

Supplement

Representativeness of our study cohort

Participants were descriptively comparable to similar cohorts drawn from the German general population regarding monthly per-capita income, DSM-IV nicotine dependence, alcohol consumption (except for an underrepresentation of alcohol-abstinent persons and an overrepresentation of persons drinking only small amounts of alcohol due to our inclusion criteria), DSM-IV alcohol abuse and BMI (see Table S1).

Table S1. Comparing our study cohort to a reference population.

Variable		Study cohort (males, 18 years, n=191)	Reference population
Monthly income	per-capita	M=861 EUR ± 375 EUR (n=116)	M=906 to 1130 EUR German households with children under age 18 ¹
DSM-IV dependence (past year)	Nicotine	7%	10% males, 18-20 years ²
Alcohol consumption (past year)			
Abstinence		0% (<i>Exclusion criterion</i>)	15% males, 18-20 years ²
0.5-24 g/day		86%	61%
>25-60 g/day		12%	14%
>60-120 g/day		<1%	2%
>120 g/day		<1%	1%
Mean g/week		85g	92 g males, 18-24 years ²
DSM-IV alcohol abuse (lifetime)		6%	8% males, 18-20 years ²
BMI			males, 18-29 years ³
M	±	SD	
underweight (<18.5)		22.3 ± 3.1	24.5 ± -
normal (18.5-<25)		6%	3%
overweight (25-<30)		76%	62%
Adipositas (≥30)		14%	27%
		3%	9%

Note. Data are for descriptive purposes only. Reference populations come from different studies.

Measures of alcohol consumption

To characterize participants' drinking behavior and how this relates to polygenic risk, we calculated a sum score of drinking variables using information acquired with the CIDI interview^{4, 5}: age of 1st drink, age of 1st time being drunk, estimated average alcohol consumption in past year (g alc/day), average alcohol consumption per drinking occasion in the past year (g alc), age of 1st binge-drinking event, number of binge-drinking events lifetime, and average alcohol consumption per binge-drinking event in the past year (g alc). Binge-drinking was defined as the consumption of at least five drinks (≥ 60 g alc) on one occasion. To increase reliability of the indicator of alcohol drinking behavior, we did not use the single CIDI items but calculated a sum score (*drink score*) from the z-scaled CIDI items with higher values indicating greater alcohol consumption⁶. Unlike the categorical high- versus low-risk drinker classification by the WHO, the resulting score is a continuous measure of alcohol intake that can be used for linear correlations with the polygenic risk score for alcohol consumption.

Moreover, the WHO suggests a second criterion for chronic harm of alcohol consumption based on the average alcohol intake per day⁷ as assessed with the CIDI interview^{4, 5}. However, 95.8 % of our sample fell into the low-risk group according to this criterion rendering our data unsuitable to examine associations of chronic risk of alcohol intake with PIT. Given this distribution of chronic risk and the young age and relatively brief period of alcohol consumption (on average two years) of our participants, chronic risk was of secondary interest to us and, therefore, we focused on comparisons between participants with low- versus high-risk drinkers for acute alcohol-related problems⁷ in our analyses as described in the main text.

Preprocessing of fMRI data

fMRI data were pre-processed using Nipype⁸. Correction for differences in slice time acquisition was performed. Voxel-displacement maps were estimated based on acquired field maps. All images were realigned to correct for motion, distortion and their interaction. After coregistration of the individual structural image to the individual mean EPI, the structural image was spatially normalized and normalization parameters were applied to all EPIs. Finally, images were spatially smoothed with a Gaussian kernel of 8 mm full width at half maximum. During individual statistical analyses, data were high-pass filtered with a cut-off of 128 s. An event-related analysis was applied on two levels using the general linear model approach as implemented in SPM12.

Sample characteristics

In Table S2 the sample characteristics for the two groups of low- (n = 97) and high-risk drinkers (n = 94) are displayed.

