

Disentangling Differing Relationships Between Internalizing Disorders and Alcohol Use

by

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B.A., University of Colorado, 2022

A thesis submitted to the

Faculty of the Graduate School of the

University of Colorado in partial fulfillment

of the requirement for the degree of

Master of Arts

Department of Ecology and Evolutionary Biology

2023

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Abstract

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Thesis directed by Assistant Professor Luke M. Evans

Both internalizing disorders and alcohol use have dramatic, wide-spread implications for global health. Previous work has established common phenotypic comorbidity among these disorders, as well as shared genetic variation underlying internalizing and alcohol use. We used genomic structural equation modeling to investigate the shared genetics of internalizing, externalizing, and alcohol use traits, as well as to explore whether specific domains of internalizing symptoms mediate the contrasting relationships with problematic alcohol use compared to alcohol consumption. We also examined patterns of genetic correlations between similar traits within additional Finnish and East Asian ancestry groups. When the shared genetic influence of externalizing psychopathology was accounted for, the effect of internalizing on alcohol use was reduced, suggesting the important role of common genetic factors underlying multiple psychiatric disorders and the genetic influences on comorbidity of internalizing and alcohol use traits. Individual internalizing domains had contrasting effects on frequency of alcohol consumption, which demonstrate the complex system of pleiotropy that exists, even within similar disorders, and can be missed when evaluating only relationships among formal diagnoses. Future work must consider both the broad effects of shared psychopathology and the fine-scale effects of heterogeneity within disorders in order to more fully understand the biology underlying complex traits.

Acknowledgements

This work was supported by the National Institutes of Health and the University of Colorado Boulder Institute for Behavioral Genetics. This work utilized the Summit supercomputer, which is supported by the National Science Foundation (awards ACI-1532235 and ACI-1532236), the University of Colorado Boulder, and Colorado State University. The Summit supercomputer is a joint effort of the University of Colorado Boulder and Colorado State University. We want to acknowledge the participants and investigators of the FinnGen study, and we thank the participants of the UK Biobank, and all the studies from which we utilized summary statistics.

I would also like to thank my committee members for guiding me throughout this project. Special thank you as well to Naomi Friedman, Andrew Grotzinger, and Harry Smolker. This project would not have been possible without their support and expertise.

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Introduction

Internalizing disorders, including anxiety and depressive disorders, and alcohol use disorder (AUD) are common, often debilitating conditions. Nearly one third of U.S adults experience an anxiety disorder during their lives¹, and approximately 16% of the world's population are affected by either mental or substance use disorders². Excessive alcohol use is one of the leading causes of preventable death in the United States³, and alcohol use is the leading cause of premature death and disability worldwide for those aged 15-49⁴.

Internalizing disorders and AUD are frequently comorbid, co-occurring two to four times more than expected for independently occurring disorders⁵⁻⁷. This further confounds diagnosis and treatment of both psychiatric and substance use disorders, which already lack effective treatment options. Along with the observed phenotypic comorbidity between internalizing disorders and AUD, there is substantial evidence of shared genetic factors contributing to comorbidity. Work by Walters et al. found significant positive genetic correlations between alcohol dependence and major depression, depressive symptoms, and neuroticism ($r_g = 0.4 - 0.6$)⁸. However, there is also evidence that the relationship with internalizing disorders differs depending on the specific alcohol phenotype considered^{9,10}, while AUD and problematic alcohol use (PAU) metrics are positively genetically correlated with internalizing, alcohol consumption metrics are negatively correlated^{9,11}.

Further complicating this relationship, there is evidence of underlying heterogeneity in internalizing disorders, with multiple separable genetic factors that do not strictly adhere to clinical diagnostic boundaries. Nitschke et al.¹² used phenotypic factor analysis to expand Watson & Clark's "tripartite model"¹³ of anxiety and depression to include four factors: anxious arousal (somatic anxiety), anxious apprehension (cognitive anxiety), depression, and low

positive affect. Recent work by Thorp et al.¹⁴ identified a three genetic factor model of anxiety and depression, with neuroticism traits loading onto either the anxiety factor or the depression factor. These studies demonstrate the multiple, distinguishable phenotypic and genetic factors underlying internalizing disorders, but there has yet to be any analysis of the genetic underpinnings of Nitschke's phenotypic factors or their relationships with alcohol phenotypes.

Here, we use genomic structural equation modeling (GSEM)¹⁵ to further investigate the differing genetic relationships between internalizing disorders and different alcohol use phenotypes. We consider how different specific domains of internalizing traits may influence these relationships, as well as whether the genetic relationship with alcohol use phenotypes is specific to internalizing disorders or shared with other correlated psychopathologies, such as externalizing disorders.

Methods

Phenotypes

We used the largest and most-recent publicly available genome wide association study (GWAS) summary statistics for a range of internalizing and alcohol use traits (Suppl. Table 1 and Suppl. Table 2). Internalizing phenotypes included Generalized Anxiety Disorder two item questionnaire (GAD-2) score from Levey et al.¹⁶, a meta-analysis of lifetime anxiety disorder from Purves et al.¹⁷, a meta-analysis of broad depression from Howard et al.¹⁸, and item-level GWAS of the Generalized Anxiety Disorder seven-item questionnaire (GAD-7) from Brasher et al.¹⁹. Alcohol use phenotypes included Alcohol Use Disorder (AUD) from Zhou et al.²⁰, GWAS of Alcohol Use Disorder Identification Test (AUDIT) items and alcohol intake frequency from Colbert et al.¹⁰, and drinks per week (dpw) from Liu et al.²¹. We included an additional

externalizing factor defined by Attention-deficit/hyperactivity disorder (ADHD)²², antisocial behavior²³, and number of sexual partners²⁴.

In addition, we performed new GWAS of Patient Health Questionnaire (PHQ-9) depression items and the 12-item EPQ-R neuroticism scale in the UK Biobank²⁵ (Suppl. Table 2). We treated PHQ-9 items as dichotomous, with an endorsement of experiencing a symptom ‘Several days’ or more over the last two weeks as a case, following Thorp et al.¹⁴. Thorp et al. demonstrate that treating symptom-level phenotypes as continuous has been shown to downwardly bias estimates of h^2_{SNP} . Additionally, they showed that for PHQ-9 depression items, genetic correlations between the continuous and dichotomous phenotypes were all >0.95 . Neuroticism questionnaire items are dichotomous, with endorsements (“Yes”) for an item considered cases for that item. GWAS were performed using BOLT-LMM²⁶, with MAF and LD-pruned array SNPs (using PLINK2²⁷) to account for relatedness. Covariates included sex, age, age², education, Townsend deprivation index, assessment center, genotyping batch, and the scores of the first ten genomic principal component (PC) axes. We used the UK Biobank full release of Haplotype Reference Consortium-imputed genotypes²⁸ for associations, requiring MAF ≥ 0.0001 , genotype missingness < 0.05 , Hardy-Weinberg test p-value $> 1e-6$, and imputation INFO score ≥ 0.9 . Summary statistics for new GWAS will be publically available in the GWAS Catalog²⁹.

In order to minimize the effects of genetic stratification, all GWAS used in the primary analysis were from individuals of European ancestry, while secondary analyses included individuals of Finnish and East Asian ancestry.

Genetic Correlations

Genome-wide genetic correlations between all pairs of traits were estimated using Linkage Disequilibrium Score Regression (LDSC)³⁰. For genetic correlations see Suppl. Figure 1.

Model Testing

To quantify the genetic relationships between our suite of internalizing, externalizing, and alcohol use phenotypes, we used genomic structural equation modeling (GSEM)¹⁵. GSEM uses GWAS summary statistics to analyze the shared genetic architecture of complex traits. This is done by first calculating the genetic covariances between all pairs of traits implied by the GWAS summary statistics using LDSC. Then parameters of the user-specified model are calculated based on minimizing the discrepancy between the model genetic covariance structure and the empirical genetic covariances.

We used GSEM confirmatory factor analysis to test a hypothesized five factor “base model” (Figure 1), in which the three, correlated alcohol use factors were regressed on the correlated internalizing and externalizing disorder factors. We included three separate alcohol use factors following Colbert et al.¹⁰ due to their demonstrated differing relationships with psychopathologies. The internalizing factor was defined by the GAD-2, lifetime anxiety, and depression GWASs. Problematic alcohol use (PAU) was defined by AUD, and AUDIT items 4, 5, 7, 8, and 10 (AUDIT-P items). Alcohol consumption quantity was defined by AUDIT items 2 and 3 and number of drinks per week. Alcohol consumption frequency was defined by AUDIT 1 and alcohol intake frequency, along with drinks per week, which had loadings on both consumption quantity and frequency. AUDIT items 6 and 9 were not included in this analysis

due to low h^2_{SNP} following Colbert et al.¹⁰ and similar to Mallard et al.³¹. We allowed correlations between all three alcohol factors, as well as between internalizing and externalizing.

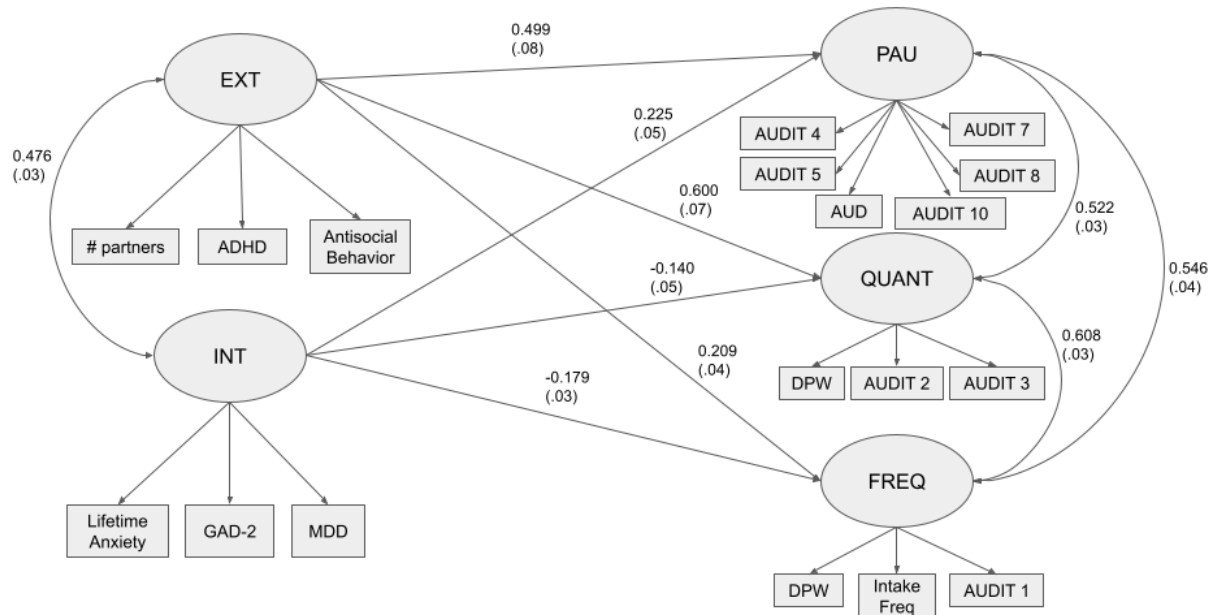


Figure 1. Genomic SEM five factor “base model”. Single headed arrows represent regressions, while double headed arrows represent correlations. Internalizing (INT) and externalizing (EXT) were allowed to be correlated, as were all three alcohol factors: problematic alcohol use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are fully standardized estimates with standard errors listed in parentheses. Solid arrows indicate the path coefficient was nominally significant ($p < 0.01$).

We also tested two exploratory models: a four factor model that excluded externalizing phenotypes entirely, as well as a five factor model which did not include externalizing, but did split the internalizing factor into an anxiety factor (GAD-2 and Lifetime anxiety) and a depression factor (MDD). Although fit was slightly better, likely due to less parameters in the model, the models without externalizing were both substantially less interpretable, and anxiety and depression were ultimately combined into a single internalizing factor since the depression factor was defined by only one GWAS.

In order to determine whether any specific domains of internalizing explain the differing relationships between internalizing and PAU versus consumption factors, we ran a series of models that included specific domains of internalizing as mediating factors (see Figure 2 for example). The 28 individual questionnaire items (GAD-7, PHQ-9, neuroticism) were split into four “domains”: worry, anxious arousal, general negative affect, and low positive affect (Figure 3), based on the tripartite model of anxiety and depression¹³ and the four factor model proposed by Nitschke et al.¹², which added an “anxious apprehension” factor similar to the “worry” domain used here. Some items, such as sleep disturbance from the PHQ-9, were included in multiple domains (low positive affect and anxious arousal) because sleeping too little may indicate more anxious arousal, while sleeping too much may indicate low positive affect. To assess the genetic relationships among these, we ran a correlated four-factor model of the domains themselves (Figure 3, Suppl. Table 3). We tested our hypothesis that the relationship between internalizing disorder and alcohol use traits are mediated by specific internalizing domains by including each domain separately as an additional, mediating factor in the model (e.g., Figure 2). Indirect effects of psychiatric factors on alcohol factors through the mediator were calculated by multiplying the effect of the psychiatric factor on the mediator and the effect of the mediator on the alcohol factor.

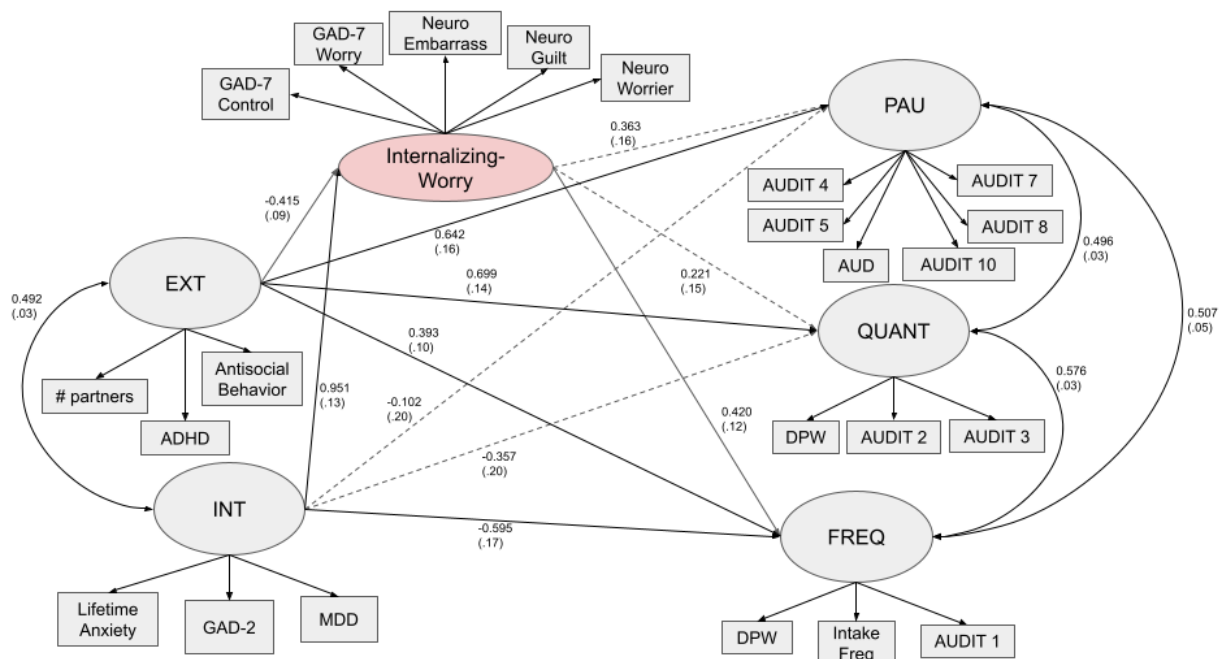


Figure 2. Genomic SEM six factor model with five core factors (INT, EXT, PAU, QUANT, FREQ) and a single specific “worry” factor mediating the relationships between the psychiatric and alcohol use factors. Single headed arrows represent regressions, while double headed arrows represent correlations. Internalizing (INT) and externalizing (EXT) were allowed to be correlated, as were all three alcohol factors: problematic alcohol use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are fully standardized estimates with standard errors listed in parentheses. Solid arrows indicate the path coefficient was nominally significant ($p < 0.01$), while dotted arrows indicate the path did not reach significance.

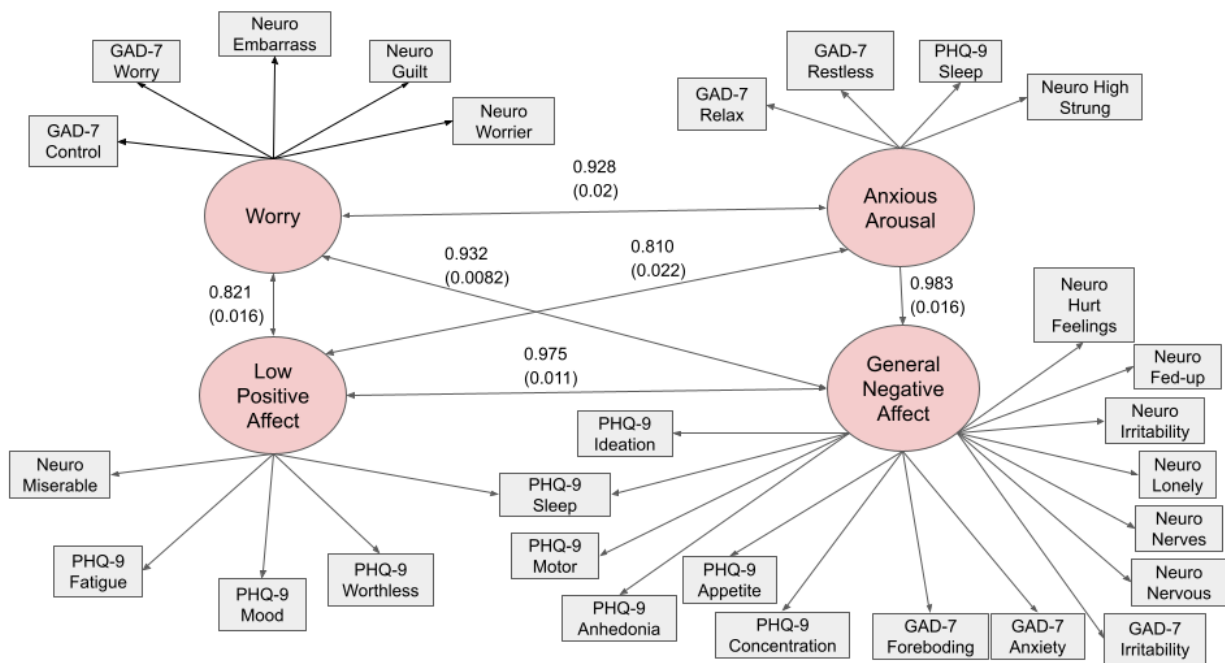


Figure 3. Genomic SEM four correlated factor model relating the four specific domains of internalizing (worry, anxious arousal, low positive affect, and general negative affect). Indicators are item-level GAD-7 anxiety, PHQ-9 depression, and EPQ-R neuroticism questions. Double headed arrows represent correlations between factors. The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are fully standardized estimates with standard errors listed in parentheses. Solid arrows indicate the path coefficient was nominally significant ($p < 0.01$).

Diverse Ancestry Replication

Since the primary GSEM analyses were limited to individuals of European ancestry, we used additional samples to investigate whether patterns of relationships between internalizing, externalizing, and alcohol use differ across diverse ancestry groups. We used summary statistics from studies of individuals of Finnish and East Asian ancestry (Suppl. Table 4), although comparable traits with sufficient sample sizes were not available to fully replicate our analyses in both ancestry groups. We used summary statistics from FinnGen³² to test a simplified version of our base model in Finnish ancestry individuals, relating an internalizing factor to a problematic alcohol use factor. For East Asian ancestry analyses, we used summary statistics from

GSCAN2³³ and the PCG³⁴ to consider cross-trait, within-ancestry genetic correlations for pairs of traits using LDSC, which uses GWAS summary statistics and LD information from ancestry-matched references to estimate genetic correlation based on the correlation of SNP effect sizes. For both ancestry groups, ancestry-specific references of HapMap3 SNPs in 1000 Genomes data³⁵ (Finnish = FIN, East Asian = EAS) were used.

We considered including African American ancestry samples as well, but ultimately did not due to admixture that leads to biased genetic correlation estimates calculated using LDSC^{30,36}.

Results

Base-model

The five factor model (Figure 1, Suppl. Table 5) relating internalizing, externalizing, and three alcohol use factors fit the data well ($\chi^2(108) = 558.023$, AIC = 648.024, CFI = 0.964, SRMR = 0.102). All indicators had strong, highly significant loadings on their respective latent factors. The three alcohol factors were all strongly correlated ($r_g = 0.50-0.60$) and internalizing and externalizing were also correlated ($r_g = 0.47$), as expected. Externalizing was significantly positively predictive of all three alcohol factors ($r_g = 0.20-0.60$), with the strongest relationship with alcohol consumption quantity. Interestingly, with externalizing included in the model, the genetic effects of internalizing on the alcohol factors were low. The genetic effect of internalizing on PAU was moderately positive (beta = 0.22), but the effects on both alcohol consumption quantity and frequency were significantly negative (beta = -0.14 and -0.18 respectively). This suggests the strong observed phenotypic and genetic relationships between

internalizing and alcohol use may be more due to shared genetic components with other psychopathologies like externalizing traits rather than genetic factors unique to internalizing.

We performed some additional exploratory model testing, including a four factor model excluding externalizing (Suppl. Table 6, Suppl. Figure 2) and a five factor model excluding externalizing and splitting internalizing into separate anxiety and depression factors (Suppl. Table 7, Suppl. Figure 3). Both models also fit the data well ($\chi^2(70) = 313.172$, AIC = 383.172, CFI = 0.979, SRMR = 0.0872 and $\chi^2(67) = 305.473$, AIC = 381.473, CFI = 0.979, SRMR = 0.0871, respectively), but ultimately we combined the anxiety and depression factors to avoid having a factor defined by only one indicator, and we included externalizing to account for the effect of shared underlying genetic components among psychopathologies. When an externalizing factor was not included in the model, the effects of internalizing on the three alcohol factors were higher, and positive or near zero, rather than negative in the case of both consumption factors (PAU = 0.47, QUANT = 0.15, FREQ = -0.076).

