

# Differential reward responses during competition against in- and out-of-network others

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**Social interactions occur within a variety of different contexts—cooperative/competitive—and often involve members of our social network. Here, we investigated whether social network modulated the value placed on positive outcomes during a competitive context. Eighteen human participants played a simple card-guessing game with three different competitors: a close friend (in-network), a confederate (out-of-network) and a random number generator (non-social condition) while undergoing functional magnetic resonance imaging. Neuroimaging results at the time of outcome receipt demonstrated a significant main effect of competitor across multiple regions of medial prefrontal cortex, with Blood Oxygen Level Dependent (BOLD) responses strongest when competing against one's friend compared with all other conditions. Striatal BOLD responses demonstrated a more general sensitivity to positive compared with negative monetary outcomes, which an exploratory analysis revealed to be stronger when interacting with social, compared with non-social, competitors. Interestingly, a Granger causality analysis indicated directed influences sent from an medial prefrontal cortex (mPFC) region, which shows social network differentiation of outcomes, and the ventral striatum bilaterally. Our results suggest that when competing against others of varying degrees of social network, mPFC differentially values these outcomes, perhaps treating in-network outcomes as more informative, leaving the striatum to more general value computations.**

**Keywords:** effective connectivity; medial prefrontal cortex; social network; striatum; valuation

## INTRODUCTION

Human behavior often occurs within varying social contexts that color our daily experiences and decisions. We often seek out social rewards, such as looking for acceptance from others (Somerville *et al.*, 2006), which may be valued subjectively in putative neural reward circuitry (Izuma *et al.*, 2008) akin to non-social rewards (Delgado *et al.*, 2000; Knutson *et al.*, 2001; O'Doherty *et al.*, 2002; Knutson *et al.*, 2003; Tricomi *et al.*, 2006; Seymour *et al.*, 2007). One interesting idea is that the value of social rewards and the influence of social context may in part be driven by a fundamental need to feel accepted or belong (Baumeister and Leary, 1995) and a desire to form meaningful relationships (van Winden *et al.*, 2008), both of which can modulate behavior. The mere chance to receive social approval for our actions increases pro-social tendencies (e.g. charitable giving) and more strongly recruits reward circuitry than when there is no chance for approval (Izuma *et al.*, 2010), and simply being in the presence of peers lends increased value to engaging in risk-taking behaviors (Steinberg and Monahan, 2007; Chein *et al.*, 2011). Furthermore, both vicarious and shared positive experiences can receive differential value depending on whether they occur with others that are perceived as socially similar (*vs* dissimilar; Mobbs *et al.*, 2009) or with someone from within (*vs* outside of) one's social network (Fareri *et al.*, 2012). Taken together, these findings lend credence to the notion that social context can influence neural signals involved in motivated behavior, in turn playing a significant role in our daily experiences.

An interesting question arises, however, when considering that social interactions can occur in contexts that are sometimes diametrically opposed—e.g. cooperative *vs* competitive. Within cooperative social contexts, humans often act against their own self-interest, forgoing maximal personal gains for lesser gains that carry greater social value in the long run; the motivation here is that concerns for social

preferences—e.g. reciprocity, fairness and reputation—underlie social behavior (Berg *et al.*, 1995; Fehr and Fischbacher, 2002; Fehr and Camerer, 2007). For example, achieving outcomes via mutual cooperation with another person elicits stronger BOLD responses in corticostriatal reward circuitry compared with when acting selfishly or when mutually cooperating with a computer (Rilling *et al.*, 2002) as well as compared with when one's cooperation goes unreciprocated (Rilling *et al.*, 2004).

Competitive contexts, on the other hand, require keeping track of others' behavior so as to be able to outperform a competitor. Such processes rely on cortical structures, particularly medial prefrontal cortex (mPFC), to monitor self and other performance (de Bruijn *et al.*, 2009; Howard-Jones *et al.*, 2010) and code for outcomes earned against another (Bault *et al.*, 2011). A competitive social context has also been found to influence striatal BOLD signals, with responses to losses in an auction correlating with a tendency to overbid (Delgado *et al.*, 2008). Taken together, these findings suggest diverging motives and mechanisms during cooperative and competitive contexts.

As many of our interactions occur with members of our social networks, it is critical to understand how social network might affect the value placed on earned outcomes within these differing social contexts. Sharing positive outcomes with a close, in-network partner more strongly recruits the striatum than sharing the same outcome with an out-of-network other (Fareri *et al.*, 2012), suggesting a higher value attached to outcomes shared with close others. However, it is unclear how competing with an in-network other might affect outcome value; i.e. will earning a positive outcome against an in-network other carry higher or lower value than against someone out-of-networks? To investigate this, we administered a simple card-guessing task (adapted from Fareri *et al.*, 2012) in which we manipulated participants' competitors and roles. Participants competed for separate pots of money against three different competitors: an in-network close friend, an out-of-network other (confederate) and a random number generator (non-social control). Participants alternated roles between making guesses in the game (player) and watching their competitors guess (observer). Importantly, outcomes could benefit one or the other party irrespective of who was responding; i.e. monetary gains could

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go to a participant if they made a correct guess or if their competitor made an incorrect guess. Based on previous work from our group (Fareri *et al.*, 2012), we hypothesized that outcome valuation as reflected by corticostriatal BOLD responses would be modulated by social network in this competitive context, with enhanced responses observed in mPFC and the striatum at the time of outcome when competing against an in- vs out-of-network competitor.

