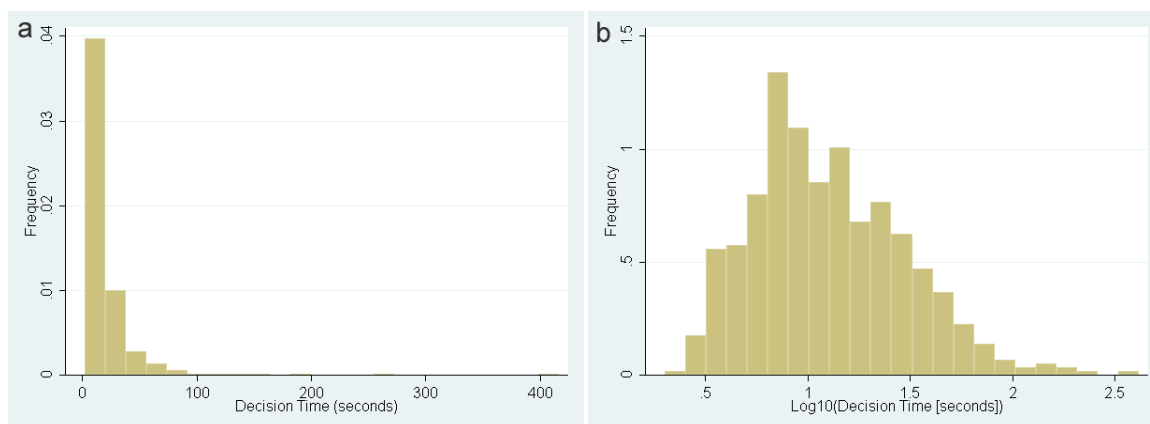


Figure S1. (a) Distribution of decision times in the baseline experiment. **(b)** Distribution of log₁₀ transformed decision times in the baseline experiment.

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3. Study 1: Correlational decision time experiment on AMT

Methods

In the baseline experiment (main text Figure 1), subjects were recruited using AMT and told they would receive a \$0.50 show-up fee for participating, and would have the chance to earn up to an additional \$1.00 based on the outcome of the experiment. After accepting the task, subjects were redirected to website where they participated in the study.

First subjects were shown the Instructions Screen, where they read a set of instructions describing the following one-shot public goods game: Players interacted in groups of 4; each player received 40 cents; players chose how many cents to contribute to the group (in increments of 2 to avoid fractional cent amounts) and how many to keep; all contributions were doubled and split equally by all group members. After they were finished reading the instructions, subjects clicked OK and were taken to the Contribution Screen. Here they entered their contribution decision and clicked OK. The website software recorded how long it took each subject to make her decision (in seconds), that is, the amount of time she spent on the Contribution Screen. Time spent on the Instructions Screen did not count towards our decision time measure. (Time spent on the Instructions Screen is examined below in Study 10 and shown not to influence cooperation.)

After entering their contribution amount, subjects were taken to the Comprehension Screen in which they answered two comprehension questions to determine whether they understood the payoff structure: “What level of contribution earns the highest payoff for the group as a whole?” (correct answer = 40) and “What level of contribution earns the highest payoff for you personally?” (correct answer = 0). Subjects were then taken to a demographic questionnaire and given a completion code.

We included comprehension questions after the contribution decision, rather than before as is typical in most laboratory experiments, because we were concerned about the possibility of pushing all of our subjects into a reflective mindset prior to their decision-making. (In SI Section 14, we discuss a supplemental experiment that validates this concern by demonstrating that subjects who complete comprehension questions, including a detailed payoff calculation, before making their decision choose to contribute significantly less than those who complete the comprehension questions afterward). Importantly, we show that our result is robust to controlling for comprehension, indicating that the negative relationship between decision time and cooperation is not driven by a lack of comprehension among the faster responders.

Once the decisions of all subjects had been collected, subjects were randomly matched into groups of 4, payoffs were calculated, and bonuses were paid through AMT. Payoffs were determined exactly as described in the instructions, and no deception was used.

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Results

We begin with descriptive statistics:

| N=212 | Mean | Std |
|---------------------------------|-------|-------|
| Contribution | 23.83 | 15.39 |
| Decision time | 15.92 | 22.96 |
| Log10(Decision time) | 1.03 | 0.34 |
| Age | 28.02 | 8.73 |
| Gender (0=M, 1=F) | 0.42 | 0.49 |
| US Residency (0=N, 1=Y) | 0.45 | 0.49 |
| Failed Comprehension (0=N, 1=Y) | 0.28 | 0.45 |

In the baseline experiment, we ask how the amount of time a subject takes to make her contribution decision relates to the amount contributed. To do so, we perform a set of Tobit regressions with robust standard errors, taking contribution amount as the dependent variable (Table S1). Tobit regression allows us to account for the fact that contribution amounts were censored at 0 and 40 (the minimum and maximum contribution amounts).

In the first regression, we take log-10 transformed decision time as the independent variable, and find a significant negative relationship. In the second regression, we show that this effect remains significant when including controls for age, gender, US residency, and failing to correctly answering the comprehension questions, as well as dummies for education level. In the third regression, we show that this effect also remains significant when excluding extreme decision times for which there was comparatively little data (regression 3 includes only subjects with $0.6 < \log_{10}(\text{decision time}) < 1.2$). We also continue to find a significant negative relationship between decision time and contribution (coeff=-0.497, $p=0.018$) using non-transformed decision times and excluding outliers (subjects with decision times more than 3 standard deviations above the mean [mean decision time = 15.9, std = 23.0 implies a cutoff of 85 seconds]) and including controls for age, gender, US residency and comprehension.

It is worthwhile to note that the average level of contribution (59.6% of the endowment) of our subjects recruited from AMT is well within the range of average contribution levels observed in previous studies. Our PGG uses a marginal per capita return (MPCR) on public good investment of 0.5 (for every cent contributed, each player earns 0.5 cents). We used an MPCR of 0.5, rather than the value of 0.4 used in many previous studies (where contributions are multiplied by 1.6 and split amongst 4 group members), to create more easily divisible numbers and therefore simpler instructions for the AMT workers, many of whom are less sophisticated than university students. Previous lab studies that used an MPCR of 0.5 report average contribution levels of 40%–70%⁸⁻¹², which are in line with our value of 59.6%. Thus our experiment adds to the growing body of literature demonstrating the validity of data gathered on AMT.

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Table S1. PGG contribution regressed against decision time.

| | (1) | (2) | (3) |
|---------------------------------------|----------|----------|----------|
| Decision time (log10 seconds) | -18.42** | -15.84** | -29.63** |
| | (7.285) | (6.772) | (15.06) |
| US Residency (0=N, 1=Y) | | 2.829 | 2.210 |
| | | (5.113) | (5.666) |
| Age | | 0.695 | 0.502 |
| | | . | . |
| Gender (0=M, 1=F) | | 0.402 | 2.598 |
| | | (4.104) | (4.794) |
| Failed Comprehension (0=N, 1=Y) | | -5.886 | -8.789 |
| | | (4.459) | (5.306) |
| Education dummies | No | Yes | Yes |
| Constant | 49.01*** | 25.91 | 25.21 |
| | (8.091) | (22.99) | (24.27) |
| Observations | 212 | 212 | 156 |
| Robust standard errors in parentheses | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | |

4. Studies 2 - 5: Reanalysis of previously published experiments run in the physical laboratory

Here we analyze decision time data from all of our previously published cooperation experiments for which decision times were recorded¹³⁻¹⁶. These experiments were conducted in the physical laboratory with Boston area college student participants, using the experimental software Ztree¹⁷. We leverage the fact that Ztree automatically records decision times. Thus, although these experiments were not originally conducted to explore the role of intuitive versus reflective cognitive processes, that fact that we find the same negative relationship between cooperation and decision time found in our online experiments demonstrates the robustness of the effect to variations in experimental design, subject pool, and online versus physical laboratory recruitment/implementation.

We note that unlike our AMT experiments, in these lab studies the subjects completed simple comprehension quizzes prior to beginning the experiment (with the exception of ref 16 which did not have a comprehension quiz). The details of these quizzes varied across experiments, but none involved the multiple detailed payoff calculations sometimes used in PGG laboratory experiments. Typical questions in our experiments, where subjects played Prisoner's Dilemma games, included "What is the probability of a subsequent round after round 1? After round 10?" or reading off entries in a Prisoner's Dilemma payoff matrix, such as "If you chose A and the other person chooses B, how many points do you get?" See SI Section 14 for a supplemental experiment exploring the effect of asking comprehension questions with detailed payoff calculations before versus after the contribution decision.

We begin by analyzing the control treatment from ref 13 in which 48 subjects played a series of one-shot Prisoner's Dilemma games. In each interaction, subjects were randomly paired, and each pair simultaneously chose to either pay 10 units to give their partner 30 units (i.e. cooperate) or to do nothing (i.e. defect). After making a decision and being informed of their partner's decision, subjects were randomly rematched with new partners for another interaction. Players were given no information about their partner's play in previous games. In total, 29 such interactions occurred. We focus on the first decision subjects made in the experimental session (i.e. the first interaction). The first decision most cleanly represents the intuitions subjects bring into the laboratory by minimizing in-game learning, and also maximizes comparability to our one-shot experiments.

Examining cooperation in the first interaction (using logistic regression with robust standard errors), we find a significant negative relationship between cooperation probability and decision time (coeff=-3.42, $p=0.014$; Figure S2A). This relationship continues to exist (coeff=-3.37, $p=0.062$) when excluding decision times with relatively few observations (times less than $10^{0.4}$ seconds or more than $10^{1.2}$ seconds). Using logistic regression with robust standard errors clustered on subject and session, we continue to find a significant effect (coeff=-0.95, $p=0.047$) when considering the first 5 interactions and controlling for interaction number, albeit with a smaller coefficient; but no longer find a significant effect when considering all 29 interactions (coeff=-0.03, $p=0.931$).

Table S2. Cooperation in series of 1-shot PDs (data from Pfeiffer et al. (2012) J Royal Society Interface). Logistic regression.

| | (1) | (2) | (3) | (4) | (5) |
|--|---------------|----------|-----------|-----------|----------|
| | Interaction 1 | Ints 1-5 | Ints 1-5 | All Ints | All Ints |
| Decision time (log10 seconds) | -3.417** | -0.243 | -0.951** | 0.268 | -0.0261 |
| | (1.394) | (0.432) | (0.480) | (0.306) | (0.301) |
| Interaction # | | | -0.342*** | | -0.0542 |
| | | | (0.115) | | (0.0384) |
| Constant | 2.939** | -0.370 | 1.092* | -1.474*** | -0.567 |
| | (1.308) | (0.546) | (0.632) | (0.401) | (0.639) |
| Observations | 48 | 240 | 240 | 1,392 | 1,392 |
| Robust standard errors in parentheses | | | | | |
| *** $p<0.01$, ** $p<0.05$, * $p<0.1$ | | | | | |

When considering ref 13, we focus on the control condition described above because it demonstrates that our effect exists in one-shot games in the physical laboratory. The effect is not restricted, however, to the control condition. If we instead analyze the data from the 176 subjects that played a stochastically repeated indirect reciprocity game, we continue to find a negative relationship between decision time and cooperation. In these experiments, the setup is the same as the control, except that there is a reputation system such that after each PD, subjects' reputations are updated (to be either 'good' or 'bad') based on an explicit assignment rule that is known to the subjects. There were three such conditions, with the assignment rule varying across conditions. Furthermore, subjects were allowed to buy and sell their reputations in two of the conditions. See ref 13 for more details.

Examining cooperation in the first interaction (using logistic regression with robust standard errors), we find a significant negative relationship between cooperation probability and decision time (coeff=-1.85, $p=0.002$). This relationship continues to hold (coeff=-1.46, $p=0.027$) when including condition dummies. Using logistic regression with robust standard errors clustered on subject and session, we continue to find a significant effect when considering all 29 interactions (no controls: coeff=-1.31, $p<0.001$; controlling for round number and condition dummies: coeff = -0.96, $p<0.001$). Ref 13 also included a set of fixed-length game conditions that we do not reanalyze as the decision time data for those conditions are not available.

