

Neurocomputational evidence that conflicting prosocial motives guide distributive justice

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In the history of humanity, most conflicts within and between societies have originated from perceived inequality in resource distribution. How humans achieve and maintain distributive justice has therefore been an intensely studied issue. However, most research on the corresponding psychological processes has focused on inequality aversion and has been largely agnostic of other motives that may either align or oppose this behavioral tendency. Here we provide behavioral, computational, and neuroimaging evidence that distribution decisions are guided by three distinct motives inequality aversion, harm aversion, and rank reversal aversion—that interact with each other and can also deter individuals from pursuing equality. At the neural level, we show that these three motives are encoded by separate neural systems, compete for representation in various brain areas processing equality and harm signals, and are integrated in the striatum, which functions as a crucial hub for translating the motives to behavior. Our findings provide a comprehensive framework for understanding the cognitive and biological processes by which multiple prosocial motives are coordinated in the brain to guide redistribution behaviors. This framework enhances our

from the advantaged to the disadvantaged party (19, 20). Supporting this tendency, people are averse to overturn stable hierarchies in a society even though such preexisting hierarchies may

reduced the inequality level (effect of Δ Inequality with ORE = 1.58, 95% CI [1.37–1.83], P < 0.001, Fig. 1C, Left and SI Appendix, Table S2) and when the initial inequality was greater (effect of Δ Initial endowment with ORE = 1.12, 95% CI [1.01–1.24], P = 0.04, SI Appendix, Fig. S2A and Table S3). However, individuals' probability to choose the more equal offer was lower in the Rank-reversal condition than in the No Rank-reversal condition (ORE = 0.37, 95% CI [0.33 – 0.42], $P_{\text{No Rank-reversal}}$ (Equal) = 0.78 ± 0.03 (MEAN ± SE), $P_{\text{Rank-reversal}}$ (Equal) = 0.38 ± 0.04, t(56) = 8.88, P< 0.001, Fig. 1C, Right), demonstrating that rank reversal aversion influences

focused these analyses on the Rank-reversal condition, which in contrast to the No Rank-reversal condition allowed us to differentiate inequality aversion from harm aversion and rank reversal aversion. We describe the principles and rationales of the four model families (M1-M4) in the following section and then report the results of the corresponding analyses. For detailed expositions of all the models and technical details of model selection and estimation, please see SI Appendix, SI Materials and Methods and Table 1.

Model Construction. The control model M1 only considered inequality aversion, whereas M2-M4 considered combinations of inequality aversion and the other motives.

The simplest model M1 followed the classical inequality aversion model 246 poster Holy OF throad 2567 mids (n 929) ind which r 1200 W focused entia 2-0 ntrn. and (e(F)I)6 (2-0 namilies)-10 y M3 contrast M3c) incompared to the contrast M3c incompa

there was no reliable difference in the accuracy with which choice data generated by M3a were recovered by M4a (0.84 ± 0.02) and M3a $(0.82 \pm 0.02, t(53) = 1.66, P = 0.104)$. Thus, the winning model M4a was indeed able to predict and capture unique aspects of the data compared to the closest alternative model.

Model Parameters. In line with the model-free analyses, model-based analyses confirmed that participants' redistribution behaviors in the Rank-reversal condition were driven by inequality aversion, harm aversion, and rank reversal aversion: Participants weighed the inequality difference between the two alternative offers ($\alpha = 0.51 \pm 0.06$, t(56) = 8.90, P < 0.001, Cohen's d = 1.18), devalued the more equal offer by the extra harm for the initially advantaged party ($\beta = 0.45 \pm 0.06$, t(56) = 7.83, P < 0.001, Cohen's d = 1.04), and valued rank reversal negatively ($\delta = 0.96 \pm 0.07$, t(56) = 13.23, P < 0.001, Cohen's d = 1.75, Fig. 2*B*). In line with expectations, greater inequality aversion (α) was associated with higher probability of more equal choice (tau = 0.74, P < 0.001, SI Appendix, Fig. S4, Left). By contrast, greater harm aversion (β , tau = -0.27, P

coordinates: [15, 20, -5], voxel-wise p(FWE) = 0.064, t-value = 3.55, k = 76) varied parametrically with equality $(-\Delta F)$ in the No Rank-reversal condition (Fig. 3A), but not in the Rank-reversal condition. A comparison between conditions confirmed a more positive striatal parametric effect of equality in the No Rankreversal than Rank-reversal condition (peak MNI coordinates: [6, 14, -5], voxel-wise p(FWE) = 0.032, t-value = 4.01, k = 45, Fig. 3B and SI Appendix, Fig. S7 for a visualization of this effect). Note that this effect was also confirmed in the subsequent whole-brain analysis (SI Appendix, Table S7). The absence of striatum responses to equality in the Rank-reversal condition may be due to interactions between inequality aversion and the other motives that are stronger in this condition, a possibility that we tested explicitly in analyses described later.

