

# Behavioral Characteristics and Neural Mechanisms Mediating Performance in a Rodent Version of the Balloon Analog Risk Task

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The tendency for some individuals to partake in high-risk behaviors (eg, substance abuse, gambling, risky sexual activities) is a matter of great public health concern, yet the characteristics and neural bases of this vulnerability are largely unknown. Recent work shows that this susceptibility can be partially predicted by laboratory measures of reward seeking under risk, including the Balloon Analog Risk Task. Rats were trained to respond on two levers: one of which (the 'add lever') increased the size of a potential food reward and a second (the 'cash-out lever') that led to delivery of accrued reward. Crucially, each add-lever response was also associated with a risk that the trial would fail and no reward would be delivered. The relative probabilities that each add-lever press would lead to an addition food pellet or to trial failure (risk) were orthogonally varied. Rats exhibited a pattern of responding characteristic of incentive motivation and risk aversion, with a subset of rats showing traits of high-risk taking and/or suboptimal responding. Neural inactivation studies suggest that the orbitofrontal cortex supports greater reward seeking in the presence or absence of risk, whereas the medial prefrontal cortex is required for optimization of patterns of responding. These findings provide new information about the neural circuitry of decision making under risk and reveal new insights into the biological determinants of risk-taking behaviors that may be useful in developing biomarkers of vulnerability.

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## INTRODUCTION

Adolescents and young adults are prone to engaging in a range of high-risk behaviors associated with life-long health-related complications, including substance abuse and risky sexual behaviors. Moreover, certain individuals are intrinsically more likely to exhibit high-risk behaviors and thus to suffer the consequences of them. Despite the public health significance of understanding the behavioral and biological markers of this vulnerability, we know remarkably little about its determinants or underlying mechanisms.

In human beings, dimensions of temperament linked to high-risk behaviors are usually measured with self-report questionnaires. These instruments have been used to discriminate between subjects that vary according to traits such as impulsivity, novelty seeking and sensation seeking

and reward sensitivity (Zuckerman *et al*, 1978; Patton *et al*, 1995; Weber *et al*, 2002; Acton, 2003; Llewellyn, 2008). That being said, although self-report measures may be useful in stratifying subjects, they are limited as tools for use in experimental studies aimed at further interrogating the neurobiology of high-risk behaviors. Progress in this area has been facilitated by the development of behavioral measures of risk-related decision making, including the Balloon Analog Risk Task (BART) (Lejuez *et al*, 2002, 2003; Hunt *et al*, 2005; White *et al*, 2008). In this procedure, subjects make a decision about the amount of risk they are willing to accept to obtain a reward on a given trial. They press one button successively to increase the amount of earned monetary reward, but because each press is also associated with a chance of trial failure (with concomitant loss of reward earned during that trial), subjects must balance their desire for larger gains with their desire to avoid risk of reward forfeiture. For any given trial, subjects can either continue accepting risk until failing or they can end the trial by accepting the money earned up to that point by pressing an alternative button. In general, a relatively higher number of responses per trial is thought to indicate greater willingness to accept risk and is reported to positively correlate to a significant, albeit limited, degree

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with 'real-world' aspects of risk-taking and/or sensation-seeking behavior (Lejuez *et al*, 2002, 2003; Aklin *et al*, 2005; Hunt *et al*, 2005; Bornovalova *et al*, 2009; Crowley *et al*, 2009). That being said, it is possible that dimensions of behavior measured by the BART are sensitive to some, but not all, forms of impulsivity; a recent study suggests that relatively higher risk acceptance is present in bipolar patients with co-morbid alcohol use problems, but not those without an alcohol use disorder (Kathleen Holmes *et al*, 2009).

For these reasons, behavioral measures such as the BART can be used to explore the systems and cellular processes involved in making decisions about risk. In a recent functional imaging study, accepting risk was associated with changes in the blood oxygenation levels within a network that includes the dorsolateral prefrontal cortex, anterior cingulate cortex, insula, striatum, and ventral midbrain (Rao *et al*, 2008). Moreover, increases in activity within the dorsolateral prefrontal cortex, particularly in the right hemisphere, were specifically linked with the decision-making processes that lead to acceptance of greater risk (Rao *et al*, 2008), suggesting that this brain structure mediates the evaluative functions required for optimal behavioral control in the task. Owing to the limitations associated with functional neuroimaging experiments, the causal contributions of these brain regions to decision making remain unknown.

To further delineate the biological origins of decision making under risk, we developed an instrumental procedure for use in rats that captures key aspects of the BART. In this manuscript, we describe initial efforts to provide validation for the animal measure that spans both behavioral and neural levels of analysis. First, we investigated behavioral sensitivity to variation in risk and reinforcement probability functions to determine whether responding was being determined by these factors. These efforts involved the novel performance metrics (eg, measures of within subject, within session variability of responding) and task conditions (eg, risk-free probe trials that allow for free-choice behavior during risk sessions). As a good deal of work in the BART revolves around the predictive value of individual differences in performance, we next set out to describe between subject variation in task performance that may be subjected to neural and genetic analyses. Third, we tested the function for two frontal regions implicated in human fMRI studies (Rao *et al*, 2008) to link theories of neural systems function during decision making under risk to systems recruited by rats to perform the task. We argue that the integrated neural and behavioral validation of the task supports the usefulness of this rodent measure of risk-related decision making.

## MATERIALS AND METHODS

### Subjects

Adult male Long-Evans rats (Harlan, Indianapolis IN) were used in this study. The subjects were ~225–300 g in body weight at the inception of testing. An initial food restriction scheme was used to reduce baseline body weights to ~85%; in addition to the food rewards obtained during testing, the

rats were supplied with a portion of standard laboratory rat chow (Purina) in their home cage, ~1 h post-testing.