Next we consider ref 15, where 278 subjects played a series of stochastically repeated 2-player Prisoner's Dilemma games with execution errors. In each round, there was a 1/8 probability of a player's move being switched to the opposite, and a 7/8 probability of a subsequent round occurring. The benefit-to-cost ratio of cooperation was varied across four different conditions, with $b/c=[1.5, 2, 2.5 \text{ and } 4]$. Examining cooperation in the first round of the first interaction (using logistic regression with robust standard errors and including condition dummies), we find a significant negative relationship between intended cooperation probability and decision time (coeff=-1.43, $p=0.005$, including controls for b/c ratio; Figure S2B). This relationship continues to exist (coeff=-1.15, $p=0.053$) when excluding decision times with relatively few observations (times of than 10 seconds). Moreover, we continue to find a significant effect when considering all decisions over the course of the session (standard errors clustered on subject and group, coeff=-0.97, $p<0.001$, including controls for b/c ratio, interaction number and round number), albeit with a smaller coefficient. Regressions are shown in Table S3.

Table S3. Cooperation in stochastically repeated PD with execution errors (data from Fudenberg et al 2012 AER). Logistic regression.

| | (1) | (2) | (4) | (5) | (6) |
|--|--------------|--------------|---------------|---------------|---------------|
| | 1st decision | 1st decision | All decisions | All decisions | All decisions |
| Decision time (log10 seconds) | -1.295*** | -1.427*** | -0.731*** | -0.777*** | -0.970*** |
| | (0.478) | (0.504) | (0.161) | (0.119) | (0.141) |
| Interaction # | | | | | 0.0199 |
| | | | | | (0.0124) |
| Round # | | | | | -0.187*** |
| | | | | | (0.0122) |
| Condition dummies | No | Yes | No | Yes | Yes |
| Constant | 0.937*** | 1.342*** | 0.132 | 0.459*** | 1.296*** |
| | (0.222) | (0.312) | (0.156) | (0.138) | (0.189) |
| Observations | 278 | 278 | 26,584 | 26,584 | 26,584 |
| Robust standard errors in parentheses | | | | | |
| *** $p<0.01$, ** $p<0.05$, * $p<0.1$ | | | | | |

Next we analyze ref 14, where 104 subjects played a series of stochastically repeated 2-player Prisoner's Dilemma games (without execution errors). After every round, there was a 3/4 probability

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of a subsequent round. The benefit-to-cost ratio of cooperation and the availability of a 3rd option for costly punishment (pay 1 for the other to lose 4) were varied across treatments (4 treatments: low b/c without punishment, low b/c with punishment, high b/c without punishment, high b/c with punishment). Examining cooperation in the first round of the first interaction (using logistic regression with robust standard errors and including dummies for treatment), we again find a significant negative relationship between cooperation probability and decision time (coeff=-2.67, $p=0.018$; Figure S2C). This relationship continues to hold (coeff=-2.78, $p=0.031$) when excluding decision times with relatively few observations (times less than $10^{0.4}$ seconds or more than $10^{1.2}$ seconds). Furthermore, we continue to find a significant relationship when analyzing all decisions over the course of the session (standard errors clustered on subject and group, coeff=-0.53, $p=0.002$), although the coefficient is smaller than in the first period. Regressions are shown in Table S4.

Table S4. Cooperation in stochastically repeated PD with/without costly punishment (data from Dreber et al 2008 Nature). Logistic regression.

| | (1) | (2) | (4) | (5) | (6) |
|--|--------------|--------------|---------------|---------------|---------------|
| | 1st decision | 1st decision | All decisions | All decisions | All decisions |
| Decision time (log10 seconds) | -2.741** | -2.660** | 0.254 | -0.528*** | -0.554*** |
| | (1.107) | (1.123) | (0.203) | (0.171) | (0.178) |
| Interaction # | | | | | -0.0128* |
| | | | | | (0.00752) |
| Round # | | | | | -0.361*** |
| | | | | | (0.0313) |
| Condition dummies | No | Yes | No | Yes | Yes |
| Constant | 2.887*** | 2.522*** | -0.275** | 0.568*** | 1.741*** |
| | (0.882) | (0.961) | (0.117) | (0.210) | (0.291) |
| Observations | 104 | 104 | 8,120 | 8,120 | 8,120 |
| Robust standard errors in parentheses | | | | | |
| *** $p<0.01$, ** $p<0.05$, * $p<0.1$ | | | | | |

Finally, we consider ref 16, where 192 subjects played a repeated public goods game with persistent groups and identities. Subjects were given no information regarding the length of the game, which lasted 50 rounds. The possibility of targeted interaction was varied across four conditions: control PGG, PGG with costly punishment, PGG with costly reward, and PGG with both punishment & reward. As in our 1-shot PGG, tobit with robust standard errors find a significant negative correlation between first round contribution (0-20) and decision time (coeff=-26.38, $p=0.001$, including condition dummies; Figure S2D). This relationship continues to hold (coeff=-23.01, $p=0.006$) when excluding decision times with relatively few observations (times less than $10^{0.6}$ seconds or more than $10^{1.2}$ seconds).

The relationship between contribution and decision time, however, decays with experience: we find a significant effect when analyzing the first 10 periods (linear regression with standard errors clustered on subject and group, $\text{coeff}=-3.26$, $p=0.030$), but not when analyzing periods 11 to 50 (linear regression with standard errors clustered on subject and group, $\text{coeff}=-1.71$, $p=0.275$). We use linear regression rather than Tobit regression for the multi-round analyses as to our knowledge, the statistical software available to us cannot do multi-level clustering with Tobit regressions. Regressions are shown in Table S5.

Table S5. Contribution in repeated PGG with/without targeted interactions (data from Rand et al 2009 Science). Note regressions 1 and 2 use Tobit regression, while regression 3-6 use linear regression clustered on subject and group.

| | (1) | (2) | (3) | (4) | (5) | (6) |
|--|-----------|-----------|------------|------------|-------------|-------------|
| | Round 1 | Round 1 | Round 1-10 | Round 1-10 | Round 11-50 | Round 11-50 |
| Decision time (log10 seconds) | -25.92*** | -26.38*** | -3.424** | -3.258** | 1.63 | -1.71 |
| | (7.430) | (7.804) | -1.403 | -1.49 | -1.769 | -1.563 |
| Condition dummies | No | Yes | No | Yes | No | Yes |
| Constant | 23.46*** | 23.47*** | 15.95*** | 17.61*** | 13.41*** | 17.83*** |
| | -2.664 | -3.249 | -1.298 | -1.359 | -1.415 | -1.627 |
| Observations | 192 | 192 | 1,920 | 1,920 | 7,680 | 7,680 |
| R-squared | - | - | 0.01 | 0.079 | 0.001 | 0.25 |
| Robust standard errors in parentheses | | | | | | |
| *** $p<0.01$, ** $p<0.05$, * $p<0.1$ | | | | | | |

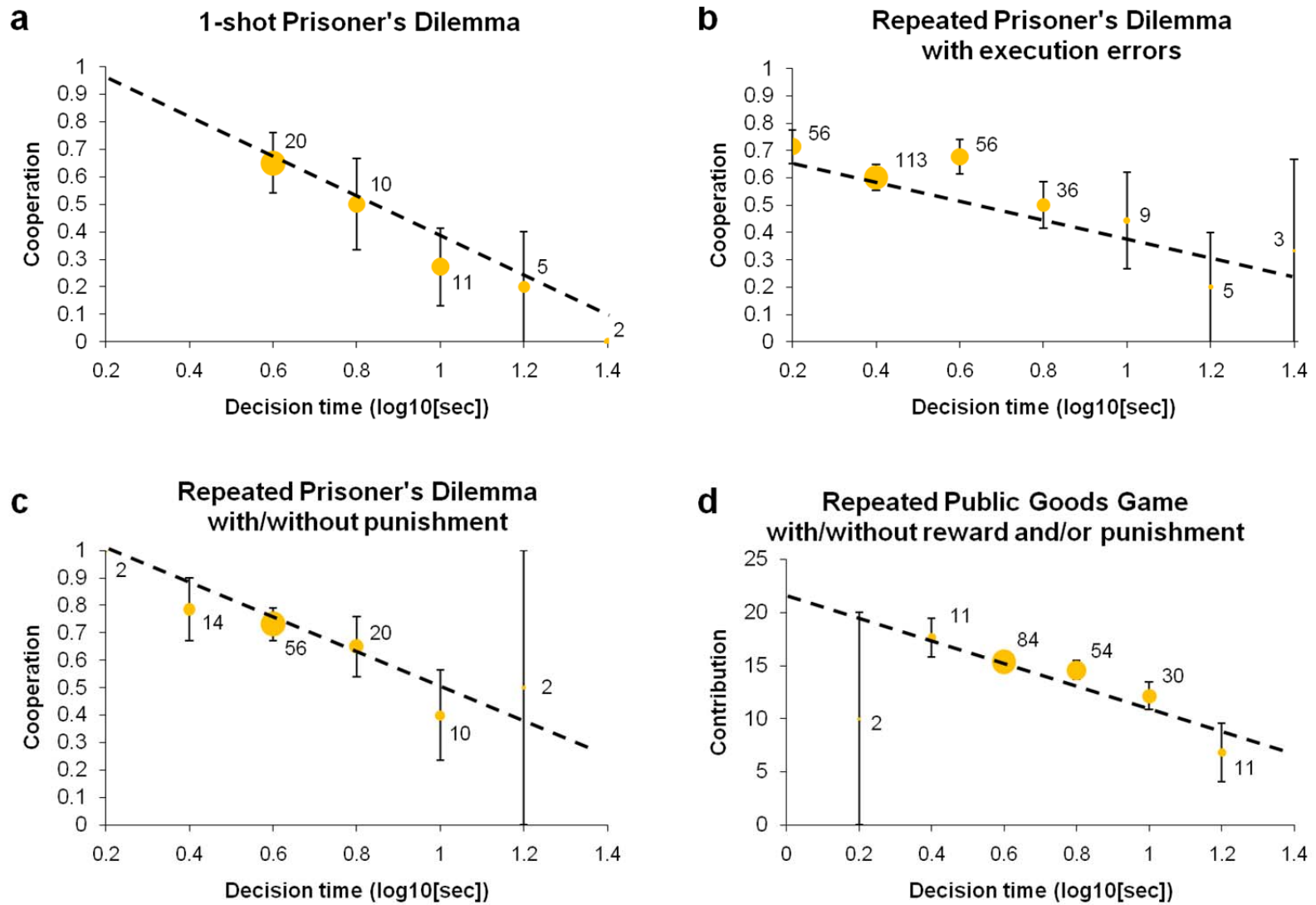


Figure S2. Reanalysis of previous experiments showing the first decision of the session in a series of 1-shot Prisoner's Dilemmas¹³ (a), a repeated Prisoner's Dilemma with execution errors¹⁵ (b), a repeated Prisoner's Dilemma with or without costly punishment¹⁴ (c), and a repeated PGG with or without reward and/or punishment¹⁶ (d). Error bars indicate standard error of the mean. Dot size is proportional to number of observations, which are indicated next to each dot.

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5. Study 6: Time pressure / time delay experiment on AMT

Methods

For Study 6, subjects were again recruited online using AMT. The experimental design was identical to that of the AMT correlational decision time experiment (Study 1), except that one additional piece of text was added to the screen on which subjects entered their PGG decision.

In the ‘time pressure’ condition, subjects were asked to make their decision as quickly as possible, and were informed that if they did not enter their decision within 10 seconds they would not be allowed to participate.

In the ‘time delay’ condition, subjects were asked to think carefully about their decision before making it, and were informed that if they must wait at least 10 seconds before entering their decision or else they would not be allowed to participate.

Subjects in the time pressure condition who took longer than 10 seconds were excluded, as were subjects in the time delay condition who took less than 10 seconds. However, the main result continues to hold even if these subjects are not excluded – see statistical analysis below.

