



## Neural correlates of inhibition and reward are negatively associated

Jessica Weafer<sup>a,\*</sup>, Natania A. Crane<sup>b</sup>, Stephanie M. Gorka<sup>b</sup>, K. Luan Phan<sup>b,c,d,e</sup>, Harriet de Wit<sup>a</sup>

<sup>a</sup> Department of Psychiatry and Behavioral Neuroscience, MC3077, University of Chicago, 5841 S. Maryland Avenue, Chicago, IL, 60637, USA

<sup>b</sup> Department of Psychiatry, University of Illinois at Chicago, 1747 Roosevelt Road, Chicago, IL, 60608, USA

<sup>c</sup> Department of Psychology, University of Illinois at Chicago, 1007 W. Harrison Street, Chicago, IL, 60607, USA

<sup>d</sup> Department of Anatomy & Cell Biology, University of Illinois at Chicago, 808 South Wood Street, Chicago, IL, 60612, USA

<sup>e</sup> Mental Health Service Line, Jesse Brown Medical Center, 802 S. Seeley Avenue, Chicago, IL, 60612, USA

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### ABSTRACT

Individuals with impulsive and addictive disorders, including drug addiction, binge eating/obesity, and problem gambling, exhibit both impaired control over behavior and heightened sensitivity to reward. However, it is not known whether such deviation in inhibitory and reward circuitry among clinical populations is a cause or consequence of the disorders. Recent evidence suggests that these constructs may be related at the neural level, and together, increase risk for engaging in maladaptive behaviors. The current study examined the degree to which brain function during inhibition relates to brain function during receipt of reward in healthy young adults who have not yet developed problem behaviors. Participants completed the stop signal task to assess inhibitory control and the doors task to assess reactivity to monetary reward (win vs loss) during functional magnetic resonance imaging (fMRI). Brain activation during response inhibition was negatively correlated with brain activation during reward. Specifically, less brain activation in right prefrontal regions during inhibition, including the right inferior frontal gyrus, middle frontal gyrus, and supplementary motor area, was associated with greater brain activation in left ventral striatum during receipt of monetary reward. Moreover, these associations were stronger in binge drinkers compared to non-binge drinkers. These findings suggest that the systems are related even before the onset of impulsive or addictive disorders. As such, it is possible that the association between inhibitory and reward circuitry may be a prospective marker of risk.

### 1. Introduction

Impulsive and addictive behaviors, including drug and alcohol addiction, binge eating/obesity, and problem gambling are characterized by both impaired control over behavior and heightened reward sensitivity. These two constructs are often considered as independent risk factors for problem behaviors, but neurobiological theories propose that the two may be related, perhaps exerting reciprocal influences on each other to promote inappropriate or maladaptive behavior (Goldstein and Volkow, 2002, 2011; Jentsch and Taylor, 1999; Kaye et al., 2013). This hypothesis is supported by evidence that inhibition and reward share overlapping neural circuitry, and that both are strongly linked to the dopamine system (Goldstein and Volkow, 2002; Jentsch and Pennington, 2014). Importantly, this relative imbalance between hypoactive inhibitory functioning and hyperactive reward functioning may be present before the onset of a disorder. If so, this neural profile could serve as an

important marker of risk, as well as provide a potential target for prevention mechanisms.

Functional neuroimaging studies provide consistent evidence implicating altered inhibition and reward circuitry in addiction and impulse control disorders. For instance, individuals who abuse drugs show hypoactivation of prefrontal regions involved in inhibitory control, including the right inferior frontal gyrus (IFG), supplementary motor area (SMA), and dorsolateral prefrontal cortex (DLPFC), during response inhibition (Luijten et al., 2014; Spechler et al., 2016). Similar hypoactivation of frontal regions during inhibition has also been observed in problem gamblers, individuals with internet gaming disorder, and adults and adolescents with bulimia nervosa, compared to healthy controls (Chen et al., 2015; de Ruiter et al., 2012; Liu et al., 2014; Marsh et al., 2009, 2011). Individuals with addictive and impulse control disorders also display heightened activation of reward regions, including the ventral striatum (VS) and medial prefrontal cortex (mPFC), in response to

