

DRD2/ANKK1 Polymorphism Modulates the Effect of Ventral Striatal Activation on Working Memory Performance

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Motivation is important for learning and cognition. Although dopaminergic (D2) transmission in the ventral striatum (VS) is associated with motivation, learning, and cognition are more strongly associated with function of the dorsal striatum, including activation in the caudate nucleus. A recent study found an interaction between intrinsic motivation and the DRD2/ANKK1 polymorphism (rs1800497), suggesting that A-carriers of rs1800497 are significantly more sensitive to motivation in order to improve during working memory (WM) training. Using data from the two large-scale imaging genetic data sets, IMAGEN ($n = 1080$, age 13–15 years) and BrainChild ($n \sim 300$, age 6–27), we investigated whether rs1800497 is associated with WM. In the IMAGEN data set, we tested whether VS/caudate activation during reward anticipation was associated with WM performance and whether rs1800497 and VS/caudate activation interact to affect WM performance. We found that rs1800497 was associated with WM performance in IMAGEN and BrainChild. Higher VS and caudate activation during reward processing were significantly associated with higher WM performance ($p < 0.0001$). An interaction was found between the DRD2/ANKK1 polymorphism rs1800497 and VS activation during reward anticipation on WM ($p < 0.01$), such that carriers of the minor allele (A) showed a significant correlation between VS activation and WM, whereas the GG-homozygotes did not, suggesting that the effect of VS BOLD on WM is modified by inter-individual genetic differences related to D2 dopaminergic transmission.

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INTRODUCTION

Dopamine is known to affect working memory (WM) performance as well as processes relating to reward and motivation, which may indirectly influence WM performance (Vijayraghavan *et al*, 2007; Williams and Goldman-Rakic, 1995). Density of dopamine transporters and receptors in the brain have been shown to affect WM performance (Backman *et al*, 2011) and recent research

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shows that dopaminergic genes known to affect receptor densities in the brain also influence WM (Söderqvist *et al*, 2013). Here, we investigate whether the DRD2/ANKK1 polymorphism and its interaction with striatal activation reflecting levels of motivation affect WM performance.

Density of D2 receptors in the striatum have been shown to affect motivation, as shown in a study of rodents where postsynaptic D2 receptor overexpression in the ventral striatum (VS) increased the animal's motivation in terms of willingness to expend effort to obtain a goal (Trifilieff *et al*, 2013). Dopaminergic neurotransmission is also central for WM performance (Aalto *et al*, 2005). In humans, cortical dopamine release is observed during the performance of WM tasks (Aalto *et al*, 2005). The value of cortical D1 density (McNab *et al*, 2009) and D2 binding in the striatum for WM has been established using positron emission tomography (Backman *et al*, 2011).

A widely studied dopaminergic polymorphism affecting reward processes and cognition is the DRD2/ANKK1 variant rs1800497 (Glu⁷¹³Lys). The polymorphism is known to be in linkage disequilibrium with the DRD2 gene (Neville *et al*, 2004) and is believed to affect dopamine binding in the striatum amongst healthy volunteers (Hirvonen *et al*, 2004). A recent study from our group showed that the DRD2/ANKK1 polymorphism is associated with WM performance after cognitive training. Furthermore, an interaction between DRD2/ANKK1-genotype and measured intrinsic motivation (ie, engaging in a task for the sake of pure interest) on WM improvement was identified after WM training. The results suggest an association between intrinsic motivation and improvement during WM training amongst minor allele-carriers (A) of rs1800497 (Söderqvist *et al*, 2013) (Figure 1). Previous research suggest that individuals who carry the A-allele show a reduced density of D2 receptors in the striatum and are more likely to develop disorders of reward deficiency such as alcohol dependence, smoking, and show ADHD symptoms (Blum *et al*, 1996; Jonsson *et al*, 1999; Tripp and Wickens, 2008). This might