### Behavioral Training and Testing

Training and testing was conducted in chambers fitted with a house light, internal stimulus lights, food-delivery magazine, and two retractable lever positioned to the left and right of the magazine (Med-Associates, St Albans VT). The boxes were controlled by a PC running Med-PC IV (Med-Associates).

Subjects were first trained to respond on both levers in two separate sessions using a fixed ratio (FR)-1 schedule of reinforcement for 45-mg dustless precision, purified diet pellets (Bio-Serv; Frenchtown NJ). Subsequently, they were trained on an FR-3 and then FR-10 on the designated 'add'-lever; subjects were progressed during this initial stage of training when they obtained at least 30 outcomes in a session. They were then familiarized with the general design of the task in a 50-trial 'forced' task in which only the add lever was presented until the rats responded between 2 and 15 times (randomly chosen from trial to trial); the add lever was then withdrawn and the cash-out lever was presented. A single cash-out response dispensed a number of pellets equal to the number of add-lever presses permitted on that trial.

The rats then began daily testing on risk and no-risk variants of the actual task (all 50 trials long) with both levers present. At this stage, all animals were trained and moved forward as a group; no individualized criteria were used to govern the progression of training. During routine tests, the risk condition was signaled by illuminating the house light from the onset of testing; the no-risk conditions was signaled by illumination of an internal stimulus light that was somewhat distinct from the house light; these lights remained on at all times during the session, except during time-outs. In the risk version, the rat could respond on the add lever until (1) it caused trial failure and reward forfeiture by responding more than permitted by the risk schedule on that trial (resulting in both levers being retracted and a 5-s time-out (signaled by lights off) being enforced) or (2) it pressed the cash-out lever to trigger delivery of earned reinforcement. In the no-risk version, the principal difference was that the rat could respond up to 100 times on the add lever before cashing out, which was, functionally, a no-risk version of the task as no rat ever made more than 25 presses before cashing out.

Initially, the rats were trained ~6 days a week with half their sessions being risk and half being no-risk versions (the order was pseudorandom and not alternating); the risk was set at 11.1% chance of trial failure per add-lever press. After 1–2 weeks of training, a 16.7% risk condition was also occasionally presented. (These risk value were related to the maximum number of presses that would be required to fail every single trial. With the first press in every trial being 'safe' and the maximum number of presses set to 7 or 10, the resulting probabilities were 16.7 or 11.1%, respectively.) In addition, the probability of gaining additional reinforcement per add-lever press was initially 100%, but was quickly decreased over training days to 50 or 33%. The measures collected in each daily session were number of add responses made per trial (for both successful and failed

trials), total number of pellets earned, number of failed trials, and session duration. Using these metrics, we were able to calculate the mean number of add-lever presses across the 50 trials, as well as the variance of these 50 values for each animal. As variance increases as a function of the mean, the variance measure was expressed as the ratio of the variance/mean. In a subset of rats, we also collected latency data, including latency to make the first add-lever press once the levers are presented, and the latency to retrieve the pellet once it was dispensed.

As the cash-out value (either the raw value or the value adjusted by eliminating failed trials) is negatively skewed (meaning that it is biased by the trials in which subjects are the most risk averse), we sought to measure free-choice behavior during performance by intermixing probe trials (ie, trials during which the animal could respond as much as it chose) with the standard 50 risk trials. This was performed in a subset of rats because the program modifications required to present these trials was introduced after some cohorts had completed testing. After completing 10 standard trials, probe trials were presented approximately every 4–6 trials. Of course, these probes might be seen altering the perceived risk of the session; however, because they were presented equivalently often irrespective of the amount of risk on standard trials, any parametric effects of session risk on free choice in probe trials must be driven by perceptions of relative differences in risk across these sessions. These unsigned probe trials that occurred in the context of risk (being surrounded by standard trials) permitted a clean assessment of free-choice responding during risk sessions, as compared with standard trials in which the risk function artificially truncated the behavior.

For the behavioral studies described here, data were collected after 2–3 weeks of training. For the infusion studies, animals had about 6 weeks of training before surgery. Essentially, the rats used in the infusion studies contributed their baseline data to the overall behavioral analysis and then underwent surgery (see below) before an additional 3–6 weeks of retraining conducted to confirm that responding, after surgery, was stable (subjects completed all their trials and exhibited mean cash-out values that did not vary by >20% when similar test conditions were imposed).

During the behavioral and infusion studies, certain task parameters (eg, risk of trial failure, reinforcement probability) were varied to make the ascertainment described here. Task parameters were always varied within subjects in a counter-balanced, cyclic Latin Square design across the subjects to control for task order effects.

### Surgeries

Rats were first anesthetized with isoflurane (3–5% in an induction box followed by 2–4% by a nose cone) and then placed in a stereotaxic apparatus. Briefly, holes were drilled in the skull surface and 26-gauge stainless-steel guide cannulae (Plastics one, Roanoke, VA) targeting the medial prefrontal cortex (mPFC) ( $n = 14$ ) or the ventrolateral orbitofrontal cortex (OFC) ( $n = 15$ ) were inserted bilaterally (mPFC: AP, +3.2, ML,  $\pm 0.5$ , DV,  $-2.0$ , relative to bregma; OFC: AP, +3.7, ML,  $\pm 3.0$ , DV,  $-3.0$ , relative to bregma,

cannulae angled  $14^\circ$  toward midline). Three steel screws and dental acrylic affixed the guide cannulae to the skull. Stainless-steel obturators were maintained in the cannulae at all times, except during infusions. Rats were given the analgesic carprofen (5 mg/kg, subcutaneously; Rimadyl, Pfizer) immediately before and for 2 days after the surgery. In addition, an antibiotic (sulfamethoxazole and trimethoprim, 200 mg/40 mg per 5 ml; Hi-tech Pharmacal, Amityville NY) was added to the drinking water (0.5 mg/ml) for 2 weeks after surgery.