Our second ROI analysis showed that VMPFC was not involved in equality processing. However, consistent with prior studies (35, 36), this area (MNI peak coordinates: [3, 56, -14], t-value = 2.76, voxel-wise p (FWE-SVC) = 0.049, k = 30, within VMPFC ROI with 8 mm radius centered on the peak MNI coordinates [0, 52, -8] involved in monetary incentive processing in ref. 35) was involved in representing the model-predicted value of the chosen option. This finding provides neural validation of our computational behavioral model.

Given that striatum was involved in signaling equality in the No Rank-reversal condition, we examined whether activity in this area can bias behavior in line with inequality aversion. A post-hoc correlation analysis showed that greater sensitivity to equality signals (i.e., more positive parametric estimates of $-\Delta F$) in putamen (MNI peak coordinates: [-18, 11, -2], max t-value =2.65, voxel-wise p (FWE-SVC) = 0.043, k = 6, ROI center MNI coordinates [-12, 10, -6]) was indeed associated with a significantly higher probability of more equal choice in the No Rank-reversal condition (Kendall's tau = 0.27, P = 0.003, robust regression: b = 7.66, P = 0.002, Fig. 3C) but not in the Rank-reversal condition (SI Appendix, Fig. S8). Whole-brain analyses revealed that no other region correlated with individuals' choices in either condition.

Taken together, these findings show that, in situations where inequality aversion is the main motive guiding behavior, the striatum plays a critical role in processing equality and biasing redistribution behaviors in line with these concerns.

Cortical Regions Involved in Signaling Harm. In the Rank-reversal condition, whole-brain analyses showed that activity in several brain areas correlated with the harm signals related to the more equal offer. These areas comprised dorsomedial prefrontal cortex/anterior cingulate cortex (DMPFC/ACC), inferior frontal gyrus (IFG), middle frontal gyrus (MFG), TPJ, and inferior temporal gyrus (ITG) (Fig. 3D and SI Appendix, Table S7). Thus, these areas could either represent the strength of the harm aversion motive, or they could be involved in processing/resolving the conflict between concerns about inequality and harm. The latter interpretation may be in line with previous findings that DMPFC/ACC, IFG, and MFG are often activated during cognitive control, conflict resolution, or behavioral adaptation (37, 38); and that TPJ is involved in mentalizing and perspective taking (39, 40). However, none of the neural effects in these areas were associated with the strength of behavioral harm aversion or inequality aversion, or the probability of more equal choice in the Rank-reversal condition. This motivated us to further examine whether and how the strength of the different motives was represented by interactions between the different neural systems representing harm and equality.

DMPFC, as a Region Signaling Harm, Dampens Neural Sensitivity to Equality in Striatum. We had observed weaker inequality aversion and dampened striatal sensitivity to equality in the Rank-reversal condition. These findings suggest that behaviorally relevant neural equality signals may not be represented invariably across different contexts, but may be modulated in situations where they conflict with harm signals. If this "conflict modulation" scenario held true, we should be able to observe that the reduction in striatal equality in the Rank-reversal condition relates to the strength of neural representations in harm-processing regions.

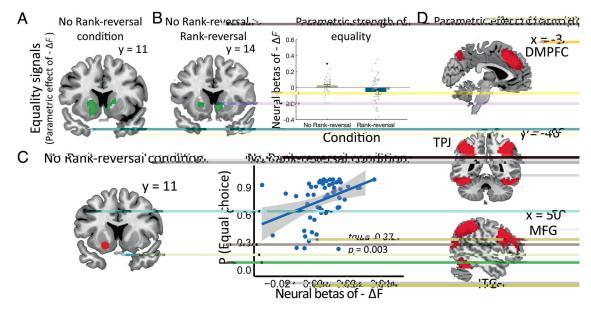


Fig. 3. Neural representations of equality and harm. (A) Activity in the striatum was associated with equality signals (-Δ*F*) in the No Rank-reversal condition. (B) More positive parametric strength of equality signal in the striatum in the No Rank-reversal than Rank-reversal condition (Left panel). For visualization, neural estimates of the significant cluster were extracted from both conditions (Right panel). Each dot represents one participant, and error bars indicate the SEMs. • P < 0.05. (C) Scatter plot shows a correlation between the parametric strength of equality signal in the striatum (peak MNI coordinates [-18, 11, -2]) and individuals' probability of more equal choice in No Rank-reversal condition, suggesting that people whose striatum is more sensitive to equality have stronger preferences for more equal distribution. (D) Parametric effects of harm to the advantaged party in the Rank-reversal condition. Activity in DMPFC, TPJ, MFG, and ITG increased with the extent of harm to the advantaged party, suggesting processing of harm signals in these brain regions. Significant clusters are thresholded at voxelwise P < 0.001 uncorrected and cluster-wise FWE corrected P < 0.05. Correlation result in (C) is thresholded at voxel-wise P < 0.05 FWE, small volume correction.

