## **Regular Article**

## Testing alternative cascades from internalizing and externalizing symptoms to adolescent alcohol use and alcohol use disorder through co-occurring symptoms and peer delinquency

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## Abstract

Given the equivocal literature on the relationship between internalizing symptoms and early adolescent alcohol use (AU) and AU disorder (AUD), the present study took a developmental perspective to understand how internalizing and externalizing symptoms may operate together in the etiology of AU and AUD. We pit the *delayed onset and rapid escalation* hypothesis (Hussong et al., 2011) against a synthesis of the *dual failure model* and the *stable co-occurring* hypothesis (Capaldi, 1992; Colder et al., 2013, 2018) to test competing developmental pathways to adolescent AU and AUD involving problem behavior, peer delinquency, and early initiation of AU. A latent transactional and mediational framework was used to test pathways to AUD spanning developmental periods before AU initiation ( $M_{age} = 11$ ) to early and high risk for AUD ( $M_{age} = 14-15$  and  $M_{age} = 17-18$ ). The results supported three pathways to AUD. The first started with "pure" externalizing symptoms in early childhood and involved multiple mediators, including the subsequent development of co-occurring symptoms and peer delinquency. The second pathway involved stable co-occurring symptoms. Interestingly, chronically elevated pure internalizing symptoms did not figure prominently in pathways to AUD. Selection and socialization effects between early AU and peer delinquency constituted a third pathway.

Keywords: adolescent alcohol use, alcohol use disorder, co-occurring internalizing and externalizing symptoms, peer delinquency

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Behavior problems are prominent features of etiological models of adolescent alcohol use (AU). A large body of literature suggests that some children initiate substance use after a long cascade of problems that begin in early childhood (e.g., Dodge, Malone, Lansford, Miller, Pettit, & Bates, 2009). These models largely focus on externalizing problems (e.g., rule breaking, aggression) and research has consistently supported externalizing problems as a robust prospective correlate of adolescent AU (Chassin, Colder, Hussong, & Sher, 2016; Hussong et al., 2011; Witkiewitz et al., 2013; Zucker, 2016), peer delinquency (Burt, McGue, & Iacono, 2009; Brook et al., 2011; Scalco et al., 2014), alcohol use disorder (AUD; Sung et al., 2004; Zucker, 2016), and other illicit substance use (Chassin et al., 2016; Dodge et al., 2009). Evidence suggests that externalizing problems promote affiliation with delinquent peers, who in turn provide support for and access to alcohol and drugs.

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In contrast to robust findings for an externalizing pathway, findings regarding the link between internalizing problems (e.g., emotional distress including depression and anxiety) and AU and AUD have been inconsistent, making the role of internalizing symptoms in the development of AU and AUD unclear (Chassin, Pitts, DeLucia, & Todd, 1999; Colder, Chassin, Lee, & Villalta, 2010; Colder et al., 2013; Costello, Erkanli, Federman, & Angold, 1999; Foster, Hicks, & Zucker, 2018; Hussong et al., 2011; Hussong, Ennett, Cox, & Haroon, 2017; Little et al., 2013; Marmorstein, White, Loeber, & Stouthamer-Loeber, 2010; Scalco et al., 2014; Stice, Barrera, & Chassin, 1998). Some of this research even suggests that internalizing might reduce risk for substance use (SU) in early adolescence (Colder et al., 2013, 2018; Mason et al., 2008; Scalco et al., 2014) yet still increase risk for AUD later in adolescence (Costello et al., 1999; Stice et al., 1998). Research and theoretical work suggests that whether internalizing problems are associated with adolescent AU and AUD may depend on the co-occurrence of internalizing symptoms with externalizing symptoms, the degree of affiliation with peers that are involved in substance use and delinquency, and the stability of problem behavior across developmental periods (Foster et al., 2018; Hussong et al., 2011; Mason, Hitchings, & Spoth, 2008; Scalco et al., 2014; Zehe et al., 2013).

