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A study on the correlates of habit-, reward-, and fear-related motivations to use alcohol in alcohol use disorder

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Abstract

Background—We assessed self-reported drives for alcohol use and their impact on clinical features of alcohol use disorder patients. Our prediction was that, in contrast to “affectively” (reward or fear) driven drinking, “habitual” drinking would be associated with worse clinical features in relation to alcohol use and higher occurrence of associated psychiatric symptoms.

Methods—Fifty-eight DSM-IV alcohol abuse patients were assessed with a comprehensive battery of reward- and fear-based behavioural tendencies. In addition, an 18-item self-report instrument (the Habit, Reward and Fear Scale, HRFS) was employed to quantify affective (fear or reward) and non-affective (habitual) motivations for alcohol use. To characterise clinical and demographic measures associated with habit, reward and fear, we conducted a partial least squares analysis.

Results—Habitual alcohol use was significantly associated with the severity of alcohol dependence reflected across a range of domains and with lower number of detoxifications across multiple settings. In contrast, reward-driven alcohol use was associated with a single domain of alcohol dependence, reward-related behavioural tendencies, and lower number of detoxifications.

Conclusions—These results seem to be consistent with a shift from goal-directed to habit-driven alcohol use with severity and progression of addiction, complementing preclinical work and informing biological models of addiction. Both reward-related and habit-driven alcohol use were

associated with lower number of detoxifications, perhaps stemming from more benign course for the reward-related and lack of treatment engagement for the habit-related alcohol abuse group. Future work should further explore the role of habit in this and other addictive disorders, and in Obsessive-Compulsive Related Disorders.

Keywords

Classification; diagnosis; dependence; substance abuse; typology

1 Introduction

Harmful alcohol consumption is responsible for 3.8% of all global deaths, 4.6% of global disabilities, and more than one percent of the gross national product (GNP) being lost in most developed countries¹. In Brazil, it has been suggested that up to 80% of all admissions for substance dependence are due to alcoholism². Accordingly, understanding the key motivations that drive alcohol abuse is critical. For many years, motivation to consume alcohol has been described as either driven by reward learning (positive reinforcement) or relief of distress (negative reinforcement)³. More recently, however, there has been an higher interest in the role of habit formation across different substance and related addictions⁴⁻⁶.

Outcome devaluation studies and Pavlovian-instrumental transfer paradigms suggest that alcohol use disorder (AUD) involves a progressive shift from goal-directed control over alcohol seeking and consumption to a more ingrained, automatic, and stimulus-driven behaviour largely independent of the expected outcome⁷. From a neurobiological standpoint, the relative transition from goal directed to habitual use of alcohol may be accompanied by a shift in behavioural control from ventral to dorsal striatum⁸ and a progressive dysregulation of the hypothalamic pituitary adrenal axis, the sympathetic adrenal medullary system, and the sex steroid systems.⁹

Prevailing models provide a framework that explains chronicity and higher rates of relapse of AUD, with potential to improve or assist with personalization of treatments¹⁰. However, as the evidence supporting these models is based mostly on laboratory studies, research on human participants based in “real life” settings is crucial to fill a gap in the established evidence-base⁷. Although few studies reported decreased goal direct choices¹¹ and/or increased habit formation in adult humans with addiction,^{12,13} a similar phenomenon has not been noted in younger populations¹⁴ (for a review on the neurobiological mechanisms underlying habit formation see Barker and Taylor, 2014)¹⁵.

Sebold et al.,¹⁶ expanded these observations by reporting that “lower model-based” (or higher habitual) control predicted relapse in patients who also had high (mostly affective) expectancies about the effects of alcohol. Also, attempts to measure the motivations according to this model included the creation of the Reasons for Heavy Drinking Questionnaire, a 7-item self-report scale with one item addressing habitual drinking¹⁷. According to a recent Delphi study on the Research Domain Criteria (RDoC) relevant to addiction, more than 80% of experts described the Positive Valence System (Reward Valuation, Expectancy, Action Selection, Reward Learning, Habit) as involved in addiction, with habit being particularly critical for later/chronic stages of the condition.¹⁸