### Microinfusion Procedures

Transient inactivation of the regions of interest was performed by bilaterally infusing a solution of the GABA<sub>A</sub> antagonist muscimol (0.03 nmol; Sigma-Aldrich) and the GABA<sub>B</sub> antagonist baclofen hydrochloride (0.3 nmol; Sigma-Aldrich) dissolved in sterile phosphate-buffered saline (0.9%). On infusion days, the dummy cannulae were replaced with 33-gauge injection needles, extending 3.5 and 2 mm below the guide cannulae for mPFC and OFC, respectively; 0.5  $\mu$ l of the muscimol and baclofen cocktail (MUS + BAC), or of vehicle, was administered at a rate of 0.2  $\mu$ l/min using a microsyringe pump, and injection needles were left in place for 2 min to allow drug diffusion. Rats were freely-moving, whereas drug was being infused. Behavioral testing commenced 10 min after the infusion was completed.

After completion of the study, rats were anesthetized using isoflurane, and a 4% solution of trypan blue was infused using the same procedure described for drug infusions. Rats were then transcardially perfused with 10% formaldehyde. The brains were removed, cut on a cryostat at 60  $\mu$ m thickness and counter-stained with Cresyl Violet to facilitate localization of the infusion.

### Statistical Analyses

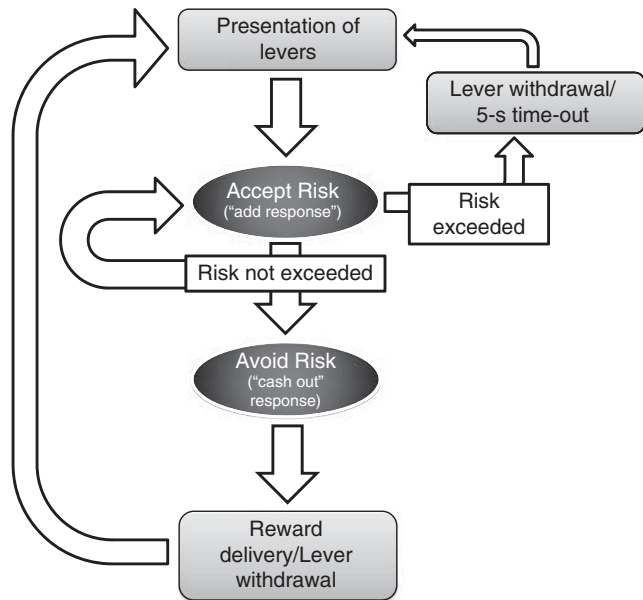
All comparisons and analyses were performed using SPSS (v15) running on a PC. All within subject contrasts were examined with ANOVA and/or two-tailed paired *t*-tests. Regressions involved stepwise or simple linear analyses, where appropriate.

## RESULTS

Rats were trained and tested in a task (Figure 1) that mirrors critical performance aspects of the BART task used in human beings. Across sessions, the probabilities that each add-lever press resulted in an increase in reward cache size or to trial failure were orthogonally varied between sessions and were never altered within a single session.

### Risk Sensitivity

We first examined whether responding was independently sensitive to the levels of risk and the reinforcement rate imposed in the task. A group of modestly trained rats ( $\sim 2$ –4 weeks of daily training on risk and no-risk contingencies;  $n = 81$ ) were tested in sessions in which risk and reinforcement probability were independently varied in a within subjects design. In the 0% risk conditions, no trials ended in



**Figure 1** Trial schematic for the decision making under risk task. At trial onset, rats have an opportunity to accept risk to seek larger rewards by responding on an 'add' lever or to avoid risk and get access to that reward already earned by responding on a 'cash-out' lever. On a subset of trials, accepting risk would lead to trial failure and loss of reward. The probabilities that each add-lever press would lead to a larger reward cache or that it would lead to trial failure were independently manipulated. Each session was comprised of 50 trials, with an inter-trial interval of 3 s.

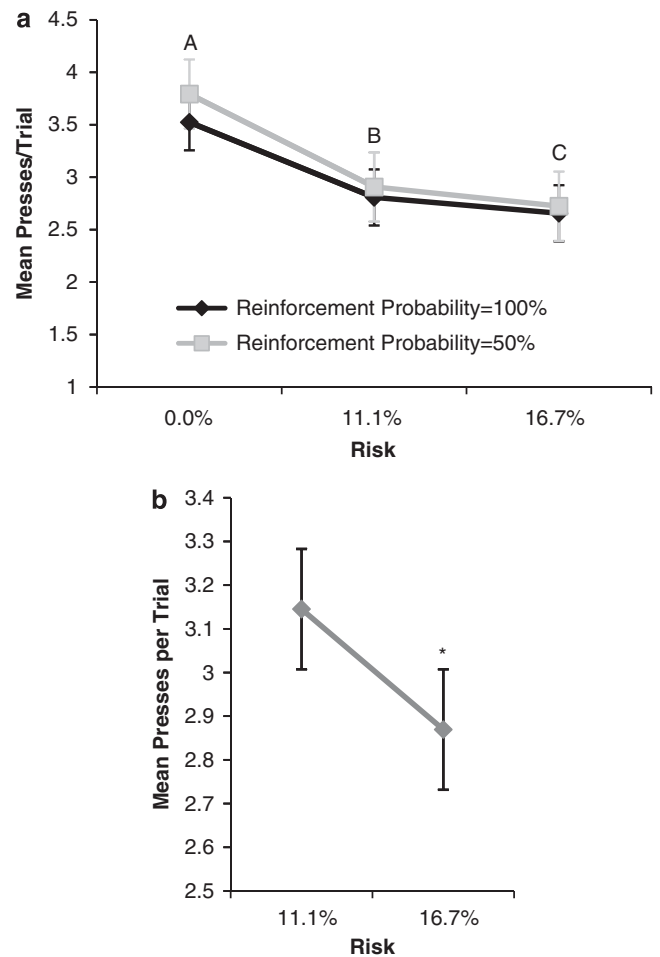
**Table 1** Number of Failed Trials Under Different Reinforcement Schedules (50–100%) and Risk Functions (0, 11.1, or 16.7%)