To test this hypothesis, we performed PPI analyses examining how interregional functional connectivity varies with inequality levels (GLMs 3 and 4; for ease of visualization $-\Delta F$ was split into two bins (high $-\Delta F$ vs. low $-\Delta F$), but note that all effects are also present for a parametric regressor of $-\Delta F$; for details, see *SI Appendix*, SI Materials and Methods). As the seed region for these analyses, we used an unbiased striatum region that was fully independent of the equality results described above (i.e., based on the peak coordinates in the Neurosynth "Striatum" activation map, Fig. 4A and SI Appendix, SI Materials and Methods). The PPI analyses were set up to identify brain regions that change their functional coupling with the striatum in line with how strongly equality concerns are relevant for the current choice. Evidence for this was assessed via the interaction term in the model, which quantifies for each voxel how much the correlation of the BOLD signal with that in the striatum changes as a function of the equality context (i.e., the equality concern triggered by the payoffs on the present trial), while simultaneously controlling for any main effects of (i.e., simple correlations with) the striatum time course and the equality context (41). These analyses revealed that dorsomedial prefrontal cortex (DMPFC, MNI peak coordinates: [0, 47, 40], k = 634, t-value = 4.89, cluster-wise p (FWE) = 0.002) was functionally connected with striatum more strongly for high equality contexts (high $-\Delta F$) in the Rank-reversal condition (Fig. 4C, Left; note that this effect was also present in control PPI analysis containing parametric inequality regressors; see SI Results). Importantly, the DMPFC region identified here largely overlapped with the DMPFC region involved in signaling harm to others (Fig. 4C, Left). A post-hoc comparison confirmed that this equality effect on DMPFC-Striatum connectivity was stronger in the Rank-reversal than No Rank-reversal condition (peak MNI coordinates: [3, 50, 34], t-value = 3.59, voxel-wise p (FWE-SVC) = 0.004, k = 63, ROI center MNI coordinates [0, 47, 40], Fig. 4C right, Rank reversal absence vs. presence).

To assess whether the pattern of DMPFC-Striatum connectivity may reflect functional influences on the striatum that change behavioral sensitivity to equality concerns, we tested for the Rank-reversal condition whether across individuals, a stronger effect of equality signals on DMPFC-Striatum connectivity may relate to a weaker striatum response to equality and a dampened tendency for equal choice. To this end, we extracted an index of neural equality sensitivity (Beta (high $-\Delta F$) – Beta (low $-\Delta F$)) from the independent striatum seed region shown in Fig. 4A. As already shown in the initial ROI analyses described above, this index confirmed that the striatum was sensitive to equality in the No Rank-reversal condition, but not in the Rank-reversal condition (Fig. 4B). In line with the conjecture that DMPFC may act to dampen these striatal equality representations, the index of DPMFC-Striatum connectivity (Fig. 4C) exhibited the opposite pattern: It was stronger during Rank-reversal and weaker during the No Rank-reversal condition. Importantly, this effect was not just present on average but also at an individual level, since the differences between the Rank-reversal and No Rank-reversal condition in equality-related DMPFC-Striatum connectivity correlated negatively with the corresponding differences in neural equality sensitivity in the striatum (