## MATERIALS AND METHODS

### Participants

Twenty-four gender-matched participant pairs were recruited using posted advertisements from Rutgers-Newark and the surrounding area. Six participant pairs were excluded from final analysis. One participant withdrew after reporting claustrophobia. Three participant pairs failed to meet inclusionary criteria: excessive head motion (>3 mm in any plane) across multiple runs of the session and observed artifact in BOLD images. Two final pairs were excluded because of reported explicit plans to split the money earned in the task prior to coming in for the scanning session, thus compromising the creation of a competitive social context. Final analysis was conducted on behavioral and functional magnetic resonance imaging (fMRI) data from the remaining 18 MRI participants (mean = 20.4 years, s.d. = 2.15, 8 female participants). Behavioral analyses were additionally conducted on questionnaire data from the cohort of behavioral participants (mean = 21 years, s.d. = 3.36). All participant pairs provided informed consent prior to participation. This study was approved by the Institutional Review Boards of Rutgers University and the University of Medicine and Dentistry of New Jersey.

### Experimental paradigm

This study took part over the course of 2 days. Recruited MRI participants were asked to bring a same gender close friend to the experimental session (not a romantic partner or family member). After providing informed consent on Day 1, participants and their friends separately completed the Inclusion of Other in Self Scale (IOS; Aron *et al.*, 1992). This served as a manipulation check by which to assess the degree of closeness within the in-network relationship, because social network was a factor of interest here. The IOS consists of a series of sets of circles varying in their degree of overlap, with increased overlap indicating increased closeness. Participant pairs were separately instructed to choose the set that best characterized their relationship. Prior to the end of the Day 1 session, a facial photograph was taken of the same gender friend and programmed as a stimulus into the Day 2 task.

The experimental session took place on Day 2 (typical delay between sessions was 1–2 days) at the University Heights Advanced Imaging Center (Newark, NJ, USA). MRI participants were told that they were going to be playing a simple card-guessing game in which they would be competing for monetary outcomes. We manipulated two factors of interest: MRI participants' competitors (1) and role (2) during the game. MRI participants played the game against three different competitors: their friend (in-network), a gender-matched confederate from the laboratory (out-of-network other) and a random number generator (RNG). MRI participants were told that their goal was to earn more money than each competitor. The confederate was portrayed as another participant in the study who had been trained separately on the task and met the MRI participant and their friend at the start of the experimental session on Day 2. Both the MRI participant and their friend rated the confederate on the IOS as a manipulation check. The confederate's true identity was not revealed until the end of the task to limit suspicions of an unfair advantage in the task. The RNG served as a non-social control condition and was represented in the task by a

photo of a matrix of random numbers (see Supplementary Materials for further discussion). MRI participants alternated roles during the task between making the guesses in the game (player) and watching their competitors make the guesses (observer).

Participants' task (adapted from Fareri *et al.*, 2012), was simply to guess whether the value of a card was lower (1, 2, 3, 4) or higher (6, 7, 8, 9) than the number 5 (Figure 1 and Supplementary Materials for trial timeline). The task consisted of 96 trials in total, evenly distributed across four functional runs. Each run contained eight trials per partner condition, randomly presented. Participants' roles alternated across runs—two player runs and two observer runs, with 48 trials total per role condition—the order of which was counterbalanced across sessions. During player runs, MRI participants responded using buttons designated 'high' and 'low' on an MRI-compatible fiber optic response box (Current Designs, Inc.); the friend was seated in the control room and pressed a designated button on a computer keyboard to 'release' the MRI participants' responses (i.e. allow them to be counted) on trials in which they were competing. During observer runs, MRI participants made a button press to release their competitors' responses. This served as both a motor control as well as to keep MRI participants and their friends engaged in the task at all times. Unknown to MRI participants, confederate and computer responses were pre-programmed into the task.

All trials had \$2.00 at stake. Correct guesses resulted in +\$2.00 for the respondent and \$0.00 for the other party; incorrect guesses resulted in the opposite distribution. Thus, the MRI participant could experience positive (+\$2.00) and negative outcomes (\$0.00) regardless of whether they (player runs) or their competitors (observer runs) were making the guesses. No monetary losses were incurred in this task unless a trial was missed. If either the MRI participant or their competitor did not respond within the requisite amount of time (Figure 1 and Supplementary Materials), the '#' symbol would appear; participants were told this indicated a monetary loss of \$1.00 for both parties involved. This was intended to encourage responding and to protect against participants potentially not responding in order to prevent a competitor from earning money. Importantly, all outcomes were predetermined (50% positive, 50% negative) and randomly presented to ensure equivalent experiences across all participants.

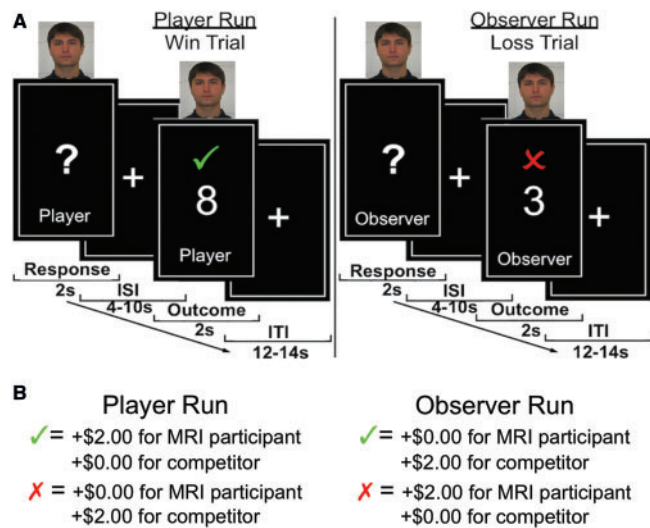
We assessed MRI participants' motivation to beat each competitor prior to the task as a subjective baseline measure of competitiveness. Post-session ratings were acquired to assess participants' experience during the task (e.g. how excited/disappointed they were to win/lose against each competitor). Ratings were made on 7-point Likert scales (1 = not at all, 7 = a lot).