\* Corresponding author. Department of Psychiatry and Behavioral Neuroscience, MC3077, University of Chicago, 5841 S. Maryland Ave, Chicago, IL, 60637, USA.  
E-mail addresses: [jweafer@uchicago.edu](mailto:jweafer@uchicago.edu) (J. Weafer), [ncrane3@uic.edu](mailto:ncrane3@uic.edu) (N.A. Crane), [sgorka2@uic.edu](mailto:sgorka2@uic.edu) (S.M. Gorka), [klphan@uic.edu](mailto:klphan@uic.edu) (K.L. Phan), [hdew@uchicago.edu](mailto:hdew@uchicago.edu) (H. de Wit).

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disorder-specific rewarding stimuli. For instance, individuals who abuse drugs display heightened activation in reward circuitry while viewing images of drugs and drug cues (Jasinska et al., 2014; Schacht et al., 2012). Problem gamblers and individuals with internet gaming disorder also show heightened activation of reward circuitry when viewing images related to gambling or gaming, respectively (Fauth-Buhler and Mann, 2017), and obese individuals show greater reward response to food cues (Tomasini and Volkow, 2013). Interestingly, there is also evidence that individuals with addictive disorders display a blunted response to non-disorder-related reward, including monetary and sexual reward, and pleasant emotional stimuli (Dunning et al., 2011; Garavan et al., 2000; Balodis and Potezna, 2015). This suggests that the relative values of different rewards may change as the disorders develop. In sum, individuals with addiction and impulse control disorders display hypo-activation of inhibitory circuitry, coupled with hyperactivation of reward circuitry to disorder-specific stimuli, compared to healthy controls.

Several recent imaging studies suggest that inhibition and reward circuits are closely linked, particularly in addicted populations. Compared to healthy controls, individuals with alcohol dependence show less functional connectivity between DLPFC (a region strongly implicated in inhibitory control) and VS during monetary reward (Becker et al., 2017; Forbes et al., 2014). Moreover, lower frontal-striatal connectivity in alcohol dependent individuals is associated with greater activation of VS during reward (Becker et al., 2017). These findings suggest that greater behavioral sensitivity to reward could be due in part to dampened prefrontal regulation of striatal reward responses.

It is not known whether aberrant functioning of inhibition and reward circuitry in these disorders is a cause or consequence of the disorder. Preliminary prospective studies show that individuals with less engagement of inhibitory control regions during response inhibition (Mahmood et al., 2013; Norman et al., 2011; Wetherill et al., 2013) as well as greater activation in reward regions during monetary reward (Heitzeg et al., 2015; Whelan et al., 2014) are more likely to exhibit substance use later in life, suggesting a potential causal relationship. Another way to investigate the relationships between these processes before problematic behaviors develop is to examine engagement of prefrontal regions during response inhibition in relation to engagement of reward circuitry during receipt of reward in healthy, non-disordered populations. That is, a risk profile for future problematic behaviors may be poor prefrontal regulation of reward circuitry.

The current study examined the degree to which brain function during inhibition relates to brain function during reward in healthy young adults with no history of addictive or impulse control disorders. Specifically, we used fMRI to examine associations between brain activation during response inhibition and during monetary reward. Brain activation during inhibition was assessed using the stop signal task. This task activates right-lateralized frontal regions known to be involved in inhibitory control, including DLPFC, IFG, and SMA, and less frontal activation is associated with poor inhibition (Aron and Poldrack, 2006; Congdon et al., 2010). Brain activation during receipt of monetary reward was assessed using the doors task (Carlson et al., 2011), which reliably activates regions involved in reward, including VS (Carlson et al., 2011; Crane et al., 2017). We hypothesized that less prefrontal activation during response inhibition would be associated with greater activation of reward circuitry during monetary reward. Additionally, we conducted exploratory analyses to examine these associations separately in binge and non-binge drinkers. As binge drinkers are a population at risk for developing substance use disorders, these analyses provided some insight as to whether associations between brain function during inhibition and reward related to risk for addictive and impulse control disorders.