Results

We begin with descriptive statistics:

| | Subjects that obeyed time constraint | | | | All subjects | | | |
|---------------------------|--------------------------------------|-------|---------------------|-------|------------------------|-------|---------------------|-------|
| | Time pressure N=194 | | Time delay N=249 | | Time pressure N=372 | | Time delay N=308 | |
| | Mean | Std | Mean | Std | Mean | Std | Mean | Std |
| Contribution | 26.98 | 14.06 | 20.88 | 14.42 | 23.31 | 14.65 | 21.49 | 14.57 |
| Decision time | 6.99 | 2.06 | 34.83 | 42.28 | 12.13 | 8.87 | 28.83 | 39.37 |
| Log10(Decision time) | 0.82 | 0.15 | 1.44 | 0.26 | 1.00 | 0.26 | 1.29 | 0.37 |
| Age | 28.74 | 8.96 | 29.58 | 9.35 | 29.01 | 9.57 | 29.80 | 9.61 |
| Gender (0=M, 1=F) | 0.47 | 0.5 | 0.39 | 0.49 | 0.45 | 0.50 | 0.39 | 0.49 |
| US Residency | 0.57 | 0.5 | 0.43 | 0.5 | 0.46 | 0.50 | 0.41 | 0.49 |
| Failed Comprehension | 0.35 | 0.48 | 0.44 | 0.5 | 0.47 | 0.50 | 0.44 | 0.50 |
| Disobeyed time constraint | - | - | - | - | 0.48 | 0.50 | 0.19 | 0.39 |

In our time constraint experiment, we examine the effect of forcing subjects to make their decision in 10 seconds or less (the ‘time pressure’ condition) versus focusing them to stop and think for at least 10 seconds (the ‘time delay’ condition). To do so we perform a set of Tobit regressions with robust standard errors, taking contribution amount as the dependent variable (Table S6). Regression 1 shows that contributions were significantly lower in the time delay

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condition. Regression 2 shows that this continues to be true when controlling for age, gender, US residency, failing to correctly answering the comprehension questions and education. Regression 3 shows that this effect is robust to including subjects that disobeyed the time constraint.

Table S6. Time pressure condition versus time delay condition.

| | (1) | (2) | (3) |
|---------------------------------------|---------------------|---------------------|----------------------|
| Time pressure condition | 10.91*** (2.474) | 10.59*** (2.450) | 5.535*** (2.022) |
| US Residency (0=N, 1=Y) | | 4.500 (3.062) | 3.805 (2.451) |
| Age | | 0.132 - | 0.329 - |
| Gender (0=M, 1=F) | | 1.345 (2.529) | 0.851 (1.979) |
| Failed comprehension | | -2.865 (2.704) | -0.694 (2.140) |
| Disobeyed time constraint | | | -6.582*** (2.121) |
| Education dummies | No | Yes | Yes |
| Constant | 22.64*** (1.524) | -0.178 (8.588) | -0.839 (6.395) |
| Observations | 443 | 443 | 680 |
| Robust standard errors in parentheses | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | |

In addition to comparing the time pressure and time delay conditions to each other, we now compare both conditions to the baseline from Study 1 (while noting that behavior in the baseline varies substantially depending on reaction time, as per Table S1 above). To do so, we conduct a set of Tobit regressions with robust standard errors on the data from Study 1 and Study 6 combined, creating two binary dummy variables: one indicating participation in the time pressure condition, and the other indicating participation in the time delay condition (Table S7). Regression 1 shows significantly lower contributions in the time delay condition compared to the baseline, and marginally significantly higher contributions in the time pressure condition compared to the baseline. Regression 2 shows that these relationships continue to hold when controlling for US residency, age, gender, failing to correctly answer the comprehension questions and education. Regression 3 shows that these relationships are robust to including subjects that did not obey the time constraint.

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Table S7. Time pressure and delay conditions versus baseline condition from Study 1.

| | (1) | (2) | (3) |
|---------------------------------------|----------|----------|-----------|
| Time delay condition | -6.351** | -5.973** | -6.456*** |
| | (2.511) | (2.512) | (2.434) |
| Time pressure condition | 4.930* | 4.776* | 4.471* |
| | (2.824) | (2.759) | (2.692) |
| US residency (0=N, 1=Y) | | 4.981* | 4.441** |
| | | (2.610) | (2.180) |
| Age | | 0.284** | 0.397*** |
| | | (0.137) | (0.106) |
| Gender (0=M, 1=F) | | 0.769 | 0.572 |
| | | (2.155) | (1.767) |
| Failed comprehension | | -3.294 | -0.670 |
| | | (2.343) | (1.947) |
| Disobeyed time pressure constraint | | | -12.81*** |
| | | | (2.615) |
| Disobeyed time delay constraint | | | 5.920 |
| | | | (3.692) |
| Education dummies | No | Yes | Yes |
| Constant | 29.14*** | 4.040 | 2.116 |
| | (2.027) | (8.221) | (6.402) |
| Observations | 655 | 655 | 892 |
| Robust standard errors in parentheses | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | |

6. Study 7: Time pressure / time delay experiment with belief elicitation in the physical laboratory

Methods

Study 7 was conducted in the Harvard Decision Sciences Laboratory. Subjects were undergraduate and graduate students under 35 years old recruited from schools around the Boston metro area. Subjects received a \$5 show up fee and then interacted anonymously via computers in the lab. The computer interface was identical to that used by subjects recruited on AMT in Study 6, with the following exceptions: Firstly, the stakes were 10-fold higher: each subject was given a \$4 endowment, rather than the \$0.40 endowment used in Study 6. Secondly, we assessed subjects' expectations about the contribution behavior of others in their group^{18,19}. After making a decision about how much to contribute, subjects were taken to a screen in which they were asked to predict the average amount contributed by the three other members of their group. To incentivize this prediction, subjects were informed when reaching the prediction

screen that they could earn up to an additional \$2 depending on the accuracy of their prediction. Specifically, for every 10 cents by which their prediction differed from the actual average, they would lose 5 cents from their additional \$2 payment.

Results

We begin with descriptive statistics:

| | Subjects that obeyed time constraint | | | | All subjects | | | |
|--|--------------------------------------|--------|--------------------|--------|------------------------|--------|---------------------|--------|
| | Time pressure N=55 | | Time delay N=98 | | Time pressure N=102 | | Time delay N=109 | |
| | Mean | Std | Mean | Std | Mean | Std | Mean | Std |
| Contribution | 230.73 | 154.85 | 169.49 | 153.45 | 197.73 | 151.32 | 163.39 | 157.21 |
| Decision time | 8.07 | 1.56 | 26.93 | 15.06 | 11.29 | 4.84 | 24.94 | 15.44 |
| Log10(Decision time) | 0.90 | 0.10 | 1.38 | 0.20 | 1.02 | 0.17 | 1.33 | 0.25 |
| Age | 20.95 | 2.18 | 21.33 | 2.67 | 21.20 | 2.52 | 21.46 | 2.74 |
| Gender (0=M, 1=F) | 0.71 | 0.46 | 0.65 | 0.48 | 0.67 | 0.47 | 0.63 | 0.48 |
| Failed Comprehension | 0.38 | 0.49 | 0.32 | 0.47 | 0.35 | 0.48 | 0.32 | 0.47 |
| Predicted avg contribution of others group members | 201.38 | 114.22 | 183.33 | 116.97 | 182.12 | 110.28 | 177.60 | 116.41 |
| Disobeyed time constraint | - | - | - | - | 0.46 | 0.50 | 0.10 | 0.30 |

First we compare the contribution levels in the time pressure condition and the time delay condition. To do so, we perform a set of Tobit regressions with robust standard errors, taking contribution amount as the dependent variable (Table S8). Regression 1 shows that contributions were significantly higher in the time pressure condition. Regression 2 shows that this continues to be true when controlling for age, gender and failing to correctly answer the comprehension questions (although the p -value on the time pressure condition falls to $p=0.052$). Regression 3 shows that this effect is robust to including subjects that disobeyed the time constraint. Regressions 4 and 5 show that this continues to be true even when controlling for subjects' expectations about the average contribution of the other group members (Regression 4 includes only subjects that obeyed the time constraint, while regression 5 includes all subjects). The robustness to controlling for expectations about others' behavior indicates that the time constraint manipulation is actually making subjects more prosocial, rather than just making them more optimistic about how others will behave (and thus more inclined to reciprocate based on 'conditional cooperation'¹⁸⁻²⁰).

To provide direct evidence that the time constraint manipulation is not altering expectations about the behavior of others, we now perform another set of Tobit regressions with robust standard errors, this time taking predicted average contribution of the other group members as the dependent variable (Table S9). Regression 1 shows no difference in predictions between the two conditions. Regression 2 shows that this continues to be true when controlling for age, gender and failing to correctly answering the comprehension questions. Regression 3 shows that

this is robust to including subjects that disobeyed the time constraint. We also find no difference across conditions in predicted average contribution using a Rank-sum test ($p=0.360$).

Finally, we examine how subjects' contribution compares to their expectation of others. We find that the subjects under time pressure contribute significantly more than they expect others to contribute (Sign-rank, $p=0.024$), whereas subjects forced to reflect contribute slightly less than they expect others to contribute, although the difference is not statistically significant (Sign-rank, $p=0.187$). These results suggest that subjects responding intuitively are not just conforming to what they understand to be the norm, but rather are systematically deviating from the perceived norm and contributing more.

Table S8. Contribution level in time pressure condition versus time delay condition, run in the physical laboratory.

| | (1) | (2) | (3) | (4) | (5) |
|--|---------------------|---------------------|---------------------|----------------------|---------------------|
| Time pressure condition | 99.92** (49.44) | 94.36* (48.58) | 99.47** (45.81) | 71.05** (33.45) | 74.16** (33.22) |
| Age | | 4.178 (7.920) | -2.275 (6.272) | 5.301 (4.860) | 3.236 (4.349) |
| Gender (0=M, 1=F) | | 5.766 (52.92) | 43.95 (41.77) | 53.25 (36.41) | 63.42** (31.55) |
| Failed comprehension | | 126.9*** (48.43) | 79.80** (39.17) | 46.48 (32.05) | 11.31 (28.15) |
| Disobeyed time constraint | | | -116.4** (50.37) | | -53.64 (38.74) |
| Predicted avg contribution of others | | | | 1.655*** (0.167) | 1.496*** (0.144) |
| Constant | 154.8*** (28.88) | 20.70 (179.0) | 145.91 (141.6) | -307.4*** (117.2) | -230.6** (104.4) |
| Observations | 153 | 153 | 211 | 153 | 211 |
| Robust standard errors in parentheses | | | | | |
| *** $p<0.01$, ** $p<0.05$, * $p<0.1$ | | | | | |

Table S9. Predicted average contribution of other 3 group members in time pressure condition versus time delay condition, run in the physical laboratory.

| | (1) | (2) | (3) |
|--|---------------------|--------------------|----------------------|
| Time pressure condition | 23.89 (22.81) | 22.16 (22.23) | 23.86 (19.69) |
| Age | | -0.114 (4.149) | -4.054 (3.328) |
| Gender (0=M, 1=F) | | -34.10 (23.46) | -19.31 (17.83) |
| Failed comprehension | | 53.98** (24.45) | 47.47** (19.45) |
| Disobeyed time constraint | | | -54.44*** (20.55) |
| Constant | 183.0*** (13.64) | 190.6** (90.52) | 265.6*** (74.23) |
| Observations | 153 | 153 | 211 |
| Robust standard errors in parentheses | | | |
| *** $p < 0.01$, ** $p < 0.05$, * $p < 0.1$ | | | |

7. Behavior on AMT versus the physical laboratory (Study 6 vs Study 7)

In combination, Study 6 and Study 7 allow us to compare behavior in an identical experiment between AMT and the physical lab with 10-fold higher stakes. To make contribution amounts directly comparable, we take the fraction of maximum possible contribution as our dependent variable (since contributions in Study 6 range from 0 to 40 cents, while contributions in Study 7 range from 0 to 400 cents). For the most basic measure, we collapse across time constraint conditions. We find that subjects in the lab contribute significantly less than those on AMT (47.9% of the endowment in the lab vs 58.9% on AMT gives a difference of 11.0%, Wilcoxon Rank-Sum $p = 0.001$; the difference is extremely similar when including subjects that did not obey the time constraint: differences of 11.2%, $p = 0.0001$). The magnitude of the difference is not trivial, but also is not exceptionally large. The lower level of cooperation we find among students in the lab is consistent with the results of a recent meta-analysis of the Dictator Game²¹, in which students were found to be significantly less altruistic than non-students.