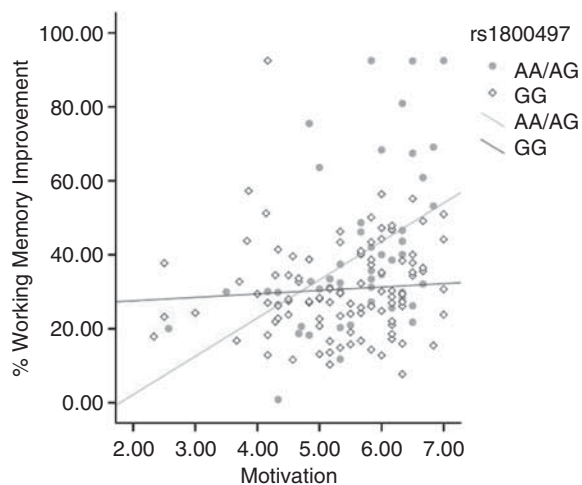


Figure 1 The estimated perceived competence measured by the intrinsic motivation inventory is shown on the x-axis in relation to actual improvements in working memory of training. Data points and line fittings are illustrated according to rs1800497 genotypes. This figure is adapted for purposes of this paper based on data from a sample presented in Söderqvist *et al* (2013).

indicate a higher sensitivity to motivational factors amongst A-carriers through striatal dopamine levels. Following up on the study by Söderqvist *et al* (2013), we aimed to investigate whether brain activity in the VS and caudate reflecting motivational drive as measured by the monetary incentive delay (MID) task is associated with WM performance.

The striatum, particularly the VS, is the neural substrate mediating feelings of reward and motivation. Single-cell recordings in macaque monkeys show that neurons in the VS are activated in response to external rewards (eg, fruit juice) (Schultz *et al*, 1997), consistent with previous research of rodents (Wise and Bozarth, 1984). Following up on these results, functional MRI studies of humans suggest that the VS responds to extrinsic rewards such as money or candy (Diekhof *et al*, 2012; Knutson *et al*, 2001b; Lükens and Barch, 2013). These studies show that the expectation of a reward given successful performance on a task, elicit VS, and particularly nucleus accumbens, activity proportional to the amount of reward at stake (Knutson *et al*, 2001a; Schott *et al*, 2008). The role of the VS during WM tasks has been investigated in recent studies suggesting that the VS is more strongly activated to correct than incorrect responses during a WM task (Satterthwaite *et al*, 2012) and that it may have an important role in tracking responses (Chatham and Badre, 2013). The VS also has an important role during tasks that require intrinsic motivation (Murayama *et al*, 2010; Wolf *et al*, 2011).

Caudate BOLD is primarily involved in instrumental learning as well as response inhibition and WM (Durstun *et al*, 2002; Mcnab and Klingberg, 2008) including development of WM during childhood (Darki and Klingberg, 2014; Ullman *et al*, 2014). In reward-related contexts, the caudate is suggested to have a role in maintaining the reward outcomes of actions to optimize future choices potentially leading to rewards (O'Doherty *et al*, 2004). The caudate also has a role in learning and memory, where a more active role in obtaining the reward is taken by the participant (Postle and D'Esposito, 1999; Ziermans *et al*, 2012).

Several imaging studies have investigated brain activity during WM (Beck *et al*, 2010; Taylor *et al*, 2004) while simultaneously modulating levels of reward. In general, rewards during WM tasks increases activity in dorsolateral prefrontal and parietal cortex. However, these findings have not explored whether inter-individual differences in brain activity during a motivational task is associated with WM performance. So although the increase in brain activity induced by motivation results in faster reaction times (Beck *et al*, 2010), changes in response bias (Taylor *et al*, 2004), and better recall in long-term memory tasks (Pochon *et al*, 2002), it has not been shown whether the increase in striatal or cortical activity is related to improved performance in terms of higher accuracy in WM trials or generally improved performance on cognitive tasks. Furthermore, genetic variations in COMT and MAOA have been associated with VS BOLD (Camara *et al*, 2010; Nymberg *et al*, 2013a), but these studies did not make any connection with WM and it is unclear whether the effect of reward-related brain activity on WM is moderated by genetic variations in dopaminergic genes.