## 2. Methods

### 2.1. Participants

Volunteers age 21–29 were recruited from the community through

online and printed advertisements. This age range was selected to target young adults, as the study aimed to identify biomarkers of addiction vulnerability, and young adulthood is a known period of risk. Individuals younger than 21 were excluded to limit variability due to ongoing brain maturation in prefrontal regions of interest (Silveri, 2012). Inclusion criteria were as follows: age 21–29, BMI between 19 and 26, at least a high school education, fluency in English, no current or past year DSM-IV diagnosis, no lifetime history of substance dependence or ADHD, no serious medical conditions, and no night shift work. Participants were excluded if they reported smoking more than five cigarettes per day or daily use of any medications other than birth control, contraindication for fMRI (e.g., metal in the body, claustrophobia), or left-handedness, or if they were pregnant, lactating, or planning to become pregnant in the next 3 months.

### 2.2. Measures

#### 2.2.1. Stop signal task

Participants performed the stop signal task (Logan et al., 1997; Karcken et al., 2013) during blood oxygen level dependent (BOLD) fMRI to assess brain activation during response inhibition. Participants were instructed to respond as quickly as possible to go signals (left- or right-pointing blue arrows), and to inhibit responses on trials in which a stop signal (up-pointing red arrow superimposed on the go arrow) occurred. The duration of the delay between presentation of the go and stop signal (i.e., the stop signal delay) was adjusted to target a 50% successful inhibition rate. Stop signal reaction time (SSRT) was calculated by subtracting the mean stop signal delay from the participant's mean go reaction time. Longer SSRT indicates a longer time needed to inhibit a response, and thus poorer inhibitory control. Supplemental Fig. S1 presents a schematic of the task and the main task parameters (go reaction time, stop signal delay, and SSRT). Behavioral task performance was considered valid if participants had a mean Go reaction time of 800 ms or less, Go accuracy of at least 75%, and Stop accuracy between 25% and 75%. Participants completed three task runs (80 go and 40 stop trials each), and each run required approximately 6 min to complete.

#### 2.2.2. Doors task

Participants completed the doors task (Carlson et al., 2011) during BOLD fMRI to assess brain activation during monetary reward and loss. Task procedures are described in detail in Crane et al. (2017). Briefly, two doors are presented on the screen, and participants are told that behind one of the doors is a monetary prize of \$.50 (signaled by '↑') and behind the other door is a loss of \$.25 (signaled by '↓'). For each trial, participants are instructed to use a button box to choose one of the two doors. They are told that they will either win or lose money based on their choices, and that they had a chance of winning between \$0 and \$15 total based on their performance. In actuality, the subjects' performance had no impact on outcomes. The task consisted of 30 predetermined Wins and 30 Losses presented in a pseudorandom order over two runs. The task required 15 min to complete, and all subjects earned \$10.

#### 2.2.3. Timeline Follow-Back (TLFB)

Participants completed a retrospective timeline calendar of their alcohol consumption for the past month to assess daily patterns of drinking, including number of binge episodes (Sobell and Sobell, 1992). For each day, participants estimated the number of standard drinks they consumed, and days on which they consumed 5 (men) or 4 (women) or more drinks were considered binge episodes. From the TLFB we calculated subjects' total number of binge-drinking days and average number of drinks per week over the past month.

### 2.3. Procedure

Participants were screened in the Human Behavioral Pharmacology Laboratory at the University of Chicago and provided informed consent.

As a separate part of the parent study, they completed four drug-challenge sessions in which they received amphetamine or placebo (presented elsewhere: Crane et al., 2018; Weafer et al., 2017a; Weafer et al., 2017b). Subjects then completed an fMRI session at the University of Illinois at Chicago. They abstained from drugs, including alcohol, for 24 h prior to the fMRI session, as verified by self-report, breath alcohol, and urine screens. Upon arrival at the laboratory, they completed a scanner safety questionnaire and a practice round of the stop signal task. They were then placed in the scanner, where they completed a battery of tasks, including the stop signal and doors tasks. All participants completed the stop signal task prior to the doors task. Upon completion of all sessions, participants were debriefed and paid for their time. The study was approved by the IRB at each institution.