More important than the absolute level of contribution, however, is the size of the effect of the time constraint manipulation. We see an almost identical difference between the time pressure and time delay conditions when comparing AMT and the lab (AMT: time pressure = 67.4%, time delay = 52.2%, difference = 15.2%; Lab: time pressure = 57.7%, time delay = 42.3%, difference = 15.3%). To demonstrate that the effect of the time constraint does not vary significantly between AMT and the lab, we perform a set of Tobit regressions with robust standard errors (Table S10). Regression 2 finds no significant interaction between the time pressure condition dummy and a dummy for being run in the lab, and regression 4 shows that this remains true when controlling for age, gender, US residency, failing to correctly answering the

comprehension questions and education level. For completeness, regressions without the interaction term are also included (regressions 1 and 3).

Table S10. Contribution level (as a fraction of the total endowment) in the time pressure condition versus time delay condition, run on AMT (Study 6) and in the physical laboratory (Study 7).

| | (1) | (2) | (3) | (4) |
|---------------------------------------|-----------------------|-----------------------|----------------------|----------------------|
| Lab (0=AMT, 1=Physical) | -0.192*** (0.0637) | -0.248*** (0.0827) | -0.177** (0.0783) | -0.232** (0.0938) |
| Time pressure condition | 0.269*** (0.0555) | 0.264*** (0.0550) | 0.278*** (0.0632) | 0.275*** (0.0627) |
| Age | | 0.00309 (0) | | 0.00312 (0) |
| Gender (0=M, 1=F) | | 0.0424 (0.0579) | | 0.0424 (0.0579) |
| US Residency | | 0.171** (0.0675) | | 0.169** (0.0675) |
| Lab X Time pressure condition | | | -0.0398 (0.133) | -0.0415 (0.131) |
| Education dummies | No | Yes | No | Yes |
| Constant | 0.572*** (0.0373) | 0.294** (0.121) | 0.568*** (0.0387) | -0.068 (0.201) |
| Observations | 596 | 596 | 596 | 596 |
| Robust standard errors in parentheses | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | |

8. Study 8: Conceptual priming experiment on AMT

Methods

The experimental design for the conceptual priming experiment was identical to the baseline correlational decision time experiment (Study 1), except that an additional screen was added to the beginning of the experiment. To induce mindsets favoring more intuitive or more reflective decision-making, we employed an induction method introduced in a recent paper from our group²². In the previous study, we demonstrated the power of these specific primes to promote intuitive versus reflective thinking in the domain of religious belief, and our findings about intuition versus reflection were validated in a subsequent study from another group using a different method²³. In the current study, we use the same priming procedure as we did in ref 22, and examine the effect of the primes on cooperation.

A more intuitive or reflective cognitive style was induced as follows. Before the screen with the PGG instructions, subjects completed a screen in which they were asked to write a paragraph

recalling an episode from their life. As per the procedure previously established in ref 22, subjects were instructed to write 8-10 sentences about one of four particular types of episodes (based on the treatment to which they were randomly assigned, see below), and only subjects that wrote at least 8 sentences were included in the analysis. We employed a 2 x 2 between-subjects design in which subjects were randomly assigned to write about a situation in which they adopted one of two cognitive approaches (intuitive vs. reflective) and where that approach led to an outcome that was either negative or positive. The instructions for each of the resulting 4 conditions are listed below:

Intuition-bad: Please write a paragraph (approximately 8-10 sentences) describing a time your intuition/first instinct led you in the wrong direction and resulted in a bad outcome.

Reflection-bad: Please write a paragraph (approximately 8-10 sentences) describing a time carefully reasoning through a situation led you in the wrong direction and resulted in a bad outcome.

Intuition-good: Please write a paragraph (approximately 8-10 sentences) describing a time your intuition/first instinct led you in the right direction and resulted in a good outcome.

Reflection-good: Please write a paragraph (approximately 8-10 sentences) describing a time carefully reasoning through a situation led you in the right direction and resulted in a good outcome.

The intuition-good and reflection-bad conditions were designed to increase the role of intuition relative to reflection. The intuition-good condition aimed to make subjects more inclined to follow their intuitive first response (and therefore less likely to reflect and carefully consider their decision). The reflection-bad condition aimed to make subjects less inclined to stop and reflect on whether their first response was well suited to the current situation (and therefore more likely to actually follow that intuitive first response).

Conversely, the intuition-bad and reflection-good conditions were designed to increase the role of reflection relative to intuition. The intuition-bad condition aimed to make subjects more wary of their intuitive first response (and therefore more likely to reflect and question the suitability of that response). The reflection-good condition aimed to make subjects more inclined to carefully reason through their decision (and therefore less likely to automatically follow their intuitive first response).

Critically, we make salient the general practice of trusting ones intuitions (or not), whatever those intuitions may be, rather than invoking experiences specifically related to cooperation. Additionally, we counterbalance valence, with both positive and negative outcomes in each of our two conditions.

We note that decision times were not recorded in Study 8 due to a technical error, but that the effect of the primes on decision time is investigated in Study 9.

"

Results

We begin with descriptive statistics:

| | Intuition-Bad N=99 | | Reflection-Bad N=77 | | Reflection-Good N=69 | | Intuition-Good N=98 | |
|-------------------------|-----------------------|-------|------------------------|-------|-------------------------|-------|------------------------|-------|
| | Mean | Std | Mean | Std | Mean | Std | Mean | Std |
| Contribution | 22.14 | 16.93 | 28.42 | 14.74 | 20.41 | 15.54 | 23.47 | 15.99 |
| Age | 31.35 | 11.66 | 33.10 | 11.17 | 31.43 | 10.39 | 30.96 | 11.07 |
| Gender (0=M, 1=F) | 0.55 | 0.50 | 0.61 | 0.49 | 0.64 | 0.48 | 0.62 | 0.49 |
| US Residency | 0.59 | 0.50 | 0.69 | 0.47 | 0.70 | 0.46 | 0.64 | 0.48 |
| Failed Comprehension | 0.55 | 0.50 | 0.44 | 0.50 | 0.42 | 0.50 | 0.51 | 0.50 |
| Paragraph length | 618 | 311 | 716 | 266 | 670 | 215 | 631 | 245 |

The goal of Study 8 was to assess whether inducing a more intuitive mindset led to higher contribution compared to inducing a more reflective mindset. To do so, we perform two complementary analyses.

Main effect of promoting intuition versus promoting reflection

The first analysis uses a set of Tobit regressions with robust standard errors (Table S11). We begin by asking whether promoting intuition relative to reflection results in a different contribution level than promoting reflection relative to intuition. Regression 1 finds that the contribution level collapsing across the two conditions designed to promote intuition over reflection (intuition-good and reflection-bad) was significantly higher than when collapsing across to the two conditions designed to promote reflection over intuition (reflection-good and intuition-bad). Regression 2 shows that this continues to be true when including a term for the valence of the outcome, controlling for variance explained by comparing the good outcome conditions (intuition-good and reflection-good) with the bad outcome conditions (intuition-bad and reflection-bad). Regression 3 shows that this again continues to be true when also controlling for US residency, age, gender, failing to correctly answer the comprehension questions, number of characters in the priming paragraph, and education level.

We note that regressions 2 and 3 find a negative effect of positive outcome valence on cooperation ($p=0.047$ without controls in regression 2, $p=0.074$ with controls in regression 3). This result is consistent with a previous study finding that inducing positive mood resulted in less giving in a Dictator Game compared to inducing a negative mood²⁴, although results from other studies on the role of mood in cooperation are mixed²⁵⁻²⁷. The effect of mood on behavior in economic games merits further study.

In regressions 4 and 5, we ask whether the effect of promoting intuition versus reflection differs based on the outcome valence. Either without controls (regression 4) or with controls (regression 5), we find no significant interaction between the promote intuition dummy and the outcome

valence dummy. This lack of significant interaction term indicates that the difference between contributions in the intuition-good condition versus the reflection-good condition is not significantly different from the difference between contributions in the reflection-bad condition versus the intuition-bad condition. Put differently, the lack of significant interaction indicates that collapsing across the intuition-good and reflection-bad conditions, as well as across the reflection-good and intuition-bad conditions, is appropriate. Thus when we present the results of Study 8 in the main text, we do in this collapsed manner.

Table S11. Contribution level in conceptual priming experiment across priming conditions.

| | (1) | (2) | (3) | (4) | (5) |
|--|----------|----------|-----------|----------|-----------|
| Promote intuition (0=[Intuition-bad, reflection-good], 1=[Intuition-good, reflection-bad]) | 10.95*** | 12.16*** | 11.14*** | 15.61** | 12.63** |
| | (4.184) | (4.195) | (4.031) | (6.159) | (6.018) |
| Outcome valence (0=[Intuition-bad, reflection-bad], 1=[Intuition-good, reflection-good]) | | -8.176** | -7.262* | -4.717 | -5.781 |
| | | (4.124) | (4.059) | (5.800) | (5.721) |
| US Residency (0=N, 1=Y) | | | 13.73*** | | 13.65*** |
| | | | (4.942) | | (4.947) |
| Age | | | 0.356* | | 0.353* |
| | | | (0.194) | | (0.195) |
| Gender (0=M, 1=F) | | | 3.191 | | 3.189 |
| | | | (4.205) | | (4.204) |
| Failed comprehension | | | -2.691 | | -2.587 |
| | | | (4.488) | | (4.500) |
| Paragraph length | | | -0.00131 | | -0.00158 |
| | | | (0.00912) | | (0.00908) |
| Promote intuition X Outcome valence | | | | -6.906 | -2.954 |
| | | | | (8.244) | (8.024) |
| Education dummies | No | No | Yes | No | Yes |
| Constant | 25.01*** | 28.43*** | 34.89** | 26.96*** | 34.51** |
| | (2.979) | (3.591) | (16.32) | (4.076) | (16.26) |
| Observations | 343 | 343 | 343 | 343 | 343 |
| Robust standard errors in parentheses | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | |

Interaction between cognitive style and outcome valence

The second analysis demonstrates the same result in a different way, using the analytic approach of our earlier work in ref 22. Instead of looking for a main effect of promoting intuition versus

reflection, we now ask whether there is a significant interaction between cognitive approach (intuition versus reflection) and outcome valence (bad versus good) using ANOVA. Specifically, contribution levels were subjected to a two-way ANOVA having two levels of reasoning style (intuitive/reflective) and two levels of outcome valence (bad/good). Together with no significant main effect of reasoning style ($F(1,339)=0.85, p=0.357$) and a marginally significant main effect of outcome valence ($F(1,339)=3.69, p=0.056$), we find a significant interaction between reasoning style and outcome valence ($F(1,339)=7.21, p=0.008$). This significant crossover interaction shows that participants who wrote about an experience that vindicated intuition (intuition-good or reflection-bad) contributed more to the public good compared with participants who wrote about an experience that vindicated reflection (intuition-bad or reflection-good).

Thus we demonstrate in two different ways that in Study 8, priming to promote intuition increases contributions in the PGG relative to priming to promote reflection.

9. Study 9: Conceptual priming experiment with experience measure and decision times on AMT

Methods

Study 9 aimed to use the conceptual priming framework from Study 8 to examine the effect of previous experience with the experimental decision task on cooperative intuitions. Based on the theoretical framework presented in main text, where cooperative intuitions are developed in daily life because cooperation is advantageous and then these intuitions spill over into the laboratory, we predicted that the difference in contributions when promoting intuition versus promoting reflection should be smaller in experienced subjects. Study 9 also aimed to provide a manipulation check on the conceptual primes' ability to manipulate reaction times: based on Studies 1-7, we would expect promoting intuition not only to increase contributions relative to promoting reflection, but also to reduce decision times.

To investigate these two issues, Study 9 used the design of the 'intuition-good' and 'reflection-good' conditions from Study 8, with the following modifications. (i) In the post-experimental questionnaire subjects were asked "To what extent have you participated in studies like this one before? (i.e. where you choose how much to keep for yourself versus contributing to benefit others)". Subjects who chose the response "Never" were classified as naïve. And (ii), decision times were recorded, as well as time spent reading the instructions.