Reinforcement probability (%)	Risk (%)	Mean (+SEM) number of failed trials/session
	0	None
50	11.1	11.49 ± 0.58
	16.7	15.45 ± 0.72****
	0	None
100	11.1	11.18 ± 0.58
	16.7	14.55 ± 0.69****

\*\*\*\*Significantly different from 11.1% condition;  $p < 0.0001$ .

failure, but as risk increased from 11.1 to 16.7%, the number of failed trials increased dramatically (Table 1; main effect of risk:  $F_{(1,80)} = 129.6$ ,  $p < 0.0001$ ). The effect of reinforcement probability reached the trend level ( $F_{(1,80)} = 3.4$ ,  $p = 0.07$ ) and did not interact with risk ( $F_{(1,80)} = 0.8$ ,  $p = 0.3$ ).

Regarding the average number of add-lever presses made per trial (Figure 2a), ANOVA revealed significant main effects of risk ( $F_{(2,87)} = 64.6$ ,  $p < 0.0001$ ) and reinforcement probability ( $F_{(1,80)} = 20.3$ ,  $p < 0.0001$ ), along with a significant interaction between these two factors ( $F_{(2,153)} = 4.3$ ,  $p = 0.02$ ). These effects were mediated by the fact that increasing risk dramatically decreased mean add-lever responses made per trial, and lower probabilities of reinforcer accrual were associated with higher responding



**Figure 2** Risk sensitivity of performance. (a) Whether reinforcement probability was 100 or 50% per add-lever press, increasing risk led to decreased average responses per trial. (b) Free-choice behavior in probe trials intermixed with standard trials during performance showed that rats voluntarily chose to respond less when they perceived the task to be more risky. A, B, and C: these letters indicate that all three risk conditions differed significantly from one another, irrespective of reinforcement probability at the  $p < 0.005$  level. \*Significant difference between the 11.1 and 16.7% conditions;  $p < 0.05$ .

per trial. Moreover, the increase in responding associated with reduced probability of reward accrual was greater when risk was low, meaning that rats dynamically increased reward-seeking behavior to a larger degree when it was associated with no chance of reward loss. Though four separate cohorts of rats were tested to generate the dataset reported above ( $n = 81$  subjects), this large sample size was not required to statistically justify these conclusions, as these relationships were observable and significant in each of the three cohorts that were independently powered to find such an effect (ie the three of the four cohorts that made up  $n = 24$  subjects each).

A decrease in the average number of add-lever responses made per trial under increasing risk conditions could be accounted for solely by the increase of failures on trials that would have contributed higher response values, truncating the resulting distribution. To address this, we tested a subset of rats under conditions wherein up to 10 probe trials were intermixed with 50 standard risk trials in a

pseudorandom manner (roughly every 4–6 trials); during probe trials, rats were able to respond as many times as they chose before cashing out. This analysis provided a direct measure of the rats' voluntary responding in the session. Risk and reinforcement probability were again varied. Under these conditions, ANOVA revealed a significant main effect of risk ( $F_{(1,21)} = 3.7$ ,  $p = 0.02$ ), with no main effect of reinforcement probability or risk  $\times$  reinforcement probability interaction (both  $F_s < 0.6$ ). Figure 2b shows that, under the 50% reinforcement condition, rats voluntarily responded less, meaning that their behavior was risk sensitive in the expected manner.

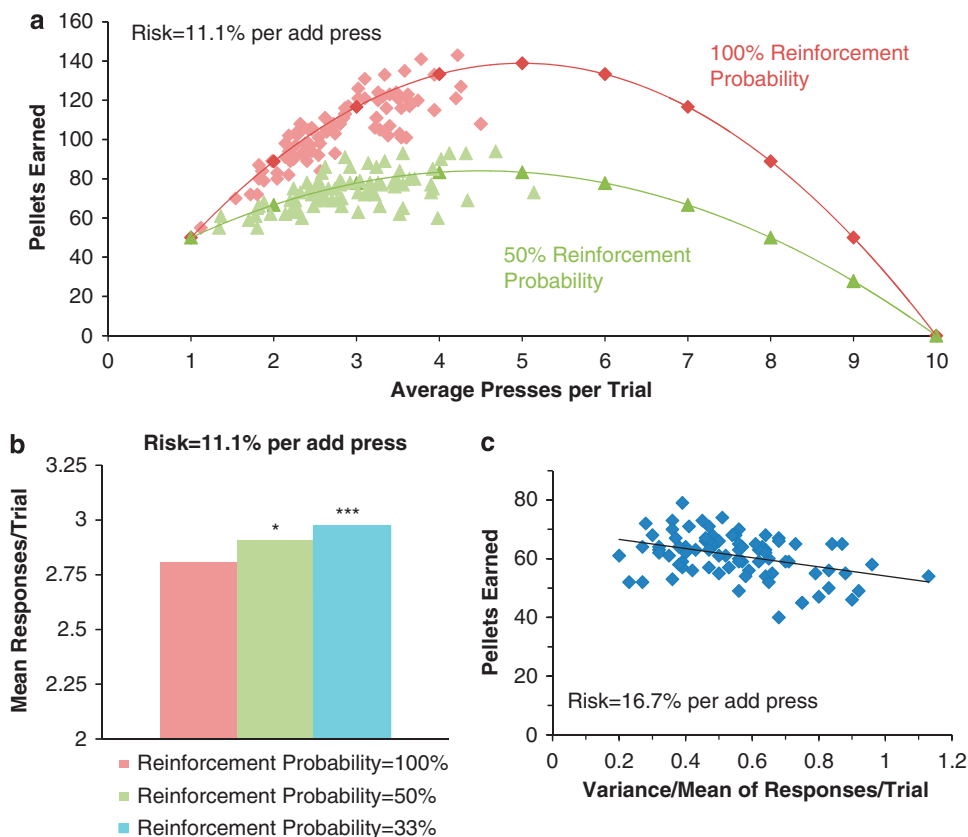
### Sensitivity to Variations in Reinforcement Probability