### 2.3.1. Imaging acquisition and processing

Participants were imaged using a 3T GE scanner with an 8-channel head coil array at the UIC Center for Magnetic Resonance Research. T1-weighted high-resolution anatomical images (BRAVO sequence with  $1 \times 1 \times 1 \text{ mm}^3$  voxels; repetition time, 9.3 ms; echo time, 3.8 ms;  $220 \times 220 \text{ mm}$  field of view; flip angle,  $13^\circ$ ) were acquired for co-registration and normalization to the MNI coordinate system. Whole-brain functional imaging was performed with a standard T2\*-sensitive echo planar imaging sequence (gradient-echo; repetition time, 2000 ms; echo time, 22.2 ms;  $64 \times 64$  matrix;  $220 \times 220 \text{ mm}$  field of view; flip angle,  $90^\circ$ ; 3 mm slice thickness with no gap, 44 axial slices).

Images were processed using SPM12 (Wellcome Trust Centre for Neuroimaging). Standard preprocessing of functional images for both tasks included slice-time correction, spatial realignment to correct for head motion, coregistration to the participant's T1 image and warping to MNI space, resampling to 2mm/side voxels and smoothing with an 8 mm FWHM isotropic Gaussian kernel. The general linear model was applied to the time series, convolved with the canonical hemodynamic response function and included a 128s high-pass filter. Condition effects were modeled with event-related regressors: correct go (Go) and stop (StopInh) trials, and incorrect go and stop trials for the stop signal task, and Win, Loss, and Fixation for the doors task. Effects were estimated at each voxel, and for each subject. Individual contrast maps were created for each participant (StopInh > Go for the stop signal task, and Win > Loss for the doors task). Volumes were identified as motion outliers based on image intensity difference (dvars) or framewise displacement (fd; >0.5 mm) using FSL's motion outlier tool (Power et al., 2012). Six head motion parameters from the SPM realignment and the FSL-tagged motion outlier files were included as regressors-of-no-interest.

## 2.4. Data analyses

### 2.4.1. Stop signal task

We conducted a second-level, random effects one sample *t*-test for StopInh > Go. As our hypotheses were specific to frontal regions, statistical inferences were made based on peak voxel significance within a frontal-insular-subcortical (FIS) mask previously used for analyses with this task (Weafer et al. 2015, 2017a). This  $382,584 \text{ mm}^3$  (47,823 voxels) mask included the following structural regions from AAL library (Tzourio-Mazoyer et al., 2002) available in MarsBar: medial and lateral frontal and orbital regions, bilateral precentral gyri, anterior and middle cingulate cortex, anterior insula, and subcortical motor regions consisting of bilateral putamen, pallidum, and caudate. Peak voxel activation ( $p_{\text{FWE}} < 0.05$ ) within the FIS mask was used as the statistical threshold.

### 2.4.2. Doors task

We conducted a second-level, random effects one sample *t*-test for Win > Loss. The doors task does not include a Neutral condition, and so we were not able to compare Win to Neutral. It is important to note, however, that the Win > Loss contrast is a more sensitive indicator of neural activation during reward processing than examining Win or Loss individually (Carlson et al., 2011; Forbes et al., 2014; Foti et al., 2011).

As our hypotheses were specific to regions implicated in reward, statistical inferences were made based on peak voxel significance within a functional reward mask downloaded from Neurosynth (Yarkoni et al., 2011). The mask was based on a meta-analysis of 532 studies with 100 terms relating to 'reward' and displaying regions that are reported more often in studies that load highly on 'reward' (<http://neurosynth.org/analyses/topics/v4-topics-100/99>). Peak voxel activation ( $p_{\text{FWE}} < 0.05$ ) within the reward mask was used as the statistical threshold.