Using two independent data sets, the international IMAGEN study and the Swedish BrainChild cohort, we investigate genetic and neural mechanisms that may affect

WM. The IMAGEN study is composed of genetic, neuroimaging, and behavioral data from ~2000 13–15-year-old adolescents, whereas the BrainChild data set is composed of genetic, neuroimaging, and cognitive data from ~300 children, adolescents, and young adults, age 6–27 years. Whereas the caudate is activated during performance of WM tasks, VS BOLD, reflecting motivational drive has not been associated with WM performance. As previous studies suggest that D2 receptor densities in the caudate and VS differentially affect motivation, with D2 receptor density in the VS being of greater importance for motivation, we aim to establish whether the *DRD2/ANKK1* genes, known to affect D2 receptor density, also have differential effect on VS and caudate BOLD (Trifilieff *et al*, 2013). Our hypothesis was that the interaction between *DRD2/ANKK1* polymorphism and motivation on WM training (Söderqvist *et al*, 2013) would be seen in an equivalent interaction with reward-related activity in VS, but not caudate. We furthermore hypothesized that the behavioral effect previously observed during training would be observed in WM performance.

MATERIALS AND METHODS

Imagen

Participants

Behavioral and neuroimaging data. The IMAGEN sample is comprised of 2000 adolescents that were tested at eight assessment centres (London, Nottingham, Dublin, Berlin, Hamburg, Paris, and Dresden)(Schumann *et al*, 2010). In this study, 1080 participants (48% males, 14.4 ± 0.4 years, 13.3–15.4 years (mean age \pm SD, range)) were included based on the following criteria: (1) had complete, quality controlled MRI data from the reward anticipation phase of the MID task ($n = 1472$); (2) had complete, quality controlled cognitive data and intelligence quotient (IQ) data based on the Wechsler intelligence scale for children (WISC) ($n = 1338$); and (3) had complete genetic data for *DRD2/ANKK1* Taq1a SNP rs1800497 ($n = 1080$; GG: $n = 669$; AA/AG: $n = 441$; 4.9% of sample were AA-homozygous). Information regarding exclusion criteria and movement outliers is available in Supplementary Information. This study is based on results from Söderqvist *et al* (2013) who divided genotype groups into AA/AG versus GG-homozygotes; thus, we merged the AA and AG groups. Previous analyses of the IMAGEN data set have addressed questions regarding reinforcement-related behavior. These studies particularly target questions of how brain function affects normal and pathological behavior in adolescence. For reviews on the IMAGEN data set, please see (Nymberg *et al*, 2013b; Schumann *et al*, 2010).

Genetic data. Deoxyribonucleic acid was extracted from blood samples. The *DRD2/ANKK1* Taq1a genotype is located on chromosome 11q23.1, rs1800497. Genotyping procedures have been previously published (Nymberg *et al*, 2013a). Information regarding genotyping is available in the Supplementary Information. Means and SD of cognitive behavior, divided by genotype are available in Table 1.

Cognitive tests

Visuospatial WM. WM was assessed through the CANTAB (Beck *et al*, 2010). Within this computerized task,

Table 1 Demographics

	AA/AG ($n = 441$)	GG ($n = 669$)	p-value
Working memory errors	19.32 (13.6)	17.27 (12.7)	0.012
ADHD symptoms	2.84 (2.26)	2.67 (2.21)	0.25
Conduct symptoms	1.57 (1.50)	1.57 (1.57)	0.78
Emotional problems	1.93 (2.00)	1.87 (2.08)	0.59
Verbal IQ	113.1 (14.6)	112.6 (14.5)	0.38
Reasoning IQ	108.8 (13.3)	109.6 (13.5)	0.25

Abbreviations: ADHD, attention deficit hyperactivity disorder; IQ, intelligence quotient; WISC, Wechsler intelligence scale for children; WM, working memory. Means and SD of A-carriers and GG-homozygotes on the WM task of the CANTAB, the Strength and Difficulties Questionnaire, and WISC. Differences between the genotype groups are shown under p-value.

subjects were required to search through boxes that appear on the screen with the aim to find a blue token hidden inside. After two practice trials with two boxes there were four test trials with each of two, three, four, six, and eight boxes. If the participant returns to an empty box that has already been opened this constitutes a ‘between search error’. Thus, in this task we measure the number of errors that participants make. A lower number indicates better performance.