Results

We begin with descriptive statistics:

| | Naïve subjects | | | | Experienced subjects | | | |
|--------------------------|-------------------------|-------|------------------------|-------|-------------------------|-------|------------------------|-------|
| | Reflection-Good N=38 | | Intuition-Good N=49 | | Reflection-Good N=94 | | Intuition-Good N=75 | |
| | Mean | Std | Mean | Std | Mean | Std | Mean | Std |
| Contribution | 19.79 | 16.76 | 29.92 | 15.29 | 24.21 | 16.11 | 24.00 | 16.46 |
| Decision time | 15.16 | 13.70 | 11.69 | 7.37 | 13.10 | 12.66 | 13.88 | 23.00 |
| Log10(Decision time) | 1.07 | 0.30 | 1.00 | 0.24 | 0.99 | 0.31 | 0.99 | 0.30 |
| Instruction reading time | 69.45 | 35.85 | 87.06 | 93.57 | 67.76 | 63.26 | 67.47 | 36.88 |
| Log10(Instructions time) | 1.78 | 0.24 | 1.86 | 0.23 | 1.73 | 0.28 | 1.77 | 0.24 |
| Age | 29.08 | 9.67 | 28.73 | 9.68 | 30.33 | 11.09 | 33.29 | 12.49 |
| Gender (0=M, 1=F) | 0.42 | 0.50 | 0.43 | 0.50 | 0.55 | 0.50 | 0.53 | 0.50 |
| US Residency | 0.82 | 0.39 | 0.65 | 0.48 | 0.84 | 0.37 | 0.81 | 0.39 |
| Failed Comprehension | 0.39 | 0.50 | 0.37 | 0.49 | 0.26 | 0.44 | 0.28 | 0.45 |
| Paragraph length | 722 | 222 | 645 | 233 | 699 | 248 | 694 | 218 |

The first goal for Study 9 was to test whether the prime condition had a greater effect among naïve subjects compared to experienced subjects. To this end we use a set of Tobit regressions with robust standard errors (Table S12). We begin by analyzing all subjects together and examining the interaction between the prime condition (promote intuition versus promote reflection) and the subject's previous experience with the experimental task (naïve versus experienced). As predicted, regression 1 shows a significant positive interaction between prime condition and naivety with respect to the experimental design, and regression 2 shows that this interaction remains significant when including controls for US residency, age, gender, failing to correctly answer the comprehension questions, number of characters in the priming paragraph and education level. Based on this significant interaction, we therefore analyze naïve and experienced subjects separately. Regression 3 shows that among naïve subjects, there is a significant positive effect of promoting intuition relative to promoting reflection. Regression 4 shows that this effect is robust to controls for US residency, age, gender, failing to correctly answer the comprehension questions, number of characters in the priming paragraph, and education level. Conversely, regressions 5 and 6 find no significant difference between priming conditions among experienced subjects, either without or with demographic controls. This finding is also consistent with the analyses in Studies 2 through 5, where the relationship between decision time and cooperation that is present at the beginning of the session becomes reduced or eliminated in later rounds.

The second goal of Study 9 was to examine the effect of the prime on decision times. To do so, we perform a set of linear regressions with robust standard errors, taking $\log_{10}(\text{Decision time})$ as the dependent variable and examining the data from the naïve subjects (Table S13). Regression 1 finds a relationship which is non-significant but trending in the direction we expect based on Studies 1-7 (promoting intuition leading to shorter decision times). Regression 2 shows that this relationship becomes significant when including controls for US residency, age, gender, failing to correctly answer the comprehension questions, number of characters in the priming paragraph, time spend reading the instructions and education level. As we will show in Study 10 below,

time spent reading the instructions is positively correlated with decision time, but does not significantly predict contribution amount. Thus we include time spent reading the instructions as a control for the subject's general level of speed. Further support for the idea that time spent reading the instructions is a stable individual difference measure comes from the lack of relationship between prime condition and time spent reading the instructions demonstrated in Table S14.

To further link the conceptual priming experiments to the experiments involving decision times, we now provide evidence that the prime condition in Study 9 affects contribution levels among naïve subjects specifically by manipulating decision times. Table S13 showed that promoting intuition resulted in faster decision times compared to promoting reflection. We now show in Table S15 that faster decision times are associated with higher contributions (as in Studies 1-5), and that the relationship between prime condition and contribution shown in Table S12 becomes non-significant when controlling for decision time. Thus it seems that priming intuition causes subjects to respond more quickly, and this quicker response leads to higher contribution.

Table S12. Contribution level in conceptual priming experiment, naïve vs experienced subjects.

| | All subjects | | Naïve subjects | | Experienced subjects | |
|---|--------------|----------|----------------|----------|----------------------|----------|
| | (1) | (2) | (3) | (4) | (5) | (6) |
| Prime condition (0=Reflection-good, 1=Intuition-good) | -1.380 | -1.932 | 28.57*** | 22.66** | -1.351 | -1.922 |
| | (6.849) | (6.860) | (10.37) | (10.69) | (6.756) | (6.777) |
| Naïve | -9.930 | -7.414 | | | | |
| | (8.034) | (7.885) | | | | |
| Prime condition X Naïve | 29.08** | 26.55** | | | | |
| | (12.08) | (11.91) | | | | |
| Age | | 0.191 | | -0.289 | | 0.284 |
| | | (0.274) | | (0.727) | | (0.295) |
| Gender (0=M, 1=F) | | 10.93* | | 10.26 | | 9.978 |
| | | (5.699) | | (10.63) | | (6.707) |
| US Residency | | 3.218 | | -8.374 | | 7.237 |
| | | (6.516) | | (11.58) | | (7.919) |
| Failed comprehension | | 3.574 | | 1.827 | | 2.559 |
| | | (5.824) | | (10.31) | | (6.998) |
| Paragraph length | | 0.00160 | | -0.0297 | | 0.0132 |
| | | (0.0124) | | (0.0225) | | (0.0141) |
| Education dummies | No | Yes | No | Yes | No | Yes |
| Constant | 32.07*** | 54.07** | 22.27*** | 256.8*** | 31.88*** | 35.60* |
| | (4.638) | (23.39) | (6.951) | (48.59) | (4.620) | (20.38) |
| Observations | 256 | 256 | 87 | 87 | 169 | 169 |
| Robust standard errors in parentheses | | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | | |

Table S13. *Log10(Decision time) in conceptual priming experiment, naïve subjects.*

| | (1) | (2) |
|---|----------|------------|
| Prime condition (0=Reflection-good, 1=Intuition-good) | -0.0737 | -0.130** |
| | (0.0593) | (0.0629) |
| Age | | -0.00216 |
| | | (0.00273) |
| Gender (0=M, 1=F) | | 0.00302 |
| | | (0.0600) |
| US Residency | | 0.0219 |
| | | (0.0795) |
| Failed comprehension | | -0.0250 |
| | | (0.0586) |
| Paragraph length | | -0.000218* |
| | | (0.000129) |
| log10(Time reading instructions) | | 0.301** |
| | | (0.148) |
| Education dummies | No | Yes |
| Constant | 1.071*** | 0.548* |
| | (0.0480) | (0.298) |
| Observations | 87 | 87 |
| R-squared | 0.019 | 0.144 |
| Robust standard errors in parentheses | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | |

Table S14. *Log10(Time reading instructions) in conceptual priming experiment, naïve subjects.*

| | (1) | (2) |
|---|----------|------------|
| Prime condition (0=Reflection-good, 1=Intuition-good) | 0.0711 | 0.0797 |
| | (0.0513) | (0.0521) |
| Age | | 0.00241 |
| | | (0.00253) |
| Gender (0=M, 1=F) | | -0.0122 |
| | | (0.0550) |
| US Residency | | -0.108* |
| | | (0.0631) |
| Failed comprehension | | -0.0258 |
| | | (0.0595) |
| Paragraph length | | 0.000112 |
| | | (0.000157) |
| log10(Decision time) | | 0.223** |
| | | (0.0964) |
| Education dummies | No | Yes |
| Constant | 1.784*** | 1.515*** |
| | (0.0392) | (0.163) |
| Observations | 87 | 87 |
| R-squared | 0.022 | 0.185 |
| Robust standard errors in parentheses | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | |

"

Table S15. Contribution level in conceptual priming experiment as a function of decision time, naïve subjects.

| | (1) | (2) | (3) | (4) | (5) |
|---|-----------|-----------|----------|----------|-----------|
| log10(Decision time) | -51.94*** | -57.14*** | | | -50.44*** |
| | (15.56) | (15.64) | | | (15.67) |
| Prime condition (0=Reflection-good, 1=Intuition-good) | | | 28.57*** | 22.66** | 15.94 |
| | | | (10.37) | (10.69) | (10.40) |
| Age | | -0.450 | | -0.289 | -0.377 |
| | | (0.705) | | (0.727) | (0.722) |
| Gender (0=M, 1=F) | | 10.47 | | 10.26 | 9.681 |
| | | (10.24) | | (10.63) | (10.07) |
| US Residency | | -12.99 | | -8.374 | -9.305 |
| | | (10.90) | | (11.58) | (10.70) |
| Failed comprehension | | -1.016 | | 1.827 | 0.656 |
| | | (9.728) | | (10.31) | (9.876) |
| Paragraph length | | -0.0459** | | -0.0297 | -0.0389* |
| | | (0.0208) | | (0.0225) | (0.0215) |
| Education | No | Yes | No | Yes | Yes |
| Constant | 92.38*** | 321.2*** | 22.27*** | 256.8*** | 299.8*** |
| | (19.03) | (50.57) | (6.951) | (48.59) | (52.26) |
| Observations | 87 | 87 | 87 | 87 | 87 |
| Robust standard errors in parentheses | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | |

10. Study 10: Correlational experiment on AMT with moderators, individual differences in cognitive style, and additional controls

Methods

The first aim of Study 10 was to test whether the relationship between decision time and cooperation differs depending on previous life experiences. Based on the theoretical framework presented in main text, we predicted that the difference in contributions between faster and slower responders should be smaller in subjects whose life outside the lab largely involves interactions with non-cooperative others. This prediction is rooted in the idea that mechanisms for the evolution of cooperation such as repetition and reputation typically involve multiple equilibria: Such mechanisms can make cooperation advantageous as long as enough others are

also using cooperative strategies, but not if a sufficiently large number of others are selfish (as seen, for example, in the Folk Theorem, where fully cooperative strategies can be equilibria, but non-cooperative strategies are also always equilibria²⁸).

The second aim of Study 10 was to test whether individual differences in cognitive style are predictive of cooperation. Substantial variation in cooperation has been documented across individuals (for a review, see ref 29). Similarly, the baseline propensity to follow one's intuitions versus stopping and reflecting has been shown to vary across individuals^{30,31}. Our manipulation experiments in Studies 6 thru 9 demonstrate through random assignment that at least some of the effect of cognitive style on cooperation occurs via variation within a given individual. However, the extent to which the results of the correlations in Studies 1 thru 5 are driven by variation in cognitive style within subjects versus variation across subjects has not been addressed. Here we investigate this question by asking whether contribution levels correlate with measures of individual differences in cognitive style.

The third and final aim of Study 10 was to explore whether the relationship between decision time and contribution shown in Study 1 is driven by risk attitudes or attention/engagement rather than intuitive reasoning.

To address these aims, Study 10 used the same design as Study 1, with the following additions:

- (i) To assess whether subjects developed their intuitions in more or less cooperative daily environments, the post-experimental questionnaire asked "To what extent do you feel you can trust other people that you interact with in your daily life?" using a ten-point Likert scale from "1=Very Little" to "10=Very Much". Cooperativeness of daily life interaction partners was operationalized using trust because we believe the concept of trust would be more familiar to our subjects and map more clearly onto what we mean by cooperation than terms such as "cooperative" or "altruistic" which are often used differently in daily speech compared to how they are used in the academic literature.
- (ii) To assess the relationship between cognitive style and contribution, subjects completed the 3-item version of the Cognitive Reflection Test³⁰ and the 40-item version of the Rational Experiential Inventory³² after making their decision and answering the comprehension questions.
- (iii) To control for risk attitudes, subjects completed a general risk-taking measure that has been widely validated³³ asking "Are you generally a person who is fully prepared to take risks or do you try to avoid taking risks?" using an 11-point Likert scale from "0=Unwilling to take risks" to "10= Fully prepared to take risks", as well as a 10-item social risk taking scale³⁴ after completing the cognitive style measures.
- (iv) To control for attentional processing and engagement in the task, we recorded the time subjects spent reading the instructions as well as the time spent making the decision. If the decision time result was due to attention/engagement, then the same effect should be present when examining reading times rather than decision times. Furthermore, to discourage potentially unengaged subjects from participating, we asked subjects to transcribe a paragraph of neutral handwritten text (reading "Yellow car not blue over and above everything else I might have said") prior to beginning the study, a procedure which has been suggested as a method for excluding AMT

subjects who disregard task instructions in order to complete tasks as quickly as possible¹.