Thus, in the current study, we aimed to quantify drives for alcohol consumption in AUD patients, focusing on their motivations to reduce fear, to obtain reward, or to execute ingrained habits. Of note, our approach was multidimensional, thus allowing AUD patients to score similarly high on different domains of motivations. We also assessed how habit-, fear-, and reward-related motivations for alcohol use related to different sociodemographic and clinical factors in AUD patients. According to existing models that suggest habitual drinking to be an “end-state” of AUD⁸, our main hypotheses were that the former would be associated with greater duration of illness, higher incidence and severity of dependence (particularly perceptual and psychophysical withdrawal), greater number of lifetime detoxifications and higher severity of anxiety, stress, and depression. In contrast, we hypothesized that affect-modulated drinking (i.e. alcohol consumption either to decrease fear or obtain reward) would be associated with a shorter duration of illness, lower severity of dependence, less lifetime detoxifications and lower severity of comorbid affective symptoms.

2 Methods

2.1 Participants

Fifty-eight DSM-IV alcohol abuse patients were included in the study. Fifteen participants (25.9% of the sample) were consecutively recruited from a public substance abuse outpatient clinic at the Institute of Psychiatry of the Federal University of Rio de Janeiro (IPUB/UFRJ); whereas the remaining patients (74.1% of the sample) were recruited consecutively from the substance abuse inpatient clinic of a private hospital in the outskirts of Rio de Janeiro. Data were collected from July 2017 to March 2018. All participants provided written informed consent and agreed with the procedures of the study, which was approved by the local institutional review board in accordance with the Declaration of Helsinki. Besides having a diagnosis of alcohol abuse according to the DSM-IV, participants had to be aged 18 to 65 years old and to be able to read and comprehend scales included in the research protocol.

2.2 Assessments

Participants were assessed by board certified psychiatrists specialized in diagnosis and treatments of substance abuse individuals (MPP and APR) including with the Mini International Neuropsychiatric Interview¹⁹ for the confirmation of alcohol abuse and the diagnosis of comorbid discrete psychiatric disorders supplemented by the drug and alcohol section of the Addiction Severity Index (ASI)²⁰, which characterizes a range of alcohol related outcomes (including severity, natural history, and number of admissions, among others).

Participants also completed a number of self-report measures, including the Habit, Reward and Fear Scale (HRFS), an 18-item tool developed by the authors to quantify affective (fear or reward) and non-affective (habitual) motivations for obsessive-compulsive and related disorders and substance or behavioural addictions (see appendix); notably, the six habit-related items from the HRFS were selected from the existing Self-Report Index of Habit Strength²¹; other items remaining were worded in a similar way to address reward (as in addictive disorders) and fear (as in obsessive-compulsive and related disorders). They were

based in the Temporal Impulsive-Compulsive Scale²² and included statements about affective states participants experience before, in anticipation, or after the behaviours, how individuals would feel if prevented from performing the behaviour, and whether they are related to other approach- or avoidance-related behaviours. A 7-point Likert scale followed each HRFS with answers ranging from 1 (disagree) to 7 (agree).

Additional instruments included the Alcohol Dependence Scale (ADS)²³ to assess the severity of alcohol dependence and its subdomains; the Behavioral inhibition/activation (BIS/BAS) scale²⁴; the Urgency, Premeditation (lack of), Perseverance (lack of), Sensation Seeking, Positive Urgency, Impulsive Behavior Scale (UPPS-P)^{25,26}; the Creatures of Habit Scale (COHS)²⁷ to quantify different traits related to fear, reward, and habit; and finally, the Short form of the Depression Anxiety Stress Scale (DASS-21)^{28,29} to assess severity of associated psychiatric symptoms.

2.3 Data analysis

Categorical data were reported in percentages and continuous data were described as means (and standard deviations) or medians (and range), depending on the normality of distribution. Group comparisons between in and outpatients were performed using chi-square or Fishers' test (categorical variables) or student's T test or Mann-Whitney tests, also depending on normality of distribution. The HRFS total and subscores' internal consistency, convergent and divergent validities were established by means of Cronbach's alpha and Pearson's correlation. Convergent validities of HRSF subscores were tested in relation to ADS PPW and COH Automaticity (HRSF habit), BIS/BAS fun seeking and UPPS-P sensation seeking (HRSF reward) and BIS/BAS BIS and UPPS-P negative urgency (HRSF fear). Divergent validities were tested by performing correlations of HRSF subscales with scales other than those reported above.