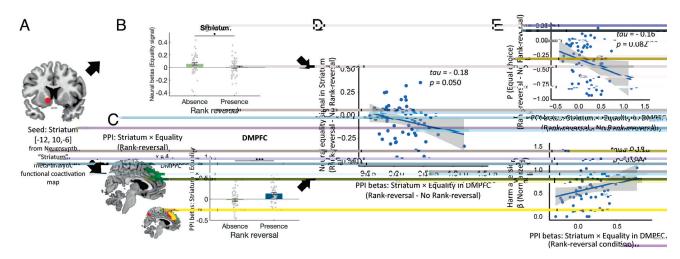


Fig. 4. Stronger DMPFC-Striatum connectivity associated with weaker neural equality signals in striatum and behavioral effects. (A) We focused the contextdependent analyses on a striatum region, with MNI coordinates [-12, 10, -6] which was derived from the "Striatum" mask at Neurosynth database. (B) We defined the neural equality signal as the difference in striatum BOLD signals between high $-\Delta F$ (i.e., $-\Delta F = -2$ and -4) and low $-\Delta F$ (i.e., $-\Delta F = -6$ and -8). These signals showed stronger equality sensitivity during absence of rank reversal (No Rank-reversal condition) than presence of rank reversal (Rank-reversal condition). (C) PPI analyses were performed to examine how connectivity with the striatum region in A changes with the contrast of "high $-\Delta F$ " These suggested a stronger DMPFC-Striatum connectivity effect of equality specifically in the Rank-reversal condition (Left panel, DMPFC in green), and this DMPFC region largely overlapped with the DMPFC region associated with harm signals (in red). The yellow area is the overlapping region. Post-hoc analyses confirmed a stronger effect of equality on PPI strength during the presence of rank reversal than absence of rank reversal. For visualization, we extracted the contrast value of the PPI regressors of the No Rank-reversal and Rank-reversal conditions within the significant cluster (Right panel). (D) Scatter plot shows that a stronger DMPFC-Striatum PPI strength of striatum*equality is associated with a lower striatum neural sensitivity to equality in the Rank-reversal than No Rank-reversal condition. (E) Scatter plots show that stronger equality-related DMPFC-Striatum PPI connectivity is associated with a lower probability of more equal choice (Top panel) and with greater harm aversion (\$\beta\$) (Bottom panel), in the Rank-reversal relative to No Rank-reversal condition. Each gray dot in (\$\beta\$) and (\$\cap(C)\$ represents one participant, and error bars represent SEMs. •••, P < 0.001; ••, P < 0.01; •, P < 0.01; •, P < 0.05. Significant clusters are thresholded at voxel-wise P < 0.001 uncorrected and cluster-wise FWE corrected P < 0.05.

in the Rank-reversal condition. Congruent with these observations, we found that activity in DMPFC and TPJ was enhanced more strongly when more inequality-averse individuals chose the more unequal offer, again implying that harm-related activity in DMPFC and TPJ may deter more equal distributions, in particular for people who are averse to inequality.

Different Motives Affect Choice via Differential Patterns of Network Interactions. The patterns of results until now suggest that inequality and harm aversion are implemented by different neural systems, which functionally interact with one another during redistribution choice. To test more directly for the relation between choice outcome and such network interactions, we performed PPI analyses focusing on the contrast between unequal choice and equal choice in the Rank-reversal condition and considered striatum (involved in equality processing) as the seed region. In particular, we examined how such network interactions may be expressed in individuals with strong behavioral expression of the different motives.

We examined two possibilities in this respect. First, for individuals with stronger inequality aversion to take unequal choices, harm- or rank-reversal-related neural activity may need to be recruited to interact with the striatum in a way that guides action selection according to context or individual preferences. Thus, in inequality-averse individuals, we should see stronger activity in harm- or rank-reversal-related neural systems and stronger connectivity with striatum during more unequal choices (see also refs. 31 and 42 for similar suggestions). Alternatively, individuals with strong harm and rank reversal aversion may exhibit more intense processing of the corresponding information and thus enhanced communication between the regions involved in these motives, reflecting more neural evidence about potential harm and rank reversal during more unequal choices.

In previous analyses, we have shown that the striatum (peak MNI coordinates [-18, 11, -2]) was involved in equality

processing and equal choice in the No Rank-reversal condition, but we found no such effects in the Rank-reversal condition. In the current analysis, we thus explored whether this striatum region still interacted with other systems during unequal/equal choices in the Rank-reversal condition with motive conflicts, where striatal activity was not related to either equality processing or equal choice. We thus defined as ROI the striatum region involved in equality processing and equal choice in the No Rank-reversal condition (a sphere with 6-mm radius centered on peak MNI coordinates of [-18, 11, -2]) and now examined with PPI analyses which areas show context-dependent connectivity with this area in the fully independent Rank-reversal condition, where equality was not neurally represented. This revealed that the connectivity strength between striatum and right IFG (peak MNI coordinates: [57, 23, 13], t-value = 5.08, cluster-wise p (FWE) = 0.046, k = 120, SI Appendix, Table S12) increased in people with greater inequality aversion when they chose the more unequal offer (i.e., normalized α , tau = 0.38, P < 0.001, Fig. 6 A and B, Left). This suggests that the striatum interacts with IFG more strongly when more inequality-averse individuals choose the more unequal offer in contexts where the more equal offer reverses ranks. Moreover, the connectivity strength between striatum and superior frontal gyrus (SFG, peak MNI coordinates: [-24, -1, 49], t-value = 5.35, cluster-wise p (FWE) = 0.041, k = 145, SI Appendix, Table S12) increased more strongly in people with greater rank reversal aversion when they chose the more unequal offer (i.e., δ , tau = 0.36, *P* < 0.001, Fig. 6 *A* and *B*, *Right*), suggesting that conflicts between rank reversal aversion and equality-related motives during choice may be coordinated in the brain via neural connectivity between this SFG area and striatum. However, we note again that our connectivity analyses cannot provide conclusive evidence about directionality and modulatory nature of such interactions, preventing us from further speculation about the specific functional mechanisms underlying these effects. Note that although inequality aversion (i.e., α) and rank reversal aversion (i.e., δ) are