Results

We begin with descriptive statistics:

| | Mean | Std |
|---|-------|-------|
| N=341 | | |
| Contribution | 23.86 | 16.25 |
| Decision time | 13.78 | 17.94 |
| Log10(Decision time) | 1.02 | 0.28 |
| Time reading instructions | 73.21 | 92.15 |
| Log10(Time reading instructions) | 1.73 | 0.35 |
| Age | 30.69 | 10.26 |
| Gender (0=M, 1=F) | 0.40 | 0.49 |
| US Residency (0=N, 1=Y) | 0.70 | 0.46 |
| Failed Comprehension (0=N, 1=Y) | 0.34 | 0.47 |
| View of daily interaction partners (1=Very untrustworthy to 7=Very trustworthy) | 6.17 | 1.98 |
| General risk taking (0 to 10) | 6.64 | 2.44 |
| Social risk taking (1 to 5) | 3.20 | 0.56 |
| Cognitive reflection test (0 to 3) | 1.40 | 1.20 |
| Need for cognition (1 to 10) | 7.59 | 1.22 |
| Faith in intuition (1 to 10) | 6.70 | 1.23 |

The first goal of Study 10 was to test whether the relationship between decision time and contribution was stronger among subjects who view their daily life interaction partners as cooperative. To this end we perform a median split on the view of daily life interaction partners measure, separating subjects into those who view their daily interaction partners as more versus less cooperative, and perform a set of Tobit regressions with robust standard errors (Table S16). We begin by analyzing all subjects together and examining the interaction between decision time and view of daily life interaction partners. As predicted, regression 1 shows a significant positive main effect of having more cooperative daily life interaction partners together with a significant negative interaction between decision time and having more cooperative daily life interaction partners. Together, this main effect and interaction indicate that those who perceive their daily interaction partners as cooperative contribute more when they respond quickly (i.e. decision time is small), but that this increase in contribution is erased with longer decision times; whereas decision times have little effect on subjects from an uncooperative world. Regression 2 shows that the main effect and interaction term remain significant when including controls for US residency, age, gender, failing to correctly answer the comprehension questions, and education level. Based on the significant interaction, we therefore analyze subjects with more versus less cooperative daily life interaction partners separately. Regression 3 shows that among subjects with largely cooperative partners outside of the lab, there is a significant negative relationship between decision time and contribution. Regression 4 shows that this effect is robust to controls for US residency, age, gender, failing to correctly answer the comprehension questions, and education level. Conversely, regressions 5 and 6 find no significant relationship between

decision time and cooperation among subjects who perceive themselves as having less cooperative interaction partners outside the lab, either without or with demographic controls. Critically, a further analysis finds no relationship between view of one's daily interaction partners and decision time (logistic regression with robust standard errors; without controls: $\text{coeff}=0.159$, $p=0.682$; with demographic controls: $\text{coeff}=0.196$, $p=0.621$). This demonstrates that attitude towards daily life interaction partners is suitable for use as a moderator in this context. The relationship between decision time and contribution among subjects with a more versus less cooperative daily life interaction partners is shown in Figure S3 (in contrast to Figure 3b in the main text which uses a median split on decision time, here we show the relationship over the full range of decision times).

The second purpose of Study 10 was to test whether individual difference measures of cognitive style predict cooperation. As shown using Tobit regression with robust standard errors in Table S17, we find no significant relationship between contribution and score on the Cognitive Reflection Test³⁰ (Regressions 1 and 2), the Need for Cognition scale³² (Regressions 3 and 4), or the Faith in Intuition scale³² (Regression 5 and 6). We find the same results when considering only subjects with a more positive view of their daily interaction partners (for brevity, analysis not shown). Using linear regression with robust standard errors (Table S18), we also find no significant relationship between any of the three measures and decision time (with the exception of a marginally significant negative relationship between Faith in Intuition and decision time when not including demographic controls). Again all of these results are qualitatively unchanged when restricting to subjects with a more positive view of their daily interaction partners. The lack of relationship between these individual difference measures of cognitive style and cooperation has important implications. Together with our manipulation experiments (in which subjects are randomly assigned to more intuitive or reflective thinking styles), these findings suggest that our correlational results are largely driven by within-subject variation across decisions in intuitiveness versus reflectiveness, rather than being the result of comparing fundamentally intuitive people with fundamentally reflective people.

The third and final goal of Study 10 was to test whether the negative relationship between decision time and contribution in Study 1 is explained by risk attitudes or attention/engagement in the task. To do so, we perform a set of Tobit regressions with robust standard errors (Table S19). Regression 1 replicates the negative relationship between decision time and contribution found in Study 1. Regression 2 shows that the effect continues to hold when controlling for our standard controls. Regression 3 shows that the effect continues to hold when also controlling for the general risk-taking measure³³, the social risk-taking measure³⁴ and time spent reading the instructions. Regression 3 also finds that none of these measures are themselves significantly correlated with contribution. This demonstrates that none of these effects explain the observed relationship between decision time and contribution. Again, these results are all robust to considering only subjects with a more positive view of their daily life interaction partners (regressions not shown for brevity). To provide further evidence for time spent reading the instructions as a proxy for attention and engagement, we note the strong positive correlation between decision time and time spent reading the instructions (linear regression with robust standard errors taking $\log_{10}[\text{decision time}]$ as the DV and $\log_{10}[\text{time reading instructions}]$ as the IV; $\text{coeff}=0.184$, $p=0.001$).

Table S16. Contribution versus decision time for subjects with a less versus more positive view of people they interact with in daily life.

| | (1) | (2) | (3) | (4) | (5) | (6) |
|--|--------------|----------|--|-----------|--|----------|
| | All subjects | | Subjects with cooperative daily interaction partners | | Subjects with uncooperative daily interaction partners | |
| log10(Decision time) | -4.112 | -8.473 | -51.28*** | -55.24*** | -3.470 | -6.321 |
| | (10.36) | (11.11) | (14.57) | (14.74) | (9.181) | (9.746) |
| Opinion of daily interaction partners (0=Uncooperative, 1=Cooperative) | 45.75** | 43.89** | | | | |
| | (18.25) | (18.34) | | | | |
| log10(Decision time) X Opinion of daily interaction partners | -40.06** | -36.34** | | | | |
| | (16.10) | (16.42) | | | | |
| Age | | 0.302 | | 0.671* | | 0.143 |
| | | (0.228) | | (0.396) | | (0.280) |
| Gender (0=M, 1=F) | | 11.05** | | 5.655 | | 14.99*** |
| | | (4.528) | | (7.952) | | (5.234) |
| US Residency | | -11.85** | | -20.97** | | -5.008 |
| | | (4.742) | | (8.906) | | (5.288) |
| Failed comprehension | | 8.696* | | 4.994 | | 10.90** |
| | | (4.499) | | (8.280) | | (5.100) |
| Education dummies | No | Yes | No | Yes | No | Yes |
| Constant | 32.59*** | 20.40 | 87.99*** | 31.47 | 30.91*** | 35.87* |
| | (11.78) | (20.39) | (16.77) | (39.69) | (10.41) | (19.01) |
| Observations | 338 | 338 | 170 | 170 | 168 | 168 |
| Robust standard errors in parentheses | | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | | |

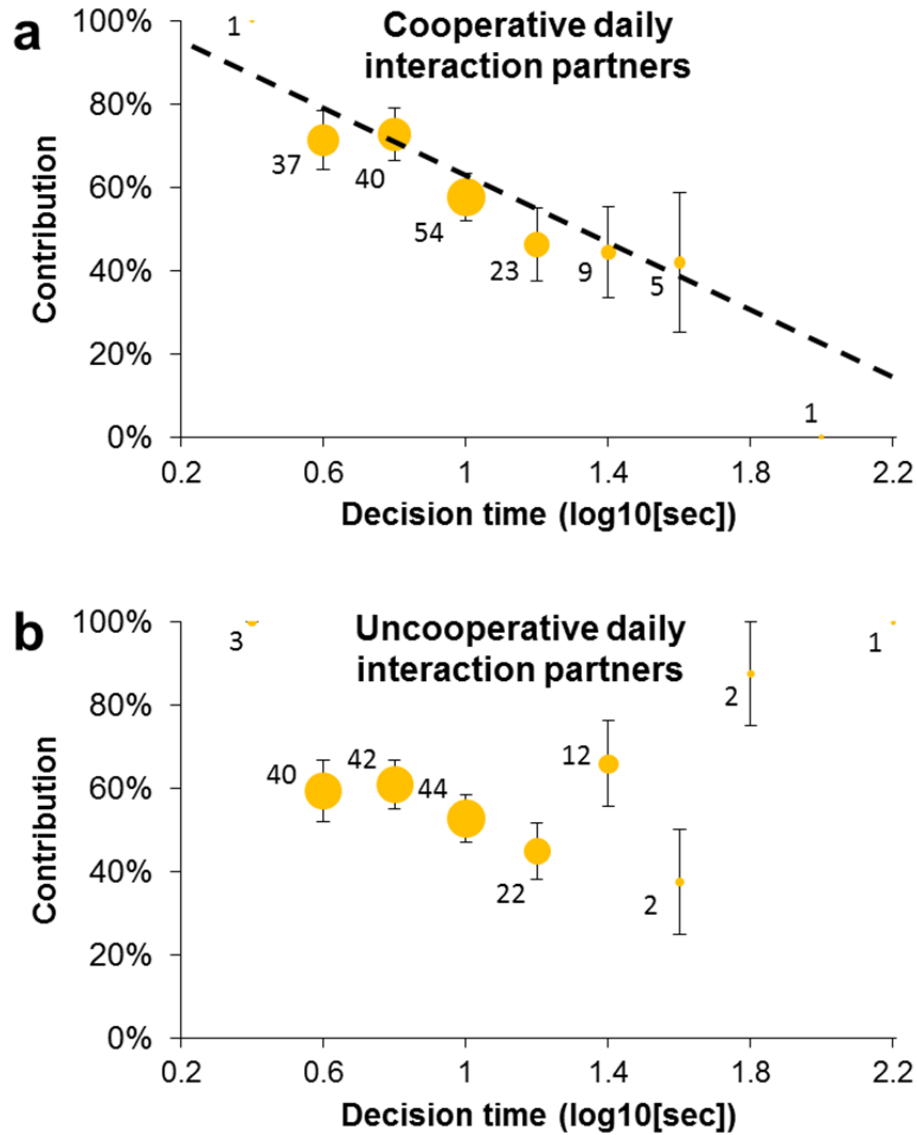


Figure S3. $\log_{10}(\text{Decision time})$ versus contribution for subjects with a more positive (a) versus negative (b) view of their daily life interaction partners. Error bars indicate standard error of the mean. Dot size is proportional to number of observations, which are indicated next to each dot. The trend line is not indicated in panel b as the relationship between decision time and contribution is not significant.