Table S2. Sample characteristics for the two groups of low- and high-risk drinkers.

	Low-risk drinkers (97)		High-risk drinkers (94)		<i>p</i>
	mean	SD	mean	SD	
Age	18.4	0.1	18.4	0.2	.96 ^a
SES	-0.03	1.4	0.03	1.9	.83 ^a
Verbal intelligence (MWT-B)	98.1	4.9	97.5	5.5	.26 ^b
Pure alcohol in kg consumed during lifetime	4.2	4.0	12.7	11.2	<.001 ^b
DSM-IV alcohol abuse (n)	1	-	12	-	-
Alcohol craving (OCDS)	3.2	2.8	4.2	3.3	.009 ^b
Alcohol use problems (ADS)	3.9	4.1	5.9	4.1	<.001 ^b
Nicotine dependence severity (FTND)	0.2	1.1	0.2	0.7	.71 ^a

Note. SES – socio-economic status: computed as the sum of z-transformed social status, household income and inverse personal debt scores⁹; MWT-B - Mehrfachwahl-Wortschatz-Intelligenztest, test for verbal intelligence¹⁰; OCDS - Obsessive Compulsive Drinking Scale, alcohol craving¹¹; ADS - Alcohol Dependence Severity¹²; FTND - Fagerström Test for Nicotine Dependence, nicotine dependence severity¹³. ^a two-sample *t*-test, two-tailed; ^b Wilcoxon rank sum test, two-tailed.

Behavioral PIT effect by group (high- versus low-risk drinkers according to WHO)

We observed a stronger PIT effect in high-risk drinkers as indicated by a significant interaction effect of group (low- versus high-risk drinkers) and Pavlovian background value (ranging from -2€ to +2€) on number of button presses. Moreover, both groups learned the instrumental contingencies equally well as we found a significant main effect of instrumental condition (collect versus not-collect), but no interaction between instrumental condition and group. See Table S3 for all main and interaction effects of the regression model.

Table S2. Regression coefficients indicating the influence of Pavlovian background conditions (-2€, -1€, 0€, +1€, +2€), instrumental conditions (collect versus not-collect) and drinking group

Coefficient	Estimate(SE)	z	p
Intercept	0.85(0.07)	11.53	<.001
Pavlovian background value	0.12(0.02)	7.27	<.001
Instrumental task (collect versus not collect)	2.27(0.17)	13.41	<.001
Group (low versus high risk drinkers)	-0.04(0.14)	-0.30	.76
Pavlovian background value * group	0.09(0.03)	2.70	<.009
Instrumental task * group	-0.20(0.34)	-0.61	.54

Moreover, we controlled our results for smoking severity as measured by the FTND¹³ and still observed a similar pattern (see Table S4).

Table S4. Regression coefficients indicating the influence of Pavlovian background conditions (-2€, -1€, 0€, +1€, +2€), instrumental conditions (collect versus not-collect) and drinking group controlled for smoking severity.

Coefficient	Estimate(SE)	z	p
Intercept	0.85(0.07)	11.54	<.001
Pavlovian background value	0.12(0.02)	7.32	<.001
Instrumental task (collect versus not collect)	2.27(0.17)	13.41	<.001
Group (low versus high risk drinkers)	-0.04(0.14)	-0.30	.76
Smoking severity	-0.02(0.08)	-0.22	.82
Pavlovian background value * group	0.09(0.03)	2.73	<.01
Instrumental task * group	-0.20(0.34)	-0.61	.54
Pavlovian background value * smoking severity	-0.02(0.02)	-1.02	.31
Instrumental task * smoking severity	-0.05(0.18)	0.29	.77
group * smoking severity	-0.05(0.15)	-0.33	.74
Pavlovian background value * group * smoking severity	-0.03(0.04)	-0.94	.35
Instrumental task *group * smoking severity	0.23(0.37)	0.62	.53

Behavioral PIT effect in whole group

With respect to the overall learning effects in the whole group of 191 male 18-year old subjects, our regression analysis revealed a main effect of collect/not collect ($\beta = 2.27$, $SE = 0.17$, $p < .001$): all participants showed a higher number of button presses during approach compared to non-approach trials, indicating successful instrumental learning. Moreover, we observed a main effect of Pavlovian background on the number of button presses ($\beta = 0.12$, $SE = 0.02$, $p < .001$), indicating a significant influence of background cues on instrumental response for the whole group (see Figure S1).