A recent study (Bornoalova et al, 2009) indicates that risk aversion increases as the payoff per inflation increases, leading to the hypothesis that subjects may target a desired prospect and accept only the amount of risk necessary to achieve that prospect. Consonant with this hypothesis, decreasing the probability that each add-lever press led to an additional pellet being earned (100 vs 50 vs 33%) significantly increased the mean number of presses made per cash-out trial (Figure 3b; main effect of reinforcement

probability:  $F_{(2,160)} = 5.6$ ,  $p < 0.005$ ; *post hoc* comparisons by two-tailed paired *t*-tests: 100 vs 50%:  $p = 0.04$ ; 100 vs 33%:  $p = 0.002$ ). That being said, most subjects were still observably risk averse under partial reinforcement conditions, making fewer than the optimal number of responses per trial (50%:  $2.9 \pm 0.1$ ; 33%:  $3.0 \pm 0.1$ ) and earning a total reward allocation below that which they were able to eat. This indicates that their risk aversion was not solely because of the fact that they could earn enough pellets to become satiated, even when avoiding risk.

### Optimization of Responding

The inverted-U function in Figure 3a shows the theoretical relationship predicted by an ideal observer between average number of responses per trial and total reward earned in a session, as well as actual data from 81 adult male rats. Subjects were tested under conditions in which (1) the first add-lever press was risk free, (2) each subsequent response was associated with an 11.1% risk of trial failure, and (3) each add-lever press earned an additional pellet. These data indicate that subjects were relatively risk averse (Figure 3b), producing an average of  $2.8 \pm 0.1$  responses per trial that was less than the total reward earned if they would have



**Figure 3** Behavioral characteristics of performance showing sensitivity to reinforcement probability and risk. (a) The theoretical relationship between the mean responses per trial and the overall size of the reward cache earned is an inverted U, with maxima at  $\sim 5$  responses per trial when there was an 11.1% risk of trial failure per add-lever press. Actual data obtained from a large group of rats mostly deviated from the theoretical optimal, with rats exhibiting relatively risk-averse behavior. (b) Decreasing the probability that each add-lever press increased reward cache size, increased responding, suggesting that rats increased reward-seeking responses when reward-delivery rate was lowered. (c) Under high-risk conditions (where the probability an add-lever press would lead to trial failure was 16.7%), the variability of responding was inversely related to reward magnitude earned, suggesting that high variance behavior was suboptimal in this task. \*,\*\*Significantly different at a  $p < 0.05$  or 0.001 level, respectively, vs control condition.

made  $\sim 5$  responses per trial. In this sense, rats are similar to human subjects in that they exhibit risk-averse profiles when performing the BART, producing fewer than the optimal number of responses (Bornovalova *et al*, 2009) and earning less reward than is possible probably because of over-estimation of the risk associated with the task.

Figure 3a also suggests that, relative to the ideal, a significant number of rats earn fewer pellets than they should; however, these curves anticipate that subjects produce the same number of responses on all trials in a session, in a sense optimizing their responding. In reality, subjects exhibit individual differences in the variability of their responding, and we hypothesized that high intra-subject, intra-session variance in the number of add-lever presses made across all 50 trials—reflecting combinations of both higher than optimal and lower than optimal trial completions—could be the cause of their inability to maximize reward receipt, particularly under high-risk conditions. To empirically examine this point, we calculated the variance of responses made per trial and divided it by the mean (to account for the fact that variance will naturally increase as the mean does). We compared performance (both mean and variance/mean of the responses per trial) for animals experiencing task conditions in which the chance of trial failure was 0% (a completely ‘safe’ control condition) or 16.7% (to impose considerable risk); the probability that an add-lever press would gain another pellet was held constant at 50%. Overall, both the mean and variance/mean measures were lower in the risk *vs* no-risk conditions ( $n = 81$ ; mean:  $t_{(80)} = 7.8$ ,  $p < 0.0001$ ; variance/mean:  $t_{(80)} = 7.0$ ,  $p < 0.0001$ ; two-tailed paired  $t$ -tests). The latter result suggests that subjects optimize or constrain performance as risk increases. Precisely as expected, stepwise regression shows that, when there was no risk of trial failure, the mean number of responses per trial was positively associated with pellets earned (adjusted  $r^2 = 0.99$ ,  $p < 0.001$ ;  $n = 81$ ; data not shown); in this case, the variability of responding was not significantly explanatory. However, in the condition in which there was a high degree of risk associated with each add-lever press, stepwise regression found that the variability of responding was negatively associated with pellets earned (Figure 3c; adjusted  $r^2 = 0.15$ ,  $p < 0.001$ ), with no variance being explained to a significant degree by the mean number of responses per trial. These data indicate that relatively high intra-subject, intra-session variability of responding could indicate relatively poor top-down control over behavior.

### Incentive Processes

To test the idea that high mean and/or high variance responding may be primarily attributable to an incentive process (‘wanting’ of the pellets), we conducted an experiment in a set of rats that were tested as usual or after pre-feeding with reinforcer pellets. The probability that each add-lever press was reinforced was 100%, and the risk of trial failure was 11.1% per add-lever press. Pre-feeding significantly reduced the mean number of responses made per trial (Table 2;  $n = 16$ ;  $t_{(15)} = 2.3$ ,  $p = 0.03$  by two-tailed paired  $t$ -test), but had no effect on the variability of responding (Table 2;  $t_{(15)} = -1.3$ ,  $p = 0.22$ ; two-tailed paired  $t$ -test). These data further support the notion that different

**Table 2** Mean Add-Lever Responses Per Trial and Response Variability Under Pre-fed or Standard Testing Conditions

Feeding condition ( $n = 16$ )	Mean number ( $\pm$ SEM) of add-lever presses per trial	Variance/mean of add-lever presses
Standard feeding condition <sup>a</sup>	2.85 $\pm$ 0.16	0.54 $\pm$ 0.05
Pre-fed condition <sup>ab</sup>	2.50 $\pm$ 0.13*	0.59 $\pm$ 0.07

Risk was set to 11.1% and reinforcement probability was 50%. \*Significantly different from standard feeding condition:  $p < 0.05$ .