Intelligence. IQ was assessed using the WISC (Wechsler, 1974).

Magnetic resonance imaging

Functional MRI task. The participants performed a modified version of the MID task to study neural responses to reward anticipation (Knutson *et al*, 2001b). This event-related task consisted of 66 10-s trials. In each particular trial, participants were presented with one of three cue shapes, with 22 trials of each type (cue, 250 ms), denoting whether a target (a white square) would subsequently appear on the left or right side of the screen and whether 0, 2, or 10 points could be won in that particular trial. After a variable delay (4000–4500 ms) of fixation on a white cross-hair, participants were instructed to respond by pressing a button with their left or right index finger as soon as the target appeared. Feedback on whether and how many points were won during the trial was presented for 1450 ms after the response. Using a tracking algorithm, task difficulty (ie, target duration varied between 100 and 300 ms) was individually adjusted such that each participant successfully responded on ~66% of trials. Participants had first completed a practice session outside the scanner (for ~5 min), during which they were instructed that for each five points won they would receive one food snack in the form of small chocolate candies. The current study used the contrast ‘anticipation high win versus no win’. Only successful ‘hit’ trials were included for analysis.

MRI data acquisition. Structural and functional MRI data were acquired at eight IMAGEN assessment sites with 3T MRI scanners of different manufacturers (Siemens, Philips, General Electric, Bruker). The scanning variables were specifically chosen to be compatible with all scanners.

The same scanning protocol was used at all sites. In brief, high-resolution T1-weighted 3D structural images were acquired for anatomical localization and co-registration with the functional time series (TR = 2300 ms, TE = 2.8 ms, $256 \times 256 \times 160$ matrix, voxel size: $1.1 \times 1.1 \times 1.1$). T2*-weighted images were acquired with a gradient-echo, echo-planar imaging (EPI) sequence. For the MID task, 300 volumes \times 40 slices were acquired for each subject (2.4 mm slice thickness, 1 mm gap). The echo-time was optimized to provide reliable imaging of subcortical areas (TR = 2200 ms, TE = 30 ms, 64×64 matrix, voxel size: $3 \times 3 \times 3$ mm).

MRI analysis. Preprocessing and statistical analysis of fMRI data were performed in SPM8 (Statistical Parametric Mapping, <http://www.fil.ion.ucl.ac.uk/spm>). Slice-time correction was conducted to adjust for time differences owing to multislice-imaging acquisition; all volumes were aligned to the first volume and non-linear warping was performed to an EPI template. Images were then smoothed with a Gaussian kernel of 5-mm full-width at half-maximum. At the first level of analysis, changes in the BOLD-response for each subject were assessed by linear combinations at the individual subject level; for each experimental condition, each trial was convolved with the hemodynamic response function to form regressors that account for potential noise variance associated with the processing of reward anticipation. Estimated movement parameters were added to the design matrix in the form of 18 additional columns (three translations, three rotations, three quadratic and three cubic translations, and each three translations with a shift of ± 1 TR). Furthermore, each individual fMRI time series underwent an automatic spike detection method. The spike detector algorithm uses a mean-squared-based metric to identify unexpected values temporally and spatially slice per slice. We used a non-parametric outlier