### 2.4.3. Associations between brain activation during inhibition and monetary reward

We extracted parameter estimates/ $\beta$ -weights representing BOLD response activation in arbitrary units averaged across all voxels within a 10-mm radius sphere surrounding peak areas of activation ( $p_{\text{FWE}} < 0.05$ ) for both tasks. For the stop signal task, we focused our analyses on significant peaks within well-established inhibitory control regions, including right IFG, MFG, insula, and SMA. For the doors task, we focused our analyses on significant peaks within VS, given this region's well-established role in reward (see Supplementary Table 3 for correlations among all significant regions of activation). We also extracted significant peaks in visual regions to serve as control regions. We first examined the activation distributions to identify any potential outliers, defined as >3 standard deviations above or below the mean. We then conducted bivariate correlational analyses to determine the degree to which BOLD activation in inhibitory regions during response inhibition was associated with BOLD activation in reward regions during monetary reward.

### 2.4.4. Association between inhibition-reward relationships in binge and non-binge drinkers

To examine the degree to which associations between brain activity during inhibition and reward related to risk for addictive behaviors, we tested associations separately in binge and non-binge drinkers. Binge drinkers were defined as participants who reported at least one binge episode in the last month on the TLFB and non-binge drinkers were defined as participants who reported no binge episodes in the past month.

## 3. Results

### 3.1. Sample characteristics

A total of 67 healthy young adults (33 men and 34 women) took part in this study. Demographic and substance use data for the sample are presented in Table 1.

### 3.2. Brain activation during response inhibition

Behavioral data for the stop signal task were lost from 11 subjects due to computer error, and 3 additional subjects had incomplete behavioral or fMRI data. Five participants were excluded from stop signal task fMRI analyses due to invalid behavioral performance (mean Go reaction

**Table 1**  
Sample characteristics (n = 44).

	Mean (SD)
Sex (M:F)	22:22
Age	24.7 (2.6)
Education (years)	15.7 (1.4)
Race	
Caucasian	29
More than one race	6
Asian	5
African-American	3
American Indian/Alaskan	1
Alcohol consumption (past 28 days)	
Binge episodes	2.0 (3.0)
Drinks per week	7.0 (9.0)

time > 800 ms, n = 3; Go accuracy < 75%, n = 1; Stop Accuracy < 25%, n = 1), resulting in a final sample size of n = 48. Behavioral task performance measures were as follows: mean SSRT = 305.7 ms; mean inhibition rate = 52.7%; mean go accuracy = 96.0%; and mean go RT = 462.1 ms. As previously reported in this sample (Weafer et al., 2017a), the StopInh > Go contrast activated inhibitory control regions, including right IFG, insula, MFG, and SMA (Fig. 1B and C; Supplementary Table 1).

3.3. Brain activation during monetary reward

As previously reported in this sample (Crane et al., 2017), fMRI analyses of the doors task showed that the Win > Loss contrast activated bilateral VS (Fig. 1A; Supplementary Table 2), as well as bilateral middle and inferior occipital gyri (Supplementary Table 2).

3.4. Associations between brain activation during inhibition and monetary reward

We extracted parameter estimates/ $\beta$ -weights representing BOLD activation within a 10 mm-radius sphere surrounding the following regions of significant peak activation for the stop signal task: right IFG [42 4 32], insula [34 24 4], MFG [28 2 50], and SMA [14 12 64]. No outliers were present. For the doors task, we extracted activation surrounding the following peaks: bilateral VS [-6 18 -2] and [10 22 -2], as well as bilateral visual cortex [-30 -86 -8] and [34 -86 -6] to serve as control regions.

Outlier analyses (activation exceeding 3 standard deviations from the mean) identified two outliers for the [-6 18 -2] peak and two outliers for the [10 22 -2] peak. After confirming that the second level model remained unchanged after removing these four participants, we excluded them from subsequent analyses. As we tested correlations for each region of activation from the doors task with four inhibitory control regions, we applied a Bonferroni correction of  $p < 0.0125$  (0.05/4). Bivariate correlational analyses showed a negative association between brain activation during response inhibition and receipt of monetary reward. Specifically, less brain activation in right prefrontal regions during inhibition, including right IFG, MFG, and SMA, was associated with greater brain activation in left, but not right, VS during receipt of monetary reward

Table 2

Correlations between brain activation during response inhibition and receipt of monetary reward (n = 44).