Mediation models

We used four additional factors (worry, anxious arousal, general negative affect, and low positive affect) in a series of models as potentially mediating the relationship between psychiatric factors and alcohol use factors (e.g. Figure 2). For all four mediating factors (Figure 4), the relationship between internalizing and the mediator was high and nominally significant (betas = 0.84-0.99, $p < 0.01$), as expected since the mediators were defined to pull out specific domains of internalizing. The externalizing factor was either not or negatively predictive of all four mediators. Across all mediation models, externalizing remained significantly positively

predictive of all three alcohol factors, while internalizing was no longer significantly positively predictive of any alcohol factor in any of the models.

| | Base | Worry | GNA | AA | LPA |
|--------------|----------|----------|----------|---------|----------|
| INT -> Med | NA | 0.951 ° | 0.996 ° | 0.989 ° | 0.835 ° |
| EXT -> Med | NA | -0.415 ° | -0.243 ° | -0.195 | -0.081 |
| Med -> PAU | NA | 0.363 | 0.101 | 0.038 | 0.121 |
| Med -> QUANT | NA | 0.221 | 0.163 | 0.155 | 0.059 |
| Med -> FREQ | NA | 0.420 ° | -0.104 | 0.294 | -0.174 |
| INT -> PAU | 0.226 ° | -0.102 | 0.119 | 0.184 | 0.124 |
| INT -> QUANT | -0.140 ° | -0.357 | -0.355 | -0.316 | -0.217 |
| INT -> FREQ | -0.179 ° | -0.595 ° | -0.100 | -0.481 | -0.049 |
| EXT -> PAU | 0.499 ° | 0.642 ° | 0.534 ° | 0.510 ° | 0.513 ° |
| EXT -> QUANT | 0.601 ° | 0.700 ° | 0.684 ° | 0.651 ° | 0.632 ° |
| EXT -> FREQ | 0.209 ° | 0.393 ° | 0.189 ° | 0.272 ° | 0.205 ° |
| ID INT PAU | NA | 0.345 | 0.101 | 0.038 | 0.101 |
| ID INT QUANT | NA | 0.210 | 0.162 | 0.153 | 0.049 |
| ID INT FREQ | NA | 0.400 ° | -0.104 | 0.290 | -0.146 ° |
| ID EXT PAU | NA | -0.150 | -0.025 | -0.007 | -0.010 |
| ID EXT QUANT | NA | -0.092 | -0.040 | -0.030 | -0.005 |
| ID EXT FREQ | NA | -0.174 | 0.025 | -0.030 | 0.014 |
| INT ~ EXT | 0.476 ° | 0.492 ° | 0.525 ° | 0.5 ° | 0.502 ° |

Figure 4. Parameter summaries for the five factor base model and each of the four mediation models. Columns indicate which model values are listed, and rows indicate which model parameter is being shown by describing the corresponding path that would be shown in a path diagram. For example, the “INT -> QUANT” row shows the path coefficients for alcohol consumption quantity regressed on internalizing directly. INT = internalizing; EXT = externalizing; PAU = problematic alcohol use; QUANT = alcohol consumption quantity; FREQ = alcohol consumption frequency; Med = mediator for that particular model (worry, general negative affect, anxious arousal, or low positive affect). The last row (INT ~ EXT) shows the correlation between the internalizing and externalizing factors, which remains consistent across models.

When mediator “worry” was included, the direct effect of internalizing on alcohol consumption frequency was moderately negative ($r_g = -0.59$, Figure 4), but the indirect effect of internalizing on frequency mediated by worry was moderately positive and significant ($r_g =$

0.400, $p < 0.01$). The genetic effect of internalizing on alcohol consumption quantity and frequency was negative in all other models as well, but not nominally significant ($p > 0.01$). Indirect effects of internalizing on alcohol use factors through the other mediators were also non-significant, with the exception of a significant negative indirect effect of internalizing on alcohol consumption frequency when mediated by low positive affect (indirect effect = -0.15, $p < 0.01$). Notably, the shared genetic correlation between internalizing and externalizing remained relatively consistent across all models ($r_g = 0.48-0.53$). For full mediation model output see Suppl. Tables 8 - 11.

Diverse Ancestry Models

Additional GWAS summary statistics were used to investigate the pattern of relationships between internalizing and alcohol use in individuals of Finnish and East Asian ancestry. In the Finnish population, we tested a reduced version of our base model with two factors: internalizing and problematic alcohol use (Suppl. Figure 4, Suppl. Table 12). None of the available externalizing traits in FinnGen have a sample size sufficient for use with GSEM or LDSC. For each of the two included factors, all indicators had strong, significant loadings. There was a moderate, positive relationship between the internalizing factor and the problematic alcohol use factor (beta = 0.84). This positive relationship is expected, as it matches the relationship observed in European ancestry models between internalizing and alcohol use when genetic variation shared with externalizing is not accounted for, as well as the consistently positive relationship between internalizing and *problematic* alcohol use specifically.

For both ancestry groups we used LDSC to calculate genetic correlations across traits, within each ancestry group (Figure 5, Suppl. Table 13). Since so few summary statistics of

sufficient size were available, particularly for individuals of East Asian ancestry, these results should be interpreted with caution. The correlations between well-powered traits in Finnish individuals were in the expected direction. The two alcohol use traits (AUD and alcohol dependence) were highly correlated ($r_g = 1.03$, $SE = 0.03$), as were all three anxiety traits ($r_g = 0.97 - 1.15$), and depression was most highly correlated with GAD ($r_g = 0.95$, $SE = 0.32$). All genetic correlations were moderate to high and positive, which matches the moderately positive relationships between internalizing and specifically *problematic* alcohol use in individuals of European ancestry across all other models.

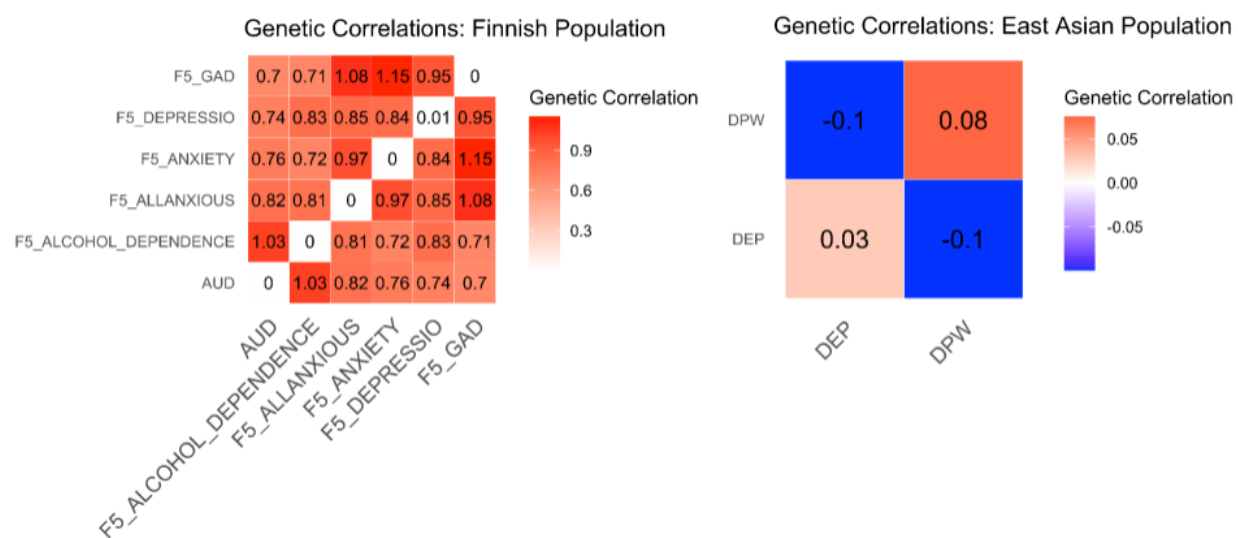


Figure 5. Genetic correlations across traits for two diverse ancestry groups: Finnish (left) and East Asian (right). Off-diagonal elements are genetic correlations and on the diagonal are observed-scale heritabilities, all estimated using LD Score Regression (LDSC). In the Finnish population, note that estimated heritabilities appear as zero due to rounding and were not truly estimated as zero. For a list of GWAS that were included, see Suppl. Table 4.

Only two traits were included for East Asian ancestry analysis: drinks per week and depression. Interestingly, they were slightly negatively, although not significantly correlated ($r_g =$

-0.10, SE = 0.28, $p = 0.72$), which is somewhat similar to the negative relationship between internalizing and alcohol intake frequency seen in European ancestry individuals.

Discussion

We used genomic structural equation modeling to test a five factor base model relating internalizing and externalizing disorder factors to three alcohol use factors (problematic use, consumption quantity, and consumption frequency). The internalizing factor was positively related to problematic alcohol use, but negatively related to both alcohol consumption factors, consistent with previous findings^{10,11}. Externalizing was significantly positively related to all three alcohol use factors, also consistent with previous findings^{37,38}. However, when the externalizing factor was not included in the model, the effects of internalizing on all three alcohol factors increased, and were positive or near-zero, rather than negative, for both alcohol consumption factors. This suggests that the commonly observed phenotypic comorbidity between internalizing traits and alcohol use may be due to underlying genetic variation that is shared among psychiatric disorders, rather than genetic variation unique to internalizing.

Four specific internalizing domains, grouped based on previously proposed phenotypic factors^{12,13}, were each strongly predicted by the internalizing factor, but largely did not mediate the relationships between internalizing and the three alcohol factors, particularly PAU. This further suggests the importance of shared psychiatric genetic variation, since no domain specific to internalizing fully explained the observed relationships between internalizing and alcohol use traits. However, the indirect effect of internalizing on alcohol consumption frequency *via* the worry factor was significantly positive, and as strong as the direct effect of externalizing on alcohol consumption frequency. Inclusion of the worry mediator led the direct effect of

internalizing on frequency to be even more negative, demonstrating that while genetic influences on “worry” internalizing symptoms, like feelings of embarrassment or guilt and inability to stop worrying, have a positive relationship with alcohol consumption frequency, it is possible other internalizing symptoms may have a more negative relationship with frequency than seen when such subtle variation in internalizing disorders is not accounted for.

Similarly, including a low positive affect factor mediating the relationship between internalizing and the alcohol use factors led to a significantly negative indirect effect of internalizing on alcohol consumption frequency, and a direct effect near zero, consistent with the hypothesis that genetic effects on low positive affect account for at least some of the negative genetic relationship between internalizing and alcohol use frequency. Low positive affect internalizing symptoms, like fatigue and feeling generally miserable, may decrease frequency of alcohol consumption, while some internalizing traits like worry may increase consumption frequency. The relationship between worry and alcohol use has been found in previous phenotypic studies^{39,40} but has not been considered at the genetic level or specifically for alcohol consumption frequency.

The mediating effects of the worry and low positive affect factors suggest that even within internalizing, there exists a more complex structure of pleiotropy, in which the genetic variation underlying some specific internalizing traits decreases alcohol consumption, while that underlying others increases it. This is particularly important because the contrasting effects of different internalizing domains can mask each other when internalizing is considered as a whole. For example, recent work by Colbert et al.¹⁰ found slightly negative, but near-zero genetic correlation between internalizing and an alcohol consumption frequency factor when evaluated at a genome-wide level, but variable genetic correlation directions for individual genomic

regions. This could be due to the effects of shared psychopathology that was not accounted for in the model, as well as the heterogeneity of effects within the internalizing disorder factor itself.

While we did see some mediating effects of worry and low positive affect domains, the potential effects of domains themselves may be obscured by heterogeneous effects of traits used to define them. For example, general negative affect was broadly defined, including symptoms from changes in appetite (either loss of appetite or increased appetite) to easily hurt feelings. Some of these symptoms may have important relationships with alcohol use traits such as problematic use, but when combined could not be detected. Similarly, combining anxiety and depression into one internalizing factor may have masked differences. As additional GWAS summary statistics for internalizing disorders become available, anxiety and depression could be considered in models like these separately to gain additional insight into the nuanced relationships between complex traits.

This complex structure of contrasting relationships may also relate to hypothesized mechanisms behind the comorbidity of internalizing disorders and alcohol use disorders. As Stewart and Conrod⁴¹ discuss, comorbid anxiety and substance use disorders may be established and maintained in three ways: 1) through self medication of anxiety symptoms using substances, 2) through the anxiety-inducing effects of substance withdrawal, or 3) not directly causally, but rather due to common basis underlying both anxiety and substance use (for example a shared genetic cause). These hypotheses reflect different types of pleiotropy, or the influence of genetic variation on two or more traits, the first two reflecting vertical pleiotropy and the third horizontal pleiotropy. Here, our analyses cannot determine the causal mechanisms underlying phenotypic comorbidity, but they do support the hypothesis that common genetic variation underlying the comorbidity of internalizing disorders and PAU is shared with other psychopathologies, notably

externalizing disorders, rather than being specific to alcohol use and internalizing disorders, suggesting horizontal pleiotropic effects on at least some aspects of internalizing and alcohol use traits. More generally, these complex relationships between alcohol use and internalizing disorders demonstrate how pleiotropy differs depending on the specific phenotype being considered.

Unfortunately, we were unable to fully replicate our models in additional ancestry groups due to the lack of available GWAS summary statistics with sufficient sample sizes. Some genetic correlations in Finnish and East Asian populations did correspond with what was observed in European ancestry models, such as the positive relationship between problematic alcohol use and internalizing when not accounting for externalizing or other shared psychopathology in Finnish ancestry individuals, and the slight negative correlation between the alcohol intake frequency metric drinks per week and depression in East Asian ancestry individuals. These results should be considered with caution due to low case prevalence in some GWAS, which highlights the critical need for large, publicly available summary statistics from diverse ancestry groups to improve equity in genomic science. We hope that despite the low sample sizes of some available data, inclusion of these non-European ancestry samples provides a starting point⁴² to incorporate underrepresented populations into analyses of the comorbidity between internalizing disorders and alcohol use.

Both internalizing and alcohol use disorders have substantial impacts on health worldwide, which are further amplified by their commonly observed comorbidity. In addition to phenotypic comorbidity, internalizing disorders and alcohol use disorders are genetically correlated, although the patterns of genetic correlation depend on the specific psychiatric and substance use traits that are considered. Our results demonstrate the importance of shared

psychopathology (e.g., across both internalizing and externalizing) to this comorbidity, which may be especially important for problematic alcohol use. Notably, this shared genetic influence of psychopathology can be missed entirely when not accounted for in models, leading to misinterpreted relationships between complex traits. By exploring the effects of specific domains of internalizing symptoms, we began to uncover a system of contrasting effects that was previously masked, making some relationships mistakenly appear insignificant. Future work must consider both the broad importance of shared psychopathology, as well as the fine-scale heterogeneity within related disorders in order to work towards a more comprehensive understanding of complex traits and their implications for health and well-being around the world.

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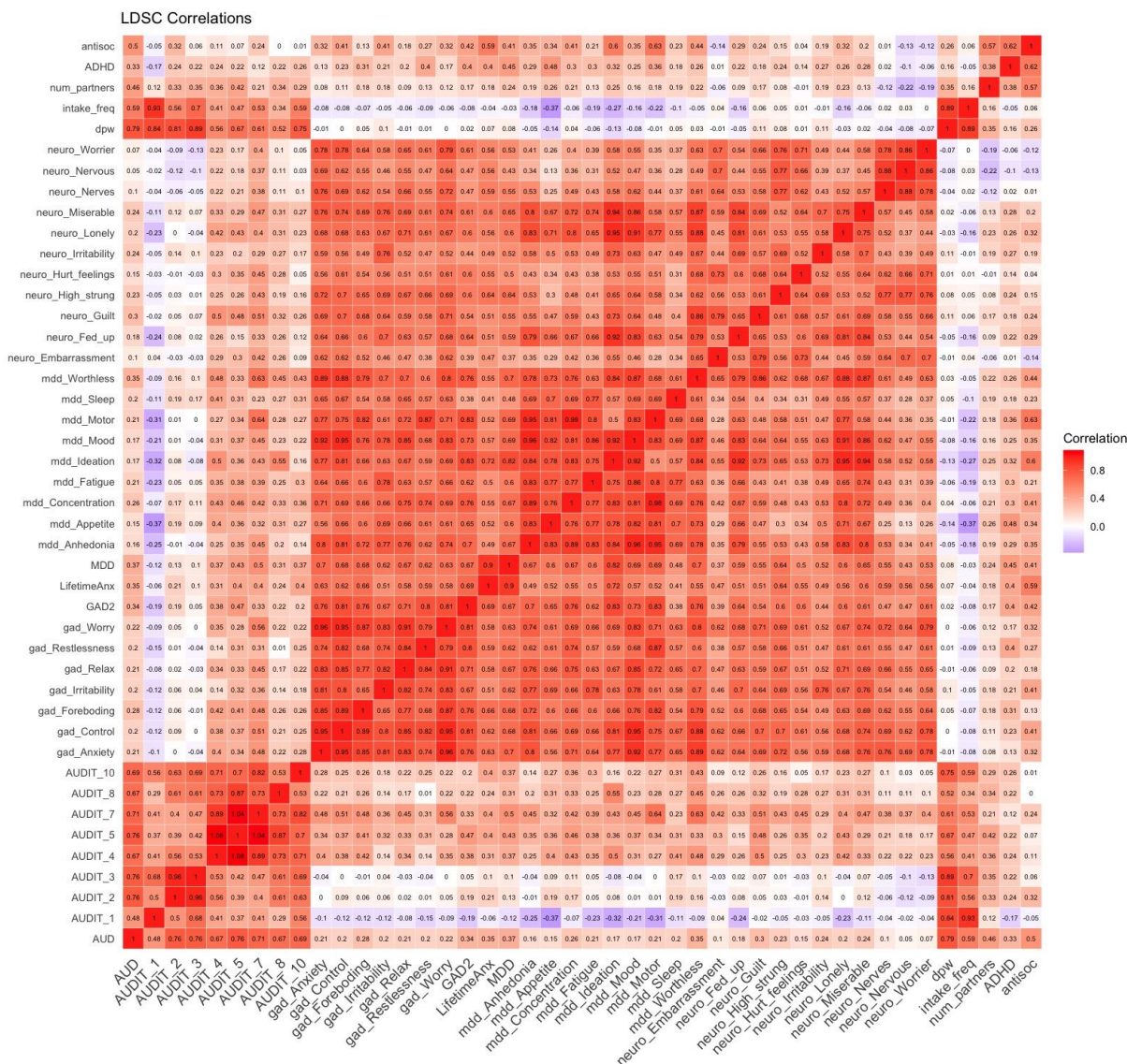
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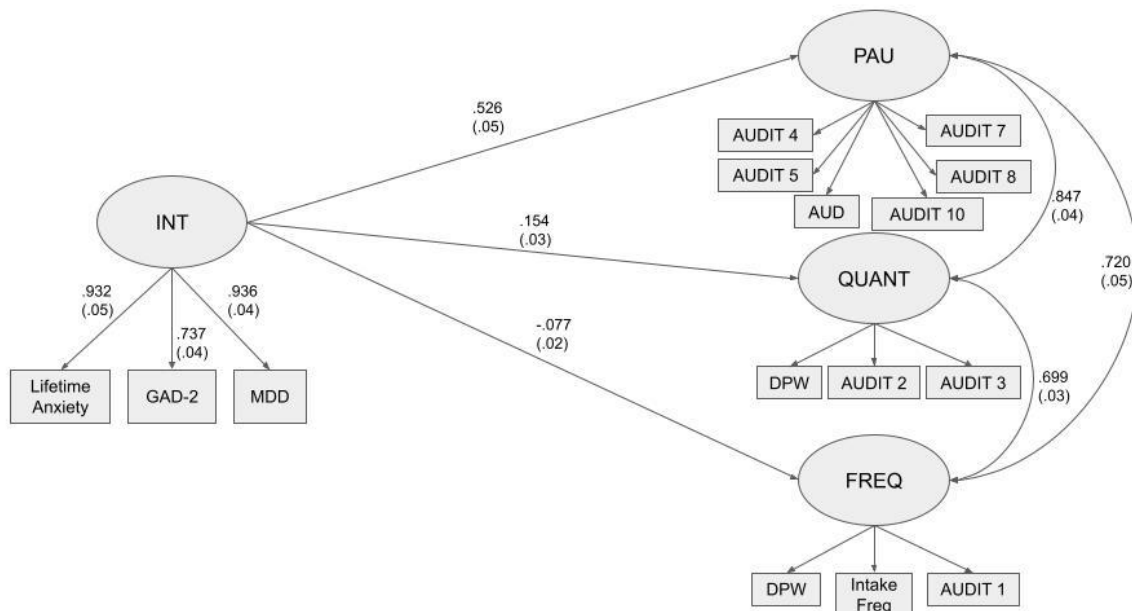
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Appendix

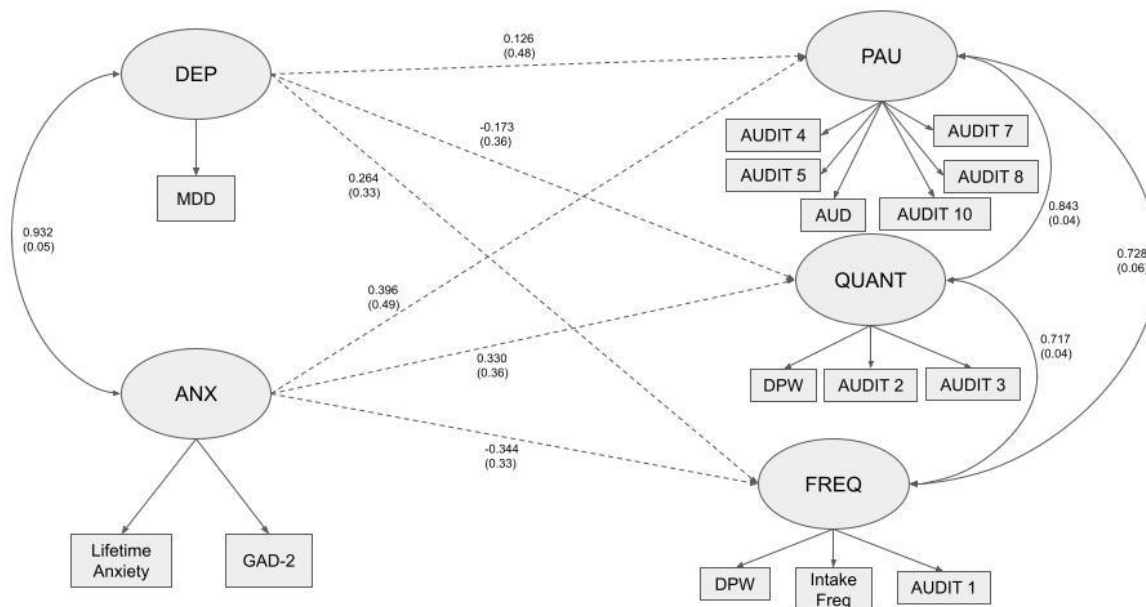
Figures



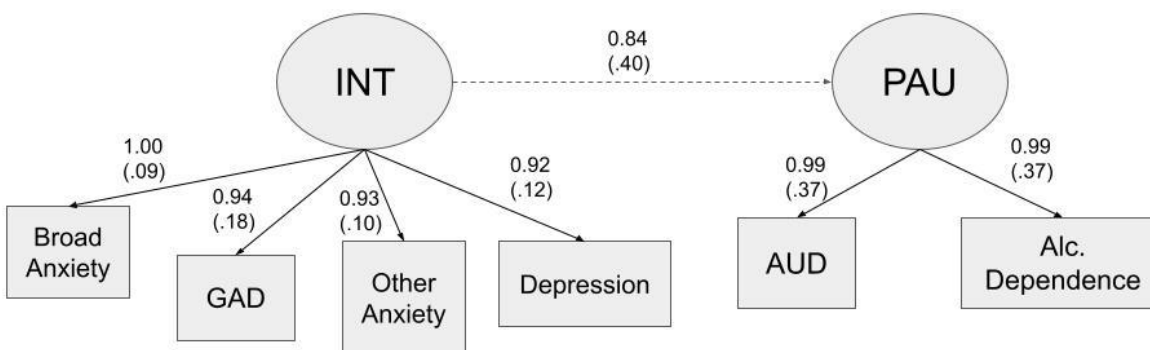
Supplemental Figure 1. Genome-wide genetic correlations for all pairs of traits, including internalizing, externalizing, and alcohol use traits, as well as item-level traits from psychiatric questionnaires (GAD-7 anxiety, PHQ-9 depression, EPQ-R neuroticism). Correlations were calculated using LDSC in individuals of European ancestry.