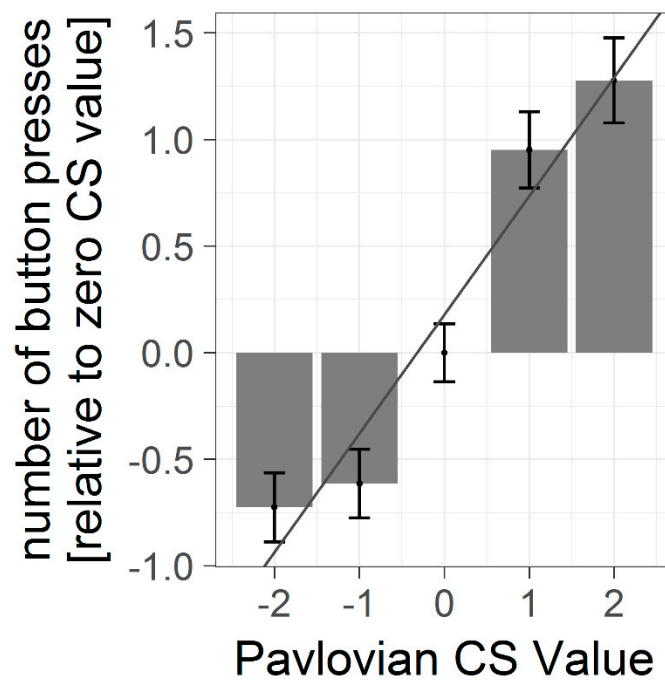


Figure S1. PIT effect in the whole sample ($n=191$). Number of button presses are displayed relative to the zero (0€) condition. Grey line reflects the group regression slope.

Neural CS effect

To explore the pure effect of CS (compound of fractal-like visual stimulus and tone in the background) during our PIT paradigm, we assessed on the second level the CS value across the whole group and again performed a small volume analysis using a ROI encompassing both the NAcc and the amygdala. We found no significant activation within the left ($t = 0.79$, $p_{SVC} = .82$, $x = -22$, $y = -8$, $z = -22$) nor right amygdala ($t = 0.9$, $p_{SVC} = .79$, $x = 24$, $y = -8$, $z = -10$). However, we found a CS value related activation in the right NAcc ($t = 3.25$, $p_{SVC} = .041$, $k = 1$, $x = 12$, $y = 10$, $z = -8$, see Figure S2). This activation was elicited by passively viewing CSs without explicit task relevance for the subjects as instructed by us; thus, the effect is not directly comparable with alcohol-related cue-reactivity or monetary incentive delay tasks, where stimuli predict possible win or loss in accordance with fast responses.

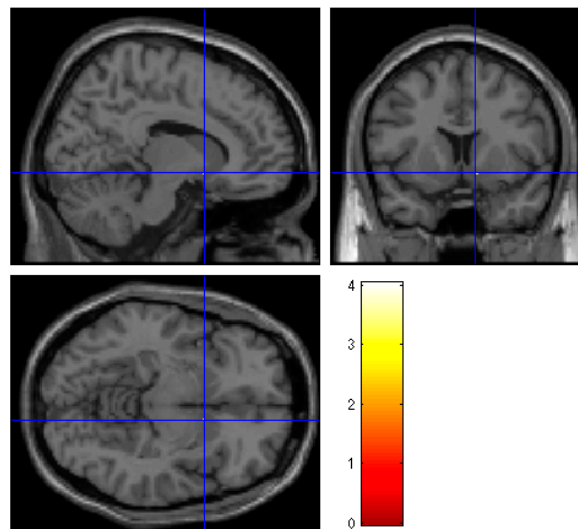


Figure S2. Pure CS effect during the PIT task. This effect was significant for the whole imaging group of $n=139$ subjects in the right NAcc only ($p_{SVC} = .041$).