SST (StopInh > Go)	Doors (Win > Loss)			
	L VS	R VS	L Occipital	R Occipital
R IFG	-0.382*	-0.337	0.060	0.167
R MFG	-0.400*	-0.294	0.026	0.024
R Insula	-0.111	-0.075	0.002	-0.099
R SMA	-0.400*	-0.322	-0.020	-0.047

Note. \* $p < 0.0125$ . SST = stop signal task; L = left; R = right; VS = ventral striatum; IFG = inferior frontal gyrus; MFG = middle frontal gyrus; SMA = supplementary motor area.

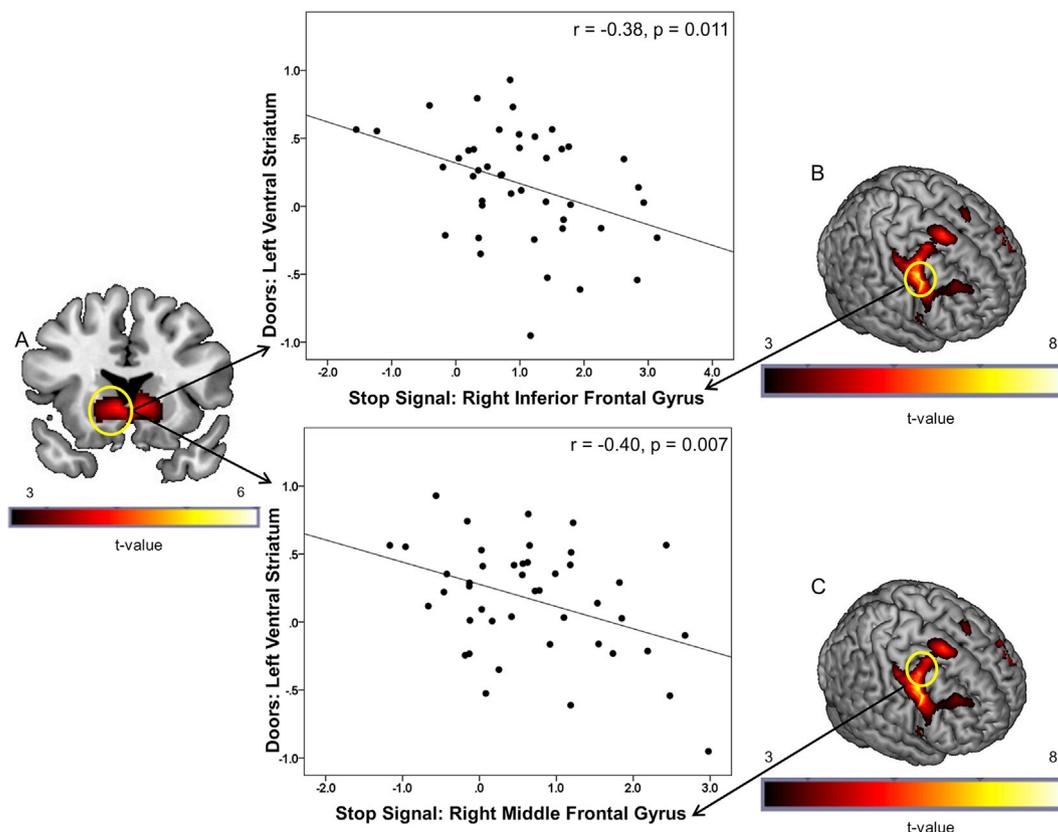


Fig. 1. (A) Brain activation during receipt of monetary reward (Doors task: Win > Loss) in left VS. Significant peak activation was observed at the [-6 18 -2] MNI coordinate after correcting for family wise error ( $p_{FWE} < 0.05$ ) within the reward mask. (B) Brain activation during successful response inhibition (StopInh > Go) within the frontal-insular-subcortical (FIS) mask. Significant ( $p_{FWE} < 0.05$ ) peak activation was observed in a large right prefrontal cluster encompassing precentral, middle, and inferior gyri and anterior insula. The top scatter plot presents the negative relationship between extracted BOLD signal from a 10 mm radius spherical region centered at the [-6 18 -2] peak in the left VS (A) during receipt of monetary reward and extracted BOLD signal from a 10 mm radius spherical region centered at the [42 4 32] peak in the right IFG during response inhibition (B). The bottom scatter plot presents the negative relationship between extracted BOLD signal from the left VS (A) during receipt of monetary reward and extracted BOLD signal from a 10 mm radius spherical region centered at the [28 2 50] peak in the right MFG during response inhibition (C). The negative relationships indicate that less right frontal activation during response inhibition was associated with greater left VS activation during reward.