Supplemental Figure 2. Genomic SEM exploratory four factor model relating internalizing (INT) to three alcohol use factors: problematic alcohol use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Single headed arrows represent regressions, while double headed arrows represent correlations. All three alcohol factors were allowed to correlate. The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are standardized with respect to the genetic variance of the phenotype, with standard errors listed in parentheses (not fully standardized). Solid arrows indicate the path coefficient was nominally significant ($p < 0.01$).



Supplemental Figure 3. Genomic SEM exploratory five factor model relating separate depression (DEP) and anxiety (ANX) factors to three alcohol use factors: problematic alcohol use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Single headed arrows represent regressions, while double headed arrows represent correlations. Depression and anxiety were allowed to correlate, as were all three alcohol factors. The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are standardized with respect to the genetic variance of the phenotype, with standard errors listed in parentheses (not fully standardized). Solid arrows indicate the path coefficient was nominally significant ($p < 0.01$), while dotted arrows indicate the coefficient did not reach significance.



Supplemental Figure 4. Genomic SEM two factor reduced base model tested using GWAS summary statistics from individuals of Finnish ancestry from the FinnGen Biobank. The dotted arrow represents problematic alcohol use (PAU) was regressed on internalizing (INT), but did not reach nominal significance ($p < 0.01$). The model used unit variance identification, which constrains the variance of the latent factors to 1. All values are fully standardized estimates with standard errors listed in parentheses. GAD = generalized anxiety disorder; AUD = alcohol use disorder.

Tables

Supplemental Table 1. Description of core genome-wide association studies. N = total sample size, case prevalence reported for case-control studies. PAU = Problematic Alcohol Use; QUANT = Alcohol Consumption Quantity; FREQ = Alcohol Consumption Frequency; INT = Internalizing; EXT = Externalizing

| Phenotype | Description | N | Case Prevalence | Factor | Source |
|----------------------|---|--------|-----------------|------------|-----------------------|
| Alcohol Use | | | | | |
| AUD | Alcohol Use Disorder | 313959 | 0.183 | PAU | Zhou et al. (2020) |
| AUDIT item 1 | How often drink | 148222 | NA | FREQ | Colbert et al. (2021) |
| AUDIT item 2 | How many drinks in a day | 141749 | NA | QUANT | Colbert et al. (2021) |
| AUDIT item 3 | frequency of six or more drinks in a day | 142034 | NA | QUANT | Colbert et al. (2021) |
| AUDIT item 4 | Unable to stop drinking | 84621 | NA | PAU | Colbert et al. (2021) |
| AUDIT item 5 | Inability to meet expectations due to drinking | 84737 | NA | PAU | Colbert et al. (2021) |
| AUDIT item 7 | Feelings of guilt after drinking | 84675 | NA | PAU | Colbert et al. (2021) |
| AUDIT item 8 | Unable to remember due to drinking | 84708 | NA | PAU | Colbert et al. (2021) |
| AUDIT item 10 | Concern from others about drinking | 148185 | NA | PAU | Colbert et al. (2021) |
| Intake freq | Alcohol intake frequency | 462016 | NA | FREQ | Colbert et al. (2021) |
| DPW | Drinks per week | 537349 | NA | QUANT/FREQ | Liu et al. (2019) |
| Internalizing | | | | | |
| Lifetime Anx | self-reported physician diagnosis of anxiety disorder | 83565 | 0.305 | INT | Purves et al. (2019) |
| GAD-2 | Generalized Anxiety Disorder 2-item questionnaire score | 175163 | NA | INT | Levey et al. (2020) |
| MDD | Broad depression meta-analysis | 322580 | 0.353 | INT | Howard et al. (2019) |

| Externalizing | | | | | |
|------------------------|---|--------|-------|-----|---------------------------|
| ADHD | Attention-deficit/ hyperactivity disorder diagnosis | 35107 | 0.108 | EXT | Demontis et al. (2019) |
| Antisocial Behavior | Meta-analysis of antisocial behavior phenotypes | 16400 | NA | EXT | Tielbeek et al. (2017) |
| # partners | Self-reported number of lifetime sexual partners | 370711 | NA | EXT | Linner et al. (2019) |

Supplemental Table 2. Description of item-level GWAS phenotypes. Summary statistics from Brasher et al. 2022. Includes most questions from Generalized Anxiety Disorder seven-item questionnaire, PHQ-9 depression questionnaire, and 12-item EPQ-R neuroticism questionnaire. GNA = General Negative Affect; W = Worry; AA = Anxious Arousal; LPA = Low Positive Affect

| Questionnaire | UKB_ID | Question | N_Total | Case_prevalence | Factor |
|---------------|--------|---|---------|-----------------|--------|
| GAD-7 | 20505 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Becoming easily annoyed or irritable" | 138765 | 0.28 | GNA |
| GAD-7 | 20506 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Feeling nervous, anxious or on edge" | 138905 | 0.29 | GNA |
| GAD-7 | 20509 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Not being able to stop or control worrying" | 138880 | 0.24 | W |
| GAD-7 | 20512 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Feeling afraid as if something awful might happen" | 138760 | 0.17 | GNA |
| GAD-7 | 20515 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Trouble relaxing" | 139013 | 0.29 | AA |
| GAD-7 | 20516 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Being so restless that it is hard to sit still" | 139109 | 0.12 | AA |

| | | | | | |
|-------|-------|---|--------|-------|-----|
| GAD-7 | 20520 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Worrying too much about different things" | 138870 | 0.32 | W |
| | | | | | |
| PHQ-9 | 20510 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Feeling down, depressed, or hopeless" | 138965 | 0.23 | LPA |
| PHQ-9 | 20511 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Poor appetite or overeating" | 139259 | 0.19 | GNA |
| PHQ-9 | 20508 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Trouble concentrating on things, such as reading the newspaper or watching television" | 139245 | 0.18 | GNA |
| PHQ-9 | 20519 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Feeling tired or having little energy" | 139167 | 0.5 | LPA |
| PHQ-9 | 20513 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Thoughts that you would be better off dead or of hurting yourself in some way" | 138392 | 0.043 | GNA |

| | | | | | |
|-------------|-------|--|--------|-------|--------------------|
| PHQ-9 | 20518 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Moving or speaking so slowly that other people could have noticed? Or the opposite - being so fidgety or restless that you have been moving around a lot more than usual" | 139202 | 0.058 | GNA |
| PHQ-9 | 20517 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Trouble falling or staying asleep, or sleeping too much" | 139155 | 0.49 | AA/ LPA/ GNA |
| PHQ-9 | 20507 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Feeling bad about yourself or that you are a failure or have let yourself or your family down" | 138784 | 0.2 | LPA |
| PHQ-9 | 20514 | "Over the last 2 weeks, how often have you been bothered by any of the following problems? Little interest or pleasure in doing things" | 139088 | 0.19 | GNA |
| | | | | | |
| Neuroticism | 2000 | "Do you worry too long after an embarrassing experience?" | 413198 | 0.48 | W |
| Neuroticism | 1960 | "Do you often feel 'fed-up'?" | 421783 | 0.41 | GNA |
| Neuroticism | 2030 | "Are you often troubled by feelings of guilt?" | 419548 | 0.29 | W |
| Neuroticism | 1990 | "Would you call yourself tense or 'highly strung'?" | 417467 | 0.18 | AA |
| Neuroticism | 1950 | "Are your feelings easily hurt?" | 418255 | 0.55 | GNA |
| Neuroticism | 1940 | "Are you an irritable person?" | 411674 | 0.28 | GNA |
| Neuroticism | 2020 | "Do you often feel lonely?" | 423810 | 0.19 | GNA |

| | | | | | |
|-------------|------|--|--------|------|-----|
| Neuroticism | 1930 | "Do you ever feel 'just miserable' for no reason?" | 423410 | 0.43 | LPA |
| Neuroticism | 2010 | "Do you suffer from 'nerves'?" | 415041 | 0.21 | GNA |
| Neuroticism | 1970 | "Would you call yourself a nervous person?" | 419463 | 0.24 | GNA |
| Neuroticism | 1980 | "Are you a worrier?" | 419468 | 0.57 | W |

Supplemental Table 3. Full model output for four correlated factor model relating the four specific domains of internalizing: worry (W), anxious arousal (AA), low positive affect (LPA), and general negative affect (GNA). Indicators are the individual items of the GAD-7, PHQ-9, and EPQ-R questionnaires. Model fit: $\chi^2(316) = 7416.549$, AIC = 7540.549, CFI = 0.8651993, SRMR = 0.1088944

| | lhs | op | rhs | Unstand_ Est | Unstand_ SE | STD_Ge notype | STD_Genot ype_SE | STD_All | STD_All SE | p_value |
|----|-----|----|-------------------------|--------------------|--------------------|------------------|-------------------|-------------------|-------------------|------------------|
| 59 | W | =~ | gad Control | 0.281206 2376 | 0.010055 6281 | 0.954108 731 | 0.03411788 846 | 0.954109 1674 | 0.034117 88846 | 4.32E-172 |
| 60 | W | =~ | gad Worry | 0.270191 0241 | 0.009796 083692 | 0.958876 3089 | 0.03476515 36 | 0.958876 321 | 0.034765 1536 | 1.85E-167 |
| 63 | W | =~ | neuro_Embarr assment | 0.232130 296 | 0.007662 156657 | 0.731567 191 | 0.02414757 898 | 0.731566 9385 | 0.024147 57898 | 1.31E-201 |
| 64 | W | =~ | neuro_Guilt | 0.249035 9727 | 0.007358 364652 | 0.841780 9608 | 0.02487242 723 | 0.841781 0415 | 0.024872 42723 | 4.46E-251 |
| 65 | W | =~ | neuro Worrier | 0.280706 1135 | 0.007162 433159 | 0.809645 9242 | 0.02065874 612 | 0.809646 1343 | 0.020658 74612 | < 5e-300 |
| 2 | AA | =~ | gad Relax | 0.248345 111 | 0.009790 965477 | 0.867000 7658 | 0.03418148 312 | 0.867000 1625 | 0.034181 48312 | 6.18E-142 |
| 3 | AA | =~ | gad_Restlessn ess | 0.224349 0129 | 0.012404 22676 | 0.783636 716 | 0.04332727 645 | 0.783635 4762 | 0.043327 27645 | 4.07E-73 |
| 6 | AA | =~ | mdd_Sleep | -0.066010 30452 | 0.051465 70726 | -0.24129 9796 | 0.18811798 2 | -0.24129 97324 | 0.188117 982 | 0.1996296 049 |
| 7 | AA | =~ | neuro_High_st rung | 0.274651 1779 | 0.009632 363446 | 0.809817 9976 | 0.02840143 214 | 0.809818 0135 | 0.028401 43214 | 8.00E-179 |
| 17 | GNA | =~ | gad Irritability | 0.235899 5191 | 0.009947 865188 | 0.824920 0953 | 0.03478681 902 | 0.824919 362 | 0.034786 81902 | 2.61E-124 |
| 15 | GNA | =~ | gad_Anxiety | 0.244902 165 | 0.009427 695062 | 0.904734 6878 | 0.03482845 268 | 0.904734 8543 | 0.034828 45268 | 9.04E-149 |
| 16 | GNA | =~ | gad_Forebod ing | 0.251815 4977 | 0.010782 32669 | 0.816202 6175 | 0.03494846 009 | 0.816201 964 | 0.034948 46009 | 1.24E-120 |
| 21 | GNA | =~ | mdd Appetite | 0.187353 5892 | 0.011367 70681 | 0.634990 1214 | 0.03852812 448 | 0.634991 0454 | 0.038528 12448 | 5.01E-61 |
| 22 | GNA | =~ | mdd_Concentr ation | 0.203371 4606 | 0.011102 33276 | 0.756663 4038 | 0.04130730 335 | 0.756664 0521 | 0.041307 30335 | 5.96E-75 |
| 23 | GNA | =~ | mdd Ideation | 0.226876 9852 | 0.015597 19873 | 0.853723 7476 | 0.05869133 692 | 0.853722 7707 | 0.058691 33692 | 6.19E-48 |
| 24 | GNA | =~ | mdd_Motor | 0.186843 5704 | 0.013754 10963 | 0.692321 1251 | 0.05096385 1 | 0.692321 3931 | 0.050963 851 | 4.94E-42 |
| 25 | GNA | =~ | mdd_Sleep | 0.068093 33721 | 0.085540 36282 | 0.248905 0564 | 0.31266417 89 | 0.248904 9909 | 0.312664 1789 | 0.4260102 35 |
| 20 | GNA | =~ | mdd_Anhedon ia | 0.231012 3789 | 0.010477 52964 | 0.790188 2636 | 0.03583886 577 | 0.790186 3648 | 0.035838 86577 | 9.90E-108 |
| 26 | GNA | =~ | neuro Fed up | 0.246596 3724 | 0.006642 710508 | 0.814310 5179 | 0.02193555 555 | 0.814310 4268 | 0.021935 55555 | 1.20E-301 |
| 27 | GNA | =~ | neuro_Hurt_fe elings | 0.219552 3739 | 0.007315 23872 | 0.728912 5069 | 0.02428654 726 | 0.728912 6302 | 0.024286 54726 | 6.64E-198 |
| 28 | GNA | =~ | neuro_Irritabil ity | 0.234637 2417 | 0.007490 578584 | 0.698921 545 | 0.02231241 526 | 0.698921 3724 | 0.022312 41526 | 2.18E-215 |
| 29 | GNA | =~ | neuro Lonely | 0.206772 1334 | 0.007308 781499 | 0.784046 492 | 0.02771371 253 | 0.784046 4671 | 0.027713 71253 | 4.47E-176 |
| 30 | GNA | =~ | neuro_Nerves | 0.218571 1293 | 0.007541 704218 | 0.749669 6166 | 0.02586703 619 | 0.749669 7738 | 0.025867 03619 | 1.12E-184 |

| | | | | | | | | | | |
|----|---------------------|---|---------------------|--------------------|--------------------|-------------------|--------------------|-------------------|--------------------|---------------------|
| 31 | GNA | ≈ | neuro_Nervous | 0.232234 2623 | 0.007671 052277 | 0.661531 6307 | 0.02185139 467 | 0.661531 5246 | 0.021851 39467 | 2.51E-201 |
| 33 | LPA | ≈ | mdd_Fatigue | 0.219478 2457 | 0.010038 3759 | 0.738826 7298 | 0.03379206 771 | 0.738826 9931 | 0.033792 06771 | 5.73E-106 |
| 34 | LPA | ≈ | mdd_Mood | 0.257597 318 | 0.010163 74897 | 0.931462 3734 | 0.03675177 808 | 0.931460 3486 | 0.036751 77808 | 1.03E-141 |
| 35 | LPA | ≈ | mdd_Sleep | 0.176027 4431 | 0.052466 94059 | 0.643439 7394 | 0.19177797 58 | 0.643439 57 | 0.191777 9758 | 0.0007936 029613 |
| 36 | LPA | ≈ | mdd_Worthless | 0.255813 847 | 0.010722 53255 | 0.957003 2892 | 0.04011317 97 | 0.957001 4344 | 0.040113 1797 | 8.45E-126 |
| 37 | LPA | ≈ | neuro_Miserable | 0.275268 44 | 0.007758 668915 | 0.911283 2469 | 0.02568531 651 | 0.911283 2681 | 0.025685 31651 | 1.04E-275 |
| 58 | W | ≈ | AA | 0.928080 5909 | 0.018142 21461 | 0.928084 3333 | 0.01814229 293 | 0.928084 3333 | 0.018142 29293 | < 5e-300 |
| 61 | W | ≈ | GNA | 0.931613 1722 | 0.008242 546525 | 0.931613 6495 | 0.00824254 6418 | 0.931613 6495 | 0.008242 546418 | < 5e-300 |
| 62 | W | ≈ | LPA | 0.820882 5461 | 0.015593 24477 | 0.820884 4416 | 0.01559326 517 | 0.820884 4416 | 0.015593 26517 | < 5e-300 |
| 4 | AA | ≈ | GNA | 0.982529 344 | 0.015539 20041 | 0.982533 1931 | 0.01553929 707 | 0.982533 1931 | 0.015539 29707 | < 5e-300 |
| 5 | AA | ≈ | LPA | 0.809999 756 | 0.022014 717 | 0.810004 9178 | 0.02201476 891 | 0.810004 9178 | 0.022014 76891 | 2.34E-296 |
| 19 | GNA | ≈ | LPA | 0.975455 6918 | 0.010627 12392 | 0.975457 2173 | 0.01062715 623 | 0.975457 2173 | 0.010627 15623 | < 5e-300 |
| 9 | gad_Control | ≈ | gad_Control | 0.007789 896536 | 0.004576 384876 | 0.089675 61465 | 0.05268276 979 | 0.089675 69667 | 0.052682 76979 | 0.0887189 3927 |
| 14 | gad_Worry | ≈ | gad_Worry | 0.006396 070277 | 0.004254 950095 | 0.080556 19907 | 0.05358928 838 | 0.080556 20109 | 0.053589 28838 | 0.1327857 027 |
| 47 | neuro_Embarrassment | ≈ | neuro_Embarrassment | 0.046798 16605 | 0.002934 364068 | 0.464810 1355 | 0.02914466 462 | 0.464809 8146 | 0.029144 66462 | 2.93E-57 |
| 49 | neuro_Guilt | ≈ | neuro_Guilt | 0.025504 83234 | 0.002698 960983 | 0.291404 6224 | 0.03083688 556 | 0.291404 6782 | 0.030836 88556 | 3.39E-21 |
| 57 | neuro_Worrier | ≈ | neuro_Worrier | 0.041406 47623 | 0.002965 035952 | 0.344472 9584 | 0.02466701 728 | 0.344473 1372 | 0.024667 01728 | 2.55E-44 |
| 12 | gad_Relax | ≈ | gad_Relax | 0.020373 05676 | 0.004531 695667 | 0.248311 0637 | 0.05523209 423 | 0.248310 7182 | 0.055232 09423 | 6.93E-06 |
| 13 | gad_Restlessness | ≈ | gad_Restlessness | 0.031630 24364 | 0.007706 683481 | 0.385916 6616 | 0.09402685 112 | 0.385915 4404 | 0.094026 85112 | 4.06E-05 |
| 45 | mdd_Sleep | ≈ | mdd_Sleep | 0.039136 64737 | 0.005068 887921 | 0.522906 1283 | 0.06772597 078 | 0.522905 8529 | 0.067725 97078 | 1.15E-14 |
| 50 | neuro_High_string | ≈ | neuro_High_string | 0.039589 82711 | 0.004330 242242 | 0.344194 7715 | 0.03764658 569 | 0.344194 7851 | 0.037646 58569 | 6.09E-20 |
| 11 | gad_Irritability | ≈ | gad_Irritability | 0.026128 12029 | 0.004735 716424 | 0.319508 6142 | 0.05791024 747 | 0.319508 0462 | 0.057910 24747 | 3.44E-08 |
| 8 | gad_Anxiety | ≈ | gad_Anxiety | 0.013295 66154 | 0.004334 374334 | 0.181454 7767 | 0.05915395 558 | 0.181454 8435 | 0.059153 95558 | 0.0021586 2748 |

| | | | | | | | | | | |
|----|---------------------|----|---------------------|----------------|----------------|---------------|---------------|---------------|---------------|----------------|
| 10 | gad_Foreboding | ~~ | gad_Foreboding | 0.0317740261 | 0.005932150638 | 0.3338148883 | 0.06232228491 | 0.3338143539 | 0.06232228491 | 8.50E-08 |
| 39 | mdd_Appetite | ~~ | mdd_Appetite | 0.05195282565 | 0.006750829597 | 0.5967846355 | 0.07754740153 | 0.5967863723 | 0.07754740153 | 1.41E-14 |
| 40 | mdd_Concentration | ~~ | mdd_Concentration | 0.03087961167 | 0.006137564569 | 0.4274587799 | 0.08496135062 | 0.4274595123 | 0.08496135062 | 4.87E-07 |
| 42 | mdd_Ideation | ~~ | mdd_Ideation | 0.01914945047 | 0.01484180778 | 0.2711580513 | 0.2101559489 | 0.2711574307 | 0.2101559489 | 0.1969683618 |
| 44 | mdd_Motor | ~~ | mdd_Motor | 0.03792470259 | 0.01181103037 | 0.5206906856 | 0.162161357 | 0.5206910887 | 0.162161357 | 0.001322940435 |
| 38 | mdd_Anhedonia | ~~ | mdd_Anhedonia | 0.03210234268 | 0.00574925043 | 0.3756073142 | 0.0672669959 | 0.375605509 | 0.0672669959 | 2.35E-08 |
| 48 | neuro_Fed up | ~~ | neuro_Fed up | 0.03089527748 | 0.002301081829 | 0.3368986042 | 0.02509220019 | 0.3368985288 | 0.02509220019 | 4.23E-41 |
| 51 | neuro_Hurt feelings | ~~ | neuro_Hurt feelings | 0.04252141422 | 0.002679169106 | 0.4686862189 | 0.02953076601 | 0.4686863775 | 0.02953076601 | 1.00E-56 |
| 52 | neuro_Irritability | ~~ | neuro_Irritability | 0.05764887198 | 0.00327607658 | 0.5115091678 | 0.02906810306 | 0.5115089152 | 0.02906810306 | 2.60E-69 |
| 53 | neuro_Lonely | ~~ | neuro_Lonely | 0.02679582263 | 0.002701848834 | 0.3852711619 | 0.03884728052 | 0.3852711374 | 0.03884728052 | 3.49E-23 |
| 55 | neuro_Nerves | ~~ | neuro_Nerves | 0.0372318415 | 0.0031660617 | 0.4379950465 | 0.03724549671 | 0.4379952302 | 0.03724549671 | 6.30E-32 |
| 56 | neuro_Nervous | ~~ | neuro_Nervous | 0.06930714297 | 0.003726145533 | 0.5623762225 | 0.03023488862 | 0.562376042 | 0.03023488862 | 3.20E-77 |
| 41 | mdd_Fatigue | ~~ | mdd_Fatigue | 0.04007568584 | 0.004929723868 | 0.4541343505 | 0.05586320045 | 0.4541346742 | 0.05586320045 | 4.31E-16 |
| 43 | mdd_Mood | ~~ | mdd_Mood | 0.01012412928 | 0.004962603787 | 0.1323821946 | 0.06488719626 | 0.1323816191 | 0.06488719626 | 0.04134194612 |
| 46 | mdd_Worthless | ~~ | mdd_Worthless | 0.006012235365 | 0.005110711851 | 0.08414858083 | 0.071525567 | 0.08414825464 | 0.071525567 | 0.2394355451 |
| 54 | neuro_Miserable | ~~ | neuro_Miserable | 0.01547134934 | 0.003141734952 | 0.1695627975 | 0.03443215935 | 0.1695628053 | 0.03443215935 | 8.46E-07 |
| 66 | W | ~~ | W | 1 | | 1 | | 1 | | NA |
| 1 | AA | ~~ | AA | 1 | | 1 | | 1 | | NA |
| 18 | GNA | ~~ | GNA | 1 | | 1 | | 1 | | NA |
| 32 | LPA | ~~ | LPA | 1 | | 1 | | 1 | | NA |