To identify correlates of habit, reward and fear scores, we utilized the statistical technique of partial least squares (PLS), as detailed in³⁰. PLS is a multivariate, iterative technique that constructs one or more latent factors (referred to as PLS components) that optimally explain variation in X and Y. The Y variable was total score on the habit, reward and fear scores and X variables were as follows: age, sex, alcohol dependence according to MINI, clinician's severity of alcohol and other drugs according to the ASI, age at first alcohol use, duration of alcohol use since first use (in years), age at first alcohol intoxication, duration of alcohol use since first intoxication (in years), number of alcohol or other drug detoxifications at home, therapeutic communities, psychiatric hospitals, and other hospital units, ADS loss of behavioural control, obsessive-compulsive drinking style, and perceptual and psychophysical symptoms, DASS 21 stress, anxiety and depression, BIS BAS drive, fun seeking, reward and BIS, COH routine and automaticity, and UPPS-P negative urgency, positive urgency, sensation seeking, lack of premeditation and lack of perseverance.

Unlike traditional regression, PLS is ideal in situations in which variables are correlated with each other; and when the number of variables is large in comparison to the number of cases, as was the case here. PLS essentially constructs a bilinear factor model, projecting explanatory (X) variables and outcome (Y) variables into a new space, identifying the relationship between X and Y matrices using one or more latent variables. Analysis was

conducted using JMP Pro software Version 13.0. Any missing data points were imputed automatically by JMP using study means. The PLS model was fitted using leave-one-out cross-validation (non-linear iterative partial least squares, NIPALS algorithm), and the optimal number of latent factors was selected by minimizing the predictive residual sum of the squares (PRESS). X variables significantly contributing to the model (i.e. explaining significant variance in disease severity) were identified on the basis of 95% confidence intervals for bootstrap distribution of the standardized model coefficients not crossing zero (N = 1000 bootstraps). Variables with Variable Importance Parameter (VIP) <0.8 were excluded.

3 Results

3.1 Description of the sample

The sample (n=58) was characterized by a predominance of white (79.3%) males (72.4%) with a mean age of 39.4 (SD = 13.6) years. Participants had been alcohol free for a mean of 26.6 (SD = 24.6) days. Only 27.5% were married or within a stable relationship and just 17.2% reported being economically active. Most patients (31%) described not having a religion, 27.6% declared being Catholics, and 22.4% were Protestants. On the ASI, alcohol addiction severity was 7.67 (SD = 1.70) according to the interviewer (minimum possible score=0; maximum possible score=9) and 2.48 (SD = 1.70) according to the patient (minimum possible score=0; maximum possible score=4). Up to 81% of the sample also abused other drugs; the severity of concurrent drug abuse as per the ASI was 6.91 (SD = 3.42) according to the interviewer and 2.67 (SD = 1.73) according to the patient. Age at first alcohol use was 14.53 (SD = 3.47) years and age of first alcohol intoxication was 16.19 (SD = 3.62) years. The mean number of years since the first alcohol intoxication was 22.50 (SD = 12.12). Number of previous detoxifications for alcohol ranged from 0-10 (at home), 0-3 (at therapeutic communities), 0-15 (at psychiatric hospital), and 0-2 (at general hospital).

The number of months of spontaneous remission (not resulting from treatment) varied from none to 60 months. The amount of money spent on alcohol in the last 30 days ranged from none to 8000 Brazilian *reals* (median = 300 *reals*; 1 US dollar = approximately 3.5 *reais*). In terms of psychiatric comorbidity according to the MINI, recurrent major depressive disorder was diagnosed in 84.5% of the sample; other substance abuse in 81%; other substance dependence in 79.3%; alcohol dependence in 74.1%; antisocial personality disorder, psychotic syndromes and generalized anxiety disorder in 20.7% each; dysthymia in 19%; bipolar disorder in 17.2%; panic disorder and social phobia in 10.3% each; agoraphobia in 8.6%; and OCD and bulimia nervosa in 1.7% each. Although all patients have been diagnosed with alcohol abuse, participants described cocaine (34.5%), alcohol (27.6%), more than one substance (19%), and marijuana (6.9%) use as their most significant problems.