Given the mixed literature and findings, it is likely that internalizing problems are involved in both risk and protective

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pathways, and to understand this complexity, it is critical to consider internalizing symptoms within the context of externalizing symptoms. A notable dearth of research has considered theoretical transactions between internalizing and externalizing problem behavior while considering multiple mechanisms of AU and AUD. In the current paper, we considered several competing theoretical perspectives to develop hypotheses about how internalizing and externalizing symptoms may operate together in developmental pathways to AU and AUD. These included the delayed onset and rapid escalation hypothesis (Hussong et al., 2011), the co-occurring hypothesis (Colder et al., 2018), and the dual failure hypothesis (Capaldi, 1992). Each theoretical perspective posits differing roles (protective, risk, null) for internalizing symptoms in the prediction of AU and AUD. In doing so, we emphasize several key issues that have been regarded as being important in understanding the role of internalizing symptoms in developmental models of addiction including the evolution of co-occurring internalizing and externalizing symptom patterns, the potential role of delinquent peers and perception of peer delinquency, the stability of behavior problems, and late versus early onset of use. Additionally, we examined whether behavior problems operate directly on AUD symptoms or operate on AUD symptoms through levels of use.

## Theoretical Formulations of an Internalizing Pathway to AU and AUD

Colder et al. (2010) and Hussong et al. (2011) posited that hallmark features of internalizing symptoms such as fearfulness, social withdrawal, and avoidance might protect some youth from AU in early adolescence but then lead to rapid escalation later in adolescence when AU becomes more normative. Delayed onset and rapid escalation is believed to be a result of the emergence of perceived acceptability of AU to cope with emotional distress. Indeed, previous research has found that internalizing problems protected youth from selecting into delinquent peer networks, which in turn decreased the likelihood of early adolescent AU (Fite, Colder, & O'Conner, 2006; Mason et al., 2008; Scalco et al., 2014). However, only one study has supported the notion of rapid escalation to problem AU later in adolescence (Kushner, Maurer, Menary, & Thuras, 2011) and this study was based on retrospective self-report. Other studies that have used longitudinal designs have failed to find support for the hypothesis that internalizing symptoms predict rapid escalation of AU later in adolescence, even when considering chronically elevated symptoms (e.g., Colder et al., 2018), an important feature of the theory that is presented in Hussong et al. (2011). Here we refer to this hypothesis as the delayed AU onset and rapid escalation hypothesis. It is notable that Hussong et al.'s (2011) description of this internalizing pathway is quite similar to the well-established externalizing pathway (involving rejection from mainstream peers and selection into deviant peer networks later in adolescence). Accordingly, it is important that externalizing symptoms are considered in such a model to ensure that the proposed internalizing pathway is not simply due to externalizing symptoms that commonly co-occur with internalizing symptoms (Colder et al., 2010, 2018; Hussong et al., 2011, 2017).

It is possible that the delayed onset and rapid escalation pathway articulated in Hussong et al. (2011) is a function of co-occurring symptoms and not internalizing symptoms alone. We refer to this as the *co-occurrence hypothesis*. Prior work on co-occurring symptoms suggests that the strongest correlates of a co-occurring

symptom constellation are peer rejection (Keiley et al., 2003); peer victimization, peer delinquency (Dishion, 2000; Scalco et al., 2012); deficits in executive functioning (Martel et al., 2017; Scalco et al., 2012); and poor social skills (Ingoldsby, Kohl, McMahon, & Lengua, 2006). As such, some aspects of the pathway described in Hussong et al., (2011) seem relevant to a co-occurring pathway, in which co-occurring problem behavior leads to peer rejection, selection into delinquent peer networks, early AU (Colder et al., 2013; Scalco et al., 2014), and possibly AUD. Even though lower levels of AU have been linked to youth with co-occurring symptoms compared to youth with externalizing symptoms alone, co-occurring symptoms are associated with poorer executive functioning, suggesting that these youth may then progress more rapidly to AUD.