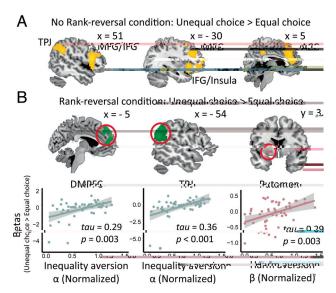


Fig. 5. Neural responses associated with more unequal choice link latent motives to behaviors. (A) In the No Rank-reversal condition, activity in MFG, IFG/ Insula, ACC, and TPJ was enhanced when individuals chose the more unequal offer vs. more equal offer. (B) In the Rank-reversal condition, activity in DMPFC (Left panel) and TPJ (Middle panel) was enhanced when more inequality-averse individuals (i.e., higher α) chose the more unequal offer, whereas activity in putamen was enhanced when more harm-averse (i.e., higher β) individuals chose the more unequal offer (Right panel). For visualization, neural estimates of the significant clusters were extracted, and scatter plots show the correlation patterns (Bottom panel). Significant clusters were thresholded at voxel-wise P < 0.001 uncorrected and cluster-wise FWE corrected P < 0.05.

negatively correlated with each other, the findings that these two motives are related to differential connectivity patterns with striatum provide evidence that they function as two different motives that independently modulate neural circuitry underlying redistribution behaviors. The correlation patterns of the above networks also held after controlling for the effect of the other two model parameters (see SI Appendix, SI Results for details).

We did not observe striatal connectivity specifically associated with harm aversion in this analysis, but together with the observations of brain activity and connectivity associated with harm aversion shown in previous analyses, our findings emphasize that distinct neural pathways link different motives (inequality aversion, harm aversion, and rank reversal aversion) to redistribution behaviors, with striatum interacting with prefrontal areas in people with stronger aversion to inequality, harm, and rank reversal.

Together, our PPI results thus provide neural evidence that striatum connectivity is crucially involved in motive trade-offs from at least two perspectives. First, the strength of functional connectivity between the striatum (involved in equality processing) and DMPFC (involved in harm signaling) is associated with individuals' harm aversion, suggesting that this behavioral tendency relates to the functional communication between these two regions. Second, the striatum was related to equality responses and choices in the No Rank-reversal condition; and its connectivity with different frontal regions for more unequal choice was related to individuals' inequality aversion and rank reversal aversion in the Rank-reversal condition. This also implies that rank reversal aversion may interact with equality-related motives via striatal-prefrontal interactions during choices of (un)equal offers.

Discussion

It is widely acknowledged that increased social inequality is associated with more risk-seeking behaviors, higher crime rate, and greater health problems (43, 44). Therefore, the question of how

to achieve distributive justice has become an intensively studied issue among researchers in many fields, including economics, politics, philosophy, and psychology. Although influential theories claim that fairness norms take precedence over other concerns (e.g., efficiency) underlying distributive justice (4), empirical evidence challenges this view and suggests that other motives can undermine fairness norms and deter equal distribution (5, 19). However, previous studies mainly focused on how self-interest motives may run counter to inequality concerns to affect wealth distribution, and most prevailing econometric models cannot explain why individuals can prefer greater inequality when different motives are in conflict (6, 25, 33). Although previous studies have demonstrated that harm aversion and rank reversal aversion are indeed involved in modulating moral decisions and redistribution decisions (8, 18, 31), it is still unclear how these motives interact with inequality aversion to bias individuals' choices.

Bridging these gaps, the current study establishes a redistribution paradigm and an integrated computational modeling approach to examine how conflicts between different prosocial motives bias individuals' preferences in wealth distribution. We demonstrate that harm aversion and rank reversal aversion can substantially interact with equality processing to prevent more equal distribution. Our neural results further suggest that the striatum serves as a hub for signaling equality and guiding decisions in line with equality concerns; and that striatal representations of equality may interact with other systems (e.g., frontal cortex) to drive choices when these are in conflict with harm avoidance and rank preserving motives.