<sup>a</sup>Chow made available 22 h before testing in both conditions.

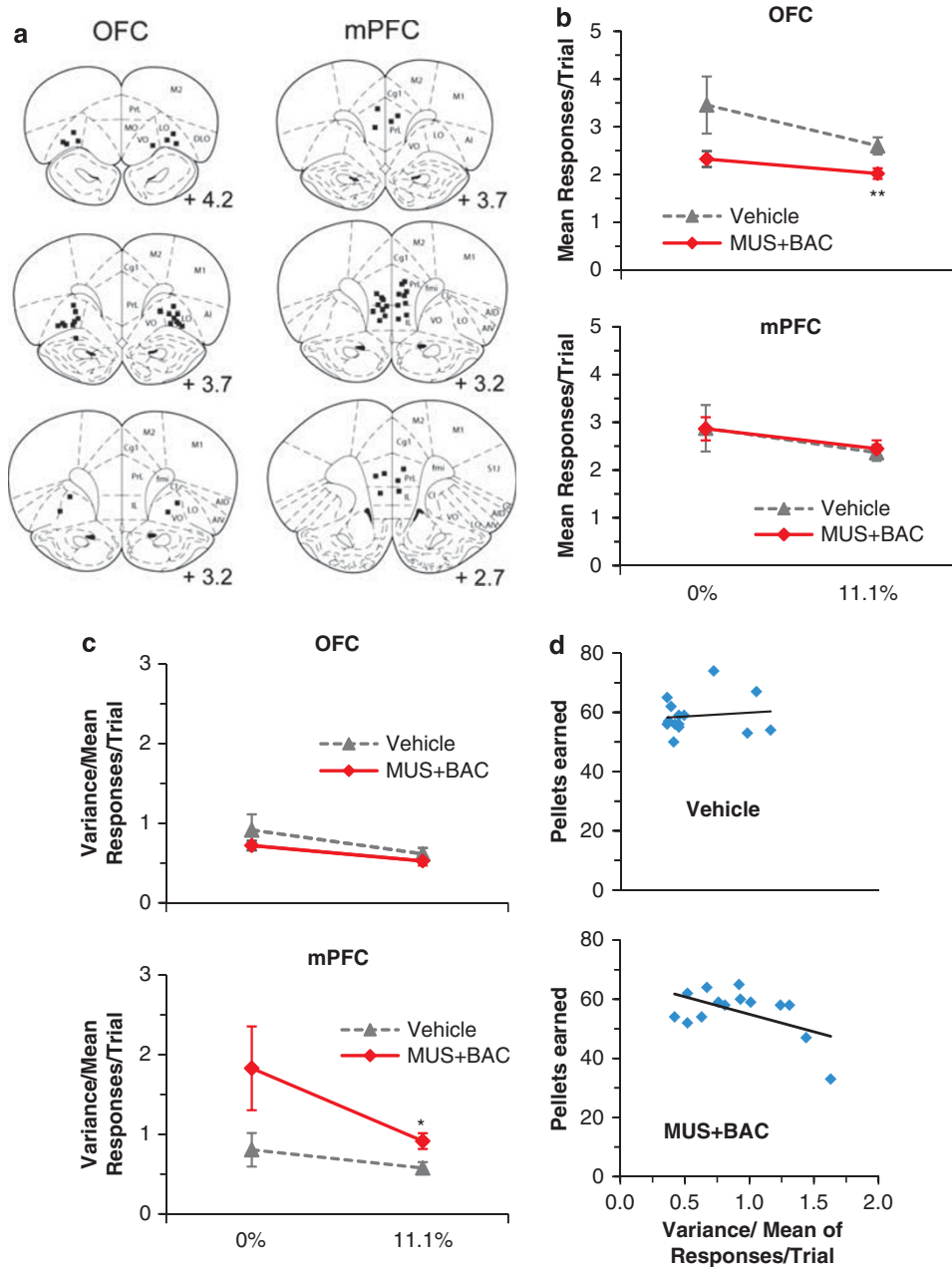
<sup>b</sup>30 g of reinforcer pellets made available 1 h before testing in pre-feeding condition.

psychological processes mediate these two dependent measures, with the average number of presses being related to an incentive process, while response variability is not.