detection procedure based on density estimation to detect and exclude individuals with contrast maps that exceeded criterion values in cortical and subcortical regions (Fritsch *et al*, 2012). These outlier criteria are used in previous studies, for eg, see (Loth *et al*, 2013; Nees *et al*, 2012). Controlling for cortical/subcortical outlier variables in the model did not affect the results and there are no genotype differences in the cortical or subcortical outlier variables ($p < 0.10$). To analyze the anticipation phase, we contrasted 'anticipation of high win (here signaled by a circle) versus anticipation of no win (here signaled by a triangle)'. The individual contrast images were subsequently included in a second-level random effects analysis. The VS (MNI: $\pm 14, 8, -8, 9$ mm radius) was extracted using the MarsBar toolbox (<http://marsbar.sourceforge.net>) as defined by (O'Doherty *et al*, 2004; Schneider *et al*, 2012). The left and right caudate was extracted based on the automated anatomical labellings (Tzourio-Mazoyer *et al*, 2002). Averaged beta-values based on all voxels in the ROIs were used for all analyses (Figure 2).

Analysis. Analyses were performed in SPSS version 21. All results are based on the full model, ie, CANTAB WM = Striatal BOLD + rs1800497 + Striatal BOLD \times rs1800497 + covariates (centre and gender). In all analyses the VS and caudate are analyzed separately. Significance levels related to MRI results are corrected for these two regions. Owing to the high correlation between left and right VS and left and right caudate BOLD responses, we have not corrected for multiple testing based on hemisphere.

Brainchild

Participants

Behavioral data. Behavioral data were collected at two time points. The first round comprised 331 individuals

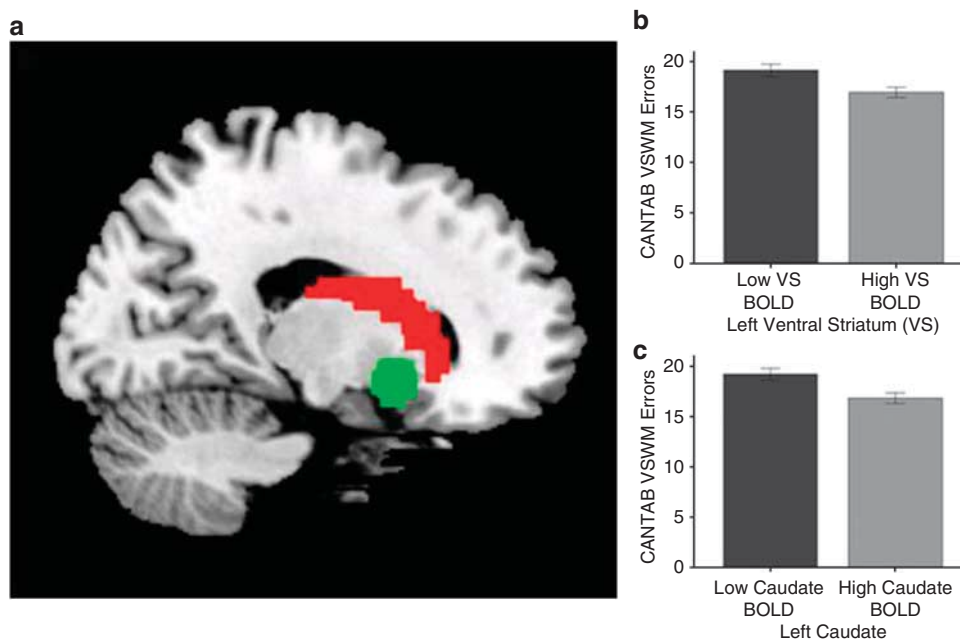


Figure 2 (a) Sagittal slice indicating caudate region of interest (ROI) in red and VS ROI in green ($x = -16$); (b, c) individuals with lower VS/caudate blood oxygenation level dependent (BOLD) defined through a median split of BOLD responses during reward anticipation make significantly more errors on a WM test relative to individuals with high VS/caudate BOLD.

(50.5% male, 12.2 years \pm 4.5, 6–25 years (mean age \pm SD, range)) and the second round 270 individuals (48.9% male, 13.7 \pm 4.0 years, 7–27 years (mean age \pm SD, range)). The second round took place 2 years after the first testing session. In round 2, measurements of 256 participants tested at the first instance were repeated. Participants from rounds 1 and 2 were included in analyses using a mixed model ANOVA, as described in the analysis section below. The participants had been recruited using random sampling from the population registry in Nynäshamn in Sweden. The study was approved by the local ethics committee of the Karolinska University Hospital, Stockholm.