Our study extends economic theories of social preferences by highlighting the trade-off between multiple prosocial motives in third-party wealth distribution and by exploring the boundaries within which inequality aversion determines wealth redistribution behavior. In the literature of third-party norms, theories often argue that people tend to punish norm violators in order to facilitate social norms (7, 45, 46). The current paradigm excludes the possibility of intentional violation of fairness norms, since the initially unequal distributions were generated from random draws. Given that participants still exhibit strong preferences for equal distribution in such situations, we suggest that inequality aversion, rather than motives to punish norm violation, drives redistribution behaviors as a core principle in wealth redistribution. However, we observed that people weighed equality less when it conflicted with preferences for harming others (i.e., harm aversion) or preserving initial rankings (i.e., rank reversal aversion), suggesting that equality-seeking motives (i.e., inequality aversion) are coordinated with other prosocial motives in wealth redistribution. Our results were gathered in the context of third-party preferences, so the question arises whether they would similarly apply to first-person contexts requiring people to allocate wealth between themselves and others. Previous studies suggest that similar mechanisms are at play in such contexts, but such studies have not yet clearly dissociated the different motives. For example, higher (lower) initial endowments will drive people to allocate more (less) wealth to themselves relative to others (19), and lower social ranking can also decrease individuals' inequality aversion strength and make them more willing to accept unfair offers (47). Thus, while people may also be averse to harm others or to reverse initial social ranking when making distributions for their own interests, these motives were often intertwined with self-interest and equality-seeking motives. Explicit evidence that our results would also apply to first-party preferences thus requires further empirical study. In general, our findings extend influential theories of fairness norms (25, 26) which mainly focused on effects of inequality aversion on distribution behaviors and emphasize the importance of considering other motives (i.e., harm aversion and

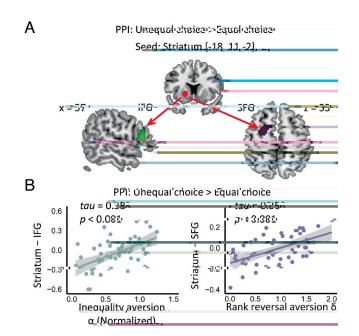


Fig. 6. Neural networks linking different motives to redistribution decisions. (A) In the Rank-reversal condition, Striatum-IFG connectivity strength was enhanced when more inequality-averse (higher α) individuals chose more unequal offers vs. more equal offers (Left panel), and Striatum-SFG connectivity strength was enhanced when more rank reversal-averse (i.e., higher δ) individuals chose more unequal offers vs. more equal offers (Right panel). Neural estimates of the significant clusters were extracted, and scatter plots show the correlation patterns (B). Significant clusters were thresholded at voxel-wise P < 0.001 uncorrected and cluster-wise FWE corrected P < 0.05.

rank reversal aversion) in econometric models, especially since conflicts between these different motives are prevalent in real-life distribution decisions (e.g., taxation policy).

Harm aversion, as a critical type of moral virtue, drives people to achieve a more equal distribution by transferring as little money as possible between two parties. When making moral decisions, people typically conform to the "do-no-harm" principle and prefer not to benefit one party by harming another party (2, 18). Studies of morality suggest that people are not willing to take responsibility for others' bad outcomes when making moral decisions (18, 48), as such moral responsibility will induce individuals' anticipatory guilt emotion which proscribes people from harming others (30, 49). Therefore, taking more money away from others brings not only greater cost for the initially advantaged party but also greater cost of moral responsibility (i.e., harm aversion) for participants which will in turn dampen their motives to seek equality.

Moreover, we suggest that rank reversal aversion is another prosocial motive that discounts the utility of equality during wealth redistribution. A stable hierarchy can provide fitness advantage by satisfying individuals' psychological need for order (50) and enhancing intragroup cooperation and productivity (51). Therefore, it is not surprising that people prefer to preserve rather than reverse preexisting hierarchy (8, 21). In line with these findings, our results suggest that the reversal of initial rankings also contributes to the disutility of equality when rank preserving and equality seeking are in conflict. Together, we demonstrate that in contrast to inequality aversion, harm aversion and rank reversal aversion function as two different third-party prosocial preferences to deter more equal wealth redistribution.

Our neural results first clarified how equality-related information is represented. GLM results support the hypothesis that individuals are sensitive to equality signals in the absence of any conflict but will be less sensitive to equality and base their decisions more heavily on other motives when they conflict with

inequality aversion. Although previous studies have proposed that the striatum signals rewarding aspects of equality-related distributions (5-7), it is still unclear which specific aspects of the distributions behavior engage the striatum and trigger the corresponding behavior—does it signal equality or other potentially rewarding aspects, such as efficiency or the other's outcomes? While stronger activity in putamen was related to higher efficiency (i.e., greater overall profits) (5), efficiency cannot account for the pattern of results in the current study since neither of the two alternative offers changed the overall profits of the distributions. An alternative explanation is that striatum activity reflects dopaminergic responses in reward computation of social welfare, as it has been widely observed that stronger striatum activity is associated with charitable giving (52, 53), altruistic punishment to norm violation (23), and more equal wealth distributions (6, 7).