Exploratory whole brain analysis of PIT effect

The following Table S5 aims to give an overview of the exploratory whole brain analysis of the PIT-effect. We used a threshold of $p_{uncorr} < .001$ and cluster size $k = 10$.

Table S5. Exploratory whole brain analysis of PIT-related activations.

set		cluster			peak					coordinates in mm			Automated anatomical labeling (AAL)	
p	C	$p_{(FWE-corr)}$	$p_{(FDR-corr)}$	k	$p_{(unc)}$	$p_{(FWE-corr)}$	$p_{(FDR-corr)}$	T	Z	$p_{(unc)}$	x	y	z	
.49	3	.82	.92	31	.44	.52	.90	3.78	3.68	< .001	24	-6	-6	R Pallidum
		.74	.92	44	.35	.62	.90	3.69	3.60	< .001	54	-8	-6	R Superior Temporal Gyrus
		.88	.92	20	.54	.75	.90	3.56	3.47	< .001	-32	-40	10	L Hippocampus

Multi-level statistical approach including multi-modal data

We conducted an additional generalized linear mixed-effects analysis including multi-modal data as additional predictors (behavioral PIT, alcohol drinking risk groups and genetic information) using the subjects that have full data sets ($n = 115$, see Table S6). This analysis confirmed our results of enhanced PIT effects in high- compared to low-risk drinking subjects (trend-wise due to lower statistical power in the smaller cohort, interaction effect between Pavlovian background value and group, $p = .053$). Moreover, we observed enhanced PIT effects with stronger amygdala activation (interaction effect between Pavlovian background value and amygdala activation, $p < .001$) and higher polygenic risk for alcohol consumption (interaction effect between Pavlovian background value and PRS, $p = .019$). All tests were conducted two-tailed.

Table S6. Generalized linear mixed-effects model for predicting number of button presses as a function of instrumental task (collect versus not collect) and Pavlovian background stimulus value (-2€, -1€, 0€, +1€, +2€). Moreover, this analysis includes additional predictors, namely alcohol risk group, neural PIT effect and polygenic risk (n = 115).

Coefficient	Estimate (SE)	z	p
intercept	1.22(0.31)	3.91	< .001
Pavlovian value of background	-0.01(0.05)	-0.19	.846
Instrumental task (collect versus not collect)	1.73 (0.71)	2.42	.016
WHO risk group (low versus high risk alcohol drinkers)	-0.29(0.20)	-1.49	.138
Amygdala activation	0.03(0.11)	0.31	.760
PRS (z)	0.17(0.10)	1.76	.079
Pavlovian value * instrumental task	-0.03(0.03)	-0.93	.354
Pavlovian value * WHO risk group	0.06(0.03)	1.94	.053
Pavlovian value * amygdala activation	0.07(0.02)	4.09	< .001
Pavlovian value * PRS (z)	0.04(0.02)	2.35	.019
Instrumental task * WHO risk group	0.52(0.45)	1.15	0.250
Instrumental task * amygdala activation	-0.23(0.25)	-0.92	0.360
Instrumental task * PRS	-0.41(0.22)	-1.83	.068
Pavlovian value * instrumental task * WHO risk group	-0.03(0.02)	-1.50	0.133
Pavlovian value * instrumental task * amygdala activation	-0.03(0.01)	-3.18	0.002
Pavlovian value * instrumental task * PRS (z)	-0.03(0.01)	-2.82	0.005

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