### Behavioral analysis

We conducted Pearson's correlations between MRI participants' and friends' responses on the IOS to probe whether they held similar views of their relationship. MRI participants' ratings of friend and confederate on the IOS were tested with paired sample *t*-tests; the same was done for friends' responses. Pre- and post-session ratings were examined with separate one-way repeated measures analyses of variance (ANOVAs). A Greenhouse–Geisser correction was applied for violations of sphericity. Where appropriate, post hoc comparisons were conducted and corrected for multiple comparisons using the sequential Bonferroni method (Holm, 1979; Rice, 1989).

### fMRI acquisition and analysis

Images were acquired using a 3T Siemens Allegra head-only scanner. Anatomical images were collected with a T1-weighted MPRAGE sequence (256 × 256 matrix; FOV = 256 mm: 176 1 mm sagittal slices). Functional images were acquired using a single-shot gradient



**Fig. 1** Task structure. MRI participants played a simple card-guessing task in which they competed for monetary outcomes against one of three competitors on each trial—a random number generator, a gender matched confederate or a close, same gender friend (adapted from Fareri *et al.*, 2012). **(A)** A picture at the top of the screen indicated MRI participants' competitor on each trial. MRI participants' roles alternated between making guesses (player runs) and observing their competitors make the guesses (observer runs). Responses were made during a 2-s response period, which was followed by jittered inter-stimulus interval (4–10 s) and an ensuing outcome phase (2 s). **(B)** Correct guesses indicated by a green check mark resulted in +\$2.00 for the respondent and \$0.00 for the other party on a given trial. Incorrect guesses indicated by a red 'X' resulted in \$0.00 for the respondent and +\$2.00 for the other party. Trials were separated by a jittered inter-trial interval (12–14 s).

echo EPI sequence (TR = 2000 ms, TE = 25 ms, FOV = 192, flip angle = 80°, bandwidth = 2604 Hz/Px, echo spacing = 44) and comprised 35 contiguous oblique-axial slices (3 × 3 × 3 mm voxels) parallel to the anterior commissure–posterior commissure line. Pre-processing and analysis of neuroimaging data were performed using BrainVoyager QX (v2.2, Brain Innovation). Pre-processing consisted of 3D motion correction (six parameters) slice scan time correction (cubic spline interpolation), 3D Gaussian spatial smoothing (4-mm Full width at half maximum (FWHM)), voxelwise linear detrending and high-pass filtering of frequencies (three cycles per time course). Individual anatomical and functional datasets were warped to standard Talairach stereotaxic space (Talairach and Tournoux, 1988). Individual whole-brain masks were created and additively combined to create a group mask excluding the skull.

We constructed a single random effects General Linear Model (GLM) using role, competitor and outcome as factors. We modeled the response and outcome phases of the task with separate regressors as a function of competitor and role conditions in order to capture variance unique to each phase. Thus, we included a total of 18 regressors of interest in our model. Six regressors were included modeling the response phase (2 s in duration; two levels of role and three levels of competitor); 12 regressors were included modeling the outcome phase (2 s in duration; two levels of role, three levels of competitor and two levels of outcome). One missed trial regressor and six motion parameters served as regressors of no interest. Regressors of interest and missed trial regressors were convolved with a 2-gamma hemodynamic response function. All regressors were *z*-transformed at the single participant level. Statistical parametric maps (SPMs) were initially set to an uncorrected height threshold of  $P < 0.001$ , unless otherwise noted, and were subsequently corrected for multiple comparisons with a corrected threshold of  $P < 0.05$  at the group level, using the Cluster Level Statistical Threshold Estimator plugin in BrainVoyager. This correction method runs a series of Monte Carlo simulations across the whole brain to determine the probability that observed significant clusters of

activation are not false positives in a given SPM (Forman *et al.*, 1995; Goebel *et al.*, 2006; see also Lieberman and Cunningham, 2009). A cluster threshold of three contiguous voxels (equivalent to 81 mm<sup>3</sup>) as determined by the plugin was applied, unless otherwise noted. We conducted three main types of analyses:

#### Whole-brain analyses.

We conducted a 2 (role) × 3 (competitor) × 2 (outcome valence) whole-brain repeated measures ANOVA to investigate BOLD responses during the outcome phase of the task. We additionally conducted a 2 (role) × 3 (competitor) whole-brain repeated measures ANOVA in order to probe BOLD responses during the response phase (see Supplementary Materials for results). Mean parameter estimates were extracted from functional clusters to characterize resulting significant effects based on an average across all voxels in a region of interest centered around the peak voxel. Where appropriate, post hoc comparisons were conducted and corrected using the sequential Bonferroni method (Holm, 1979; Rice, 1989). We probed modulation of outcome-related BOLD responses by social closeness (Fareri *et al.*, 2012) with whole-brain correlations between self-reported closeness (IOS) with their friends and outcome-related BOLD responses collapsed across all competitor types (e.g.  $\sum$  positive >  $\sum$  negative outcomes).

#### Second-order contrast.

We also conducted a second-order contrast to explore differences in outcome value signals (e.g. positive greater than negative) as a function of whether a competitor was a social or non-social entity. We performed separate contrasts of positive *vs* negative outcomes for social (friend + confederate) and non-social (RNG) trials at the single participant level. We then conducted a subtraction of social–non-social outcome maps for each participant and combined single-subject subtractions to form a group map that was subjected to a *t*-test against zero. This exploratory analysis was set at a more lenient threshold of  $P < 0.005$ , whole-brain corrected at the cluster level to five contiguous voxels (135 mm<sup>3</sup>) of brain tissue as determined by the Cluster Level Statistical Estimator.