"

Table S17. Contribution versus measures of individual differences in cognitive style.

| | (1) | (2) | (3) | (4) | (5) | (6) |
|---------------------------------------|----------|---------|---------|----------|----------|---------|
| Cognitive reflection test | 0.811 | 2.013 | | | | |
| | (1.878) | (1.981) | | | | |
| Need for cognition | | | 1.280 | 3.016 | | |
| | | | (1.902) | (1.987) | | |
| Faith in intuition | | | | | -0.931 | -0.999 |
| | | | | | (1.921) | (2.002) |
| Age | | 0.294 | | 0.288 | | 0.321 |
| | | (0.231) | | (0.233) | | (0.232) |
| Gender (0=M, 1=F) | | 11.12** | | 11.74** | | 11.22** |
| | | (4.651) | | (4.677) | | (4.664) |
| US Residency | | -8.754* | | -9.752** | | -8.264* |
| | | (4.700) | | (4.770) | | (4.855) |
| Failed comprehension | | 10.53** | | 10.37** | | 9.037** |
| | | (4.709) | | (4.549) | | (4.465) |
| Education dummies | No | Yes | No | Yes | No | Yes |
| Constant | 29.42*** | 11.10 | 20.86 | -8.048 | 36.76*** | 19.18 |
| | (3.311) | (17.01) | (14.27) | (21.99) | (13.01) | (20.09) |
| Observations | 341 | 341 | 341 | 341 | 341 | 341 |
| Robust standard errors in parentheses | | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | | |

"

Table S18. Log10(Decision time) versus measures of individual differences in cognitive style.

| | (1) | (2) | (3) | (4) | (5) | (6) |
|---------------------------------------|----------------------|-----------------------|----------------------|-----------------------|----------------------|-----------------------|
| Cognitive reflection test | 0.00820 (0.0125) | 0.00101 (0.0132) | | | | |
| Need for cognition | | | -0.00913 (0.0119) | -0.00787 (0.0120) | | |
| Faith in intuition | | | | | -0.0211* (0.0122) | -0.0111 (0.0131) |
| Age | | 0.00208 (0.00151) | | 0.00211 (0.00150) | | 0.00220 (0.00154) |
| Gender (0=M, 1=F) | | -0.0129 (0.0322) | | -0.0148 (0.0326) | | -0.00936 (0.0331) |
| US Residency | | -0.122*** (0.0369) | | -0.121*** (0.0368) | | -0.116*** (0.0367) |
| Failed comprehension | | -0.0416 (0.0330) | | -0.0455 (0.0322) | | -0.0425 (0.0317) |
| Education dummies | No | Yes | No | Yes | No | Yes |
| Constant | 1.007*** (0.0224) | 1.117*** (0.231) | 1.088*** (0.0924) | 1.174*** (0.241) | 1.160*** (0.0863) | 1.182*** (0.237) |
| Observations | 338 | 338 | 338 | 338 | 338 | 338 |
| R-squared | 0.001 | 0.050 | 0.002 | 0.051 | 0.008 | 0.052 |
| Robust standard errors in parentheses | | | | | | |
| *** p<0.01, ** p<0.05, * p<0.1 | | | | | | |

Table S19. Contribution versus $\log_{10}(\text{Decision time})$ with additional controls.

| | (1) | (2) | (3) |
|--|----------|-----------|-----------|
| Decision time (log10 seconds) | -21.11** | -24.27*** | -26.70*** |
| | (8.361) | (8.710) | (8.854) |
| US Residency (0=N, 1=Y) | | -11.95** | -10.86** |
| | | (4.802) | (4.836) |
| Age | | 0.363 | 0.323 |
| | | (0.230) | (0.233) |
| Gender (0=M, 1=F) | | 10.84** | 10.15** |
| | | (4.583) | (4.712) |
| Failed Comprehension (0=N, 1=Y) | | 7.668* | 9.498** |
| | | (4.509) | (4.762) |
| Social risk-taking (1 to 5) | | | 0.952 |
| | | | (4.094) |
| General risk-taking (1 to 11) | | | 0.0910 |
| | | | (1.075) |
| Time reading instructions (log10 seconds) | | | 9.920 |
| | | | (6.111) |
| Education dummies | No | Yes | Yes |
| Constant | 52.24*** | 40.78** | 23.09 |
| | (9.403) | (19.71) | (25.66) |
| Observations | 338 | 338 | 338 |
| Robust standard errors in parentheses | | | |
| *** $p < 0.01$, ** $p < 0.05$, * $p < 0.1$ | | | |

"

11. Robustness of relationship between intuition and cooperation

Did faster deciders simply not understand the instructions?

In our each of our analyses, we demonstrate that the effect of intuition is robust to controlling for correctly answering the comprehension questions regarding the payoff structure. Thus it seems that comprehension does not explain our effect.

How does decision time relate to time spent understanding the decision setting?

In Study 10, we demonstrate that the decision time effect is robust to controlling for time spent reading the instructions (and that time spent reading the instructions does not predict contribution; if anything, it is trending in the opposite direction with longer readers contributing slightly more). Furthermore, the time constraint manipulation experiments in Studies 6 and 7 provide direct evidence that the relationship between decision time and contribution is independent of time spent reading the instructions. In the time constraint experiment, subjects are only informed that they must make their decisions quickly (or slowly) after they have finished reading the instructions and proceeded to the next screen. Thus time spent reading the instructions cannot account for the effect of time pressure/delay on cooperation we observe.

The fact that the two processes of (a) understanding the game setup and payoffs, versus (b) actually making a decision, are distinct in our design is an important feature of our experiments. Because our decision time metric applies only to the latter, this allows us to explore the cognitive mechanism underpinning the contribution *decision* without adding confounds related to game comprehension. This stands in contrast to a previous reaction time study where in each round, subjects chose between a different set of 4 monetary divisions³⁵. In that design, the 'decision time' measures how long subjects take to read and understand the different payoff options, as well as how long it takes them to reach a decision. Thus their finding that longer decision times were associated with more prosocial divisions is not necessarily in conflict with ours: their result can be explained by prosocial subjects taking longer to understand the game setup (because of an interest in the other's payoffs as well as their own), rather than taking longer to reach their decision (conditional on understanding the game). Consistent with this interpretation is the positive (although not statistically significant) trend we find between contribution and time spent reading the instructions in Study 10.

This perspective also helps connect our results to previous work showing that selfishness is automatic in the context of conflicts of interest, where reflection is required to perceive that such conflicts exist³⁶. Further exploration of this difference in cognitive processing between the task of understanding the nature of the situation versus actually making a decision is an important direction for future research.

Is the relationship between intuition and cooperation unique to our online sample, the small stakes used on AMT, or any particular feature(s) of our online experimental environment? Are our findings restricted to American college undergraduates?

We find significantly more cooperation when forcing subjects to respond quickly compared to taking time to think both on AMT with subjects from around the world (Study 6) and in the physical lab using Boston-area undergraduates playing for 10x larger stakes (Study 7). This demonstrates the robustness of our fundamental finding with respect to subject pool, online vs offline, and stake size.

Is the relationship between decision time and cooperation we observe the result of adjusting away from a salient anchor?

It has been suggested that in resource division tasks, subjects anchor on an equitable split, and then with further reflection adjust away from that anchor towards selfishness³⁷. However, anchoring and adjustment do not explain the relationship between decision time and cooperation that we observe in our experiments: In the lab experiments using Prisoner's Dilemma games (Studies 2 thru 4), subjects make a binary choice (cooperate or defect) rather than a numerical decision of how much to contribute. This binary decision does not involve anchoring and adjustment, yet we continue to find the same negative relationship between decision time and cooperation in this binary choice. Furthermore, even in the public goods games where subjects choose a numerical contribution amount and anchoring and adjustment is possible, it is not *a priori* evident why full contribution would be a more natural anchor than zero contribution.

Are the effects of intuitive versus reflective thinking we observe the result of comparing more intuitive versus more reflective people (i.e. variation across individuals), or the result of variation within individuals?

Our various manipulation studies (Studies 6 through 9) demonstrate that there is within-individual variation in cognitive style and resulting behavior. Subjects are randomly assigned to conditions, and thus do not systemically vary across conditions in their dispositions toward intuitive vs. reflective decision-making. Yet the experimental manipulation can push people to be more intuitive and therefore more cooperative, or more reflective and therefore more selfish. Furthermore, we find no evidence of between-individual differences in use of intuitive versus reflection predicting cooperation in Study 10. Together, these findings suggest that our results are largely driven by within-subject variation across decisions in intuitiveness vs. reflectiveness, rather than reflecting differences between people who are dispositionally intuitive vs. dispositionally reflective.

12. Implications for economic and evolutionary models

Our findings have significant implications for the understanding of human prosocial behavior. Economic models have typically explained non-self-interested actions using social preferences. For example, people in our experiments might cooperate if, rather than being purely selfish, they have consistent preferences for equity^{38,39}, efficiency⁴⁰ and/or reciprocity³⁹⁻⁴³. However, our manipulation studies indicate that people do not have a single, consistent set of preferences. Instead, our data indicate that intuition often promotes behavior consistent with a set of preferences that are more prosocial than those favored by reflection. As we show, experimental

manipulations that have no effect on material outcomes can cause different preferences to be operative. Thus our results highlight the need for more cognitively complex models of prosocial behavior, along the lines of recent models for non-social decision-making⁴⁴⁻⁴⁷. Furthermore, our results suggest a special role for intuition in promoting cooperation⁴⁸ (in contrast to ref⁴⁶, in which reflection is assumed to underlie prosociality).

The present experiments also have important implications for the evolution of cooperation. In traditional evolutionary models, each agent has a specific strategy that determines her behavior, such as cooperate or defect in one-shot games, or always-defect or tit-for-tat (or some other strategy) in repeated games. Natural selection then operates on these strategies. Our results, however, suggest that people are not of a single mind, and are not committed to a single strategy. Instead, social behaviors are the product of an internal equilibrium between competing strategies, with some strategies favored by intuition and others by reflection. Expanding evolutionary models to include this cognitive conflict is an important direction for future research, and can help us understand why natural selection would favor cooperative intuitions.

13. Previous dual-process research using economic games

Previous research exploring automatic versus controlled processes and social preferences in economic games has largely focused on rejecting unfair offers in the Ultimatum Game (UG). Several behavioral and neurobiological studies suggest that rejections in this game are driven by intuitive processes⁴⁹⁻⁵⁴, while others conclude that reflective processes promote rejection^{55,56} or that rejections are not preferentially associated with either intuition or reflection⁵⁷. This variation in results when studying the UG may be due to the presence of both prosocial motivations (*e.g.* fairness) and anti-social motivations (*e.g.* jealousy or spite) leading to the same behavior. Rejecting low offers is certainly “other-regarding”, and arguably fair, but is not “cooperative” (unlike contributions to the public good, which are clearly cooperative). Nonetheless, it seems that the bulk of evidence supports a dominant role of intuition in motivating rejections.

At first, this finding may seem to contradict our main conclusion that cooperation is intuitive in social dilemmas: how can prosocial behavior (*i.e.* PGG cooperation) and antisocial behavior (*i.e.* rejecting in the UG) both be intuitive? In light of our proposed mechanism, however, it is possible that these observations represent two sides of the same coin. If our intuitions reflect behaviors that are beneficial in daily life, then (i) cooperation should be intuitive, because cooperation is typically advantageous in the context of repetition, reputation and sanctions; and at the same time (ii) rejecting low offers should also be intuitive, as once again this behavior is advantageous in interactions that involve reciprocity: rejecting a low offer today can lead others to make higher offers to you in the future⁵⁸. A general implication of this finding is that cooperation need not be the intuitive response under all circumstances. For example, defection might be the automatic action in a PD if one’s partner defected against oneself in the previous period (as once again, this tit-for-tat style behavior can be optimal in repeated games); or cooperation may not be intuitive when interacting with out-group members. Exploring these issues is an important direction for future research.

We also note that other recent studies are consistent with our results regarding PGG cooperation. Such studies reveal a negative relationship between offers in the UG and decision time^{57,59}, a positive effect of cognitive load on donations in the Dictator Game⁶⁰ (although see ref⁶¹ which finds no effect of cognitive load in the Dictator Game), a marginal negative effect of decision time on choosing the efficient option in a series of binary-choice money division tasks⁶², and a negative effect of decision time on choosing full cooperation in the centipede game⁵⁷. Furthermore, our results are not explained by differences in the time taken to understand the game's payoff structure³⁵, or by the degree of adjustment away from an equitable anchor³⁷, as elaborated above in SI Section 11.

14. Supplemental study: Experiment on AMT showing that detailed comprehension questions induce reflective thinking and reduce cooperation

This supplemental study explored the effect of asking detailed comprehension questions prior to the contribution decision (unlike the other studies conducted for this paper, in which comprehension questions were asked after the contribution decision). We hypothesized that forcing subjects to perform a detailed payoff calculation prior to making their decision would shift them into a more reflective mindset. Based on the results of our other studies, we thus predicted that comprehension questions prior to the decision would reduce the average contribution, and increase the average decision time.