Given the potential importance of co-occurring internalizing and externalizing symptoms in developmental pathways to AU and AUD, it is notable that few studies consider theoretical models of the development of co-occurring symptoms and their relevance to AUD. One possibility is a developmental progression from externalizing symptoms to co-occurring symptoms to AU and AUD. According to the dual failure hypothesis (Capaldi, 1991; 1992) and evidence from prior research (Chassin et al., 1999; Copeland, Shanahan, Costello, & Angold, 2009; McElroy, Shevlin, & Murphy, 2017; Owens & Hinshaw, 2016), externalizing symptoms can lead to internalizing symptoms as a result of peer rejection, alienation from school and parents (Capaldi 1991, 1992; Chassin et al., 1999), and the negative consequences of delinquent behavior in adolescence (Lahey & Waldman, 2017). The implications of the emergence of internalizing symptoms secondary to externalizing symptoms for AU and AUD are unclear. Some work suggests lower risk for AU among youth with co-occurring symptoms relative to those with elevated externalizing symptoms alone (Colder et al., 2013, 2018; Scalco et al., 2014) but increased risk for co-occurring symptoms relative to internalizing symptoms alone, a finding that has been replicated in several samples (Colder et al., 2013; Foster et al., 2018; Mason et al., 2008). Furthermore, some studies have found a direct effect of internalizing symptoms on AUD when externalizing symptoms were included as a statistical control (Costello et al., 1999; Stice et al., 1998). It is plausible that such direct effects are due to co-occurring symptoms given (a) that interactions between internalizing and externalizing are not typically included in analytic models (Scalco et al., 2014) and (b) that co-occurring symptoms have a stronger relationship with poor executive functioning than with internalizing symptoms alone in adolescence (Colder et al., 2013; Keiley et al., 2003; Scalco et al., 2012).

Another possibility is that externalizing symptoms develop secondary to internalizing symptoms. Hussong et al. (2011) hypothesized that chronic internalizing symptoms result in peer problems and then selection into peer delinquency. Following socialization theory, this process could then result in socialization of externalizing behavior or the development of co-occurring symptoms. Following the research linking co-occurring symptoms to AU, subsequent co-occurring symptoms may then predict AU and AUD later in adolescence.

Taken together, the dual-failure hypothesis, the delayed onset/ rapid escalation hypothesis, and the co-occurring hypothesis postulate different and competing starting points (internalizing/ externalizing alone versus co-occurring symptoms), different and competing mechanisms (development of internalizing and externalizing symptoms second to externalizing and internalizing, respectively), and common mechanisms (peer behavior and social norms) to explain the development of AU and AUD in adolescence. Previous research has failed to compare and contrast these different theoretical and mechanistic accounts of the etiology of developmental pathways to AU and AUD (e.g., Foster et. al., 2018) to provide a rigorous test of theory. This is a notable gap in the research literature and informs the objectives of the current study.

## Summary and the Present Study

Despite a plethora of theory and empirical evidence, no studies to our knowledge have tested developmental pathways from internalizing and externalizing symptoms and their co-occurrence to AUD through theoretical mediators such as changes in problem behavior, peer delinquency, and changes in AU across adolescence. The dual failure hypothesis proposes that externalizing symptoms lead to co-occurring symptoms, both of which should increase risk for peer delinquency, AU, and possibly AUD. Therefore, this theory emphasizes the role of externalizing symptoms, while internalizing symptoms and peer delinquency are part of a cascade that follows from externalizing symptoms to a constellation of co-occurring symptoms. Alternatively, the delayed onset and rapid escalation hypothesis predicts that chronic internalizing symptoms should decrease risk for peer delinquency and AU in early adolescence, but this results in rapid escalation in AU and eventually AUD later in adolescence. This perspective doesn't explicitly address the role of externalizing symptoms and hypothesizes a primary role for internalizing symptoms. However, Hussong et al. (2011) suggest that chronic internalizing symptoms may lead to peer problems and selection into delinquent peer networks. Following socialization and influence theories, peer delinquency may then increase externalizing symptoms and eventually lead to AU and AUD later in adolescence. According to this perspective, internalizing symptoms are expected to be prospectively associated with the emergence of externalizing symptoms and a co-occurring symptom constellation (the opposite prediction of the dual failure model) via peer delinquency. Third, the co-occurring hypothesis suggests that stable co-occurring symptoms may lead to peer delinquency, AU, and AUD similarly to externalizing symptoms, but then lead to earlier AUD symptoms given poorer executive functioning and more severe social problems among youth with stable co-occurring symptoms (Keiley et. al., 2003; Scalco et al., 2012).

Finally, selection and socialization mechanisms are important factors in the development of problem behavior and AU (Cruz, Emery, & Turkheimer, 2012; Curran, Stice, & Chassin, 1997; Dishion & Skaggs 2000; Haynie & Osgood, 2005; Hill, Emery, Harden, Mendle, & Turkheimer, 2008; Knecht, Burk, Weesie, & Steglich, 2010; Osgood et al., 2013; Scalco, Meisel, & Colder, 2016; Scalco, Trucco, Coffman, & Colder, 2015; Trucco, Colder, & Wieczorek, 2011). We expected that both perceived and actual peer behavior will be important in understanding the role of selection and socialization in our proposed developmental pathways. For instance, the perception that peer delinquency is normative may result in selection into delinquent peer networks and socialization of either externalizing symptoms or early AU, eventually leading to AUD.