Supplemental Table 4. Diverse ancestry GWAS. Total N is reported, as well as case prevalence for case-control studies. INT = Internalizing; PAU = Problematic Alcohol Use; COMSUM = Alcohol Consumption (quantity and/or frequency).

| Phenotype | Description | N | Case Prevalence | Factor | Source |
|-------------------------------|---|----------|------------------------|---------------|----------------------------------|
| Finnish- all ICD based | | | | | |
| AUD | Alcohol use disorder | 429209 | 0.0417 | PAU | FinnGen |
| F5_ALCOHOL_DEPENDENCE | alcohol dependence | 429209 | 0.026 | PAU | FinnGen |
| F5_ALLANXIOUS | Anxiety disorder, includes GAD, panic, OCD, phobic, other | 429209 | 0.0671 | INT | FinnGen |
| F5_ANXIETY | Other anxiety disorder | 429209 | 0.0459 | INT | FinnGen |
| F5_DEPRESSIO | unipolar depression | 429209 | 0.1158 | INT | FinnGen |
| F5_GAD | generalized anxiety disorder | 429209 | 0.0128 | INT | FinnGen |
| East Asian | | | | | |
| DPW | self-reported average drinks per week | 90852 | NA | CONSUM | Saunders et al. 2022 (GSCAN2) |
| DEP | Depression | 98502 | 0.128 | INT | Giannakopoulou et al. 2021 (PGC) |

Supplemental Table 5. Full model output for base model relating internalizing (INT), externalizing (EXT), and three alcohol use factors- problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Model fit: $\chi^2(108) = 558.0237$, AIC = 648.0237, CFI = 0.963751, SRMR = 0.101803

| | lhs | op | rhs | Unstand_ Est | Unstand_ SE | STD_Geno type | STD_Genot ype SE | STD_All | STD_All_ SE | p_value |
|----|-----------|----|------------------|------------------|-----------------|------------------|--------------------------|------------------|-----------------|-----------------|
| 29 | INT | ≈ | MDD | 0.2451661 69 | 0.0092038 88 | 0.9437843 97 | 0.03543103 3 | 0.9437846 32 | 0.0354310 52 | 2.52E-15 6 |
| 26 | INT | ≈ | GAD2 | 0.1752325 06 | 0.0089788 58 | 0.7412502 38 | 0.03798144 4 | 0.7412504 13 | 0.0379814 43 | 8.01E-85 |
| 28 | INT | ≈ | LifetimeA nx | 0.4250784 74 | 0.0184130 86 | 0.9095317 38 | 0.03939812 9 | 0.9095316 15 | 0.0393981 2 | 6.45E-11 8 |
| 16 | EXT | ≈ | num_part ners | 0.2127271 67 | 0.0113029 81 | 0.6743407 78 | 0.03583020 3 | 0.6743407 24 | 0.0358302 18 | 5.13E-79 |
| 13 | EXT | ≈ | ADHD | 0.4209249 86 | 0.0307691 32 | 0.5927393 05 | 0.04332853 6 | 0.5927392 42 | 0.0433285 35 | 1.33E-42 |
| 14 | EXT | ≈ | antisoc | 0.1627778 52 | 0.0216821 19 | 0.7266166 96 | 0.09678590 4 | 0.7266146 39 | 0.0967859 18 | 6.03E-14 |
| 33 | PAU | ≈ | AUD | 0.1751191 35 | 0.0122692 82 | 0.7328405 61 | 0.05134449 8 | 0.9516244 71 | 0.0666755 92 | 3.23E-46 |
| 35 | PAU | ≈ | AUDIT 4 | 0.0992438 68 | 0.0102584 7 | 0.5862346 64 | 0.06059685 3 | 0.7612505 38 | 0.0786905 94 | 3.88E-22 |
| 36 | PAU | ≈ | AUDIT 5 | 0.0808014 55 | 0.0094662 38 | 0.5814973 39 | 0.06812483 4 | 0.7550986 84 | 0.0884663 49 | 1.39E-17 |
| 37 | PAU | ≈ | AUDIT 7 | 0.1118255 16 | 0.0107580 52 | 0.5937259 46 | 0.05711867 4 | 0.7709781 24 | 0.0741738 59 | 2.62E-25 |
| 38 | PAU | ≈ | AUDIT 8 | 0.1048899 93 | 0.0103604 69 | 0.5374755 02 | 0.05308885 5 | 0.6979347 37 | 0.0689407 7 | 4.32E-24 |
| 34 | PAU | ≈ | AUDIT_1 0 | 0.1040808 42 | 0.0092009 07 | 0.6381820 71 | 0.05641618 2 | 0.8287059 93 | 0.0732616 19 | 1.14E-29 |
| 46 | QUAN T | ≈ | dpw | 0.1274700 17 | 0.0109054 65 | 0.5685630 14 | 0.04864235 0.04864235 | 0.6798029 3 | 0.0581802 53 | 1.46E-31 |
| 44 | QUAN T | ≈ | AUDIT 2 | 0.1633591 67 | 0.0088728 28 | 0.7138380 36 | 0.03877192 6 | 0.8535016 49 | 0.0463744 54 | 1.07E-75 |
| 45 | QUAN T | ≈ | AUDIT 3 | 0.1920341 71 | 0.0095643 87 | 0.7817308 45 | 0.03893450 9 | 0.9346765 62 | 0.0465689 1 | 1.15E-89 |
| 18 | FREQ | ≈ | dpw | 0.0875106 82 | 0.0115780 18 | 0.3903290 89 | 0.05164220 7 | 0.3983756 31 | 0.0527070 42 | 4.08E-14 |
| 22 | FREQ | ≈ | intake_fre q | 0.2461967 61 | 0.0067944 19 | 0.9921053 81 | 0.02737965 4 | 1.0125573 23 | 0.0279442 49 | 1.70E-28 7 |
| 17 | FREQ | ≈ | AUDIT 1 | 0.2430454 43 | 0.0083662 41 | 0.9028844 94 | 0.03107957 6 | 0.9214972 29 | 0.0317204 6 | 1.51E-18 5 |
| 41 | PAU | ~ | INT | 0.2929923 02 | 0.0647679 79 | 0.2929938 56 | 0.06476793 6 | 0.2256328 88 | 0.0498754 97 | 6.08E-06 |
| 39 | PAU | ~ | EXT | 0.6477784 92 | 0.1032821 25 | 0.6477755 75 | 0.10328162 3 | 0.4988482 53 | 0.0795336 74 | 3.57E-10 |
| 49 | QUAN T | ~ | INT | -0.167826 102 | 0.0573593 75 | -0.1678255 88 | 0.05735922 6 | -0.1403633 56 | 0.0479558 24 | 0.003434 939 |
| 47 | QUAN T | ~ | EXT | 0.7185114 47 | 0.0851593 33 | 0.7185097 92 | 0.08515900 3 | 0.6009360 47 | 0.0711981 86 | 3.25E-17 |
| 21 | FREQ | ~ | INT | -0.182499 572 | 0.0337671 66 | -0.1824992 86 | 0.03376716 9 | -0.1788130 94 | 0.0330848 87 | 6.49E-08 |
| 19 | FREQ | ~ | EXT | 0.2130010 37 | 0.0401193 12 | 0.2130009 63 | 0.04011928 7 | 0.2086986 85 | 0.0393086 71 | 1.10E-07 |

| | | | | | | | | | | |
|----|------------------|----|------------------|--------------|-------------|--------------|-------------|--------------|-------------|-------------|
| 43 | PAU | ~~ | QUANT | 0.81025608 | 0.052039586 | 0.810255943 | 0.052039493 | 0.810255943 | 0.033504194 | 1.16E-54 |
| 40 | PAU | ~~ | FREQ | 0.724114047 | 0.058195874 | 0.724114098 | 0.058195801 | 0.724114098 | 0.043909132 | 1.53E-35 |
| 48 | QUAN T | ~~ | FREQ | 0.742056046 | 0.035573819 | 0.74205588 | 0.035573764 | 0.74205588 | 0.029140961 | 1.25E-96 |
| 25 | INT | ~~ | EXT | 0.476183008 | 0.03015303 | 0.476182979 | 0.030153015 | 0.476182979 | 0.030153009 | 3.52E-56 |
| 31 | MDD | ~~ | MDD | 0.007373528 | 0.004645537 | 0.109270513 | 0.068843143 | 0.109270568 | 0.068843216 | 0.112460905 |
| 23 | GAD2 | ~~ | GAD2 | 0.025179128 | 0.00442921 | 0.450547612 | 0.079255007 | 0.450547825 | 0.079255017 | 1.31E-08 |
| 30 | Lifetim eAnx | ~~ | LifetimeA nx | 0.03773295 | 0.020557395 | 0.172752288 | 0.094116532 | 0.172752242 | 0.094116506 | 0.066432711 |
| 32 | num_p artners | ~~ | num_part ners | 0.054262029 | 0.005472722 | 0.545264677 | 0.054994074 | 0.545264588 | 0.054994088 | 3.58E-23 |
| 1 | ADHD | ~~ | ADHD | 0.327114183 | 0.033984882 | 0.648660329 | 0.067391224 | 0.648660191 | 0.067391208 | 6.25E-22 |
| 2 | antisoc | ~~ | antisoc | 0.023688742 | 0.027921986 | 0.47203384 | 0.556374231 | 0.472031167 | 0.556374263 | 0.396220656 |
| 3 | AUD | ~~ | AUD | 0.005390969 | 0.003299983 | 0.09441087 | 0.057791349 | 0.094410866 | 0.057791342 | 0.102335441 |
| 8 | AUDI T 4 | ~~ | AUDIT 4 | 0.012051139 | 0.004547564 | 0.420497609 | 0.158677103 | 0.420497619 | 0.158677096 | 0.008048686 |
| 9 | AUDI T 5 | ~~ | AUDIT 5 | 0.008299205 | 0.004859351 | 0.429826238 | 0.25167171 | 0.429825978 | 0.25167171 | 0.087657962 |
| 10 | AUDI T 7 | ~~ | AUDIT 7 | 0.014387941 | 0.004337489 | 0.405592892 | 0.122272227 | 0.405592733 | 0.122272227 | 0.000909529 |
| 11 | AUDI T 8 | ~~ | AUDIT 8 | 0.019533287 | 0.004643413 | 0.512887038 | 0.121922964 | 0.512887103 | 0.121922959 | 2.59E-05 |
| 4 | AUDI T 10 | ~~ | AUDIT_1 0 | 0.008331757 | 0.002498686 | 0.313246712 | 0.093941745 | 0.313246377 | 0.093941747 | 0.000854667 |
| 12 | dpw | ~~ | dpw | 0.000178381 | 0.002715991 | 0.003547546 | 0.054034147 | 0.003547546 | 0.054034133 | 0.947634133 |
| 6 | AUDI T 2 | ~~ | AUDIT 2 | 0.014220555 | 0.002604223 | 0.27153463 | 0.049726733 | 0.271534935 | 0.049726739 | 4.75E-08 |
| 7 | AUDI T 3 | ~~ | AUDIT_3 | 0.00762641 | 0.002631865 | 0.126379918 | 0.043613416 | 0.126379725 | 0.043613415 | 0.003758851 |
| 24 | intake_ freq | ~~ | intake_fre q | -0.001556378 | 0.002286629 | -0.025272337 | 0.037131855 | -0.025272333 | 0.037131936 | 0.496097542 |
| 5 | AUDI T 1 | ~~ | AUDIT 1 | 0.010930376 | 0.003123254 | 0.150842868 | 0.043101936 | 0.150842858 | 0.043101931 | 0.000465825 |
| 27 | INT | ~~ | INT | 1 | | 1 | | 1 | | NA |
| 15 | EXT | ~~ | EXT | 1 | | 1 | | 1 | | NA |
| 42 | PAU | ~~ | PAU | 1 | | 1 | | 0.593045173 | | NA |
| 50 | QUAN T | ~~ | QUANT | 1 | | 1 | | 0.699505493 | | NA |
| 20 | FREQ | ~~ | FREQ | 1 | | 1 | | 0.960011184 | | NA |

Supplemental Table 6. Full model output for exploratory model relating internalizing (INT) with three alcohol use factors- problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Model does not include an externalizing factor.
 Model fit: $\chi^2(70) = 313.1723$, AIC = 383.1723, CFI = 0.9788987, SRMR = 0.0871512

| | lhs | op | rhs | Unstand Est | Unstand_S E | STD_Genotype | STD_Genotype SE | STD All | p value |
|----|-------------|----|--------------|-----------------|----------------|----------------|-----------------|----------------|-----------------|
| 18 | INT | ≈ | MDD | 0.2423220106 | 0.01079764891 | 0.9361585455 | 0.04170966438 | 0.9361585391 | 1.53E-111 |
| 16 | INT | ≈ | GAD2 | 0.1741721308 | 0.01022561164 | 0.7367635725 | 0.04325212561 | 0.7367635733 | 4.68E-65 |
| 17 | INT | ≈ | Lifetime Anx | 0.4350301859 | 0.02162858795 | 0.9317359499 | 0.04631902471 | 0.9317359368 | 5.60E-90 |
| 22 | PAU | ≈ | AUD | 0.1970832786 | 0.01005845189 | 0.8269967689 | 0.04220475752 | 0.934455834 | 1.75E-85 |
| 24 | PAU | ≈ | AUDIT_4 | 0.113699407 | 0.01054968904 | 0.6730299154 | 0.06244832489 | 0.7604830171 | 4.40E-27 |
| 25 | PAU | ≈ | AUDIT_5 | 0.09296122385 | 0.01007269865 | 0.6724622094 | 0.07286352046 | 0.7598412139 | 2.73E-20 |
| 26 | PAU | ≈ | AUDIT_7 | 0.1344296601 | 0.01065139458 | 0.7246401047 | 0.05741452823 | 0.8187991147 | 1.62E-36 |
| 27 | PAU | ≈ | AUDIT_8 | 0.1199058257 | 0.01043812969 | 0.6166910427 | 0.05368343131 | 0.6968232071 | 1.53E-30 |
| 23 | PAU | ≈ | AUDIT_10 | 0.1234559701 | 0.008799098116 | 0.7774989998 | 0.05541447737 | 0.8785264079 | 1.01E-44 |
| 34 | QUANT | ≈ | dpw | 0.1361626504 | 0.01380964867 | 0.6119483439 | 0.06141060314 | 0.6191290644 | 6.21E-23 |
| 32 | QUANT | ≈ | AUDIT_2 | 0.1957663635 | 0.008866683201 | 0.8598755572 | 0.03894465607 | 0.8699654596 | 5.05E-108 |
| 33 | QUANT | ≈ | AUDIT_3 | 0.2339488329 | 0.009108945692 | 0.9597176389 | 0.037359938 | 0.9709791015 | 1.79E-145 |
| 11 | FREQ | ≈ | dpw | 0.1043128586 | 0.01340576097 | 0.4640726269 | 0.0595181389 | 0.4654346477 | 7.18E-15 |
| 12 | FREQ | ≈ | intake_freq | 0.2464810748 | 0.006670659347 | 0.9976965816 | 0.02686420809 | 0.9976965816 | 7.27E-299 |
| 10 | FREQ | ≈ | AUDIT_1 | 0.2473636225 | 0.008512947084 | 0.9197148055 | 0.03160424649 | 0.9224138791 | 1.24E-185 |
| 39 | intake_freq | ≈ | intake_freq | 0.0009999826538 | 0.002240654694 | 0.001000516547 | 0.03668289946 | 0.001000516547 | 0.6553874982 |
| 28 | PAU | ~ | INT | 0.5260930491 | 0.0508668582 | 0.526081878 | 0.05086460902 | 0.4655843176 | 4.52E-25 |
| 35 | QUANT | ~ | INT | 0.1540350446 | 0.026822266 | 0.1536426103 | 0.02674254475 | 0.1518606501 | 9.31E-09 |
| 13 | FREQ | ~ | INT | -0.07685852494 | 0.02120932213 | -0.07667103488 | 0.0211345465 | -0.07644667025 | 0.0002902964116 |
| 31 | PAU | ≈ | QUANT | 0.8464974795 | 0.0387161713 | 0.8468069728 | 0.03868678827 | 0.8468069728 | 5.70E-106 |
| 29 | PAU | ≈ | FREQ | 0.7222639988 | 0.04654059127 | 0.7198831266 | 0.04639483071 | 0.7198831266 | 2.58E-54 |
| 36 | QUANT | ≈ | FREQ | 0.702059737 | 0.02907619582 | 0.6992899562 | 0.0289731785 | 0.6992899562 | 8.32E-129 |
| 21 | MDD | ≈ | MDD | 0.00828471309 | 0.005411175056 | 0.1236071913 | 0.08075077068 | 0.1236071896 | 0.1257600719 |

| | | | | | | | | | |
|----|---------------------|----|-----------------|--------------------|--------------------|--------------------|---------------|-------------------|---------------------|
| 15 | GAD 2 | ~~ | GAD2 | 0.025547175 6 | 0.00480018 9941 | 0.45717943 6 | 0.08589140385 | 0.45717943 7 | 1.03E-07 |
| 20 | Lifeti meAn x | ~~ | Lifetime Anx | 0.028744223 35 | 0.02274519 237 | 0.13186814 79 | 0.1043307738 | 0.13186814 41 | 0.206319985 8 |
| 9 | AUD | ~~ | AUD | 0.007205532 554 | 0.00313930 8595 | 0.12679231 26 | 0.05527323539 | 0.12679229 43 | 0.021718171 79 |
| 5 | AUDI T 4 | ~~ | AUDIT_ 4 | 0.012031200 27 | 0.00448977 5595 | 0.42166528 36 | 0.1573344646 | 0.42166558 07 | 0.007369068 775 |
| 6 | AUDI T 5 | ~~ | AUDIT_ 5 | 0.008075547 37 | 0.00485875 9947 | 0.42264139 87 | 0.2542624734 | 0.42264132 96 | 0.096500876 25 |
| 7 | AUDI T 7 | ~~ | AUDIT_ 7 | 0.011340676 4 | 0.00435119 2925 | 0.32956800 99 | 0.12644088 | 0.32956800 98 | 0.009151629 19 |
| 8 | AUDI T 8 | ~~ | AUDIT_ 8 | 0.019447700 93 | 0.00458289 0876 | 0.51443749 58 | 0.1212254806 | 0.51443741 81 | 2.20E-05 |
| 1 | AUDI T 10 | ~~ | AUDIT_ 10 | 0.005752421 636 | 0.00241701 7996 | 0.22819136 84 | 0.09586770033 | 0.22819135 07 | 0.017314216 34 |
| 38 | dpw | ~~ | dpw | 0.000412969 265 | 0.00293833 9975 | 0.00955993 5674 | 0.05884234112 | 0.00955993 593 | 0.888229327 |
| 3 | AUDI T 2 | ~~ | AUDIT_ 2 | 0.012623053 15 | 0.00257208 9602 | 0.24316011 74 | 0.04963299873 | 0.24316009 92 | 9.21E-07 |
| 4 | AUDI T 3 | ~~ | AUDIT_ 3 | 0.003420705 2 | 0.00269451 3335 | 0.05719958 879 | 0.04534010538 | 0.05719958 44 | 0.204260075 9 |
| 2 | AUDI T 1 | ~~ | AUDIT_ 1 | 0.010878457 79 | 0.00304659 4463 | 0.14915270 45 | 0.04202485655 | 0.14915263 56 | 0.000356036 0976 |
| 19 | INT | ~~ | INT | 1 | | 1 | | 1 | NA |
| 30 | PAU | ~~ | PAU | 1 | | 1 | | 0.78323124 32 | NA |
| 37 | QUA NT | ~~ | QUANT | 1 | | 1 | | 0.97693834 3 | NA |
| 14 | FREQ | ~~ | FREQ | 1 | | 1 | | 0.99415590 66 | NA |