(Fig. 1; Table 2). By contrast, right insula activation during inhibition was not related to VS activation during monetary reward. We also examined correlations between brain activation during inhibition and activation in visual cortex during reward processing to serve as a control region. Table 2 shows that no significant associations were observed between prefrontal and visual regions ( $p > 0.27$ ), suggesting that prefrontal activation during inhibition was specifically correlated with regions known to be implicated in reward.

No significant associations were detected between the in-scanner behavioral measure of inhibition (SSRT) and brain activation during inhibition or reward ( $p > 0.05$ ).

### 3.5. Association between inhibition-reward relationships in binge and non-binge drinkers

Twenty-three participants were classified as binge drinkers (at least one binge episode in the last month) and 21 were classified as non-binge drinkers (no binge episodes in the past month). Among the binge drinkers, greater brain activation in left VS during reward was associated with less brain activation in right SMA ( $r = -0.60$ ,  $p = 0.003$ ) and IFG ( $r = -0.53$ ;  $p = 0.009$ ), but not the MFG ( $r = -0.26$ ,  $p = 0.23$ ) during inhibition. By contrast, no significant correlations were observed at the corrected  $p$ -value of 0.0125 among the non-binge drinkers (SMA:  $r = -0.22$ ,  $p = 0.34$ ; IFG:  $r = -0.12$ ,  $p = 0.62$ ; MFG:  $r = -0.46$ ;  $p = 0.03$ ).

## 4. Discussion

This study revealed a novel association between brain activation underlying two seemingly independent constructs: response inhibition and reward sensitivity. Both inhibition and reward sensitivity have long been linked to propensity for impulsive and addictive behaviors; however, few studies have examined how the two risk factors might be related to one another. The current study provides the first evidence of a negative correlation between brain activation during inhibition and reward. Specifically, individuals with less prefrontal engagement during response inhibition displayed greater engagement of reward circuitry during monetary reward. Additionally, these associations were more pronounced in binge drinkers, a population at risk for addictive disorders, compared to non-binge drinkers. These findings have important implications for understanding interactions between brain engagement during inhibition and reward processing, and how a potential imbalance between the two might confer increased risk for problematic and maladaptive behaviors.

Our finding that underactive inhibitory engagement is coupled with overactive reward circuitry among healthy adults, and that the association is more pronounced in binge drinkers compared to non-binge drinkers, has important implications for understanding disrupted inhibitory and reward processing in addiction and other impulse control disorders. Specifically, the imbalance observed in individuals with these disorders may not be entirely a consequence of the disorder. Instead, it may be a prospective risk factor and could even play a causal role in the onset of problematic behaviors. Indeed, prospective studies have shown that neural circuitry underlying inhibitory control and reward sensitivity both predict the development of drug-related problems independently (Heitzeg et al., 2015; Mahmood et al., 2013; Norman et al., 2011; Wetherill et al., 2013; Whelan et al., 2014). It will be important for future longitudinal studies to assess the relative balance between inhibition and reward functioning as a predictor of addictive and other impulse control disorders, as individuals who experience both poor inhibition and overactive reward are likely at greater risk.

It is important to note that the current analyses are correlational, and thus do not directly speak to the mechanisms underlying the negative association between prefrontal inhibitory and sub-cortical reward processing observed here. Although speculative, one potential explanation is that prefrontal functioning could serve a regulatory role in reward processing, similar to its regulatory role in motor inhibition. In the context of