#### Granger causality analysis.

As previous investigations have demonstrated connectivity within corticostriatal circuitry during competitive and strategic social interactions (e.g. Hampton *et al.*, 2008; Bault *et al.*, 2011), we conducted a Granger causality analysis in BrainVoyager. Granger causality assesses interactions between a seed region of interest and all other areas of the brain by assuming a linear dependence between two time series *x* and *y* when using vector autoregression (Geweke, 1982). Linear dependence  $F_{x,y}$  between two time series can be quantified as a summation of the extent to which: past values of one time series *x* can better predict values of a second time series *y* ( $F_{x \rightarrow y}$ ) than past values of *y* and vice versa ( $F_{y \rightarrow x}$ ) as well as the undirected instantaneous influence that may occur between time series *x* and *y* ( $F_{x \leftrightarrow y}$ ) (Goebel *et al.*, 2003; Roebroeck *et al.*, 2005). Granger causality thus tests for both effective (directed) and functional (instantaneous) connectivity between a seed region and all other areas of the brain (Goebel *et al.*, 2003; Roebroeck *et al.*, 2005, 2011). We computed separate functional and effective connectivity maps demonstrating interactions between this seed region and all other voxels in the brain across the entire timecourse of each functional run (290 TRs) for each participant. As we were primarily interested in directed influences to and from this seed region, we focused on effective connectivity results. Connectivity maps were computed for each participant and were combined to form a group map which was subjected to a *t*-test against zero (Dickerson *et al.*, 2010). Group comparison maps were thresholded

at  $P < 0.005$  and corrected using a cluster threshold of six contiguous voxels (equivalent to  $162 \text{ mm}^3$  of contiguous brain tissue) as determined by the Cluster Level Statistical Estimator.

## RESULTS

### Behavioral results

A simple Pearson's correlation between MRI participants' and their friends' responses on the IOS revealed a significant correlation [ $r_{(16)} = 0.68$ ,  $P = 0.002$ ], suggesting similar perceptions of the friendship. Supporting these results, both MRI participants [ $t_{(17)} = 12.83$ ,  $P < 0.001$ ] and their friends [ $t_{(17)} = 12.70$ ,  $P < 0.001$ ] reported feeling closer to each other than to the confederate, suggesting an effective in- vs out-of-network manipulation.

Assessing MRI participants' pre-task ratings of competitiveness (e.g. 'How much do you want to beat this competitor in the game?') with a one-way repeated measures ANOVA revealed a marginally significant main effect [ $F_{(1.335, 22.694)} = 3.045$ ,  $P = 0.084$ ]. Participants were marginally more motivated to compete against the RNG (mean = 6.39, s.d. = 0.98) compared with their friend [mean = 5.55, s.d. = 1.54;  $t_{(17)} = 1.97$ ,  $P = 0.065$ ]; this effect was weaker between confederate (mean = 6.11, s.d. = 0.96) and friend [ $t_{(17)} = 1.49$ ,  $P = 0.15$ ]. These results suggest that competing against an in-network other may have differentially affected participants' motivation in the task as expected, though they did not quite reach significance. Probing post-session ratings of excitement and disappointment for winning/losing revealed no significant effects.

### Neuroimaging results

#### Whole-brain analyses.

Our primary interest in this study was whether level of social network with a competitor would modulate corticostriatal outcome value signals. A 2 (role)  $\times$  3 (competitor)  $\times$  2 (outcome) whole-brain repeated measures ANOVA revealed a main effect of competitor (Table 1) that was highly robust across many mPFC regions (Figure 2A). Importantly, a cluster emerged in a dorsal part of BA10 in mPFC ( $x, y, z = -7, 49, 6$ ), encompassing voxels previously implicated as being sensitive to social gains from risky choices compared to social losses and non-social outcomes (Bault *et al.*, 2011). When collapsing across outcome valence (Figure 2B), BOLD responses here were more positive when competing against one's friend as compared with the random number generator [ $t_{(17)} = 6.45$ ,  $P = 0.000006$ ], or confederate [ $t_{(17)} = 2.42$ ,  $P = 0.027$ ]. This region also showed a more positive BOLD response when competing against the confederate than when competing against the RNG [ $t_{(17)} = 3.74$ ,  $P = 0.002$ ]. Other areas of mPFC—dorsomedial PFC (BA9), ventromedial PFC (BA10) and a cluster bordering orbitofrontal cortex (BA11)—all showed this same general pattern. A cluster in posterior cingulate cortex bordering the cuneus (BA31) showed similar effects (Figure 2C): BOLD responses when competing against the confederate [ $t_{(17)} = 5.19$ ,  $P = 0.000074$ ] and friend [ $t_{(17)} = 4.34$ ,  $P = 0.0004$ ] were more positive than when competing against the RNG. A marginally significant trend emerged when comparing activation in this region during friend vs confederate trials [ $t_{(17)} = 1.92$ ,  $P = 0.07$ ].

Interestingly, we observed no modulation of BOLD activation in the striatum as a function of social network in this task. Rather, a main effect of outcome was observed in multiple striatal subregions, including bilateral ventral caudate nucleus and bilateral putamen (Table 2). Striatal BOLD responses were significantly greater for positive compared with negative outcomes, irrespective of competitor (Figure 3A and B). No regions emerged showing a stronger response for negative outcomes (Supplementary Materials for additional ANOVA results).

Given previous findings suggesting social closeness with an in-network other as a modulator of shared reward value (Fareri *et al.*, 2012), we probed a potential role for this factor here. We explored whether any regions demonstrating increased BOLD responses to positive vs negative outcomes (collapsed across competitors) were further modulated by social closeness with an in-network competitor. Whole-brain correlations between a contrast of positive greater than negative outcomes and IOS ratings of one's friend revealed no significant activation, suggesting that social closeness was not playing a significant role during outcome valuation within this competitive social context.