Supplemental Table 7. Full model output for exploratory model including two separate internalizing factors, anxiety (ANX) and depression (DEP), related to three alcohol use factors- problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Model does not include an externalizing factor. Model fit: $\chi^2(67) = 305.4727$, AIC = 381.4727, CFI = 0.9789053, SRMR = 0.08710279

| | lhs | op | rhs | Unstand Est | Unstand_S E | STD_Genotype | STD_Genotype SE | STD All | p value |
|----|-------------|----|--------------|-----------------|----------------|----------------|-----------------|----------------|--------------|
| 1 | ANX | ≈ | GAD2 | 0.1747230324 | 0.009734916333 | 0.7390978156 | 0.04117776944 | 0.7390978258 | 4.97E-72 |
| 2 | ANX | ≈ | Lifetime Anx | 0.4363892131 | 0.02341015291 | 0.9346528317 | 0.05013680882 | 0.9346528381 | 1.49E-77 |
| 14 | DEP | ≈ | MDD | 0.2588527357 | 0.004867218252 | 0.9999995089 | 0.0188030681 | 0.9999995089 | < 5e-300 |
| 25 | PAU | ≈ | AUD | 0.1979843468 | 0.01002961978 | 0.8307721683 | 0.0420847591 | 0.9348354082 | 9.78E-87 |
| 27 | PAU | ≈ | AUDIT_4 | 0.1141507704 | 0.01060471557 | 0.6757054322 | 0.06277448232 | 0.760344958 | 5.08E-27 |
| 28 | PAU | ≈ | AUDIT_5 | 0.09315069197 | 0.0100752779 | 0.6738342552 | 0.07288238327 | 0.758239373 | 2.34E-20 |
| 29 | PAU | ≈ | AUDIT_7 | 0.1347021956 | 0.01069340139 | 0.7261108042 | 0.05764200531 | 0.8170640829 | 2.20E-36 |
| 30 | PAU | ≈ | AUDIT_8 | 0.1205099193 | 0.01044581893 | 0.6197964524 | 0.05372350682 | 0.6974326844 | 8.62E-31 |
| 26 | PAU | ≈ | AUDIT_10 | 0.1239468909 | 0.0088619437 | 0.7805836839 | 0.05581063225 | 0.8783602878 | 1.89E-44 |
| 38 | QUANT | ≈ | dpw | 0.1351600043 | 0.01370857073 | 0.6075420512 | 0.06093161562 | 0.6172566553 | 6.23E-23 |
| 36 | QUANT | ≈ | AUDIT_2 | 0.1954632973 | 0.009164757921 | 0.8585806719 | 0.04023629929 | 0.8723093239 | 6.28E-101 |
| 37 | QUANT | ≈ | AUDIT_3 | 0.2329345123 | 0.009259432154 | 0.9556052862 | 0.03795840152 | 0.9708853639 | 1.20E-139 |
| 17 | FREQ | ≈ | dpw | 0.104262214 | 0.01340926775 | 0.4638109992 | 0.05951317067 | 0.4681398738 | 7.52E-15 |
| 18 | FREQ | ≈ | intake_freq | 0.2448901706 | 0.007465532936 | 0.9913204975 | 0.03005842269 | 0.9913204975 | 5.38E-236 |
| 16 | FREQ | ≈ | AUDIT_1 | 0.2455320943 | 0.009016368456 | 0.9129773213 | 0.03345341113 | 0.9214981473 | 2.73E-163 |
| 44 | intake_freq | ≈ | intake_freq | 0.0009999915106 | 0.002245308348 | 0.001000443435 | 0.03675088157 | 0.001000443435 | 0.6560528611 |
| 31 | PAU | ~ | ANX | 0.3959222959 | 0.4883653198 | 0.3959918606 | 0.4884865675 | 0.3519111589 | 0.4175326439 |
| 32 | PAU | ~ | DEP | 0.1265626699 | 0.4779929857 | 0.1264863518 | 0.4781120593 | 0.1124062464 | 0.7911794491 |
| 39 | QUANT | ~ | ANX | 0.3312470228 | 0.3624453688 | 0.3295158802 | 0.3612606735 | 0.3243298583 | 0.3607575044 |
| 40 | QUANT | ~ | DEP | -0.1741906782 | 0.3563949705 | -0.1728823624 | 0.355248967 | -0.1701614868 | 0.6250134628 |
| 19 | FREQ | ~ | ANX | -0.3451738422 | 0.3317635394 | -0.3441265869 | 0.3308858351 | -0.3409444761 | 0.2981442252 |
| 20 | FREQ | ~ | DEP | 0.2643975205 | 0.328102874 | 0.2635517584 | 0.3272389267 | 0.2611147165 | 0.4203366917 |
| 35 | PAU | ~ | QUANT | 0.8428504061 | 0.03875784466 | 0.8431555709 | 0.03871613425 | 0.8431555709 | 7.44E-105 |

| | | | | | | | | | |
|----|---------------------|----|-----------------|---------------------|--------------------|--------------------|---------------------|--------------------|---------------------|
| 33 | PAU | ~~ | FREQ | 0.730379005 5 | 0.055978856 83 | 0.727927074 3 | 0.0557855216 5 | 0.727927074 3 | 6.57E-39 |
| 41 | QUA NT | ~~ | FREQ | 0.719941760 6 | 0.041240670 81 | 0.716961950 9 | 0.0409793225 6 | 0.716961950 9 | 3.04E-68 |
| 4 | ANX | ~~ | DEP | 0.932389921 9 | 0.047698541 39 | 0.932404049 4 | 0.0476995533 4 | 0.932404049 4 | 4.33E-85 |
| 22 | GAD 2 | ~~ | GAD2 | 0.025354969 56 | 0.004458485 911 | 0.453734391 4 | 0.0797795606 6 | 0.453734403 9 | 1.29E-08 |
| 23 | Lifeti meAn x | ~~ | Lifetime Anx | 0.027559941 54 | 0.024793820 14 | 0.126424070 4 | 0.1137314228 2 | 0.126424072 2 | 0.266325248 |
| 13 | AUD | ~~ | AUD | 0.007164920 03 | 0.003228865 064 | 0.126082763 2 | 0.0568497012 1 | 0.126082759 5 | 0.026485282 28 |
| 9 | AUD IT 4 | ~~ | AUDIT_ 4 | 0.012037480 43 | 0.004507201 83 | 0.421875468 6 | 0.1579449866 8 | 0.421875544 8 | 0.007568843 591 |
| 10 | AUD IT 5 | ~~ | AUDIT_ 5 | 0.008122145 062 | 0.004861691 902 | 0.425073002 2 | 0.2544152144 2 | 0.425073053 2 | 0.094792477 27 |
| 11 | AUD IT 7 | ~~ | AUDIT_ 7 | 0.011438618 35 | 0.004243126 282 | 0.332406284 3 | 0.1233002734 4 | 0.332406284 4 | 0.007021988 78 |
| 12 | AUD IT 8 | ~~ | AUDIT_ 8 | 0.019415622 06 | 0.004604946 723 | 0.513587676 5 | 0.1218093314 8 | 0.513587650 8 | 2.48E-05 |
| 5 | AUD IT 10 | ~~ | AUDIT_ 10 | 0.005759566 282 | 0.002460435 113 | 0.228483202 5 | 0.0975895690 1 | 0.228483204 8 | 0.019238706 89 |
| 43 | dpw | ~~ | dpw | 0.000356704 7156 | 0.002841082 388 | 0.008468838 759 | 0.0568923870 4 | 0.008468839 595 | 0.900086243 1 |
| 7 | AUD IT 2 | ~~ | AUDIT_ 2 | 0.012410444 91 | 0.002526162 733 | 0.239076454 3 | 0.0487460531 3 | 0.239076443 5 | 8.98E-07 |
| 8 | AUD IT 3 | ~~ | AUDIT_ 3 | 0.003431179 185 | 0.002733613 663 | 0.057381611 77 | 0.04600115035 14 | 0.057381610 14 | 0.209413160 3 |
| 6 | AUD IT 1 | ~~ | AUDIT_ 1 | 0.011005352 36 | 0.003105858 294 | 0.150841228 4 | 0.0428425362 3 | 0.150841164 6 | 0.000394976 9994 |
| 24 | MDD | ~~ | MDD | 0 | | 0 | | 0 | NA |
| 3 | ANX | ~~ | ANX | 1 | | 1 | | 1 | NA |
| 15 | DEP | ~~ | DEP | 1 | | 1 | | 1 | NA |
| 34 | PAU | ~~ | PAU | 1 | | 1 | | 0.789757134 8 | NA |
| 42 | QUA NT | ~~ | QUANT | 1 | | 1 | | 0.968771081 6 | NA |
| 21 | FRE Q | ~~ | FREQ | 1 | | 1 | | 0.981591666 6 | NA |

Supplemental Table 8. Full model output for model that includes a "worry" factor (W) as mediating the relationships between internalizing (INT), externalizing (EXT), and three alcohol use factors: problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Total effects (TOT) and indirect effects (ID) were calculated using the path coefficients (a = psychiatric factor to mediator; b = mediator to alcohol factor; c = direct path from psychiatric factor to alcohol factor).

Model fit: $\chi^2(193) = 1812.984$, AIC = 1932.984, CFI = 0.931771, SRMR = 0.1023

| | lhs | op | rhs | Unstand Est | Unstan d SE | STD_Gen otype | STD_Genoty pe SE | STD All | STD_All SE | p value |
|----|-------|----|-------------------------|-----------------|-----------------|--------------------------|---------------------|-----------------|-----------------|---------------|
| 38 | INT | ≈ | MDD | 0.225452 504 | 0.00678 9358 | 0.8652160 25 | 0.026055432 | 0.865215 674 | 0.026055 43 | 8.60E-2 42 |
| 35 | INT | ≈ | GAD2 | 0.201352 066 | 0.00828 8257 | 0.8452121 55 | 0.034791473 | 0.845212 798 | 0.034791 482 | 2.29E-1 30 |
| 37 | INT | ≈ | LifetimeAnx | 0.407618 242 | 0.01629 8634 | 0.8702072 23 | 0.034795292 | 0.870207 068 | 0.034795 296 | 4.84E-1 38 |
| 16 | EXT | ≈ | num_partners | 0.210305 344 | 0.01126 0268 | 0.6671501 47 | 0.035720851 | 0.667150 179 | 0.035720 826 | 7.65E-7 8 |
| 13 | EXT | ≈ | ADHD | 0.425258 6 | 0.03113 7348 | 0.5988487 36 | 0.043847556 | 0.598848 942 | 0.043847 585 | 1.82E-4 2 |
| 14 | EXT | ≈ | antisoc | 0.164821 581 | 0.02191 5397 | 0.7130564 25 | 0.094811202 | 0.713056 762 | 0.094811 249 | 5.44E-1 4 |
| 45 | PAU | ≈ | AUD | 0.159167 657 | 0.01391 3123 | 0.6649842 2 | 0.058127596 | 0.903898 583 | 0.079028 569 | 2.64E-3 0 |
| 47 | PAU | ≈ | AUDIT 4 | 0.100108 214 | 0.01099 8373 | 0.5885615 29 | 0.064662333 | 0.800020 924 | 0.087912 934 | 8.86E-2 0 |
| 48 | PAU | ≈ | AUDIT 5 | 0.080124 779 | 0.00988 1354 | 0.5629383 7 | 0.069424271 | 0.765190 252 | 0.094387 182 | 5.12E-1 6 |
| 49 | PAU | ≈ | AUDIT 7 | 0.116832 343 | 0.01190 9245 | 0.6111352 46 | 0.062295861 | 0.830703 92 | 0.084695 554 | 1.02E-2 2 |
| 50 | PAU | ≈ | AUDIT 8 | 0.101582 316 | 0.01113 0334 | 0.5215146 76 | 0.05714224 | 0.708883 583 | 0.077688 812 | 7.07E-2 0 |
| 46 | PAU | ≈ | AUDIT 10 | 0.096627 551 | 0.00987 6118 | 0.5844875 89 | 0.059739487 | 0.794482 615 | 0.081220 049 | 1.32E-2 2 |
| 59 | QUANT | ≈ | dpw | 0.124285 027 | 0.01113 1557 | 0.5543833 96 | 0.049653072 | 0.671736 672 | 0.060168 981 | 6.04E-2 9 |
| 57 | QUANT | ≈ | AUDIT 2 | 0.161102 712 | 0.00978 9595 | 0.7037004 0.042761153 | | 0.852662 015 | 0.051817 528 | 7.53E-6 1 |
| 58 | QUANT | ≈ | AUDIT 3 | 0.189648 69 | 0.01081 4869 | 0.7706877 43 | 0.043949062 | 0.933828 777 | 0.053257 039 | 7.62E-6 9 |
| 18 | FREQ | ≈ | dpw | 0.086890 652 | 0.01135 4532 | 0.3875810 77 | 0.05064761 | 0.408236 763 | 0.053357 664 | 1.97E-1 4 |
| 22 | FREQ | ≈ | intake freq | 0.238204 582 | 0.00799 5411 | 0.9573632 6 | 0.032134288 | 1.008384 573 | 0.033853 744 | 4.86E-1 95 |
| 17 | FREQ | ≈ | AUDIT 1 | 0.235267 883 | 0.00918 1938 | 0.8725681 42 | 0.034054258 | 0.919069 618 | 0.035876 431 | 8.48E-1 45 |
| 72 | W | ≈ | gad_Control | 0.152409 075 | 0.01462 7988 | 0.5225322 16 | 0.050152115 | 0.938020 732 | 0.090075 77 | 2.03E-2 5 |
| 73 | W | ≈ | gad Worry | 0.146999 312 | 0.01408 5541 | 0.5206837 63 | 0.049892431 | 0.934701 966 | 0.089609 316 | 1.69E-2 5 |
| 75 | W | ≈ | neuro_Embarr assment | 0.128234 71 | 0.01238 9257 | 0.4030663 81 | 0.038942037 | 0.723561 941 | 0.069941 858 | 4.16E-2 5 |
| 76 | W | ≈ | neuro_Guilt | 0.141530 94 | 0.01363 0744 | 0.4783293 46 | 0.046067822 | 0.858669 656 | 0.082740 184 | 2.96E-2 5 |

| | | | | | | | | | | |
|----|--------------|---|---------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 77 | W | ≈ | neuro Worrier | 0.159065 401 | 0.01457 643 | 0.4573496 46 | 0.041910842 | 0.821008 243 | 0.075273 906 | 1.00E-2 7 |
| 53 | PAU | ~ | INT | -0.13926 6174 | 0.26989 2487 | -0.139270 744 | 0.269894676 | -0.10245 9262 | 0.198514 468 | 0.60585 0137 |
| 51 | PAU | ~ | EXT | 0.872710 626 | 0.21144 8182 | 0.8727140 17 | 0.211449695 | 0.642041 764 | 0.155526 912 | 3.67E-0 5 |
| 56 | PAU | ~ | W | 0.274507 264 | 0.12387 6259 | 0.2745088 12 | 0.123876916 | 0.362532 385 | 0.163646 982 | 0.02669 2899 |
| 62 | QUANT | ~ | INT | -0.43266 6947 | 0.23722 8828 | -0.432671 35 | 0.23723039 | -0.35708 3061 | 0.195769 147 | 0.06817 657 |
| 60 | QUANT | ~ | EXT | 0.848131 615 | 0.16853 342 | 0.8481321 41 | 0.168534176 | 0.699962 272 | 0.139079 323 | 4.84E-0 7 |
| 64 | QUANT | ~ | W | 0.148895 698 | 0.09789 0046 | 0.1488978 7 | 0.097890366 | 0.220596 585 | 0.145088 652 | 0.12824 7179 |
| 21 | FREQ | ~ | INT | -0.62648 6802 | 0.18348 9964 | -0.626490 37 | 0.183491701 | -0.59479 1574 | 0.174172 076 | 0.00063 9499 |
| 19 | FREQ | ~ | EXT | 0.413909 091 | 0.11000 0579 | 0.4139118 26 | 0.110001548 | 0.392968 956 | 0.104414 584 | 0.00016 8028 |
| 23 | FREQ | ~ | W | 0.246459 626 | 0.06894 2912 | 0.2464607 04 | 0.068943321 | 0.420046 414 | 0.117536 81 | 0.00035 0447 |
| 74 | W | ~ | INT | 1.708850 765 | 0.23454 0141 | 1.7088560 63 | 0.234541874 | 0.951932 805 | 0.130586 947 | 3.19E-1 3 |
| 71 | W | ~ | EXT | -0.74469 5982 | 0.15886 1043 | -0.744699 322 | 0.158862046 | -0.41484 1092 | 0.088450 418 | 2.76E-0 6 |
| 55 | PAU | ≈ | QUANT | 0.816986 793 | 0.05679 3718 | 0.8169862 93 | 0.056793718 | 0.816986 293 | 0.034472 568 | 6.41E-4 7 |
| 52 | PAU | ≈ | FREQ | 0.725638 084 | 0.06580 1208 | 0.7256366 29 | 0.065801193 | 0.725636 629 | 0.045940 535 | 2.81E-2 8 |
| 61 | QUANT | ≈ | FREQ | 0.735162 623 | 0.03716 0364 | 0.7351596 96 | 0.037160302 | 0.735159 696 | 0.029108 292 | 4.13E-8 7 |
| 34 | INT | ≈ | EXT | 0.492000 983 | 0.03094 9626 | 0.4920011 96 | 0.030949629 | 0.492001 196 | 0.030949 633 | 6.67E-5 7 |
| 40 | MDD | ≈ | MDD | 0.017069 79 | 0.00352 8171 | 0.2514020 41 | 0.051962344 | 0.251401 837 | 0.051962 344 | 1.31E-0 6 |
| 24 | GAD2 | ≈ | GAD2 | 0.016209 339 | 0.00458 9671 | 0.2856148 92 | 0.080872477 | 0.285615 326 | 0.080872 51 | 0.00041 2898 |
| 39 | LifetimeAnx | ≈ | LifetimeAnx | 0.053259 619 | 0.01928 7446 | 0.2427397 45 | 0.087904928 | 0.242739 659 | 0.087904 948 | 0.00575 6086 |
| 44 | num_partners | ≈ | num partners | 0.055141 355 | 0.00542 089 | 0.5549105 86 | 0.054552779 | 0.554910 639 | 0.054552 695 | 2.64E-2 4 |
| 1 | ADHD | ≈ | ADHD | 0.323435 345 | 0.03446 1216 | 0.6413795 04 | 0.068337404 | 0.641379 945 | 0.068337 423 | 6.26E-2 1 |
| 2 | antisoc | ≈ | antisoc | 0.026263 058 | 0.02797 5247 | 0.4915495 91 | 0.523594225 | 0.491550 055 | 0.523594 336 | 0.34783 5358 |
| 3 | AUD | ≈ | AUD | 0.010482 319 | 0.00315 7013 | 0.1829676 1 | 0.055104853 | 0.182967 352 | 0.055104 875 | 0.00089 9117 |
| 8 | AUDIT 4 | ≈ | AUDIT 4 | 0.010414 001 | 0.00447 8348 | 0.3599651 91 | 0.154797179 | 0.359966 521 | 0.154797 207 | 0.02004 999 |
| 9 | AUDIT 5 | ≈ | AUDIT 5 | 0.008396 845 | 0.00484 2021 | 0.4144840 6 | 0.23901009 | 0.414483 878 | 0.239010 093 | 0.08288 9481 |
| 10 | AUDIT 7 | ≈ | AUDIT 7 | 0.011327 035 | 0.00424 3085 | 0.3099306 32 | 0.116099472 | 0.309930 998 | 0.116099 495 | 0.00759 5787 |
| 11 | AUDIT 8 | ≈ | AUDIT 8 | 0.018874 581 | 0.00462 835 | 0.4974847 25 | 0.121989728 | 0.497484 066 | 0.121989 774 | 4.54E-0 5 |