3.2 Differences between public and private alcohol abuse patients

As expected, inpatients (recruited in a private hospital) had a previous history of being more frequently treated in psychiatric hospitals for alcohol problems ($z = -2.51$; $p = .01$); they have also been drinking for a longer time (in months) than outpatients ($z = 2.06$; $p = .04$). In

contrast, outpatients (recruited in a public hospital) had a greater number of overdoses ($z=-3.53$; $p=.00004$), more severe perceptual and psychophysical withdrawal ($t=2.18$; $df=16.5$; $p=.04$), anxiety ($t=2.05$; $df=56$; $p=.04$), and depression ($t=2.29$; $df=34.2$; $p=0.03$). In terms of HRFS, outpatients displayed greater habit ($t=2.08$; $df=56$; $p=0.04$) and reward-related scores ($t=2.12$; $df=56$; $p=.04$). Greater severity among outpatients may reflect the fact that they all come from public services in Rio de Janeiro, which show restrictions in terms of available beds for individuals with AUD.

3.3 Habit, Reward and Fear Scale (HRFS)

The Cronbach's alpha was deemed adequate (.77) for the whole HRFS and good (.81) for its Habit subscale. Removal of different items (e.g. 3, 6, 7, 10, 14 and 16) from the Habit subscale did not increase Cronbach's alpha values, thus suggesting good internal consistency. As expected, the Habit subscale of the HRFS correlated significantly with ADS PPW ($r=.40$; $p=0.002$). However, it showed no convergent validity with the COH Automaticity scores ($r=.20$; $p=0.13$). Adequate divergent validity was confirmed by the lack of correlations between Habit and BIS/BAS fun seeking ($r=.16$; $p=0.22$), UPPS-P sensation seeking ($r=-.06$; $p=0.64$), BIS/BAS BIS ($r=-.13$; $p=0.32$), and UPPS-P negative urgency ($r=-.32$; $p=0.80$).

Cronbach's alpha of the Reward subscale of the HRFS (.72) was acceptable. Removal of different items (e.g. 2, 4, 9, 12, 15 and 17) of this subscale did not increase Cronbach's alpha values, thus supporting good internal consistency of the subscale. As expected, the Reward subscale of the HRFS showed good convergent and divergent validities for correlating with the BIS/BAS fun seeking ($r=.35$; $p=0.006$) and not correlating with the ADS PPW ($r=.17$; $p=0.19$), the COH Automaticity ($r=.21$; $p=0.11$), the BIS/BAS BIS ($r=-.03$; $p=0.81$), and the UPPS-P negative urgency ($r=.05$; $p=0.69$). However, the Reward subscale of the HRFS did not correlate to a substantial degree with the UPPS-P sensation seeking ($r=.25$; $p=0.06$).

Finally, Cronbach's alpha of the Fear subscale of the HRFS (.38) was unacceptably low. In addition, poor convergent validity of the Fear subscale of the HRFS was demonstrated in the present sample by the lack of correlations between its scores with both the BIS/BAS BIS ($r=-.08$; $p=0.52$) and UPPS-P negative urgency ($r=.25$; $p=0.06$). Further, despite lack of correlations between the Fear subscale of the HRFS with the COH Automaticity ($r=-.008$; $p=0.95$), the BIS/BAS fun seeking ($r=.13$; $p=0.32$) and the UPPS-P sensation seeking ($r=.06$; $p=0.65$), its divergent validity was not satisfactory, as it correlated positively with the ADS PPW ($r=.33$; $p=0.01$). For these reasons, PLS models with fear as Y variable of interest was not pursued.