To assess these predictions, we had subjects on AMT participate in the same PGG as in Study 1, with the addition of a detailed payoff calculation question to the comprehension check section ("If you contributed 20 cents, and the other 3 group members contributed 10, 30 and 40 cents respectively, what bonus would you earn? [Remember that (i) you start with 40 cents and (ii) for every two cents contributed, all group members receive 1 cent]").

We then compared behavior in two experimental conditions, with the position of the comprehension questions in the experimental protocol varied between conditions. In the 'Before decision' condition, the comprehension questions were included at the end of the screen with the instructions; thus in this condition, subjects had to reason thru the payoff calculation before advancing to the screen on which that made their contribution decision. In the 'After decision' condition, the comprehension questions appeared on the screen following the contribution decision (as in Studies 1 and 6 thru 10).

The goal of this study was to assess the effect of reasoning through a payoff calculation prior to making one's decision. Thus in our analysis we will restrict our attention to the subset of subjects that correctly answered the comprehension questions (N=72 in the 'Before decision' condition, and N=51 in the 'After decision' condition): it is unclear that subjects who answered incorrectly actually reflected on the questions.

In line with our first prediction, contributions are significantly lower in the 'Before decision' condition (51.0%) compared to the 'After decision' condition (69.3%; Rank-sum, $p=0.0142$).

This relationship continues to hold (coeff=22.61, $p=0.020$) in a Tobit regression with robust standard errors including controls for age, gender and US residence.

In line with our second prediction, subjects take significantly longer to reach their decisions in the 'Before decision' condition ($\log_{10}(\text{Decision time})=1.30$) compared to the 'After decision' condition ($\log_{10}(\text{Decision time})=1.01$; Rank-sum, $p<0.001$). This relationship again continues to hold (coeff=-0.252, $p=0.001$) in a linear regression with robust standard errors including controls for age, gender and US residence. Furthermore, despite the greater mean in the 'Before decision' condition, there is significantly larger variance in $\log_{10}(\text{Decision time})$ in the 'Before decision' condition (variance=0.092) compared to the 'After decision' condition (variance=0.172; F-test for the homogeneity of variances, $p=0.016$).

Thus we provide evidence that completing a detailed comprehension question prior to making one's decision shifts subjects into a more reflective mindset and leads to less cooperation. It therefore seems likely that asking subjects to complete numerous detailed payoff calculations prior to making their decision (rather than the one question we asked here) would lead to even lower contribution levels and greater reflectiveness (and even less variance in decision time), potentially reducing or eliminating any association between decision time and cooperation by forcing all subjects into a reflective mindset. This should be kept in mind when analyzing decision time data from other datasets.

"

15. Experimental instructions

Study 1

Screen 1:

Thank you for accepting this HIT. You have received \$0.50 for participating. You also have the opportunity to receive additional money, which will be described in the next few pages.

Screen 2:

You have been randomly assigned to interact with 3 other people. All of you receive this same set of instructions. You cannot participate in this study more than once.

Each person in your group is given 40 cents for this interaction (in addition to the 50 cents you received already for participating).

You each decide how much of your 40 cents to keep for yourself, and how much (if any) to contribute to the group's common project (in increments of 2 units: 0, 2, 4, 6 etc).

All money contributed to the common project is doubled, and then split evenly among the 4 group members.

Thus, for every 2 cents contributed to the common project, each group member receives 1 cent.

If everyone contributes all of their 40 cents, everyone's money will double: each of you will earn 80 cents.

But if everyone else contributes their 40 cents, while you keep your 40 cents, you will earn 100 cents, while the others will earn only 60 cents. That is because for every 2 cents you contribute, you get only 1 cent back. Thus you personally lose money on contributing.

The other people are REAL and will really make a decision – there is no deception in this study.

Once you and the other people have chosen how much to contribute, the interaction is over. Neither you nor the other people receive any bonus other than what comes out of this interaction.

Screen 3:

Please use the slider to choose the amount of money you wish to contribute.

Your contribution: 0 -----slider-----40

Screen 4:

You MUST answer these two questions correctly to receive your bonus!

1. What level of contribution earns the highest payoff for the group as a whole?
2. What level of contribution earns the highest payoff for you personally?

Studies 2-5

See the original papers experimental instructions.

Study 6

Screen 1:

Thank you for accepting this HIT. You have received \$0.50 for participating. You also have the opportunity to receive additional money, which will be described in the next few pages.

Screen 2:

You have been randomly assigned to interact with 3 other people. All of you receive this same set of instructions. You cannot participate in this study more than once.

Each person in your group is given 40 cents for this interaction (in addition to the 50 cents you received already for participating).

You each decide how much of your 40 cents to keep for yourself, and how much (if any) to contribute to the group's common project (in increments of 2 units: 0, 2, 4, 6 etc).

All money contributed to the common project is doubled, and then split evenly among the 4 group members.

Thus, for every 2 cents contributed to the common project, each group member receives 1 cent.

If everyone contributes all of their 40 cents, everyone's money will double: each of you will earn 80 cents.

But if everyone else contributes their 40 cents, while you keep your 40 cents, you will earn 100 cents, while the others will earn only 60 cents. That is because for every 2 cents you contribute, you get only 1 cent back. Thus you personally lose money on contributing.

The other people are REAL and will really make a decision – there is no deception in this study.

Once you and the other people have chosen how much to contribute, the interaction is over. Neither you nor the other people receive any bonus other than what comes out of this interaction.

Screen 3:

[Time pressure condition] Please make your decision as quickly as possible. You must make your decision in less than 10 seconds!

[Forced delay condition] Please carefully consider your decision. You must wait and think for at least 10 seconds before making your decision.

Please use the slider to choose the amount of money you wish to contribute.

Your contribution: 0 -----slider-----40

Screen 4:

You **MUST** answer these two questions correctly to receive your bonus!

1. What level of contribution earns the highest payoff for the group as a whole?
2. What level of contribution earns the highest payoff for you personally?

Study 7*Screen 1:*

In this task, you will participate in a simple decision making study. You will receive a \$5 show-up fee, and then earn additional money based on your decision and the decision of others. You will be paid in cash immediately following the experiment.

Screen 2:

You have been randomly assigned to interact with 3 of the other people in the room. All of you receive this same set of instructions. You cannot participate in this study more than once.

Each person in your group is given \$4 for this interaction.

You each decide how much of your \$4 to keep for yourself, and how much (if any) to contribute to the group's common project (in increments of 2 cents: 0, 2, 4, 6 etc).

All money contributed to the common project is doubled, and then split evenly among the 4 group members.

Thus, for every 2 cents contributed to the common project, each group member receives 1 cent.

If everyone contributes all of their \$4, everyone's money will double: each of you will earn \$8. But if everyone else contributes their \$4, while you keep your \$4, you will earn \$10, while the others will earn only \$6. That is because for every 2 cents you contribute, you get only 1 cent back. Thus you personally lose money on contributing.

Once you and the other people have chosen how much to contribute, the interaction is over. None of you can effect each other's payoffs other than through the single decision in this interaction.

Screen 3:

[Time pressure condition] Please make your decision as quickly as possible. You must make your decision in less than 10 seconds!

[Forced delay condition] Please carefully consider you decision. You must wait and think for at least 10 seconds before making your decision.

Please use the slider to choose the amount of money you wish to contribute.

Your contribution: 0 -----slider-----400

Screen 4:

In this stage, we would like you to predict the average contribution of the others in your group. You can earn up to an additional \$2 depending on the accuracy of your prediction. For every 10 cents by which your prediction differs from the actual average, you lose 5 cents from your additional \$2 payment. Thus you have an incentive to be as accurate as possible when making your prediction.

How much do you think the other people in your group contributed on average (0 to 400 cents)?

Average contribution of other group members: 0 -----slider-----400

Screen 5:

1. What level of contribution earns the highest payoff for the group as a whole?
2. What level of contribution earns the highest payoff for you personally?

Study 8 (and Study 9, using only the Intuition-good and Reflection-good conditions)

Screen 1:

Thank you for accepting this HIT. You have received \$0.50 for participating. You also have the opportunity to receive additional money, which will be described in the next few pages.

Screen 2:

In this task, you will participate in a simple decision making study, and then answer a short survey. When you finish the survey, you will receive a completion code in order to get paid.

Screen 3:

[Intuition-good condition] Please write a paragraph (approximately 8-10 sentences) describing a time your intuition/first instinct led you in the right direction and resulted in a good outcome.

[Intuition-bad condition] Please write a paragraph (approximately 8-10 sentences) describing a time your intuition/first instinct led you in the wrong direction and resulted in a bad outcome.

[Reflection-good condition] Please write a paragraph (approximately 8-10 sentences) describing a time when carefully reasoning through a situation led you in the right direction and resulted in a good outcome.

[Reflection -bad condition] Please write a paragraph (approximately 8-10 sentences) describing a time when carefully reasoning through a situation led you in the wrong direction and resulted in a bad outcome.

--Large text box--

Please click 'Next' to begin the study.

Screen 4:

You have been randomly assigned to interact with 3 other people. All of you receive this same set of instructions. You cannot participate in this study more than once.

Each person in your group is given 40 cents for this interaction (in addition to the 50 cents you received already for participating).

You each decide how much of your 40 cents to keep for yourself, and how much (if any) to contribute to the group's common project (in increments of 2 units: 0, 2, 4, 6 etc).

All money contributed to the common project is doubled, and then split evenly among the 4 group members.

Thus, for every 2 cents contributed to the common project, each group member receives 1 cent.

If everyone contributes all of their 40 cents, everyone's money will double: each of you will earn 80 cents.

But if everyone else contributes their 40 cents, while you keep your 40 cents, you will earn 100 cents, while the others will earn only 60 cents. That is because for every 2 cents you contribute, you get only 1 cent back. Thus you personally lose money on contributing.

"

The other people are REAL and will really make a decision – there is no deception in this study.

Once you and the other people have chosen how much to contribute, the interaction is over. Neither you nor the other people receive any bonus other than what comes out of this interaction.
Screen 5:

Please use the slider to choose the amount of money you wish to contribute.

Your contribution: 0 -----slider-----40

Screen 6:

You MUST answer these two questions correctly to receive your bonus!

1. What level of contribution earns the highest payoff for the group as a whole?
2. What level of contribution earns the highest payoff for you personally?

Study 10

Screen 1:

Thank you for accepting this HIT. You have received \$0.50 for participating. You also have the opportunity to receive additional money, which will be described in the next few pages.

Screen 2:

Yellow can not
blue over and
above everything
else I might
have said.

Please transcribe this hand-written text in the box below. You must correctly transcribe the text in order for your HIT to be accepted.

--Large text box--

Please click 'Next' to begin the study.

Screen 3:

You have been randomly assigned to interact with 3 other people. All of you receive this same set of instructions. You cannot participate in this study more than once.

Each person in your group is given 40 cents for this interaction (in addition to the 50 cents you received already for participating).

You each decide how much of your 40 cents to keep for yourself, and how much (if any) to contribute to the group's common project (in increments of 2 units: 0, 2, 4, 6 etc).

All money contributed to the common project is doubled, and then split evenly among the 4 group members.

Thus, for every 2 cents contributed to the common project, each group member receives 1 cent.

If everyone contributes all of their 40 cents, everyone's money will double: each of you will earn 80 cents.

But if everyone else contributes their 40 cents, while you keep your 40 cents, you will earn 100 cents, while the others will earn only 60 cents. That is because for every 2 cents you contribute, you get only 1 cent back. Thus you personally lose money on contributing.

The other people are REAL and will really make a decision – there is no deception in this study.

Once you and the other people have chosen how much to contribute, the interaction is over. Neither you nor the other people receive any bonus other than what comes out of this interaction.

Screen 4:

Please use the slider to choose the amount of money you wish to contribute.

Your contribution: 0 -----slider-----40

Screen 5:

You MUST answer these two questions correctly to receive your bonus!

3. What level of contribution earns the highest payoff for the group as a whole?
4. What level of contribution earns the highest payoff for you personally?

"

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