| | | | | | | | | | | |
|----|-------------------------|----|-------------------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 4 | AUDIT 10 | ~~ | AUDIT 10 | 0.010079 579 | 0.00253 6457 | 0.3687966 39 | 0.092806175 | 0.368797 374 | 0.092806 175 | 7.07E-0 5 |
| 12 | dpw | ~~ | dpw | 0.000120 166 | 0.00272 6804 | 0.0023902 96 | 0.05425435 | 0.002390 295 | 0.054254 329 | 0.96484 9849 |
| 6 | AUDIT 2 | ~~ | AUDIT 2 | 0.014306 882 | 0.00260 103 | 0.2729672 | 0.04962655 | 0.272967 488 | 0.049626 527 | 3.79E-0 8 |
| 7 | AUDIT 3 | ~~ | AUDIT 3 | 0.007748 908 | 0.00263 3516 | 0.1279638 68 | 0.043490242 | 0.127963 816 | 0.043490 214 | 0.00325 6585 |
| 33 | intake freq | ~~ | intake freq | -0.00104 2485 | 0.00228 7656 | -0.016839 459 | 0.03695253 | -0.01683 9446 | 0.036952 529 | 0.64860 5755 |
| 5 | AUDIT 1 | ~~ | AUDIT 1 | 0.011291 027 | 0.00314 1361 | 0.1553114 19 | 0.043210631 | 0.155311 036 | 0.043210 608 | 0.00032 5252 |
| 25 | gad Contro l | ~~ | gad Control | 0.010218 774 | 0.00562 9153 | 0.1201170 09 | 0.066168217 | 0.120117 106 | 0.066168 215 | 0.06947 3126 |
| 26 | gad Worry | ~~ | gad Worry | 0.010069 3 | 0.00543 3359 | 0.1263322 74 | 0.068169087 | 0.126332 234 | 0.068169 079 | 0.06384 8435 |
| 41 | neuro_Emb arrassment | ~~ | neuro_Embarr assment | 0.048225 96 | 0.00279 5303 | 0.4764582 32 | 0.027616771 | 0.476458 118 | 0.027616 77 | 1.07E-6 6 |
| 42 | neuro Guilt | ~~ | neuro Guilt | 0.022997 484 | 0.00266 1663 | 0.2626865 42 | 0.030402335 | 0.262686 421 | 0.030402 349 | 5.61E-1 8 |
| 43 | neuro_Worr ier | ~~ | neuro Worrier | 0.039427 482 | 0.00313 4344 | 0.3259454 96 | 0.02591156 | 0.325945 466 | 0.025911 54 | 2.75E-3 6 |
| 31 | ID_INT_PA U | := | a1*b1 | 0.469091 947 | 0.19460 5439 | 0.4690960 48 | 0.194607548 | 0.345106 471 | 0.143138 782 | 0.01593 1673 |
| 69 | TOT_INT_ PAU | := | c1+(a1*b1) | 0.329825 773 | 0.04622 6357 | 0.3298253 04 | 0.046226376 | 0.242647 208 | 0.034000 769 | 9.68E-1 3 |
| 32 | ID_INT_Q UANT | := | a1*b2 | 0.254440 528 | 0.17925 9716 | 0.2544450 28 | 0.179261372 | 0.209993 126 | 0.147931 362 | 0.15578 3592 |
| 70 | TOT_INT_ QUANT | := | c2+(a1*b2) | -0.17822 6419 | 0.06419 6046 | -0.178226 322 | 0.06419596 | -0.14708 9935 | 0.052976 447 | 0.00549 8425 |
| 30 | ID_INT_FR EQ | := | a1*b3 | 0.421162 72 | 0.15037 5021 | 0.4211658 68 | 0.150376659 | 0.399855 962 | 0.142738 907 | 0.00509 8413 |
| 68 | TOT_INT_ FREQ | := | c3+(a1*b3) | -0.20532 4082 | 0.03497 5193 | -0.205324 502 | 0.034975278 | -0.19493 5612 | 0.033198 963 | 4.34E-0 9 |
| 28 | ID_EXT_P AU | := | a2*b1 | -0.20442 4456 | 0.09873 6791 | -0.204426 526 | 0.098737958 | -0.15039 3331 | 0.072624 263 | 0.03841 5086 |
| 66 | TOT_EXT_ PAU | := | c1+(a2*b1) | -0.34369 063 | 0.32489 0361 | -0.343697 271 | 0.324893589 | -0.25285 2593 | 0.238967 534 | 0.29011 6307 |
| 29 | ID_EXT_Q UANT | := | a2*b2 | -0.11088 2028 | 0.08585 5739 | -0.110884 143 | 0.085856712 | -0.09151 2528 | 0.070851 279 | 0.19653 3011 |
| 67 | TOT_EXT_ QUANT | := | c2+(a2*b2) | -0.54354 8975 | 0.32143 4261 | -0.543555 493 | 0.321436777 | -0.44859 5589 | 0.265258 538 | 0.09083 464 |
| 27 | ID_EXT_F REQ | := | a2*b3 | -0.18353 7493 | 0.07755 2854 | -0.183539 119 | 0.077553755 | -0.17425 2513 | 0.073614 743 | 0.01795 1756 |
| 65 | TOT_EXT_ FREQ | := | c3+(a2*b3) | -0.81002 4295 | 0.25419 4618 | -0.810029 489 | 0.254197223 | -0.76904 4087 | 0.241286 445 | 0.00143 9406 |
| 36 | INT | ~~ | INT | 1 | | 1 | | 1 | | NA |
| 15 | EXT | ~~ | EXT | 1 | | 1 | | 1 | | NA |
| 54 | PAU | ~~ | PAU | 1 | | 1 | | 0.541230 99 | | NA |
| 63 | QUANT | ~~ | QUANT | 1 | | 1 | | 0.681117 785 | | NA |

| | | | | | | | |
|----|------|---|------|---|---|-----------------|----|
| 20 | FREQ | ≈ | FREQ | 1 | 1 | 0.901365 26 | NA |
| 78 | W | ≈ | W | 1 | 1 | 0.310314 179 | NA |

Supplemental Table 9. Full model output for model that includes a "general negative affect" factor (GNA) as mediating the relationships between internalizing (INT), externalizing (EXT), and three alcohol use factors: problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Total effects (TOT) and indirect effects (ID) were calculated using the path coefficients (a = psychiatric factor to mediator; b = mediator to alcohol factor; c = direct path from psychiatric factor to alcohol factor).

Model fit: $\chi^2(448) = 6542.752$, AIC = 6702.752, CFI = 0.84497, SRMR = 0.101504

| | lhs | op | rhs | Unstand Est | Unstand SE | STD_Gen otype | STD_Genoty pe_SE | STD_All All | STD_All SE | p_value |
|----|-------|----|----------------------|-----------------|-----------------|------------------|---------------------|-----------------|-----------------|---------------|
| 57 | INT | ≈ | MDD | 0.229359 977 | 0.00672 163 | 0.8758667 55 | 0.025668205 | 0.875866 947 | 0.025668 208 | 3.40E-2 55 |
| 54 | INT | ≈ | GAD2 | 0.205323 072 | 0.00866 3415 | 0.8506009 82 | 0.035890353 | 0.850600 842 | 0.035890 357 | 3.60E-1 24 |
| 56 | INT | ≈ | LifetimeAnx | 0.390134 083 | 0.01624 1707 | 0.8321603 72 | 0.034643753 | 0.832160 267 | 0.034643 758 | 1.70E-1 27 |
| 16 | EXT | ≈ | num_partners | 0.190752 775 | 0.01057 0854 | 0.6048092 62 | 0.033516419 | 0.604809 319 | 0.033516 499 | 8.61E-7 3 |
| 13 | EXT | ≈ | ADHD | 0.467437 237 | 0.03333 9183 | 0.6581633 95 | 0.046942425 | 0.658163 205 | 0.046942 477 | 1.17E-4 4 |
| 14 | EXT | ≈ | antisoc | 0.172746 769 | 0.02362 8809 | 0.7259018 27 | 0.099290922 | 0.725901 886 | 0.099291 085 | 2.65E-1 3 |
| 73 | PAU | ≈ | AUD | 0.158648 43 | 0.01233 2154 | 0.6610237 73 | 0.051383646 | 0.873366 768 | 0.067939 759 | 7.12E-3 8 |
| 75 | PAU | ≈ | AUDIT_4 | 0.104260 257 | 0.01091 0783 | 0.5941077 96 | 0.062173412 | 0.784955 144 | 0.082206 415 | 1.23E-2 1 |
| 76 | PAU | ≈ | AUDIT_5 | 0.083824 426 | 0.00982 148 | 0.5876032 22 | 0.068848215 | 0.776361 301 | 0.091032 05 | 1.40E-1 7 |
| 77 | PAU | ≈ | AUDIT_7 | 0.123977 932 | 0.01174 5052 | 0.6271157 71 | 0.059410252 | 0.828566 185 | 0.078552 82 | 4.78E-2 6 |
| 78 | PAU | ≈ | AUDIT_8 | 0.108085 355 | 0.01104 7301 | 0.5420873 18 | 0.055406542 | 0.716224 136 | 0.073259 127 | 1.32E-2 2 |
| 74 | PAU | ≈ | AUDIT_10 | 0.097445 635 | 0.00942 947 | 0.5865494 98 | 0.056758732 | 0.774969 258 | 0.075046 992 | 4.94E-2 5 |
| 87 | QUANT | ≈ | dpw | 0.129918 326 | 0.01344 3928 | 0.5745388 25 | 0.059453679 | 0.700286 547 | 0.072471 807 | 4.30E-2 2 |
| 85 | QUANT | ≈ | AUDIT_2 | 0.159090 852 | 0.00943 5797 | 0.6933895 12 | 0.04112636 | 0.845149 752 | 0.050130 935 | 8.81E-6 4 |
| 86 | QUANT | ≈ | AUDIT_3 | 0.185947 927 | 0.01031 8709 | 0.7514430 81 | 0.041700528 | 0.915908 836 | 0.050830 632 | 1.35E-7 2 |
| 18 | FREQ | ≈ | dpw | 0.078699 603 | 0.01445 7983 | 0.3480360 13 | 0.063937686 | 0.355944 375 | 0.065392 624 | 5.23E-0 8 |
| 23 | FREQ | ≈ | intake freq | 0.241765 839 | 0.00677 7542 | 0.9700930 04 | 0.027195057 | 0.992136 313 | 0.027813 855 | 1.09E-2 78 |
| 17 | FREQ | ≈ | AUDIT_1 | 0.248982 194 | 0.00826 0533 | 0.9201004 84 | 0.030526352 | 0.941007 661 | 0.031220 936 | 1.40E-1 99 |
| 31 | GNA | ≈ | gad_Irritabilit y | 0.104876 372 | 0.01477 3775 | 0.3675020 82 | 0.051771797 | 0.819054 635 | 0.115475 565 | 1.26E-1 2 |

| | | | | | | | | | | |
|----|-------|---|-------------------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 29 | GNA | ≈ | gad Anxiety | 0.107099 333 | 0.01504 0006 | 0.3973360 33 | 0.055800617 | 0.885547 067 | 0.124461 731 | 1.07E-1 2 |
| 30 | GNA | ≈ | gad_Forebodi ng | 0.115809 583 | 0.01621 3451 | 0.3738170 94 | 0.052337128 | 0.833128 745 | 0.116736 449 | 9.14E-1 3 |
| 35 | GNA | ≈ | mdd Appetite | 0.097537 244 | 0.01390 4189 | 0.3284104 07 | 0.046817807 | 0.731929 865 | 0.104425 854 | 2.30E-1 2 |
| 36 | GNA | ≈ | mdd_Concent ration | 0.100236 879 | 0.01421 9602 | 0.3722046 95 | 0.052803285 | 0.829535 141 | 0.117776 336 | 1.80E-1 2 |
| 37 | GNA | ≈ | mdd Ideation | 0.108686 128 | 0.01611 9784 | 0.3969321 03 | 0.058873407 | 0.884645 323 | 0.131315 656 | 1.56E-1 1 |
| 38 | GNA | ≈ | mdd Motor | 0.094178 934 | 0.01397 7629 | 0.3464255 6 | 0.051417084 | 0.772081 986 | 0.114684 426 | 1.61E-1 1 |
| 39 | GNA | ≈ | mdd Sleep | 0.079952 797 | 0.01156 5824 | 0.2914160 56 | 0.042157529 | 0.649481 226 | 0.094031 214 | 4.75E-1 2 |
| 34 | GNA | ≈ | mdd_Anhedo nia | 0.112586 277 | 0.01586 5943 | 0.3858733 63 | 0.054380714 | 0.859998 973 | 0.121294 673 | 1.28E-1 2 |
| 40 | GNA | ≈ | neuro Fed up | 0.112469 827 | 0.01532 8677 | 0.3710711 9 | 0.050576258 | 0.827009 104 | 0.112808 789 | 2.18E-1 3 |
| 41 | GNA | ≈ | neuro_Hurt_f eelings | 0.091405 797 | 0.01255 5516 | 0.3032878 98 | 0.041661628 | 0.675941 063 | 0.092925 083 | 3.33E-1 3 |
| 42 | GNA | ≈ | neuro_Irritabi lity | 0.106652 976 | 0.01462 6014 | 0.3170725 16 | 0.043484276 | 0.706662 518 | 0.096990 395 | 3.05E-1 3 |
| 43 | GNA | ≈ | neuro Lonely | 0.098936 487 | 0.01379 7417 | 0.3760107 57 | 0.052439896 | 0.838018 895 | 0.116965 641 | 7.46E-1 3 |
| 44 | GNA | ≈ | neuro Nerves | 0.088521 712 | 0.01215 5279 | 0.3034241 72 | 0.041666354 | 0.676244 283 | 0.092935 601 | 3.28E-1 3 |
| 45 | GNA | ≈ | neuro_Nervou s | 0.089092 068 | 0.01208 8648 | 0.2534522 45 | 0.034391817 | 0.564871 454 | 0.076709 946 | 1.71E-1 3 |
| 82 | PAU | ~ | INT | 0.156775 791 | 0.32492 7921 | 0.1567597 66 | 0.324944429 | 0.118646 504 | 0.245751 624 | 0.62945 502 |
| 79 | PAU | ~ | EXT | 0.705642 835 | 0.15655 2602 | 0.7056541 56 | 0.156559656 | 0.534087 289 | 0.118403 224 | 6.56E-0 6 |
| 81 | PAU | ~ | GNA | 0.059916 045 | 0.12580 1998 | 0.0599207 36 | 0.125805666 | 0.101076 653 | 0.212223 627 | 0.63388 0178 |
| 91 | QUANT | ~ | INT | -0.43303 756 | 0.30127 2966 | -0.433075 933 | 0.301296916 | -0.35531 018 | 0.247161 158 | 0.15061 587 |
| 88 | QUANT | ~ | EXT | 0.833216 67 | 0.15119 6803 | 0.8332385 76 | 0.151207665 | 0.683617 181 | 0.124038 841 | 3.57E-0 8 |
| 90 | QUANT | ~ | GNA | 0.089134 733 | 0.10720 6847 | 0.0891459 32 | 0.107211944 | 0.163004 093 | 0.196172 884 | 0.40573 2104 |
| 22 | FREQ | ~ | INT | -0.10270 4182 | 0.15601 035 | -0.102710 861 | 0.156017619 | -0.10042 8835 | 0.152543 702 | 0.51033 48 |
| 19 | FREQ | ~ | EXT | 0.193790 319 | 0.06387 1219 | 0.1937917 59 | 0.063873863 | 0.189486 101 | 0.062451 325 | 0.00241 2713 |
| 21 | FREQ | ~ | GNA | -0.04770 9781 | 0.06282 8476 | -0.047705 922 | 0.062829972 | -0.10396 0349 | 0.137023 1 | 0.44763 3905 |
| 33 | GNA | ~ | INT | 2.222060 191 | 0.38865 6909 | 2.2221170 38 | 0.388682951 | 0.997042 222 | 0.174253 419 | 1.08E-0 8 |
| 28 | GNA | ~ | EXT | -0.54209 4669 | 0.18172 5517 | -0.542123 287 | 0.18173665 | -0.24324 5426 | 0.081475 415 | 0.00285 3998 |
| 84 | PAU | ≈ | QUANT | 0.831398 361 | 0.05772 1624 | 0.8313989 56 | 0.05772254 | 0.831398 956 | 0.035813 34 | 4.91E-4 7 |
| 80 | PAU | ≈ | FREQ | 0.756580 736 | 0.06192 212 | 0.7565829 2 | 0.061922644 | 0.756582 92 | 0.045790 167 | 2.48E-3 4 |

| | | | | | | | | | | |
|----|-------------------|----|-------------------|-----------------|-----------------|-----------------|-------------|-----------------|-----------------|-----------------|
| 89 | QUANT | ~~ | FREQ | 0.779337 203 | 0.03904 053 | 0.7793380 7 | 0.039041317 | 0.779338 07 | 0.031314 979 | 1.17E-8 8 |
| 53 | INT | ~~ | EXT | 0.524855 912 | 0.03179 9593 | 0.5248602 23 | 0.031799833 | 0.524860 223 | 0.031799 61 | 3.37E-6 1 |
| 63 | MDD | ~~ | MDD | 0.015967 636 | 0.00358 8243 | 0.2328569 9 | 0.052326718 | 0.232857 092 | 0.052326 757 | 8.59E-0 6 |
| 24 | GAD2 | ~~ | GAD2 | 0.016109 308 | 0.00476 8649 | 0.2764782 99 | 0.08184136 | 0.276478 208 | 0.081841 397 | 0.00072 9699 |
| 58 | LifetimeAnx | ~~ | LifetimeAnx | 0.067587 181 | 0.01915 5488 | 0.3075093 67 | 0.087152599 | 0.307509 29 | 0.087152 619 | 0.00041 8166 |
| 72 | num_partners | ~~ | num partners | 0.063085 88 | 0.00490 8919 | 0.6342055 7 | 0.049349369 | 0.634205 688 | 0.049349 557 | 8.46E-3 8 |
| 1 | ADHD | ~~ | ADHD | 0.285904 85 | 0.03727 9463 | 0.5668215 21 | 0.073908013 | 0.566821 195 | 0.073908 165 | 1.73E-1 4 |
| 2 | antisoc | ~~ | antisoc | 0.026790 326 | 0.02822 0722 | 0.4730663 76 | 0.49831681 | 0.473066 452 | 0.498316 875 | 0.34246 0951 |
| 3 | AUD | ~~ | AUD | 0.013664 782 | 0.00310 753 | 0.2372305 73 | 0.053948734 | 0.237230 489 | 0.053948 765 | 1.10E-0 5 |
| 8 | AUDIT 4 | ~~ | AUDIT 4 | 0.011821 178 | 0.00445 8512 | 0.3838455 5 | 0.144772484 | 0.383845 422 | 0.144772 481 | 0.00801 6528 |
| 9 | AUDIT 5 | ~~ | AUDIT 5 | 0.008084 414 | 0.00483 9316 | 0.3972630 38 | 0.237801577 | 0.397263 13 | 0.237801 556 | 0.09480 6703 |
| 10 | AUDIT 7 | ~~ | AUDIT 7 | 0.012251 689 | 0.00425 2373 | 0.3134783 35 | 0.108803201 | 0.313478 077 | 0.108803 191 | 0.00396 2375 |
| 11 | AUDIT 8 | ~~ | AUDIT 8 | 0.019361 627 | 0.00464 0591 | 0.4870228 88 | 0.116729514 | 0.487022 987 | 0.116729 5 | 3.02E-0 5 |
| 4 | AUDIT_10 | ~~ | AUDIT 10 | 0.011024 175 | 0.00261 4442 | 0.3994223 8 | 0.094725579 | 0.399422 649 | 0.094725 565 | 2.48E-0 5 |
| 12 | dpw | ~~ | dpw | 0.001512 901 | 0.00274 4987 | 0.0295873 21 | 0.053683675 | 0.029587 321 | 0.053683 681 | 0.58153 0578 |
| 6 | AUDIT 2 | ~~ | AUDIT 2 | 0.015040 945 | 0.00264 7567 | 0.2857218 95 | 0.050293888 | 0.285721 897 | 0.050293 89 | 1.34E-0 8 |
| 7 | AUDIT 3 | ~~ | AUDIT 3 | 0.009865 314 | 0.00265 8817 | 0.1611111 83 | 0.043421268 | 0.161111 005 | 0.043421 24 | 0.00020 692 |
| 52 | intake_freq | ~~ | intake freq | 0.000973 085 | 0.00216 2316 | 0.0156655 34 | 0.034814157 | 0.015665 536 | 0.034814 157 | 0.65269 6088 |
| 5 | AUDIT 1 | ~~ | AUDIT 1 | 0.008384 756 | 0.00310 0397 | 0.1145046 06 | 0.042340002 | 0.114504 581 | 0.042339 99 | 0.00684 2496 |
| 27 | gad_Irritability | ~~ | gad_Irritability | 0.026804 767 | 0.00510 469 | 0.3291499 77 | 0.0626829 | 0.329149 505 | 0.062682 902 | 1.51E-0 7 |
| 25 | gad_Anxiety | ~~ | gad Anxiety | 0.015678 513 | 0.00486 7181 | 0.2158060 76 | 0.066993978 | 0.215806 392 | 0.066993 978 | 0.00127 623 |
| 26 | gad_Foreboding | ~~ | gad_Foreboding | 0.029358 002 | 0.00629 8 | 0.3058970 82 | 0.065621631 | 0.305896 494 | 0.065621 634 | 3.14E-0 6 |
| 60 | mdd_Appetite | ~~ | mdd Appetite | 0.040951 244 | 0.00666 2885 | 0.4642804 32 | 0.075538895 | 0.464278 673 | 0.075538 895 | 7.94E-1 0 |
| 61 | mdd_Concentration | ~~ | mdd Concentration | 0.022617 54 | 0.00614 6488 | 0.3118720 79 | 0.084752215 | 0.311871 45 | 0.084752 216 | 0.00023 3462 |
| 62 | mdd_Ideation | ~~ | mdd Ideation | 0.016299 686 | 0.01485 5161 | 0.2174030 73 | 0.198141787 | 0.217402 653 | 0.198141 793 | 0.27253 6213 |
| 64 | mdd_Motor | ~~ | mdd Motor | 0.029849 468 | 0.01171 6453 | 0.4038891 97 | 0.158534037 | 0.403889 406 | 0.158534 043 | 0.01084 4997 |
| 65 | mdd_Sleep | ~~ | mdd Sleep | 0.043519 569 | 0.00517 3731 | 0.5781748 13 | 0.068735071 | 0.578174 137 | 0.068735 073 | 4.04E-1 7 |

| | | | | | | | | | | |
|----|---------------------|----|---------------------|--------------|-------------|--------------|-------------|--------------|-------------|-------------|
| 59 | mdd_Anhedonia | ~~ | mdd_Anhedonia | 0.02216697 | 0.00575781 | 0.260402062 | 0.06763817 | 0.260401766 | 0.067638171 | 0.000118168 |
| 66 | neuro_Fed up | ~~ | neuro Fed up | 0.0290337 | 0.002377399 | 0.316056417 | 0.025879757 | 0.316055942 | 0.025879751 | 2.67E-34 |
| 67 | neuro_Hurt feelings | ~~ | neuro_Hurt feelings | 0.049329385 | 0.002844184 | 0.543102756 | 0.0313138 | 0.543103679 | 0.031313802 | 2.19E-67 |
| 68 | neuro_Irritability | ~~ | neuro_Irritability | 0.056640718 | 0.0033559 | 0.500627907 | 0.029661695 | 0.500628086 | 0.029661696 | 6.54E-64 |
| 69 | neuro_Lonely | ~~ | neuro Lonely | 0.020611648 | 0.002697171 | 0.297724111 | 0.038959307 | 0.297724332 | 0.038959303 | 2.14E-14 |
| 70 | neuro_Nerves | ~~ | neuro Nerves | 0.046189055 | 0.003358732 | 0.542693542 | 0.039463125 | 0.54269367 | 0.039463122 | 4.96E-43 |
| 71 | neuro_Nervous | ~~ | neuro_Nervous | 0.0841331 | 0.004085935 | 0.680919906 | 0.033068984 | 0.68092024 | 0.033068982 | 3.31E-94 |
| 50 | ID_INT_PAU | := | a1*b1 | 0.133137059 | 0.18638828 | 0.133150887 | 0.186400781 | 0.100777691 | 0.14097125 | 0.475041987 |
| 97 | TOT_INT_PAU | := | c1+(a1*b1) | 0.28991285 | 0.054223066 | 0.289910654 | 0.05422403 | 0.219424195 | 0.041009325 | 8.96E-08 |
| 51 | ID_INT_QUANT | := | a1*b2 | 0.198062741 | 0.222407695 | 0.198092694 | 0.22242876 | 0.162521963 | 0.182462261 | 0.373176501 |
| 98 | TOT_INT_QUANT | := | c2+(a1*b2) | -0.234974818 | 0.073563646 | -0.234983239 | 0.073566335 | -0.192788218 | 0.060349254 | 0.001402333 |
| 49 | ID_INT_FREQ | := | a1*b3 | -0.106014006 | 0.101102949 | -0.106008143 | 0.101108723 | -0.103652857 | 0.098857061 | 0.294373853 |
| 96 | TOT_INT_FREQ | := | c3+(a1*b3) | -0.208718188 | 0.033948914 | -0.208719004 | 0.033949366 | -0.204081692 | 0.033193695 | 7.85E-10 |
| 47 | ID_EXT_PAU | := | a2*b1 | -0.032480169 | 0.048494333 | -0.03248426 | 0.04849905 | -0.024586434 | 0.036677959 | 0.503002855 |
| 94 | TOT_EXT_PAU | := | c1+(a2*b1) | 0.124295622 | 0.281596549 | 0.12427534 | 0.281614627 | 0.094060071 | 0.212979358 | 0.658926257 |
| 48 | ID_EXT_QUANT | := | a2*b2 | -0.048319463 | 0.060898485 | -0.048328085 | 0.060906256 | -0.03965 | 0.049961127 | 0.42751989 |
| 95 | TOT_EXT_QUANT | := | c2+(a2*b2) | -0.481357023 | 0.345429049 | -0.481404019 | 0.345460125 | -0.39496018 | 0.283386991 | 0.163467207 |
| 46 | ID_EXT_FREQ | := | a2*b3 | 0.025863218 | 0.023641551 | 0.025862491 | 0.023643563 | 0.025287879 | 0.023116572 | 0.273966826 |
| 93 | TOT_EXT_FREQ | := | c3+(a2*b3) | -0.076840964 | 0.152981205 | -0.07684837 | 0.152989614 | -0.075140955 | 0.149582323 | 0.615463384 |
| 55 | INT | ~~ | INT | 1 | | 1 | | 1 | | NA |
| 15 | EXT | ~~ | EXT | 1 | | 1 | | 1 | | NA |
| 83 | PAU | ~~ | PAU | 1 | | 1 | | 0.572849684 | | NA |
| 92 | QUANT | ~~ | QUANT | 1 | | 1 | | 0.673111798 | | NA |
| 20 | FREQ | ~~ | FREQ | 1 | | 1 | | 0.956057708 | | NA |
| 32 | GNA | ~~ | GNA | 1 | | 1 | | 0.201322929 | | NA |

Supplemental Table 10. Full model output for model that includes an "anxious arousal" factor (AA) as mediating the relationships between internalizing (INT), externalizing (EXT), and three alcohol use factors: problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Total effects (TOT) and indirect effects (ID) were calculated using the path coefficients (a = psychiatric factor to mediator; b = mediator to alcohol factor; c = direct path from psychiatric factor to alcohol factor).