3.4 Habit scores as Y variable of interest in PLS model

The optimal model had one latent factor, and accounted for 23.8% of variance in X variables, and 36.3% of variance in habit scores. The standardized model coefficients for each variable of interest are presented in Figure 1. Variables with positive coefficients had a positive relationship with habit scores, and vice versa. Those measures shown in bold and with an asterisk retained statistical significance by bootstrap, i.e. the 95% confidence interval of the bootstrap distribution of the model coefficient did not cross zero. Higher

habitual use of alcohol in the present sample was significantly associated with greater severity of alcohol dependence in AUD patients across different domains (including loss of behavioural control, obsessive-compulsive drinking, and perceptual and psychophysical withdrawal) and, unexpectedly, with a lower number of alcohol and drug detoxifications across multiple settings.

3.5 Reward scores as Y variable of interest in PLS model

The optimal model had one latent factor, and accounted for 17.6% of variance in X variables, and 41.4% of variance in reward scores. The standardized model coefficients for each variable of interest are presented in Figure 2. Variables with positive coefficients had a positive relationship with reward scores, and vice versa. Those measures shown in bold and with an asterisk retained statistical significance by bootstrap, i.e. the 95% confidence interval of the bootstrap distribution of the model coefficient did not cross zero. Reward-related scores in the HRFS scores were associated with a single domain of alcohol dependence (namely loss of behavioural control), higher BIS BAS fun seeking, COH routine and, as expected, lower number of alcohol and drug detoxifications.

3.6 Fear scores as Y variable of interest in PLS model

This model did not converge in terms of the PRESS statistic, indicating that X variables overall did not significantly predict fear score.

4 Discussion

In this study, we used diagnostic interviews and self-report instruments to address the intensity of different motivations for alcohol use and their correlates in a clinical sample of AUD. We demonstrated that higher severity of alcohol dependence was associated with habitual use of alcohol on the HRFS, in keeping with preclinical data⁸ Also in agreement with the above result, the use of alcohol for its rewarding properties on the HRFS was associated with a less generalized severity of dependence and with a range of impulsive personality features. These findings were consistent with our initial hypotheses. Although higher impulsivity levels, particularly UPPS-P sensation seeking³¹ and BAS drive and fun seeking³² have been reported in alcohol abuse individuals, these studies were unable to previously ascribe these psychological profiles to a specific AUD phenotype.

Despite employing a dimensional approach whose objective did not include the identification of discrete subgroups of AUD patients (the same patient could score similarly high on different motivations), our data suggest that habit- and reward-based alcohol use could partially map into existing subtypes of phenotypes of AUD patients, such as Babor's types A and B alcoholism, respectively³³. For instance, habit based alcohol use seems to correspond to the more severe type B subgroup, which also shows a longer duration of illness and higher genetic (family history)/environmental (stress/traumatic) risk factors. In contrast, the reward-based alcohol use would be consistent with the less severe (type A) group of alcohol use, also having a shorter duration of illness and low-genetic/environmental vulnerabilities³³. Contrary to our initial prediction higher scores of anxiety and depression were not positively correlated to habit-driven subjects disorder in this sample.

Accordingly, lower number of detoxifications in participants using alcohol to obtain reward may also reflect a more benign course, a finding consistent with the milder subtype of alcohol use described above³³. In contrast, the association between lower (rather than higher) numbers of detoxification and habitual use of alcohol contradicted our initial prediction. This novel result may be clinically important, suggesting that while habitual alcohol use is associated with more severe alcohol use pathology, such high habit scoring individuals may be less likely to ‘break their habit’ and seek/agree to inpatient treatment. The impact of scale scores on treatment engagement and outcomes should be explored further in future work.

We found that higher reward-driven use of alcohol on the HRFS was associated with higher ‘routine’ scores on the Creature of Habit (COH) scale; and that higher habit-driven use of alcohol on the HRFS tended to be associated with higher ‘automaticity’ scores on the COH scale (albeit the latter was not significant with bootstrap). This may reflect the nature of the COH scale items: the COH ‘routine’ items relate largely to comfort and the need for comfort whereas those for ‘automaticity’ relate more to finding oneself engaged in acts or habits without prior thought. Conceivably early alcohol use may thus be motivated by the need for comfort (i.e. reduction of anxiety) whereas later it is linked to more automatic habitual tendencies.