Genetic data. Deoxyribonucleic acid was extracted from either blood or saliva samples. Genotyping procedures have been previously published (Dumoutheil *et al*, 2011).

Cognitive tests

Visuospatial WM. WM performance was assessed using the Automated Working Memory Assessment (AWMA) battery (Dumoutheil and Klingberg, 2012). The task involves remembering the location and order of dots displayed sequentially in a four-by-four grid for 1000 ms each, with a 500 ms interval between dots. After training with one, two, and three dots the test started with one dot. Each level consisted of six trials. Four correct answers were required for moving to the next level, where one more dot needed to be remembered. The test ended when three errors were committed on one level. The score used was the total number of correct trials. Thus, a higher score is better.

Intelligence. IQ was assessed through Raven's progressive matrices (Raven *et al*, 1998).

Analysis. Analyses were performed in SPSS version 21. A mixed linear model was performed using the repeated covariance type 'compound symmetry'. The time point at which data had been collected (T1 or T2) was entered as a repeated variable. WM performance acted as the dependent variable, whereas rs1800497-genotype, age, and IQ were entered as predictor variables.

RESULTS

Effect of rs1800497 on WM

Imagen. The effect of rs1800497 on the CANTAB WM between search errors was analyzed with a general linear model, controlling for sex and centre effects. This analysis suggested that GG-homozygotes produced significantly fewer errors, ie, showed higher WM performance ($F_{1, 1070} = 6.39$, $p < 0.012$, partial $\eta^2 = 0.006$). The association between rs1800497 and WM slightly increased when also adding verbal IQ (based on the WISC) as a covariate ($F_{1, 1067} = 7.39$, $p < 0.007$, partial $\eta^2 = 0.007$).

Brainchild. Linear mixed models with age⁻¹_Z, sex, and rs1800497-genotype entered as covariates were used to test for genetic effects on performance on the AWMA. An effect of rs1800497-genotype was identified, with a significantly higher performance on the AWMA identified in individuals

homozygous for the G-allele ($F_{1, 315.7} = 6.66$, $p = 0.010$). The SNP by age interaction on AWMA performance was not significant ($p = 0.74$). The association between rs1800497 and WM remained significant when adding IQ-scores in the form of Ravens as a covariate ($F_{1, 310.4} = 6.42$, $p = 0.036$).

Effect of rs1800497 on BOLD-Response

Imagen. No direct effects of the rs1800497 polymorphism on either VS (left VS: $p = 0.50$, right VS: $p = 0.18$) or caudate activation (left caudate: $p = 0.94$, right caudate: $p = 0.29$) were identified when controlling for centre, gender, and handedness. No significant genotype differences were identified in the number of successfully completed trials ($p > 0.14$), suggesting that the tracking algorithm of the MID task was effective.

Effect of rs1800497, Striatal BOLD, and rs1800497 \times Striatal BOLD on WM

Imagen. Next, we tested the full model of rs1800497 + striatal BOLD during reward anticipation + rs1800497 \times striatal BOLD during reward anticipation on WM. Four models were completed as left VS, right VS, left caudate, and right caudate varied as predictor variables (Figure 3b). Considering that we tested two regions (VS and caudate), we report corrected significance levels.

Main Effect of rs1800497 on WM

The effect of rs1800497 on WM was significant also in these models ($p < 0.0001$, partial $\eta^2 = 0.012$ – 0.015).