#### Second-order Contrast.

Previous results suggest differential striatal responses during social compared with non-social conditions during outcome receipt (Rilling *et al.*, 2002; Delgado *et al.*, 2008). We explored whether striatal BOLD responses might similarly demonstrate a more general social vs non-social distinction in the current paradigm. We conducted an exploratory analysis using a second-order contrast of positive greater than negative outcomes for social–non-social competitors. Results from this exploratory analysis (Supplementary Materials and Supplementary Figure S1 for additional discussion) revealed increased BOLD responses in a number of striatal subregions (Table 3), including bilateral putamen, when experiencing positive compared with negative outcomes against a social compared with non-social competitor.

#### Granger causality analysis.

Based on a main effect of competitor emerging in mPFC but not the striatum and evidence showing connectivity between these two areas during strategic and competitive interactions (e.g. Hampton *et al.*, 2008; Bault *et al.*, 2011), we examined interactions between mPFC and the rest of the brain with a Granger causality analysis. We chose a cluster in BA10 ( $x, y, z = -7, 49, 6$ ) as the seed region for this analysis, given our results showing its sensitivity to social network. This cluster also contains the peak voxel reported in a recent study by Bault and colleagues (2011) as demonstrating increased BOLD responses when experiencing positive outcomes gained in comparison to against another person. Figure 4 depicts effective connectivity results; clusters in red are targets of the mPFC seed region. As can be seen, directed influences are sent to bilateral ventral striatum (Table 4 for complete list of regions identified in this analysis), which demonstrated a main effect of outcome in our whole-brain ANOVA.

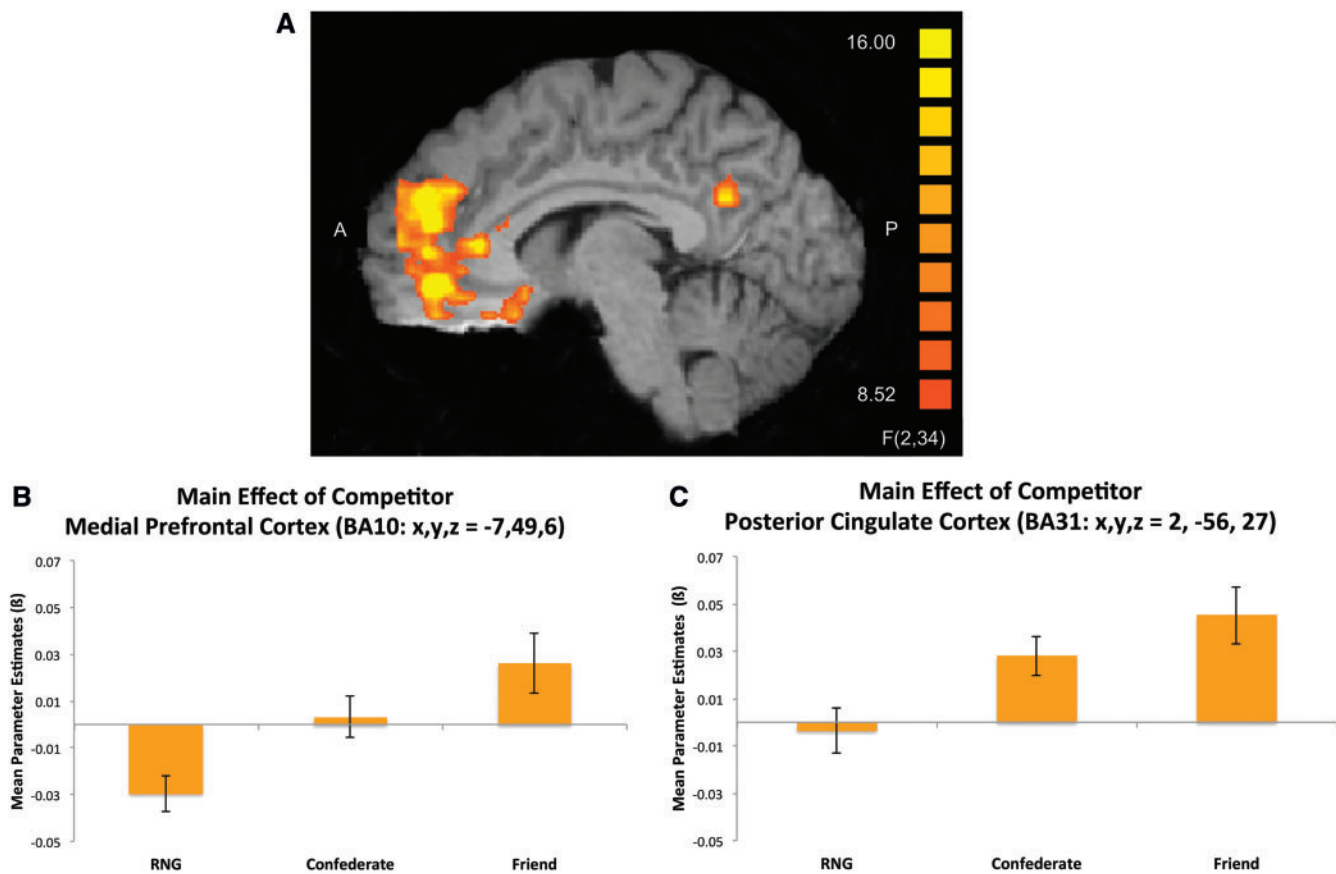
## DISCUSSION

We investigated whether outcomes experienced during a competitive social context would carry differential value as a function of social network. Our results demonstrate that competing against an in-network other elicits enhanced outcome value signals in corticostriatal circuitry. BOLD responses across a wide range of mPFC showed sensitivity to social network, with activation strongest when evaluating outcomes experienced against an in-network competitor. In the ventral striatum, BOLD responses were characterized by a main effect of outcome—stronger for positive compared with negative outcomes—and a more general social vs non-social distinction, with increased activation observed for positive vs negative outcomes on social compared with non-social trials. A Granger causality analysis further revealed corticostriatal interactions: an mPFC cluster showing social network sensitivity sent directed influences to bilateral ventral striatum. Together, our findings suggest that during a competitive social context involving competitors of differing levels of social network, mPFC differentiates