Model fit: $\chi^2(173) = 771.5416$, AIC = 887.5416, CFI = 0.959579, SRMR = 0.094138

| | lhs | op | rhs | Unstand Est | Unstand SE | STD_Genotype | STD_Genotype SE | STD All | STD All SE | p value |
|----|-------|----|-------------------|-----------------|-----------------|--------------------------|-----------------|-----------------|-----------------|---------------|
| 45 | INT | =~ | MDD | 0.235030 465 | 0.00702 4222 | 0.9055258 43 | 0.027062937 | 0.905525 832 | 0.027062 959 | 1.84E-2 45 |
| 42 | INT | =~ | GAD2 | 0.191175 86 | 0.00846 9599 | 0.8070539 53 | 0.035754555 | 0.807053 948 | 0.035754 566 | 8.17E-11 3 |
| 44 | INT | =~ | LifetimeAnx | 0.409140 67 | 0.01646 9887 | 0.8749465 66 | 0.035220458 | 0.874946 542 | 0.035220 474 | 3.18E-1 36 |
| 23 | EXT | =~ | num_partners | 0.203573 403 | 0.01073 7335 | 0.6453492 44 | 0.034036969 | 0.645349 239 | 0.034036 985 | 3.69E-8 0 |
| 20 | EXT | =~ | ADHD | 0.441927 878 | 0.03119 2785 | 0.6222859 38 | 0.043922092 | 0.622285 927 | 0.043922 096 | 1.45E-4 5 |
| 21 | EXT | =~ | antisoc | 0.162961 658 | 0.02179 8728 | 0.7219299 92 | 0.096566776 | 0.721929 753 | 0.096566 796 | 7.68E-1 4 |
| 52 | PAU | =~ | AUD | 0.171524 165 | 0.01231 8989 | 0.7176500 24 | 0.051540987 | 0.937818 153 | 0.067386 764 | 4.56E-4 4 |
| 54 | PAU | =~ | AUDIT_4 | 0.099920 042 | 0.01032 8673 | 0.5814689 83 | 0.060106193 | 0.759858 17 | 0.078585 276 | 3.89E-2 2 |
| 55 | PAU | =~ | AUDIT_5 | 0.081353 675 | 0.00953 645 | 0.5784288 52 | 0.067804646 | 0.755885 523 | 0.088650 561 | 1.45E-1 7 |
| 56 | PAU | =~ | AUDIT_7 | 0.115054 117 | 0.01092 6379 | 0.6050956 77 | 0.057463722 | 0.790733 251 | 0.075130 401 | 6.29E-2 6 |
| 57 | PAU | =~ | AUDIT_8 | 0.103597 127 | 0.01040 8619 | 0.5292154 95 | 0.053170666 | 0.691573 718 | 0.069517 49 | 2.45E-2 3 |
| 53 | PAU | =~ | AUDIT_10 | 0.102669 718 | 0.00922 3839 | 0.6271632 64 | 0.056344131 | 0.819570 955 | 0.073666 599 | 8.87E-2 9 |
| 66 | QUANT | =~ | dpw | 0.127513 714 | 0.01162 33 | 0.5699282 66 | 0.051608115 | 0.688454 445 | 0.062354 944 | 5.30E-2 8 |
| 64 | QUANT | =~ | AUDIT_2 | 0.161408 178 | 0.00930 7245 | 0.7080083 61 | 0.040793358 | 0.855250 183 | 0.049287 998 | 2.26E-6 7 |
| 65 | QUANT | =~ | AUDIT_3 | 0.188934 194 | 0.01013 9006 | 0.7683566 99 | 0.041193192 | 0.928148 976 | 0.049771 014 | 1.69E-7 7 |
| 26 | FREQ | =~ | dpw | 0.084597 149 | 0.01197 8424 | 0.3763661 91 | 0.053064682 | 0.387503 54 | 0.054644 851 | 1.64E-1 2 |
| 30 | FREQ | =~ | intake freq | 0.240724 554 | 0.00746 1067 | 0.9744368 0.030034844 | | 0.974436 8 | 0.030929 1 | 2.23E-2 28 |
| 25 | FREQ | =~ | AUDIT_1 | 0.241317 973 | 0.00878 4356 | 0.8961609 24 | 0.032539079 | 0.922679 56 | 0.033507 961 | 3.86E-1 66 |
| 3 | AA | =~ | gad_Relax | 0.103435 804 | 0.02157 3333 | 0.3625978 74 | 0.075639469 | 0.863946 566 | 0.180294 545 | 1.63E-0 6 |
| 4 | AA | =~ | gad_Restlessness | 0.102148 83 | 0.02165 1786 | 0.3596077 0.076236727 | | 0.856821 972 | 0.181718 32 | 2.38E-0 6 |
| 6 | AA | =~ | mdd Sleep | 0.068714 342 | 0.01443 7483 | 0.2509208 24 | 0.052729725 | 0.597858 361 | 0.125686 865 | 1.94E-0 6 |
| 7 | AA | =~ | neuro_High_strung | 0.109117 193 | 0.02318 3432 | 0.3223655 69 | 0.068502897 | 0.768086 794 | 0.163283 913 | 2.52E-0 6 |

| | | | | | | | | | | |
|----|------------------|----|------------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 60 | PAU | ~ | INT | 0.240933 159 | 0.39361 952 | 0.2409241 13 | 0.393681125 | 0.184363 239 | 0.301096 131 | 0.54047 3865 |
| 58 | PAU | ~ | EXT | 0.666986 226 | 0.14187 2838 | 0.6669877 05 | 0.141884384 | 0.510401 438 | 0.108518 455 | 2.59E-0 6 |
| 51 | PAU | ~ | AA | 0.020958 757 | 0.15231 8928 | 0.0209580 04 | 0.152330156 | 0.038212 514 | 0.277714 406 | 0.89055 8257 |
| 69 | QUANT | ~ | INT | -0.38106 997 | 0.34109 7078 | -0.381715 059 | 0.340995879 | -0.31599 7978 | 0.282209 033 | 0.26391 344 |
| 67 | QUANT | ~ | EXT | 0.786427 568 | 0.13562 9666 | 0.7860335 41 | 0.135528962 | 0.650707 914 | 0.112165 93 | 6.70E-0 9 |
| 63 | QUANT | ~ | AA | 0.078375 008 | 0.12289 1507 | 0.0785850 02 | 0.12281096 | 0.155005 216 | 0.242277 854 | 0.52363 1403 |
| 29 | FREQ | ~ | INT | -0.49782 6157 | 0.27218 0641 | -0.495833 957 | 0.271150783 | -0.48158 3077 | 0.263296 501 | 0.06739 5335 |
| 27 | FREQ | ~ | EXT | 0.280706 083 | 0.08352 444 | 0.2796186 2 | 0.083201839 | 0.271582 036 | 0.080792 63 | 0.00077 7267 |
| 24 | FREQ | ~ | AA | 0.127356 17 | 0.09008 6697 | 0.1268377 26 | 0.089747542 | 0.293524 958 | 0.207735 795 | 0.15744 8026 |
| 5 | AA | ~ | INT | 2.357161 51 | 0.57500 9199 | 2.3573926 35 | 0.575154611 | 0.989396 312 | 0.241276 999 | 4.14E-0 5 |
| 2 | AA | ~ | EXT | -0.46443 8103 | 0.20426 9253 | -0.464516 164 | 0.204310671 | -0.19495 7163 | 0.085709 279 | 0.02298 6651 |
| 62 | PAU | ~~ | QUANT | 0.816541 85 | 0.05615 4634 | 0.8166671 58 | 0.05613189 | 0.816667 158 | 0.035532 701 | 6.67E-4 8 |
| 59 | PAU | ~~ | FREQ | 0.742765 224 | 0.06601 9367 | 0.7402229 95 | 0.065774769 | 0.740222 995 | 0.048852 945 | 2.30E-2 9 |
| 68 | QUANT | ~~ | FREQ | 0.757257 188 | 0.03691 0205 | 0.7535576 96 | 0.036767631 | 0.753557 696 | 0.029550 587 | 1.54E-9 3 |
| 41 | INT | ~~ | EXT | 0.500438 89 | 0.03089 9025 | 0.5004434 12 | 0.030899193 | 0.500443 412 | 0.030899 136 | 5.39E-5 9 |
| 40 | intake_fre q | ~~ | intake freq | 0.000999 957 | 0.00223 1558 | 0.0010004 17 | 0.036532042 | 0.001000 417 | 0.036532 042 | 0.65408 2472 |
| 47 | MDD | ~~ | MDD | 0.012127 391 | 0.00368 3488 | 0.1800229 71 | 0.054677613 | 0.180022 967 | 0.054677 697 | 0.00099 3481 |
| 31 | GAD2 | ~~ | GAD2 | 0.019563 067 | 0.00452 2141 | 0.3486639 28 | 0.080591437 | 0.348663 924 | 0.080591 468 | 1.52E-0 5 |
| 46 | LifetimeA nx | ~~ | LifetimeAnx | 0.051270 221 | 0.01940 8624 | 0.2344685 62 | 0.088758547 | 0.234468 549 | 0.088758 597 | 0.00825 1042 |
| 50 | num_part ners | ~~ | num_partner s | 0.058064 962 | 0.00513 6397 | 0.5835243 68 | 0.051616611 | 0.583524 36 | 0.051616 643 | 1.25E-2 9 |
| 8 | ADHD | ~~ | ADHD | 0.309032 047 | 0.03474 2668 | 0.6127602 46 | 0.068887068 | 0.612760 225 | 0.068887 078 | 5.85E-1 9 |
| 9 | antisoc | ~~ | antisoc | 0.024397 446 | 0.02793 1977 | 0.4788177 48 | 0.548178796 | 0.478817 431 | 0.548178 807 | 0.38241 2766 |
| 10 | AUD | ~~ | AUD | 0.006886 462 | 0.00321 0422 | 0.1204971 17 | 0.056198478 | 0.120497 112 | 0.056198 478 | 0.03195 0204 |
| 15 | AUDIT 4 | ~~ | AUDIT 4 | 0.012477 632 | 0.00453 7252 | 0.4226154 74 | 0.153663412 | 0.422615 562 | 0.153663 409 | 0.00595 8765 |
| 16 | AUDIT 5 | ~~ | AUDIT 5 | 0.008477 883 | 0.00485 9523 | 0.4286367 98 | 0.24567492 | 0.428637 077 | 0.245674 918 | 0.08105 5972 |
| 17 | AUDIT 7 | ~~ | AUDIT 7 | 0.013547 311 | 0.00431 2509 | 0.3747409 05 | 0.119287182 | 0.374740 926 | 0.119287 179 | 0.00168 143 |
| 18 | AUDIT 8 | ~~ | AUDIT 8 | 0.019992 852 | 0.00465 2637 | 0.5217258 16 | 0.121412879 | 0.521725 792 | 0.121412 876 | 1.73E-0 5 |

| | | | | | | | | | | |
|----|-----------------------|----|-----------------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 11 | AUDIT_1 0 | ~~ | AUDIT 10 | 0.008797 439 | 0.00251 0853 | 0.3283034 37 | 0.093694333 | 0.328303 449 | 0.093694 332 | 0.00045 8731 |
| 19 | dpw | ~~ | dpw | 2.97E-05 | 0.00273 4067 | 0.0017429 59 | 0.054353624 | 0.001742 96 | 0.054353 619 | 0.99132 6499 |
| 13 | AUDIT_2 | ~~ | AUDIT_2 | 0.014012 412 | 0.00261 7288 | 0.2685473 72 | 0.050314183 | 0.268547 125 | 0.050314 18 | 8.61E-0 8 |
| 14 | AUDIT_3 | ~~ | AUDIT_3 | 0.008437 566 | 0.00263 3233 | 0.1385395 95 | 0.043532484 | 0.138539 479 | 0.043532 494 | 0.00135 4098 |
| 12 | AUDIT_1 | ~~ | AUDIT_1 | 0.010867 521 | 0.00310 7553 | 0.1486625 34 | 0.042766615 | 0.148662 43 | 0.042766 626 | 0.00047 029 |
| 32 | gad_Relax | ~~ | gad_Relax | 0.020632 497 | 0.00509 8185 | 0.2535963 38 | 0.062660835 | 0.253596 331 | 0.062660 84 | 5.19E-0 5 |
| 33 | gad_Restl essness | ~~ | gad_Restless ness | 0.021447 178 | 0.00838 0746 | 0.2658561 35 | 0.10388304 | 0.265856 108 | 0.103883 038 | 0.01049 4319 |
| 48 | mdd_Slee p | ~~ | mdd_Sleep | 0.048178 885 | 0.00560 7991 | 0.6425654 78 | 0.074793425 | 0.642565 38 | 0.074793 422 | 8.61E-1 8 |
| 49 | neuro_Hi gh_strung | ~~ | neuro_High_ strung | 0.046973 679 | 0.00478 9042 | 0.4100426 51 | 0.041804636 | 0.410042 676 | 0.041804 679 | 1.03E-2 2 |
| 38 | ID_INT_ PAU | := | a1*b1 | 0.049403 174 | 0.24906 1294 | 0.0494062 43 | 0.24910814 | 0.037807 32 | 0.190522 666 | 0.84276 5371 |
| 75 | TOT_INT PAU | := | c1+(a1*b1) | 0.290336 333 | 0.05060 7068 | 0.2903303 56 | 0.050607608 | 0.222170 559 | 0.038707 234 | 9.63E-0 9 |
| 39 | ID_INT_ QUANT | := | a1*b2 | 0.184742 552 | 0.28776 1148 | 0.1852557 04 | 0.287700834 | 0.153361 589 | 0.238100 047 | 0.52087 3421 |
| 76 | TOT_INT QUANT | := | c2+(a1*b2) | -0.19632 7418 | 0.06532 587 | -0.196459 355 | 0.065271576 | -0.16263 6389 | 0.054021 355 | 0.00265 2712 |
| 37 | ID_INT_ FREQ | := | a1*b3 | 0.300199 062 | 0.22797 3513 | 0.2990063 22 | 0.227133742 | 0.290412 511 | 0.220553 424 | 0.18790 0466 |
| 74 | TOT_INT FREQ | := | c3+(a1*b3) | -0.19762 7095 | 0.03333 4393 | -0.196827 635 | 0.033196131 | -0.19117 0566 | 0.032236 038 | 3.05E-0 9 |
| 35 | ID_EXT_ PAU | := | a2*b1 | -0.00973 4045 | 0.05017 2137 | -0.009735 331 | 0.050184876 | -0.00744 9803 | 0.038381 926 | 0.84616 573 |
| 72 | TOT_EX T_PAU | := | c1+(a2*b1) | 0.231199 114 | 0.33358 3796 | 0.2311887 82 | 0.333644039 | 0.176913 436 | 0.255177 919 | 0.48826 1499 |
| 36 | ID_EXT_ QUANT | := | a2*b2 | -0.03640 034 | 0.06349 7258 | -0.036504 004 | 0.063512373 | -0.03021 9377 | 0.052561 682 | 0.56646 9713 |
| 73 | TOT_EX T_QUAN T | := | c2+(a2*b2) | -0.41747 0309 | 0.39506 2133 | -0.418219 063 | 0.394976416 | -0.34621 7356 | 0.326881 963 | 0.29063 9103 |
| 34 | ID_EXT_ FREQ | := | a2*b3 | -0.05914 9058 | 0.05457 9443 | -0.058918 174 | 0.054377008 | -0.05722 4793 | 0.052801 296 | 0.27848 7147 |
| 71 | TOT_EX T_FREQ | := | c3+(a2*b3) | -0.55697 5216 | 0.30196 0857 | -0.554752 131 | 0.300830075 | -0.53880 787 | 0.292115 339 | 0.06510 6248 |
| 43 | INT | ~~ | INT | 1 | | 1 | | 1 | | NA |
| 22 | EXT | ~~ | EXT | 1 | | 1 | | 1 | | NA |
| 61 | PAU | ~~ | PAU | 1 | | 1 | | 0.585582 545 | | NA |
| 70 | QUANT | ~~ | QUANT | 1 | | 1 | | 0.685314 658 | | NA |
| 28 | FREQ | ~~ | FREQ | 1 | | 1 | | 0.943343 592 | | NA |
| 1 | AA | ~~ | AA | 1 | | 1 | | 0.176147 6 | | NA |