Main Effect of Striatal BOLD-Response on WM

A positive BOLD-response was identified in both the VS and the caudate during the contrast anticipation high reward anticipation versus no reward. Increased activation of the VS during this contrast was associated with better WM (measured as between search errors) (left VS_{corrected}: $F_{1,1068} = 21.97$, $p < 0.0001$, partial $\eta^2 = 0.020$; right VS_{corrected}: $F_{1,1068} = 16.84$, $p < 0.0001$, partial $\eta^2 = 0.016$) after controlling for centre and gender. The associations remained significant after adding verbal IQ as a covariate (left VS_{corrected}: $F_{1,1067} = 20.57$, $p < 0.0001$, partial $\eta^2 = 0.019$; right VS_{corrected}: $F_{1,1067} = 16.17$, $p < 0.0001$, partial $\eta^2 = 0.015$) (Figure 2). Similarly, increased BOLD in the caudate during reward anticipation was associated with better performance on the CANTAB WM task (left caudate_{corrected}: $F_{1,1068} = 18.38$, $p < 0.0001$, partial $\eta^2 = 0.017$; right caudate_{corrected}: $F_{1,1068} = 16.05$, $p = 0.00013$, partial $\eta^2 = 0.015$). Again, these associations remained significant after controlling for verbal IQ (left caudate_{corrected}: $F_{1,1072} = 18.03$, $p < 0.0001$, partial $\eta^2 = 0.017$; right caudate_{corrected}: $F_{1,1067} = 15.51$, $p < 0.00017$, partial $\eta^2 = 0.014$).

Rs1800497 \times Striatal BOLD-Response Interaction on WM

We identified a significant interaction between rs1800497 and VS_{corrected} BOLD on WM (left VS_{corrected} \times rs1800497: $F_{1,1068} = 10.48$, $p = 0.002$, partial $\eta^2 = 0.010$; right VS_{corrected} \times rs1800497: $F_{1,1068} = 7.25$, $p = 0.014$, partial $\eta^2 = 0.007$)

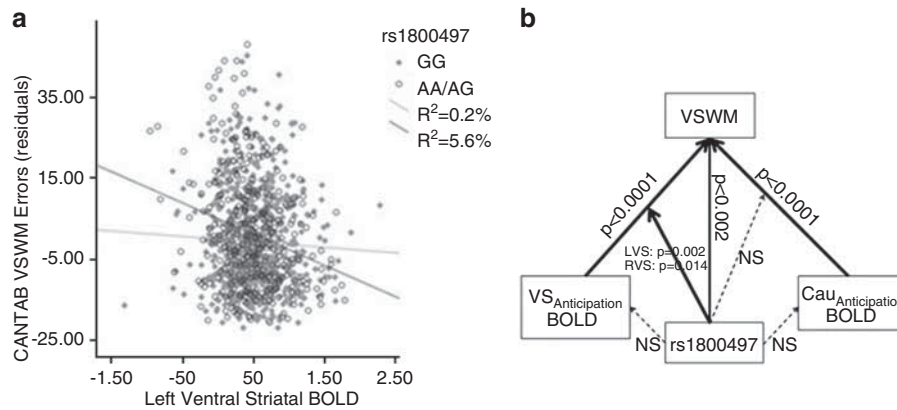


Figure 3 (a) rs1800497 \times ventral striatum (VS) blood oxygenation level dependent (BOLD) interaction suggesting that individuals carrying the A-allele make more errors on a working memory (WM) ($r = -0.24$, $p < 0.0001$, $r^2 = 5.6\%$) when they have reduced VS BOLD during reward anticipation. The negative correlation was not significant amongst GG-homozygotes ($r = -0.04$, $p = 0.27$, $r^2 = 0.2\%$). Residuals of WM errors after controlling for centre and gender are shown. (b) Depiction of main effects and interactions from the model rs1800497 + striatal BOLD + rs1800497 \times striatal BOLD = WM (controlling for centre and gender) based on the IMAGEN sample. The non-significant effects of rs1800497 on BOLD responses are based on the individual analyses. The figure shows significant main effects of rs1800497 on WM, main effects of caudate and VS BOLD on WM as well as interactions between rs1800497 and BOLD responses on WM.