### Frontal Cortical Contributions

We next explored the function for distinct frontal cortical brain regions in aspects of risk-related responding, given recent results indicating that frontal regions contribute to a network of fore- and midbrain structures involved in decision making about risk and effective behavioral control during reward seeking (Rao *et al*, 2008). Rats ( $n = 29$ ) performed a version of the task in which reinforcement probability was fixed at 33% per add-lever press (to promote higher responding), but in which risk was varied across sessions (0 *vs* 11.1%); they were surgically cannulated, recovered, and then trained. Microinfusions of a GABA agonist cocktail (0.03 nmol of muscimol and 0.3 nmol of baclofen in 0.5  $\mu$ l of vehicle; MUS + BAC) to transiently inactivate neural activity, or vehicle microinfusions, were made into either the mPFC—the functional analog of the human dorsolateral prefrontal cortex (Preuss, 1995; Brown and Bowman, 2002)—or into the OFC; the anatomical location of each infusion is shown in Figure 4a. When considering the mean number of responses per trial, omnibus ANOVA revealed a significant interaction between brain region (mPFC *vs* OFC) and infusion (vehicle *vs* MUS + BAC) (Figure 4b;  $F_{(1,27)} = 4.4$ ,  $p = 0.04$ ;  $n = 29$ ); this interaction was due to the fact that inactivation of the OFC elicited a significant reduction in the mean number of presses per trial (Figure 4b; 11.1% risk:  $t_{(14)} = 3.5$ ,  $p = 0.003$ ; 0% risk:  $t_{(14)} = 1.9$ ,  $p = 0.06$  by two-tailed paired  $t$ -tests;  $n = 15$ ), whereas suppression of neural activity in the mPFC failed to affect this measure (11.1%:  $t_{(13)} = -0.5$ ,  $p = 0.58$ ; 0%:  $t_{(13)} = 0.0$ ,  $p = 0.98$  by two-tailed paired  $t$ -tests;  $n = 14$ ). The opposite effect was found when examining the variability of responding after GABA agonist infusion into these brain regions (Figure 4c; brain region  $\times$  infusion interaction:  $F_{(1,27)} = 8.4$ ,  $p = 0.007$ ). Infusion of the GABA agonist cocktail into the mPFC increased the variance of responding (Figure 4c; 11.1%:  $t_{(13)} = -3.2$ ,  $p = 0.006$ ; 0%:  $t_{(13)} = -1.6$ ,  $p = 0.11$ ), which was unaffected after inactivation of the OFC (Figure 4c; 11.1%:  $t_{(14)} = -1.1$ ,  $p = 0.25$ ; 0%:  $t_{(14)} = 1.1$ ,  $p = 0.28$ ). Neither infusion affected response latencies (data not shown).

Importantly, the change in variability of responding elicited by mPFC inactivation produced a suboptimal response profile in that we measured a significant, negative



**Figure 4** Dissociable contributions of the mPFC and OFC on decision making under risk. (a) Infusion locations were centered on the ventral and lateral OFC or mPFC. (b) Inactivation of the OFC (top panel), but not of the mPFC (bottom panel) decreased the mean number of responses made per trial (mean  $\pm$  SEM), whereas (c) inactivation of the mPFC (bottom panel), but not of the OFC (top panel) increased response variability under risk conditions (mean  $\pm$  SEM). (d) The variance of responding was negatively related to reward obtained when the mPFC was inactivated (bottom panel), while there was no correlation between these measures under vehicle infusion. \*Significantly different at a  $p < 0.05$  level vs vehicle infusion; \*\* $p < 0.005$ .

relationship between the variance measure and reward obtained under mPFC inactivation (Figure 4d; adjusted  $r^2 = 0.23$ ,  $p = 0.04$  by simple linear regression), but not after vehicle infusion (Figure 4d; adjusted  $r^2 = 0.06$ ,  $p = 0.69$ ). (A negative relationship between baseline response variability and pellets earned, such as the one described above, is generally only observable under high-risk conditions). These data show a clear double dissociation between mPFC and OFC, as they relate to goal-directed decision making under risk and indicate that a neural circuit involving the mPFC is implicated in coordinating adaptive responding under risk in the rat, providing direct evidence that this

structure participates in voluntary behavioral control in rats, as well as in human beings (Hare *et al*, 2009).

## DISCUSSION

Considerable interest is focused on the neural mechanisms by which individuals make good and/or poor decisions about their behavior, particularly in circumstances in which there is a tension between the risks and rewards associated with their actions (Trepel *et al*, 2005; Floresco *et al*, 2008; Platt and Huettel, 2008). To date, most research in rodent

models has focused on probabilistic or temporal discounting procedures in which subjects have to choose between certain/immediate/easy-to-obtain gratification and uncertain/delayed/hard-to-obtain reward (Winstanley *et al*, 2004; Walton *et al*, 2006; Bickel *et al*, 2007; Mar and Robbins, 2007; Wilhelm and Mitchell, 2008; St Onge and Floresco, 2009). Along with probabilistic discounting tasks, another set of procedures emphasize balancing the potential for reward gains and losses during choice behavior (van den Bos *et al*, 2006; Rivalan *et al*, 2009; Zeeb *et al*, 2009); these tasks probably more directly address phenotypes akin to 'gambling' behavior. Our efforts to develop a rodent analog of the BART represent an attempt to further develop cross-species assessments of risky decision making with translational potential.

### Behavioral Characteristics

The results presented here point to a remarkable conservation of risk-averse-choice behavior, as well as an important component of incentive motivation in decision making, across species. The results presented here indicate clear risk sensitivity of performance; by using probe trials intermixed during standard risk sessions, we are able to directly measure the free-choice behavior of subjects during sessions in which they have developed a perception of risk. We also show that risk aversion increases as reward is accrued with less effort, indicating that goal-directed reward seeking is the basis for risk acceptance. Together, these data indicate that the choice behavior of rats during the BART task is consistent with descriptive accounts of human decision making under risk afforded by prospect theory (Tversky and Kahneman, 1981; Trepel *et al*, 2005).

Despite the fact that animals choose to respond more when risk is absent, they still make fewer responses than one would expect. It is important to note that animals experience zero-, low-, and high-risk sessions in an unpredictable manner. During any given no-risk session, they likely experienced risk in earlier daily tests, and it is expected that long-term reinforcement histories related to recent risk performance will carry over into the no-risk sessions. In addition, animals may not be willing to produce longer response chains during no-risk trials because doing so requires them to delay gratification.

A final note pertains to the fact that an important dimension of performance most closely related to sub-optimal performance in this task is the intra-subject, intra-session variability of performance across the session, rather than simply the average number of responses made per trial. Most human and animal subjects are risk averse, meaning that they produce fewer responses per trial than the theoretical optimum. That being said, intra-subject, intra-session variability (mixing high and low cash-out values) reflects a behavioral style that actually confounds reward maximization. We propose that high intra-subject, intra-session variability of responding is likely to reflect a behavioral style in which instantaneous reinforcement histories overwhelmingly drive performance. In 'gambling' tasks, reward is maximized when subjects follow long-term reinforcement rules, as opposed to adapting behavior in response to real-time gains and losses because the outcome of any given trial is purely probabilistic. In that sense, we

view high intra-subject, intra-session variability as a behavioral index of poor self-control over risk-taking behavior.