Moreover, striatum has been involved in arousal representations (54). For example, stronger striatal activation was related to greater motivation for norm compliance (55). In the current study, smaller equality difference between the two alternative offers may require participants to base their decisions more heavily on the evidence of equality signals and result in stronger motivation to comply with fairness norms for them, which is manifested by enhanced striatal activity. Together with the finding that greater sensitivity to equality in putamen was related to higher probability of more equal choice, our results suggest that striatum not only reflects processing of equality signals but also promotes fairness norm compliance.

Importantly, representations of equality in striatum were only observed in the No Rank-reversal condition, and this striatal signaling of equality was dampened in the context with conflicts between motives (i.e., Rank-reversal condition). Moreover, stronger DMPFC-Striatum connectivity was associated with lower equality sensitivity in striatum, less equal choice, and higher strength of harm aversion in the Rank-reversal condition. These findings help to clarify the neurocognitive mechanisms of the weighing processes of different motives, by providing a potential neural explanation for the weaker impact of equality on redistribution decisions in the Rank-reversal condition: DMPFC may process harm-related information, convey the harm aversion motive to striatum, interact with striatum, and dampen the tendency for more equal choice. Evidence from two lines of research supports such a modulating role of DMPFC. First, DMPFC, with adjacent regions ACC, is engaged in conflict monitoring, conflict resolution, and action selection in a variety of cognitive tasks (37, 38), which may support the resolution of conflict between different motives in the current paradigm. Second, DMPFC is also thought to be part of the mentalizing system that supports vicarious experiences of others' pain or beliefs (39, 56), which may support harm signals in the current paradigm. In line with our findings, connectivity between prefrontal cortex and striatal value representations was also found to modulate individuals' behaviors in other kinds of social and non-social decision-making (31, 57). However, despite the logical consistency of this interpretation, it is difficult to unambiguously infer the directionality and precise functional contributions of neural interactions from the results of PPI analyses. Future studies with brain stimulation may be needed to establish whether DMPFC influences on striatum are indeed causally involved in guiding redistribution behaviors under circumstances with conflicts between multiple motives.

Our results also provide crucial evidence for frontostriatal circuitry in redistribution decisions. The critical role of frontostriatal circuitry in decision-making has been highlighted in both social and non-social behaviors (31, 55, 57). In general, striatum is suggested to receive inputs of goal-related representations from lateral prefrontal cortex and output value signals to guide response selection to maximize reward (58). In line with these suggestions, lateral prefrontal cortices are implicated in either modulating intuitive motivations or value representations that integrate information from different sources for moral and prosocial decision-making (31, 59). Our findings further refine previous accounts of frontostriatal circuitry in moral decision-making by clarifying that different prosocial motives modulate redistribution decisions through differential frontostriatal circuitries. Nevertheless, the specific functional contributions (i.e., inhibitory or modulatory) of these interactions between the striatal and frontal regions still need to be clarified in future studies.

Another critical contribution of our study is to clarify what neural processes underlie the modulations of different prosocial motives on redistribution decisions. Apart from processes involved in arbitrating between motives (i.e., DMPFC-Striatum connectivity), it is also important to identify processes that bias behavior on a trial-by-trial level in line with different motives and which may differ between people with different motive strengths. Activity in both DMPFC and TPJ was stronger when more inequality-averse individuals chose the more unequal offer, and activity in putamen was stronger when more harm-averse individuals chose the more unequal offer. One possibility suggested by the literature is that DMPFC and TPJ may support social cognitive processes such as mentalizing, perspective taking, inference, and learning about others' preferences (39, 56, 60). Recent studies further differentiated the roles of these two regions, by suggesting that while DMPFC is implicated in value-based action selection in a domain general manner (61-63), TPJ may be more specifically involved in processing of context-dependent social information (64, 65). Although our findings cannot provide a clear dissociation between DMPFC and TPJ, among all the regions involved in harm signaling, these two regions may be well-suited to link latent social motives to specific decisions. These findings also parallel the observation of stronger activity in TPJ for unequal choice vs equal choice in the No Rank-reversal condition, which may implicate the role of TPJ in social cognitive processing irrespective of whether there are conflicts between different motives.