This study has a number of limitations, including a small and heterogeneous sample with different comorbid psychiatric disorders and polysubstance use, a cross-sectional design, and the use of an instrument that still has incipient psychometric properties being evaluated (the HRFS). Habits’ ability to override conscious deliberative tendencies may interfere somehow with the individual’s competence to describe their own habitual behaviour appropriately.^{34,35}

Further, initial predictions about fear-driven AUD could not be appropriately tested due to problems exhibited by the fear subscale of the HRFS. It is difficult to speculate on the reasons for poor convergent and divergent validities and unacceptable intraclass correlations coefficients of this subscale, as they could reflect problems such as low numbers, items that do not address adequately the fear component of alcohol abuse or even the irrelevance of the fear construct for alcohol abuse patients (which, at least in our population, orbited around themes of reward and habit). Future studies including bigger numbers and participants with impulsive-compulsive disorders with clearer fear components, such as OCRDs, should help clarify these issues. They could also incorporate specific metrics of insight into illness, as the association between greater habit and reward scores and less detoxification among patients with addiction can also reflect greater ability to reflect on their own habitual behaviour.

In conclusion, our study represents an important step towards the translation to the clinical arena of experimental human and animal research indicative of transition from goal-directed towards habitual alcohol use with more severe illness (disease progression). In the future, habit and reward subcomponents of the HRFS may be used in alcohol abuse patients to monitor evolution and select more specific treatments¹⁰. Use of such measures in wider contexts, such as in other substance addictions, behavioural addictions, and Obsessive-

Compulsive Related Disorders, may help to advance the field and further elucidate the fit of this model to understanding different forms of psychopathology.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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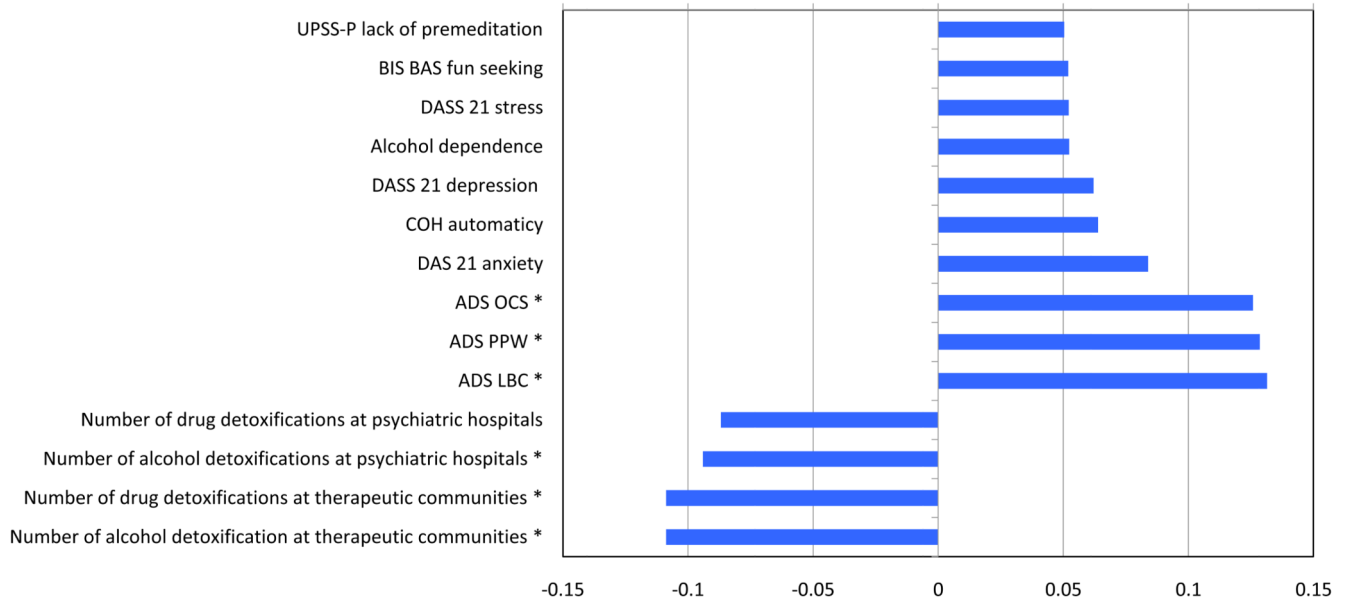