### Frontal Cortical Mechanisms

This study provides direct evidence that the mPFC, arguably the rodent functional analog of the dorsolateral prefrontal cortex (Preuss, 1995; Brown and Bowman, 2002), is involved in constraining and optimizing responding, in that subjects with temporary inactivation of this brain region exhibit a transient increase in the variability of responding that represents a suboptimal, maladaptive overall behavioral profile. These observations are consistent with recent work suggesting that mPFC inactivation in rats decreases risk aversion in a probabilistic-choice task (St Onge and Floresco, 2009) and implicating the dorsolateral prefrontal cortex in self-control and reflective processes underlying decision making in human beings (Rao *et al*, 2008; Hare *et al*, 2009).

Alternatively, the OFC seems to be required for the full expression of incentive motivation to obtain large value rewards, in that its inactivation transiently decreases the average number of responses made per trial. Although a broader network of structures likely contributes to the multiple components of decision making under risk (Dalley *et al*, 2008; Floresco *et al*, 2008; Rao *et al*, 2008), these results describe a clear double dissociation within the frontal lobe in how medial and orbital regions contribute to cognitive and motivational aspects of decision making.

The mPFC and OFC probably exert their influence on performance in our task through direct regulation of specific striatal zones. The mPFC innervates ventromedial aspects of the striatum, including the nucleus accumbens (Berendse *et al*, 1992; Sesack and Pickel, 1992), whereas the specific subdivision of the OFC targeted here innervates ventrolateral portions of the striatum, including the putamen (Schilman *et al*, 2008). Notably, prefrontal cortical fibers interact with inputs from medial temporal lobe structures, including the hippocampus and amygdala and the dopamine-rich ventral midbrain to drive goal-directed behavior (Goto and Grace, 2005, 2008; Gruber *et al*, 2009; Sesack and Grace, 2010). Though functional neuroimaging studies have not yet resolved the influences of these posterior structures on BART performance in human beings, it remains possible that they exert independent and interactive effects on network function in striatal subregions to control different aspects of behavioral performance.

### Validity of the Rat BART

The value of behavioral measures of risk taking in human beings has been their potential as prognostic indicators of real-world high-risk behaviors (Lejuez *et al*, 2002, 2003), though they measure only one dimension of temperament likely relevant to this vulnerability (Daughters *et al*, 2009). That being the case, the rodent model represents a powerful opportunity to identify molecular and systems-level biomarkers for this susceptibility, as well as to further interrogate the causal function for these biomarkers in behavioral phenotypes. Although individual differences in a



laboratory measure of risk-taking behavior in rats may not directly relate to predisposition to self-administer illicit drugs (because drug consumption does not carry the same sociocultural and perceived health risks in rats that it does in human beings), it still represents a model system in which to detect the signature of liability to taking risks, and to explore the neural mechanisms by which that signature reflects predisposition to pursue risky circumstances. Recent studies indicate that individual variation in aspects of pre- and post-synaptic dopamine function may determine impulsive risk-taking behavior (Cools *et al*, 2007; Dalley *et al*, 2007; James *et al*, 2007; Zald *et al*, 2008; Forbes *et al*, 2009), though these mechanisms probably represent only a fraction of the molecular influences on high-risk behaviors.

The data provided here support the face and construct validity of the rat-BART task. In human beings, performance on the BART is typically risk averse. For example, in their initial studies, Lejuez *et al* (2002, 2003, 2007) report mean and standard deviations for pumps per trial that reveal at least 95% of all individuals exhibit response profiles that are below the predicted, optimal mean level of responding that is predicted from the risk schedule imposed (Hunt *et al*, 2005); in this sense, rats and human beings seem to perform in the context of their respective versions of the task in very similar ways. Furthermore, the experimental manipulations performed here establish construct validity for the task by showing that behavioral decision making depends on both risk- and payoff-sensitive processes in a manner predicted by the theoretical basis of the task. This raises the potential for predictive validity (that rat and human behavior will respond to similar manipulations); however, this is not yet established based on the dataset presented here.

Recent work has begun to illustrate the situations under which BART performance is subject to pharmacological or environmental modification. For example, oxycodone, pramipexole, and bupropion have been reported to have no effect on BART performance (Acheson and de Wit, 2008; Hamidovic *et al*, 2008; Zacny and de Wit, 2009), whereas amphetamine exerts effects that depend on trait differences in reward sensitivity (White *et al*, 2007). Moreover, there are sex differences in performance, which are magnified by an acute stress challenge (Lighthall *et al*, 2009). These studies represent potentially interesting ways to validate environmental influences on risky-choice behavior in the rat BART.

A recent study in human beings indicated that heritability of BART performance was 0.55 (Anokhin *et al*, 2009), indicating that it is likely that there is also a moderately large genetic influence on performance. Interestingly, the out-bred rat strain studied here exhibits relatively large intersubject variation in performance (Figure 3a). Owing to this, rodents represent a powerful model system in which to study the genetic and genomic determinants of these individual differences, using either whole genome or candidate gene approaches. Beyond this, the development of a version of the BART task suitable for mice will enable candidate gene studies using transgenic and mutant models.

Translational research on the neurobiology of the 'at-risk' phenotype will be substantially aided by convergent studies of human beings and laboratory animals performing analog

risk tasks, such as the one described here. Through study of the molecular and network mechanisms guiding adaptive decision making, new insights into the mechanisms by which genetic and environmental factors sculpt behavioral and temperamental profiles can be identified and new interventions (both behavioral and pharmaceutical) can be created. More importantly, biomarkers of this phenotype can be identified, permitting prevention research and policy to be implemented in the context of biologically tractable mechanisms and hypotheses.

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## DISCLOSURE

The authors declare no conflict of interest.

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