**Table 1** Outcome phase  $2 \times 3 \times 2$  ANOVA: main effect of competitor

Region of activation	Brodmann area	Direction	Laterality	Talairach coordinates			No. of voxels (mm <sup>3</sup> )	F-statistic
				x	y	z		
Cerebellum		*	R	44	-53	-21	464	14.45
Inferior/middle frontal gyrus	BA11/47	*	R	29	31	-15	278	19.20
Medial frontal gyrus/OFC	BA11	*	L	-4	31	-15	222	14.67
Subgenual anterior cingulate	BA25	*	L	-7	19	-15	152	13.82
Inferior frontal gyrus	BA47	*	L	-37	19	-15	239	14.24
Medial frontal gyrus	BA10	*	L	-7	46	-6	2110	28.50
Medial frontal gyrus	BA10	*	L	-7	49	6	2016	19.66
Cingulate gyrus/corpus callosum	BA24	**	L	-4	25	15	94	11.56
Medial frontal gyrus	BA9	*	L	-1	46	24	2554	27.50
Inferior parietal lobule/angular gyrus	BA39	***	L	-49	-62	24	710	15.30
Posterior cingulate	BA31	*	R	2	-56	27	1810	20.16

\* = friend > confederate > RNG; \*\* = friend > RNG, friend > confederate; \*\*\* friend > RNG, confederate > RNG.



**Fig. 2** Main effect of competitor (outcome phase). (A) A  $2$  (role)  $\times 3$  (competitor)  $\times 2$  (outcome) whole-brain repeated measures ANOVA revealed a significant main effect of competitor in a number of regions. (B) Parameter estimates extracted from a cluster in BA10 ( $x, y, z = -7, 49, 6$ ) demonstrate this effect to be driven by enhanced value signals to outcomes on friend trials compared with confederate or RNG trials. (C) Similar results emerged in a cluster of posterior cingulate cortex bordering the cuneus (BA31). Activation maps were set to an initial uncorrected height threshold of  $P < 0.001$  and subsequently, whole-brain corrected at the cluster level to a threshold of  $P < 0.05$ .

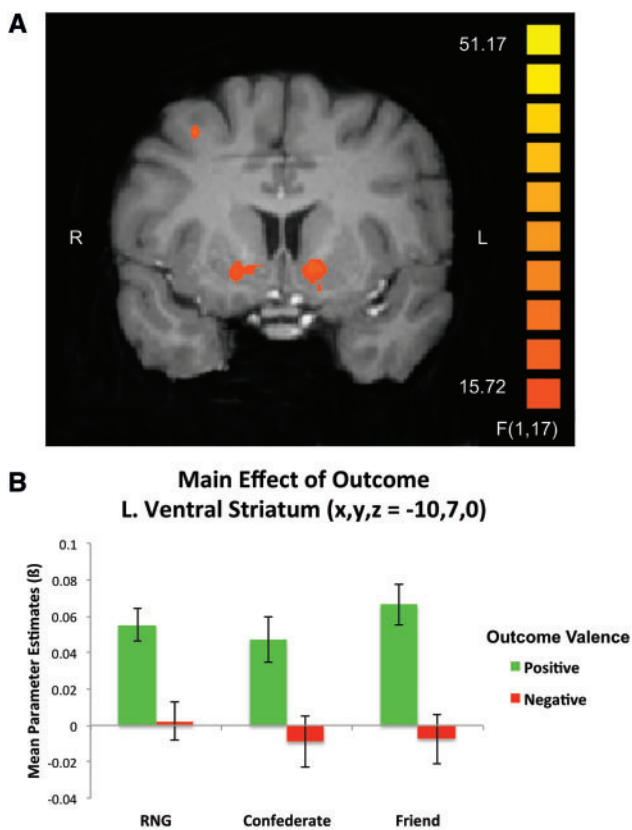
outcome value as a function of competitor, leaving the ventral striatum to process outcome value in a more coarse or general sense.

The striatum and mPFC are well-recognized components of a neural valuation system (for reviews see Daw and Doya, 2006; Delgado, 2007; Rangel *et al.*, 2008; Haber and Knutson, 2010), which assigns value to expected and experienced outcomes (Delgado *et al.*, 2000; Knutson *et al.*, 2001, 2003; O’Doherty *et al.*, 2002, 2004; Delgado *et al.*, 2004; Galvan *et al.*, 2005; Hare *et al.*, 2008) to help guide decision-making (Kennerley *et al.*, 2006; Rushworth, 2008; Rushworth and Behrens, 2008).