suggesting that A-carriers, who on average performed worse on tests of WM, show a significantly higher accuracy on the WM task with higher VS activation (Figure 3). These interactions remained significant in the left VS after covarying for verbal IQ (left VS_{corrected} \times rs1800497: $F_{1,1067} = 8.14$, $p = 0.004$, partial $\eta^2 = 0.008$; right VS_{corrected} \times rs1800497: $F_{1,1067} = 4.61$, $p = 0.064$, partial $\eta^2 = 0.004$). Interactions between caudate BOLD and WM were not significant after correcting for multiple testing (left caudate_{corrected} \times rs1800497: $F_{1,1068} = 3.34$, $p = 0.14$; right caudate_{corrected} \times rs1800497: $F_{1,1068} = 4.92$, $p = 0.054$). Although the main effect of left VS BOLD accounted for 1.4% of the variance in WM performance in the full sample, when investigating the variance accounted for by left VS BOLD amongst the A-carriers, 5.6% of the variance is accounted for, whereas only 0.2% of the variance is accounted for amongst the GG-homozygotes.

DISCUSSION

The results of this study show that VS and caudate activity during reward anticipation have a small but significant effect on WM performance in a large sample of adolescents. Whereas striatal activity has previously been associated with WM (Satterthwaite *et al*, 2012; Ziermans *et al*, 2012), this is the first study to show that striatal activity during a reward task is associated with WM performance measured outside the scanner, suggesting that striatally mediated motivation is important for WM performance (Figure 3b). Furthermore, the study suggests that the DRD2/ANKK1 polymorphism rs1800497, which has previously been shown to interact with motivation to influence improvement after WM training, also interacts with VS activity during reward processing to affect WM performance. Individuals who carry the lower expressed A-allele show reduced WM performance relative to GG-homozygotes. According to previous studies, A-carriers also tend to develop disorders of reward deficiency, such as alcohol abuse, and ADHD

more frequently (Blum *et al*, 1996; Comings and Blum, 2000); here we show that these individuals show a positive association between reward-related VS activity and WM performance.

In a study of a different sample, Söderqvist *et al* (2013) showed that individuals who carry the A-allele of rs1800497 are more sensitive to intrinsic motivation during WM training in order to improve their WM relative to the GG-homozygotes (Söderqvist *et al*, 2013). The study suggests that A-carriers improve significantly more on a task of WM after completing several weeks of cognitive training. The sample showed no association between rs1800497 and WM at baseline and the significant interaction between rs1800497 and motivation on WM remained after controlling for baseline performance. Our study suggests that that A-carriers of rs1800497 may also be significantly more sensitive to VS activity during reward processing in order to perform well on a WM task. However, the A-carriers also perform significantly worse on a tasks of WM. Thus, we speculate that the relative performance of A-carriers and GG-homozygotes depends on the amount of activity in VS, and on the level of motivation during testing. Although this association of rs1800497-genotype on WM was not identified in the study by Söderqvist *et al* (2013), the findings fit well with previous research suggesting that individuals who carry the A-allele show reduced density of D2 receptors in the VS and are more likely to develop disorders of reward deficiency such as excessive drinking, smoking, and show ADHD symptoms (Blum *et al*, 1996; Jonsson *et al*, 1999; Volter *et al*, 2012). We speculate that the reward deficiency, which has previously been associated with A-carriers of rs1800497, does not only affect motivation but indirectly also impacts on WM performance. In our sample, we did not identify significant associations between rs1800497 and ADHD/drinking behaviors, but we cannot exclude that unknown third variables drive the observed interaction.

In conclusion, these results add clarity to the neural mechanisms that underlie associations between motivation

and WM. Previous studies implicate striatal function as important for WM. We suggest that striatal BOLD during reward processing is an important factor underlying performance on tasks of WM, but that individuals differ in their response. In combination with the study by Söderqvist *et al* (2013), this study suggests that individuals who show reduced WM based on ANKK1/DRD2 genotype may be able to increase their performance through increased motivation, which is associated with striatal activation. Future research should aim to investigate the effect of striatal activation during different phases of reward processing on WM performance in an MRI task that integrates both reward processing and WM. It would also be of use to better understand the molecular mechanisms by which rs1800497 affects D2 receptors in the striatum in humans. Finally, it would be of interest to determine whether motivation during WM training affects striatal activation.

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