motor inhibition, frontal regions are thought to exert ‘top-down’ executive control over lower level, sub-cortical regions, including the striatum (Bari and Robbins, 2013). This frontal-striatal circuitry primarily encompasses dorsal striatal regions involved in motor control, and deficits in prefrontal engagement and weakened frontal-dorsal striatal connectivity are associated with impaired response inhibition (Courtney et al., 2012; Ghahremani et al., 2012). It is possible that such downstream inhibitory projections could extend to ventral striatal regions implicated in reward as well. This idea is consistent with the current findings, as well as reports in both healthy and addicted populations showing that weakened frontal-ventral striatal connectivity during reward processing is associated with greater striatal activation during reward (Becker et al., 2017; Behan et al., 2015; Forbes et al., 2014). In order to test whether prefrontal inhibitory functioning does indeed exert top-down regulation over striatal reward regions, future studies should assess reward reactivity following direct manipulations of prefrontal functioning. For example, engagement of inhibitory brain regions can be acutely enhanced using transcranial magnetic stimulation (TMS; Watanabe et al., 2015; Xu et al., 2016) or pharmacotherapy (Schmaal et al., 2013). These methods could be used to test the causal effects of increased inhibitory functioning on activation of reward circuitry. If, as hypothesized, enhanced prefrontal functioning dampens reward activation, then targeting inhibitory functioning could be a promising means of preventing drug abuse problems in at-risk individuals.

A second potential explanation for the association between neural correlates of inhibition and reward is that the two are connected by an as-yet unidentified common mechanism, such as fewer striatal dopamine D2 receptors, which have been separately linked to both inhibition and reward. Animals with fewer striatal D2 receptors commit more inhibitory errors on response inhibition tasks (Jentsch et al., 2014) and self-administer greater amounts of stimulant drugs (Dalley et al., 2007; Diergaarde et al., 2008; Nader et al., 2008), suggesting a link between D2 receptor number and drug reward sensitivity. In humans, individuals with fewer striatal D2 receptors exhibit poorer inhibitory control and less brain activation during response inhibition (Ghahremani et al., 2012; Robertson et al., 2015) and report greater positive subjective response to stimulant drugs and sweet tastes (Pepino et al., 2016; Volkow et al. 1999, 2002). Thus, it could be that low levels of D2 receptors contribute to both low levels of brain engagement during inhibition and heightened engagement during reward. It will be important for future multimodal imaging studies to combine PET and fMRI to directly test associations between striatal D2 receptor availability and neural correlates of inhibition and reward.

This study has some limitations. First, this sample was comprised of healthy adults without addictive or impulse control disorders. Without longitudinal follow-up data, we can only speculate about the association between inhibition and reward as a predictor of addictive behaviors. Second, while our finding that the association is stronger in binge drinkers supports the idea that this association may be a prospective marker of risk, this finding also raises the possibility that the association in binge drinkers is a result of heavy alcohol consumption. Again, longitudinal studies are needed to assess associations between inhibition and reward before the onset of any substance use to directly address this question. Third, we probed activation of neural reward circuitry using monetary reward, yet hyperactivation of reward circuitry in addiction is often specific to drug- or disorder-related cues (Garavan et al., 2000; Dunning et al., 2011; Berridge and Robinson, 2016). As such, it is not clear if our findings of responses to monetary reward generalize to responses to drug reward in addiction. Fourth, we did not include a behavioral measure of appetitive motivation, and the behavioral measure of response inhibition (SSRT) did not correlate with brain activity during response inhibition or reward. However, previous studies have also failed to observe robust correlations between SSRT and brain activation, likely due to the need for very large samples and sufficient power for voxelwise analyses (Congdon et al., 2010). Finally, this study did not include a resting state scan. Future studies are needed that examine associations

between inhibitory and reward circuitry when subjects are at rest, to determine whether these networks are coupled in the absence of any task manipulation.

In sum, this is the first study to show that individual differences in prefrontal engagement during response inhibition are related to individual differences in engagement of reward circuitry during receipt of monetary reward. These findings have important implications for understanding risk for impulsive and addictive behaviors, particularly in individuals with compromised inhibitory functioning. It will be important for future longitudinal studies to examine interactions between inhibitory and reward functioning as prospective predictors of the onset and escalation of these disorders later in life. If, as hypothesized, poor inhibitory control mechanisms result in heightened sensitivity to reward, this will serve as an important target for prevention and treatment efforts in at-risk populations.

## Declarations of interest

None.

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## Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.neuroimage.2019.04.021>.

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