Figure 1. Standardized model coefficients for each X variable of interest in the optimal PLS model (one latent variable): Habit related scores of the HRFS as the Y variable of interest
 Footnote: UPPS-P= Urgency, Premeditation (lack of), Perseverance (lack of), Sensation Seeking, Positive Urgency, Impulsive Behavior Scale; BIS BAS= Behavioral Inhibition/Activation scale; DASS-21= Depression Anxiety Stress Scale; COH=Creatures of Habit, ADS=Alcohol Dependence Scale; OCS=Obsessive-Compulsive Symptoms; PPW=Perceptual and Psychophysical Withdrawal; LBC=Loss of Behavioral Control; *: statistically significant predictive variable by bootstrap.

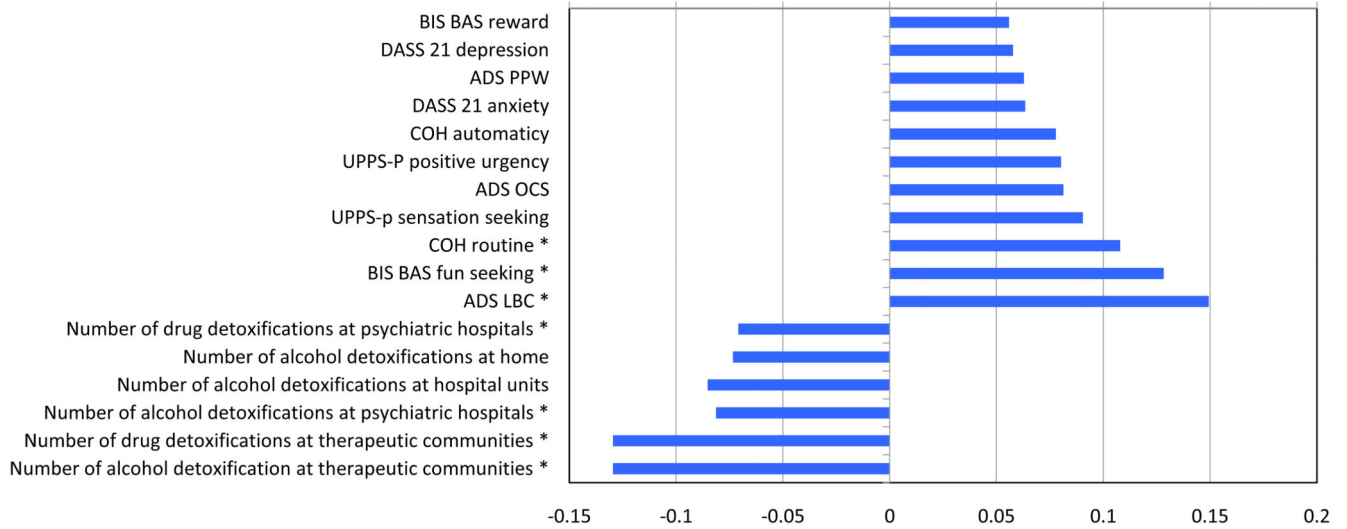


Figure 2. Standardized model coefficients for each X variable of interest in the optimal PLS model (one latent variable): Reward related scores of the HRFS as the Y variable of interest
 Footnote: UPPS-P= Urgency, Premeditation (lack of), Perseverance (lack of), Sensation Seeking, Positive Urgency, Impulsive Behavior Scale; BIS BAS= Behavioral Inhibition/ Activation scale; DASS-21= Depression Anxiety Stress Scale; COH=Creatures of Habit, ADS=Alcohol Dependence Scale; OCS=Obsessive-Compulsive Symptoms; PPW=Perceptual and Psychophysical Withdrawal; LBC=Loss of Behavioral Control; *: statistically significant predictive variable by bootstrap.