In general, our findings may have economic, political, and social implications (66). The endowment effect has been introduced for decades to explain individuals' tendency to increase the subjective value of objects they own already (versus those they want to purchase) (67). Forgoing one's own good is seen as a kind of loss, and loss aversion will make it harder to give up the good (68, 69). In analogy to the endowment effect (70), our study highlights that people are inclined to maintain initial relative rankings and to take less money away from others in wealth redistribution, considering the reversal of initial rankings and others' monetary loss as a kind of third-party loss which proscribes actions to achieve higher equality (8). More generally, our findings may also explain resistance to reform policies that aim to promote social welfare or reduce income inequality (21, 71). For instance, rich people in regions with more equal income distribution, whose advantaged ranks can be more easily reversed, are less supportive of redistribution than those in regions with more unequal income distribution (16). Given that the effects of different motives are scientifically validated in the current study, this may help to develop better taxation policies by taking these motives into account when designing measures to reduce social inequality on the one hand and satisfy people in different income groups who pursue different motives on the other hand.

To conclude, the current study provides a neurocomputational account of the trade-off between multiple prosocial motives underlying resource distribution. Our findings suggest that in addition to inequality aversion, harm aversion and rank reversal aversion

work as two separate prosocial motives to modulate individuals' behaviors during wealth redistribution. Moreover, our study offers neural explanations for how different prosocial motives modulate redistribution behaviors, by highlighting a crucial role of striatum in equality processing and modulation of motives on ultimate decisions. Our approach improves our understanding of cognitive and neurobiological mechanisms underlying social preferences and distributive justice and may have implications for development of reform policies to promote fairness norms and social justice.

Materials and Methods

Participants. Sixty-three right-handed healthy adults were recruited in the experiment. Six participants were excluded because of either making the same decision all the time or excessive head movement ($> \pm 3$ mm in translation and/ or $> \pm 3^{\circ}$ in rotation). The remaining 57 participants were aged between 19 and 28 y (mean = 21.83 SD = 1.91; 31 female). No participant reported any history of psychiatric, neurological, or cognitive disorders. Informed written consent was obtained from each participant before the experiment. The study was carried out in accordance with the Declaration of Helsinski and was approved by the Ethics Committee of the Department of Psychology, Peking University.

Experimental Procedure. In the present study, we developed a redistribution task to assess individuals' preferences to redistribute unequal wealth allocations. In this task, participants were first presented with a monetary distribution scheme between two anonymous strangers. The initial endowment of each party was allocated unequally and randomly by computer, and participants had to choose between two redistribution options (i.e., alternative offers) which transferred a certain amount of money from the one with higher initial endowment (advantaged party) to the one with lower initial endowment (disadvantaged party, Fig. 1A). In the No Rank-reversal condition, both alternative offers were more equal than the initial offer and kept the same total payoffs and the same relative rankings between the two parties as the initial offer. While in the Rank-reversal condition, participants were presented with the same initial offer and the same more unequal alternative offer as the No Rank-reversal condition, but with a different more equal alternative offer that had the same inequality level as the more equal alternative offer in the No Rank-reversal condition but would reverse the initially relative advantageous/disadvantageous rankings of the two parties (Fig. 1B). There were 66 trials in each of the No Rank-reversal and Rank-reversal conditions and 15 trials in each of two filler conditions. The 162 trials were divided into three scanning sessions lasting ~15 min each. After the experiment, each participant received CNY 120 (~ USD 20) for compensation. For further details of the experimental paradigm, see SI Appendix, SI Materials and Methods.

Computational Modeling Analyses. To formalize different motives underlying redistribution behaviors, we performed model-based analyses by establishing four families of computational models to examine how inequality aversion, harm aversion, and rank reversal aversion affect individuals' redistribution behaviors in the Rank-reversal condition. For detailed modeling analyses, including model construction, estimation, comparison, and simulation, see SI Appendix, SI Materials and Methods.

Neuroimaging Analyses. We collected T2*-weighted echo-planar images using a GE-MR750 3.0 T scanner with a standard head coil at Tongji University, China. The images were acquired in 40 axial slices parallel to the AC-PC line in an interleaved order, with an in-plane resolution of 3 mm × 3 mm, a slice thickness of 4 mm, an inter-slice gap of 4 mm, a repetition time of 2000 ms, an echo time of 30 ms, a flip angle of 90°, and a field of view of 200 mm \times 200 mm. We used Statistical Parametric Mapping software SPM12 (Wellcome Trust Department of Cognitive Neurology, London, UK) which was run-through MATLAB (MathWorks) to preprocess the fMRI images, perform GLM analyses and PPI analyses. For detailed neuroimaging analyses, see SI Appendix, SI Materials and Methods.

Data, Materials, and Software Availability. Data (behavioral and fMRI) and customized MATLAB and R codes are available online (https://osf.io/zd2tg/).

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