Importantly, areas of mPFC also encode social information pertaining to self and others (for reviews, see Amodio and Frith, 2006; Wagner *et al.*, 2012), responding to socially dominant others (Rudebeck *et al.*, 2006) and close friends in comparison with similar others (Krienen *et al.*, 2010). The present results merge these two literatures, showing that during a competitive social context, mPFC differentially assigns value to experienced positive outcomes as a function of whether one’s competitor was from within or outside of one’s social network. A possible explanation for this might be that participants attempted to use

**Table 2** Outcome phase  $2 \times 3 \times 2$  ANOVA: main effect of outcome

Region of activation	Brodmann area	Laterality	Talairach coordinates			No. of voxels (mm <sup>3</sup> )	F-statistic
			x	y	z		
Cerebellum		R	20	-77	-33	214	24.72
Cerebellum		R	35	-77	-30	690	50.29
Middle frontal gyrus	BA11	L	-22	37	-15	262	35.65
Putamen		L	-19	1	-9	179	22.25
Medial frontal/cingulate gyrus	BA10/32	L	-19	40	-6	253	31.97
Middle frontal gyrus	BA10/47	L	-43	46	-3	405	40.69
Putamen		R	17	4	0	187	27.48
Caudate nucleus		R	8	10	0	155	19.58
Caudate nucleus/ventral striatum		L	-10	7	0	428	23.87
Middle frontal gyrus	BA10	R	23	58	3	81	27.62
Caudate nucleus		L	-13	16	6	112	23.12
Inferior frontal gyrus	BA45/46	R	35	31	9	142	32.37
Medial occipital gyrus	BA18	R	20	-89	12	99	22.17
Cingulate gyrus	BA31	L	-16	-44	27	103	21.84
Cingulate gyrus	BA33	L	-4	-32	30	399	25.64
Superior parietal lobule	BA7	R	35	-65	48	249	27.79
Middle frontal gyrus	BA8	R	29	10	48	408	29.95
Middle frontal/superior frontal gyrus	BA8	L	-28	19	51	82	24.83



**Fig. 3** Main effect of outcome. (A) A significant main effect of outcome emerged during a  $2$  (role)  $\times 3$  (competitor)  $\times 2$  (outcome) whole-brain repeated measures ANOVA in bilateral ventral striatum. (B) BOLD responses in the left ventral striatum ( $x, y, z = -10, 7, 0$ ) demonstrated enhanced value signals to positive compared with negative outcomes across all competitor conditions. Activation map was set to an initial uncorrected height threshold of  $P < 0.001$  and subsequently, whole-brain corrected at the cluster level to a threshold of  $P < 0.05$ .

outcomes on in-network trials to inform behavior more so than outcomes with other competitors, thus lending heavier weight to them. Although we could not directly test this, given the random nature of outcome distribution and no opportunity for learning, this

interpretation would be consistent with a role for mPFC in outcome monitoring and strategic thinking during competitive contexts in humans (Hampton *et al.*, 2008; de Bruijn *et al.*, 2009; Bault *et al.*, 2011) as well as in rats and non-human primates (Hillman and Bilkey, 2012; Yoshida *et al.*, 2012). Future investigations could more fruitfully explore effects of social network on outcome processing in competitive situations involving dynamic learning scenarios.

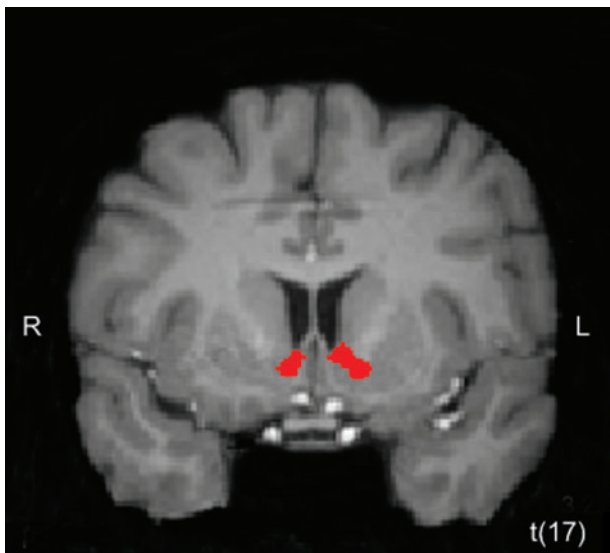
Our whole-brain analyses demonstrated a main effect of outcome in bilateral ventral striatum, with increased BOLD responses observed for positive vs negative outcomes, consistent with previous iterations of this paradigm (e.g. Delgado *et al.*, 2000, 2003, 2004). This also supports recent investigations of competitive interactions in which the striatum generally comes online during outcome processing (de Bruijn *et al.*, 2009; Hampton *et al.*, 2008) sometimes coding for social compared to non-social outcomes (Bault *et al.*, 2011), but more putative cortical and prefrontal cortical regions support behavioral updating as a function of more complex social information (Hampton *et al.*, 2008). In conjunction with a second-order contrast showing striatal sensitivity to positive social outcomes in the striatum, but not social network, these findings implicate the striatum as performing a more general role in outcome valuation during a competitive social context.

We observed effective connectivity within corticostriatal circuitry as a result of a Granger causality analysis: bilateral ventral striatum was a target of directed influence from a cluster of mPFC demonstrated to value positive outcomes earned after risky choices in comparison with another person (Bault *et al.*, 2011). It is possible that the directed influences sent from this cluster of mPFC, which demonstrated an in- vs out-of-network distinction in the present study, led to a more general representation of outcome value in the striatum as opposed to one that was specifically sensitive to social network in a more motivationally salient, cooperative context (Fareri *et al.*, 2012). This may additionally help explain why participants did not differentially rate excitement for winning or losing against each competitor. We thus suggest that the striatum in part may have processed outcome value more coarsely here due to directed modulation from mPFC, which was coding a finer sensitivity to social network.