Supplemental Table 11. Full model output for model that includes a "low positive affect" factor (LPA) as mediating the relationships between internalizing (INT), externalizing (EXT), and three alcohol use factors: problematic use (PAU), consumption quantity (QUANT), and consumption frequency (FREQ). Total effects (TOT) and indirect effects (ID) were calculated using the path coefficients (a = psychiatric factor to mediator; b = mediator to alcohol factor; c = direct path from psychiatric factor to alcohol factor).
Model fit: $\chi^2(193) = 811.6359$, AIC = 931.6359, CFI = 0.962583, SRMR = 0.09049

| | lhs | op | rhs | Unstand Est | Unstand SE | STD_Genotype | STD_Genotype SE | STD All | STD All SE | p value |
|----|-------|----|-------------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|---------------|
| 31 | INT | ≈ | MDD | 0.238636 763 | 0.007260 816 | 0.9155982 49 | 0.027858186 | 0.915598 134 | 0.027858 178 | 6.64E-2 37 |
| 29 | INT | ≈ | GAD2 | 0.194157 315 | 0.008471 022 | 0.8132514 32 | 0.035481887 | 0.813252 169 | 0.035481 883 | 2.92E-11 6 |
| 30 | INT | ≈ | LifetimeAn x | 0.394890 965 | 0.016349 243 | 0.8440663 23 | 0.034945952 | 0.844066 791 | 0.034945 946 | 6.87E-1 29 |
| 13 | EXT | ≈ | num_partne rs | 0.201019 058 | 0.010561 089 | 0.6373062 87 | 0.0334826 | 0.637306 17 | 0.033482 61 | 8.93E-8 1 |
| 11 | EXT | ≈ | ADHD | 0.446312 182 | 0.031335 172 | 0.6284668 68 | 0.044124032 | 0.628467 384 | 0.044124 031 | 4.94E-4 6 |
| 12 | EXT | ≈ | antisoc | 0.166155 591 | 0.021981 734 | 0.7333043 24 | 0.097013129 | 0.733302 957 | 0.097013 135 | 4.07E-1 4 |
| 44 | PAU | ≈ | AUD | 0.165852 529 | 0.012215 587 | 0.6939892 98 | 0.051114252 | 0.913896 647 | 0.067348 997 | 5.47E-4 2 |
| 46 | PAU | ≈ | AUDIT 4 | 0.101218 883 | 0.010404 81 | 0.5937459 27 | 0.061033954 | 0.781887 636 | 0.080419 312 | 2.29E-2 2 |
| 47 | PAU | ≈ | AUDIT 5 | 0.080932 565 | 0.009513 924 | 0.5628154 33 | 0.066160844 | 0.741156 285 | 0.087174 57 | 1.79E-1 7 |
| 48 | PAU | ≈ | AUDIT 7 | 0.116291 988 | 0.011041 887 | 0.6058004 6 | 0.057520292 | 0.797762 094 | 0.075789 664 | 6.16E-2 6 |
| 49 | PAU | ≈ | AUDIT 8 | 0.105849 986 | 0.010525 125 | 0.5396049 93 | 0.053655041 | 0.710591 305 | 0.070696 747 | 8.57E-2 4 |
| 45 | PAU | ≈ | AUDIT 10 | 0.102917 59 | 0.009313 845 | 0.6236277 61 | 0.056436843 | 0.821238 53 | 0.074362 131 | 2.19E-2 8 |
| 58 | QUANT | ≈ | dpw | 0.120771 787 | 0.010876 935 | 0.5376424 91 | 0.048421091 | 0.650648 811 | 0.058633 085 | 1.21E-2 8 |
| 56 | QUANT | ≈ | AUDIT 2 | 0.162906 089 | 0.009162 242 | 0.7122556 41 | 0.040058977 | 0.861963 338 | 0.048507 305 | 1.01E-7 0 |
| 57 | QUANT | ≈ | AUDIT 3 | 0.190496 915 | 0.009966 429 | 0.7747643 92 | 0.040534104 | 0.937611 135 | 0.049082 617 | 1.94E-8 1 |
| 16 | FREQ | ≈ | dpw | 0.094224 243 | 0.011365 063 | 0.4194607 58 | 0.050594129 | 0.431260 278 | 0.052018 197 | 1.13E-1 6 |
| 17 | FREQ | ≈ | intake freq | 0.241681 78 | 0.006773 686 | 0.9723895 15 | 0.027253448 | 0.999742 753 | 0.028020 503 | 8.22E-2 79 |
| 15 | FREQ | ≈ | AUDIT 1 | 0.241989 882 | 0.008291 863 | 0.8978130 71 | 0.030763892 | 0.923068 707 | 0.031629 745 | 3.09E-1 87 |
| 34 | LPA | ≈ | mdd_Fatig ue | 0.149793 897 | 0.011915 676 | 0.5071566 02 | 0.04034261 | 0.841909 008 | 0.067051 846 | 3.04E-3 6 |
| 35 | LPA | ≈ | mdd Mood | 0.153275 724 | 0.011894 713 | 0.5677055 38 | 0.044055594 | 0.942423 405 | 0.073223 099 | 5.39E-3 8 |
| 36 | LPA | ≈ | mdd Sleep | 0.113759 075 | 0.009465 67 | 0.4153842 39 | 0.034563125 | 0.689560 838 | 0.057446 001 | 2.86E-3 3 |
| 37 | LPA | ≈ | mdd_Worth less | 0.150129 186 | 0.012129 736 | 0.5569051 88 | 0.044995078 | 0.924491 968 | 0.074784 552 | 3.48E-3 5 |

| | | | | | | | | | | |
|----|--------------|---|----------------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 38 | LPA | ≈ | neuro_Misera- ble | 0.159747 363 | 0.012232 358 | 0.5292326 66 | 0.040524747 | 0.878555 811 | 0.067354 641 | 5.62E-3 9 |
| 51 | PAU | ~ | INT | 0.162863 282 | 0.168487 087 | 0.1628666 79 | 0.168485353 | 0.123676 738 | 0.127872 23 | 0.33373 3157 |
| 50 | PAU | ~ | EXT | 0.676431 166 | 0.114936 421 | 0.6764261 91 | 0.114935157 | 0.513660 532 | 0.087229 786 | 3.97E-0 9 |
| 52 | PAU | ~ | LPA | 0.095797 27 | 0.096876 294 | 0.0957960 33 | 0.096875668 | 0.120760 817 | 0.122200 65 | 0.32273 0745 |
| 60 | QUANT | ~ | INT | -0.26221 6425 | 0.141174 749 | -0.2622152 42 | 0.141173534 | -0.21667 3075 | 0.116586 059 | 0.06325 5831 |
| 59 | QUANT | ~ | EXT | 0.764874 395 | 0.098307 657 | 0.7648733 48 | 0.098307136 | 0.632028 326 | 0.081185 098 | 7.23E-1 5 |
| 61 | QUANT | ~ | LPA | 0.042947 33 | 0.075541 893 | 0.0429472 16 | 0.075541579 | 0.058912 136 | 0.103687 093 | 0.56967 9658 |
| 19 | FREQ | ~ | INT | -0.05057 3559 | 0.082653 219 | -0.0505729 77 | 0.082652608 | -0.04918 928 | 0.080390 515 | 0.54061 95 |
| 18 | FREQ | ~ | EXT | 0.210407 417 | 0.043697 636 | 0.2104067 3 | 0.043697449 | 0.204649 919 | 0.042501 285 | 1.47E-0 6 |
| 20 | FREQ | ~ | LPA | -0.10783 159 | 0.049438 963 | -0.1078319 19 | 0.049438807 | -0.17410 9321 | 0.079920 973 | 0.02917 5622 |
| 40 | LPA | ~ | INT | 1.387621 72 | 0.152867 293 | 1.3876152 57 | 0.152865725 | 0.835884 608 | 0.091974 612 | 1.11E-19 |
| 39 | LPA | ~ | EXT | -0.13471 1375 | 0.089094 181 | -0.1347085 83 | 0.08909349 | -0.08114 7012 | 0.053604 589 | 0.13053 1083 |
| 55 | PAU | ≈ | QUANT | 0.810277 538 | 0.053605 979 | 0.8102767 11 | 0.053605787 | 0.810276 711 | 0.033598 16 | 1.28E-5 1 |
| 53 | PAU | ≈ | FREQ | 0.760448 685 | 0.059538 943 | 0.7604478 76 | 0.05953864 | 0.760447 876 | 0.043949 794 | 2.34E-3 7 |
| 62 | QUANT | ≈ | FREQ | 0.750574 621 | 0.037806 688 | 0.7505751 07 | 0.037806687 | 0.750575 107 | 0.030367 269 | 1.04E-8 7 |
| 32 | INT | ≈ | EXT | 0.502442 82 | 0.030837 751 | 0.5024419 16 | 0.030837666 | 0.502441 916 | 0.030837 666 | 1.10E-5 9 |
| 43 | MDD | ≈ | MDD | 0.010983 089 | 0.003824 256 | 0.1616800 99 | 0.056296569 | 0.161680 058 | 0.056296 527 | 0.00407 9421 |
| 22 | GAD2 | ≈ | GAD2 | 0.019300 78 | 0.004568 767 | 0.3386202 96 | 0.080156867 | 0.338620 91 | 0.080156 852 | 2.39E-0 5 |
| 42 | LifetimeAnx | ≈ | LifetimeAnx | 0.062938 882 | 0.018989 81 | 0.2875509 32 | 0.086759901 | 0.287551 252 | 0.086759 875 | 0.00091 8563 |
| 78 | num_partners | ≈ | num_partners | 0.059081 233 | 0.005059 552 | 0.5938410 64 | 0.050854962 | 0.593840 846 | 0.050854 99 | 1.67E-3 1 |
| 1 | ADHD | ≈ | ADHD | 0.305133 885 | 0.035214 3 | 0.6050277 55 | 0.069824112 | 0.605028 748 | 0.069824 119 | 4.51E-1 8 |
| 70 | antisoc | ≈ | antisoc | 0.023732 796 | 0.028003 079 | 0.4622684 98 | 0.545434754 | 0.462266 774 | 0.545434 754 | 0.39671 2777 |
| 10 | AUD | ≈ | AUD | 0.009412 043 | 0.003132 398 | 0.1647928 48 | 0.054844871 | 0.164792 918 | 0.054844 862 | 0.00265 808 |
| 6 | AUDIT 4 | ≈ | AUDIT 4 | 0.011294 969 | 0.004480 784 | 0.3886526 48 | 0.154180598 | 0.388651 724 | 0.154180 62 | 0.01171 0261 |
| 7 | AUDIT 5 | ≈ | AUDIT 5 | 0.009319 51 | 0.004848 798 | 0.4506882 33 | 0.234486289 | 0.450687 361 | 0.234486 304 | 0.05460 2657 |
| 8 | AUDIT 7 | ≈ | AUDIT 7 | 0.013397 897 | 0.004264 193 | 0.3635763 45 | 0.115716185 | 0.363575 642 | 0.115716 208 | 0.00167 8247 |
| 9 | AUDIT 8 | ≈ | AUDIT 8 | 0.019049 755 | 0.004625 908 | 0.4950606 55 | 0.120216699 | 0.495059 997 | 0.120216 722 | 3.82E-0 5 |

| | | | | | | | | | | |
|----|-----------------|----|-----------------|------------------|-----------------|------------------|-------------|------------------|-----------------|-----------------|
| 2 | AUDIT 10 | ~ | AUDIT 10 | 0.008866 858 | 0.002522 004 | 0.3255677 88 | 0.092600937 | 0.325567 277 | 0.092600 947 | 0.00043 8434 |
| 71 | dpw | ~ | dpw | 0.000185 721 | 0.002713 209 | 0.0036797 86 | 0.053769959 | 0.003679 787 | 0.053769 946 | 0.94542 6993 |
| 4 | AUDIT 2 | ~ | AUDIT 2 | 0.013445 185 | 0.002578 073 | 0.2570193 09 | 0.049282447 | 0.257019 204 | 0.049282 451 | 1.84E-0 7 |
| 5 | AUDIT 3 | ~ | AUDIT 3 | 0.007308 28 | 0.002632 559 | 0.1208852 94 | 0.043545291 | 0.120885 359 | 0.043545 265 | 0.00550 1316 |
| 72 | intake freq | ~ | intake freq | 3.17E-05 | 0.002165 944 | 0.0005144 28 | 0.035062271 | 0.000514 428 | 0.035062 258 | 0.98831 4343 |
| 3 | AUDIT 1 | ~ | AUDIT 1 | 0.010747 701 | 0.003084 348 | 0.1479441 25 | 0.042456229 | 0.147944 162 | 0.042456 227 | 0.00049 2885 |
| 73 | mdd_Fatigue | ~ | mdd_Fatigue | 0.025402 913 | 0.004793 767 | 0.2911887 74 | 0.054950323 | 0.291189 223 | 0.054950 327 | 1.16E-0 7 |
| 74 | mdd Mood | ~ | mdd Mood | 0.008152 689 | 0.005437 29 | 0.1118380 25 | 0.074589816 | 0.111838 125 | 0.074589 827 | 0.13376 9127 |
| 75 | mdd Sleep | ~ | mdd Sleep | 0.039339 094 | 0.005151 405 | 0.5245062 43 | 0.06868335 | 0.524505 85 | 0.068683 357 | 2.23E-1 4 |
| 76 | mdd_Worthless | ~ | mdd_Worthless | 0.010560 114 | 0.005521 206 | 0.1453151 77 | 0.075973855 | 0.145314 602 | 0.075973 862 | 0.05579 3361 |
| 77 | neuro_Misurable | ~ | neuro_Misurable | 0.020786 285 | 0.003710 387 | 0.2281397 13 | 0.040723304 | 0.228139 686 | 0.040723 296 | 2.12E-0 8 |
| 27 | ID_INT_PAU | := | a1*b1 | 0.132930 373 | 0.084200 768 | 0.1329280 36 | 0.084199576 | 0.100942 108 | 0.063903 539 | 0.11439 7745 |
| 68 | TOT_INT_PAU | := | c1+(a1*b1) | 0.295793 655 | 0.050654 748 | 0.2957947 15 | 0.050654379 | 0.224618 846 | 0.038443 993 | 5.24E-0 9 |
| 28 | ID_INT_QUANT | := | a1*b2 | 0.059594 648 | 0.087293 83 | 0.0595942 12 | 0.087292915 | 0.049243 747 | 0.072089 682 | 0.49480 2581 |
| 69 | TOT_INT_QUANT | := | c2+(a1*b2) | -0.20262 1777 | 0.065887 11 | -0.2026210 3 | 0.065886767 | -0.16742 9328 | 0.054411 347 | 0.00210 3 |
| 26 | ID_INT_FREQ | := | a1*b3 | -0.14962 9456 | 0.048882 084 | -0.1496292 17 | 0.048881672 | -0.14553 5302 | 0.047543 927 | 0.00220 5781 |
| 67 | TOT_INT_FREQ | := | c3+(a1*b3) | -0.20020 3015 | 0.031850 102 | -0.2002021 93 | 0.031849961 | -0.19472 4582 | 0.030978 108 | 3.26E-1 0 |
| 24 | ID_EXT_PAU | := | a2*b1 | -0.01290 4982 | 0.012828 725 | -0.0129045 48 | 0.012828381 | -0.00979 9379 | 0.009736 178 | 0.31444 2387 |
| 65 | TOT_EXT_PAU | := | c1+(a2*b1) | 0.149958 301 | 0.130922 015 | 0.1499621 31 | 0.130920222 | 0.113877 359 | 0.099362 132 | 0.25204 2788 |
| 25 | ID_EXT_QUANT | := | a2*b2 | -0.00578 5494 | 0.010709 579 | -0.0057853 59 | 0.010709334 | -0.00478 0544 | 0.008844 114 | 0.58904 7552 |
| 66 | TOT_EXT_QUANT | := | c2+(a2*b2) | -0.26800 1919 | 0.144871 041 | -0.2680006 01 | 0.144869593 | -0.22145 3619 | 0.119638 3 | 0.06432 3007 |
| 23 | ID_EXT_FREQ | := | a2*b3 | 0.014526 142 | 0.008260 029 | 0.0145258 85 | 0.008259968 | 0.014128 451 | 0.008033 887 | 0.07864 4348 |
| 64 | TOT_EXT_FREQ | := | c3+(a2*b3) | -0.03604 7417 | 0.072985 632 | -0.0360470 92 | 0.072985017 | -0.03506 0829 | 0.070987 524 | 0.62137 8613 |
| 33 | INT | ~ | INT | 1 | | 1 | | 1 | | NA |
| 14 | EXT | ~ | EXT | 1 | | 1 | | 1 | | NA |
| 54 | PAU | ~ | PAU | 1 | | 1 | | 0.576649 027 | | NA |
| 63 | QUANT | ~ | QUANT | 1 | | 1 | | 0.682800 812 | | NA |

| | | | | | | | |
|----|------|---|------|---|---|-----------------|----|
| 21 | FREQ | ~ | FREQ | 1 | 1 | 0.946027 798 | NA |
| 41 | LPA | ~ | LPA | 1 | 1 | 0.362872 89 | NA |

Table 12. Full model output for the reduced base model in the Finnish population relating internalizing (INT) and problematic alcohol use (PAU).

Model fit: $\chi^2(8) = 3.903019$, AIC = 29.90302, CFI = 1, SRMR = 0.0415988

| | lhs | op | rhs | Unstand Est | Unstan d SE | STD_Ge notype | STD_Gen otype SE | STD All ll SE | STD_A ll SE | p value |
|----|-------------------------------|----|---------------------------|----------------------|--------------------|---------------------|---------------------|---------------------|-------------------|--------------------|
| 7 | INT | =~ | F5_ALLANXIO US | 0.123884 417 | 0.01141 827138 | 1.004508 049 | 0.0925842 6737 | 1.004507 94 | 0.09258 426382 | 2.00E-2 7 |
| 8 | INT | =~ | F5_ANXIETY | 0.117954 0969 | 0.01312 752671 | 0.926819 0716 | 0.1031489 356 | 0.926819 3143 | 0.10314 89353 | 2.58E-1 9 |
| 9 | INT | =~ | F5_DEPRESSIO | 0.111080 3735 | 0.01427 205386 | 0.920885 1365 | 0.1183190 358 | 0.920885 1355 | 0.11831 90343 | 7.08E-1 5 |
| 10 | INT | =~ | F5_GAD | 0.104034 9248 | 0.01957 617259 | 0.939187 6465 | 0.1767262 309 | 0.939187 6144 | 0.17672 62267 | 1.07E-0 7 |
| 12 | PAU | =~ | AUD | 0.079923 61825 | 0.03018 99294 | 0.533047 7502 | 0.2013506 678 | 0.987551 8601 | 0.37325 58164 | 0.00811 2288817 |
| 13 | PAU | =~ | F5_ALCOHOL_ DEPENDENCE | 0.088037 46374 | 0.03261 432023 | 0.537429 2457 | 0.1990958 071 | 0.995669 331 | 0.36907 58123 | 0.00694 7507719 |
| 14 | PAU | ~ | INT | 1.559589 278 | 0.73260 78488 | 1.559589 247 | 0.7326078 421 | 0.841814 562 | 0.39520 09842 | 0.03326 926431 |
| 3 | F5_ALLAN XIOUS | ~ | F5_ALLANXIO US | -0.00013 74491922 | 0.00178 8115019 | -0.00903 6203844 | 0.1175625 596 | -0.00903 6201878 | 0.11756 25751 | 0.93872 83912 |
| 4 | F5_ANXIET Y | ~ | F5_ANXIETY | 0.002283 895509 | 0.00254 0039303 | 0.141005 8847 | 0.1568209 709 | 0.141005 9586 | 0.15682 09623 | 0.36856 87491 |
| 5 | F5_DEPRES SIO | ~ | F5_DEPRESSIO | 0.002211 174837 | 0.00282 8750062 | 0.151970 5675 | 0.1944154 874 | 0.151970 5672 | 0.19441 54877 | 0.43440 31802 |
| 6 | F5_GAD | ~ | F5_GAD | 0.001446 986602 | 0.00706 2082256 | 0.117926 633 | 0.5755449 077 | 0.117926 6249 | 0.57554 4903 | 0.83765 40226 |
| 1 | AUD | ~ | AUD | 0.000556 2082669 | 0.00305 7549883 | 0.024741 32383 | 0.1360052 065 | 0.024741 32366 | 0.13600 52151 | 0.85565 09521 |
| 2 | F5_ALCOH OL_DEPEN DENCE | ~ | F5_ALCOHOL_ DEPENDENCE | 0.000231 9233635 | 0.00333 3049136 | 0.008642 581869 | 0.1242079 078 | 0.008642 583296 | 0.12420 79049 | 0.94452 56146 |
| 11 | INT | ~ | INT | 1 | | 1 | | 1 | | NA |
| 15 | PAU | ~ | PAU | 1 | | 1 | | 0.291348 2433 | | NA |

Supplemental Table 13. Full output for cross-trait genetic correlations calculated using LDSC for two separate populations: Finnish and East Asian. For details of diverse ancestry GWAS, see Suppl. Table 3. Columns: rg = genetic correlation; h2_obs = heritability of trait 2; h2_int = LDSC regression intercept for trait 2; gcov_int = cross-trait LDSC intercept

| trait 1 | trait 2 | rg | se | z | p | h2_obs | h2_obs se | h2_int | h2_int se | gcov_int | gcov_int se |
|----------------------------|-----------------------|---------|--------|---------|------------|--------|-----------|--------|-----------|----------|-------------|
| Finnish Ancestry | | | | | | | | | | | |
| AUD | F5_ALCOHOL_DEPENDENCE | 1.0266 | 0.0322 | 31.9177 | 1.52E-223 | 0.0042 | 8.00E-04 | 1.1397 | 0.0103 | 0.9593 | 0.0104 |
| AUD | F5_ALLANXIOUS | 0.8168 | 0.1207 | 6.7666 | 1.32E-11 | 0.0045 | 8.00E-04 | 1.1541 | 0.0099 | 0.2384 | 0.0079 |
| AUD | F5_ANXIETY | 0.761 | 0.1331 | 5.7191 | 1.07E-08 | 0.0036 | 7.00E-04 | 1.1196 | 0.0088 | 0.221 | 0.0076 |
| AUD | F5_DEPRESSION | 0.7362 | 0.0912 | 8.075 | 6.75E-16 | 0.0061 | 0.0011 | 1.2208 | 0.0114 | 0.3246 | 0.0082 |
| AUD | F5_GAD | 0.6953 | 0.2969 | 2.3418 | 0.019193 | 0.001 | 7.00E-04 | 1.0419 | 0.0076 | 0.0964 | 0.0063 |
| F5_ALCOHOL_DEPENDENCE | F5_ALLANXIOUS | 0.8103 | 0.1294 | 6.2642 | 3.75E-10 | 0.0045 | 8.00E-04 | 1.1541 | 0.0099 | 0.2173 | 0.0072 |
| F5_ALCOHOL_DEPENDENCE | F5_ANXIETY | 0.7189 | 0.1379 | 5.2129 | 1.86E-07 | 0.0036 | 7.00E-04 | 1.1196 | 0.0088 | 0.2049 | 0.007 |
| F5_ALCOHOL_DEPENDENCE | F5_DEPRESSION | 0.8318 | 0.1143 | 7.2777 | 3.40E-13 | 0.0061 | 0.0011 | 1.2208 | 0.0114 | 0.291 | 0.0074 |
| F5_ALCOHOL_DEPENDENCE | F5_GAD | 0.7085 | 0.3168 | 2.2368 | 0.025298 | 0.001 | 7.00E-04 | 1.0419 | 0.0076 | 0.0862 | 0.0059 |
| F5_ALLANXIOUS | F5_ANXIETY | 0.9724 | 0.0243 | 39.9826 | 0 | 0.0036 | 7.00E-04 | 1.1196 | 0.0088 | 0.9723 | 0.0088 |
| F5_ALLANXIOUS | F5_DEPRESSION | 0.853 | 0.0802 | 10.6337 | 2.08E-26 | 0.0061 | 0.0011 | 1.2208 | 0.0114 | 0.5445 | 0.0079 |
| F5_ALLANXIOUS | F5_GAD | 1.0797 | 0.2942 | 3.6702 | 0.00024235 | 0.001 | 7.00E-04 | 1.0419 | 0.0076 | 0.5078 | 0.0067 |
| F5_ANXIETY | F5_DEPRESSION | 0.84 | 0.0909 | 9.2414 | 2.43E-20 | 0.0061 | 0.0011 | 1.2208 | 0.0114 | 0.4723 | 0.0077 |
| F5_ANXIETY | F5_GAD | 1.1539 | 0.3845 | 3.0007 | 0.0026934 | 0.001 | 7.00E-04 | 1.0419 | 0.0076 | 0.3277 | 0.0065 |
| F5_DEPRESSION | F5_GAD | 0.948 | 0.3247 | 2.9192 | 0.0035 | 0.001 | 7.00E-04 | 1.0419 | 0.0076 | 0.2786 | 0.006 |
| East Asian Ancestry | | | | | | | | | | | |
| DPW | DEP | -0.0998 | 0.2777 | -0.3592 | 0.7194 | 0.0277 | 0.0105 | 1.0169 | 0.0081 | -0.0029 | 0.006 |