It is important to consider potential caveats regarding this connectivity analysis. Granger causality is an exploratory analysis requiring no specific predictions about directionality or an a priori specified

**Table 3** Second-order contrast: social–non-social, win > loss

Region of activation	Brodmann area	Laterality	Talairach coordinates			No. of voxels (mm <sup>3</sup> )	t-statistic
			x	y	z		
Inferior frontal gyrus	BA47	R	26	22	−21	182	5.51
Putamen/globus pallidus		L	−19	1	−9	418	4.62
Inferior frontal gyrus	BA45	L	−43	25	0	463	6.28
Putamen		L	−25	7	3	203	4.28
Putamen		R	17	13	6	233	3.92
Putamen		L	−28	−14	6	264	4.77
Middle frontal gyrus	BA10	L	−40	52	12	193	4.69
Middle temporal gyrus/inferior parietal lobule	BA19	L	−52	−62	18	154	4.01



**Fig. 4** Effective connectivity results. A Granger causality analysis using a seed region in mPFC that demonstrated a main effect of competitor ( $x, y, z = -7, 49, 6$ ) revealed directed influences sent from this region to bilateral ventral striatum (right:  $x, y, z = 11, 13, -3$ ; left:  $x, y, z = -7, 7, 0$ ). The clusters depicted in red denote directed influences received from the mPFC seed. Activation map was set to an initial uncorrected height threshold of  $P < 0.005$  and subsequently, whole-brain corrected at the cluster level to a threshold of  $P < 0.05$ .

network of neural regions involved (Roebroeck *et al.*, 2005). This analysis searches for correlations and predictive relationships between the timecourse of activation in a specified seed region and the rest of the brain. One study (David *et al.*, 2008) contends that Granger causality may not be optimal for fMRI data, because the temporal dynamics of the hemodynamic response may be heterogeneous across the brain. However, other evidence suggests that considering temporal dynamics of fMRI data, and particularly temporal precedence, is necessary when attempting to model or detect causal influences (Roebroeck *et al.*, 2011; for further discussion also see Valdes-Sosa *et al.*, 2011).

Social closeness did not modulate outcome valuation as a function of social network in the present study. Closeness ratings in the present cohort of participants may have lacked sufficient range or variability to serve as an adequate predictor variable. All potential values of the IOS scale were not represented as selected responses in this sample of participants. Perhaps, with a sample exhibiting more diversity in their IOS responses, an effect may have emerged. However, given previous evidence from our group (Fareri *et al.*, 2012) as well as complementary evidence suggesting general social reward sensitivity may be related to other measures of interpersonal closeness (Vrticka *et al.*,

2008; for review see Vrticka and Vuilleumier, 2012), this result is not necessarily surprising. Competing against a close, in-network other may in fact be orthogonal to the notion of a merged representation of a social relationship inherent in the construct of social closeness (Aron *et al.*, 1992). Rather than sharing a positive experience with another and perhaps reaffirming a friendship with said shared reward (Fareri *et al.*, 2012), positive outcomes in the present task necessarily came at the expense of an in-network friend, which would not be a mutually positive and reaffirming experience.

The striatum demonstrated a general sensitivity to positive compared with negative outcomes, which was greater when competing against a social entity. We did not observe any significant competitor effects in response to negative outcomes as previously observed (Delgado *et al.*, 2008). This could have been in part due to the competitive social context here not being salient enough. Although positive outcomes for the MRI participant in this task resulted in monetary gains, negative outcomes only led to a gain for the competitor and no gain (or cost) for the MRI participant. Previous work in which striatal BOLD responses to social losses correlated with overbidding in an auction (Delgado *et al.*, 2008) necessitated more meaningful decisions. It is plausible that because participants in the present investigation simply made guesses, with no true opportunity to maximize earnings, the social manipulation may not have been as motivationally salient as intended. Future work could probe the effects of social network in a competition through the creation of a more salient and meaningful competitive context, one in which learning an optimal behavioral strategy is necessary to beat in- vs out-of-network competitors. Such an alternative design might better parse contributions of mPFC and striatum when competing against in-/out-of-network others. This may also further delineate behavioral correlates of competitiveness. Although it is conceivable that competing against one's friend may elicit a stronger competitive desire, it seems equally likely that participants might be less motivated to beat their friend and a more salient design may further elucidate these divergent predictions.

The value placed on experienced outcomes is subject to a great deal of influence across varying social contexts. A common and important modulator of experienced outcomes is with whom they occur—someone from within or outside our social network. Our findings demonstrate that when competing against in-network other, increased value signals emerge in mPFC upon outcome receipt, as compared with receiving the same outcome in competition with an out-of-network other or non-social entity. This supports an integrating role for the mPFC, combining social information with value signals in a competitive social context.

#### SUPPLEMENTARY DATA

Supplementary data are available at SCAN online.

**Table 4** Granger causality analysis: Effective connectivity.

Region of activation	Brodmann area	Laterality	Talairach coordinates			No. of voxels (mm <sup>3</sup> )	t-statistic
			x	y	z		
Medial frontal gyrus	BA11	L	-4	40	-12	228	4.93
Medial temporal lobe	BA35	L	-22	-20	-12	367	4.49
Ventral striatum		R	11	13	-3	431	6.62
Ventral striatum		L	-7	7	0	428	4.30
PCC/corpus callosum	BA29	R	2	-41	6	1441	4.77
Medial frontal gyrus/cingulate gyrus	BA10/32	L	-4	49	6	5616	4.69
Thalamus		L	-4	-14	12	364	4.54
Superior frontal gyrus	BA10	L	-22	49	24	176	4.35
Cingulate gyrus	BA32	L	-1	28	27	172	4.98
Precuneus/PCC	BA31	L	-4	-44	36	2234	5.43
Medial frontal gyrus	BA8	L	-7	49	42	216	4.02

Regions receiving directed influence from mPFC seed region (x, y, z = -7, 49, 6).

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**Conflict of Interest**

None declared.

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