Hypotheses were tested using a longitudinal community sample with assessments that spanned from early to late adolescence. Our longitudinal design offered a number of advantages over previous research (e.g., Foster, et al., 2018), which did not assess AUD symptoms and mediation by peer delinquency. Furthermore, given our focus on co-occurring symptoms, we used a longitudinal bifactor model, which partitions variance in problem behavior into four orthogonal dimensions: "pure" internalizing, "pure" externalizing, co-occurring symptoms, and error. This allowed us to examine the transactional effects between pure and co-occurring continuous symptom dimensions as well as peer delinquency, AU, and AUD while adjusting for measurement error. The advantages of this design include considering co-occurring internalizing and externalizing symptoms within a dimensional and latent framework (Markon, Chmielewski, & Miller, 2011), considering the stability of problem behavior symptoms across developmental periods (Hussong et al., 2011, 2017), modeling growth in levels of AU during critical periods of development for AU and AUD (Sung et al., 2004), and considering multiple reporters of peer delinquency (Scalco, et al., 2016) while assessing the sequencing of competing theoretical mediators within a transaction framework (MacKinnon, 2008; Sameroff & MacKenzie, 2003).

## Methods

## Participants

The participants were part of a longitudinal study of risk and protective factors for adolescent substance use. The original sample included 387 families (caregiver median income = \$70,000; the adolescents were 55% female and 83.1% Caucasian) who were assessed annually. The average age of the adolescent participants at each assessment wave (W) was 11.6 at W1, 12.6 at W2, 13.6 at W3, 14.6 at W4, 15.5 at W5, 16.6 at W6 and 17.9 at W7. The second through seventh assessments occurred at the one-year anniversary of the prior assessment. From W2 to W7 the sample size ranged from N = 354 (91%) to N = 373 (96%). In previous papers (Colder et al., 2018), we have tested for differences between families who completed all seven assessments and families who missed at least one measurement on minority status, gender, age, parental education, marital status, family income, lifetime alcohol use, lifetime cigarette use, and internalizing and externalizing problems. There was only a difference on externalizing symptoms, and this difference did not meet conventional criteria for statistical significance (p = .056) and was small (Cohen d = .27). The low attrition rate and few differences on the baseline variables suggest that missing data likely had a limited influence on the study findings. Nonetheless, full information maximum likelihood (FIML) was used to estimate the parameters for the full sample (N = 387), an approach which is comparable to multiple imputation when variables related to missingness are included (Schafer & Graham, 2002).

At W1–W3, target adolescents provided the names of four close friends and one was recruited into the study (close friend) to provide collateral reports of the target adolescent's peer environment. Peers were required to be within two years of age of the target adolescent and could not be a sibling. To account for the fluid nature of adolescent peer relationships, targets were allowed to nominate different peers at each wave. The mean ages of peers (53% to 56% female) at W1–W3 were 11.5 (SD = 1.15), 12.4 (SD = 1.27), and 13.4 (SD = 1.18), respectively. Peers were not sampled after W3. The proportion of missing peer data was 8.3, 13.9, and 18.6% for W1–W3, respectively. In prior papers, we have tested for differences amongst those with and without peer data on 31 total variables, and the results have suggested that missing peer data was associated with lower socioeconomic status (SES), minority status, or being from a single-parent family and with increased

likelihood of cigarette use, peer cigarette use, and perceived peer cigarette use (all ps < 0.05); however, these effects were small ( $R^2 = .4\%$ ; phi range = 0.07–0.13, (see Scalco, Meisel, & Colder, 2016; Scalco, Trucco, Coffman, & Colder, 2015). Missingness was not related to the remaining 24 variables. These findings suggest that missing peer data also likely had a limited influence on the study findings. Full information maximum likelihood was used to handle missing data so that all possible cases were included in the analysis. For the peer sample, a more detailed description of recruitment, demographics, and procedures can be found in (Scalco et al., 2015).

### Procedure

Procedural information and demographics have been reported in previous papers (Colder et al., 2013; Scalco et al., 2014), Briefly, from W1-W3 families were interviewed in university research offices and parents and adolescents were assessed in separate rooms. The assessments included laboratory tasks and questionnaires. The present study uses adolescent-reported questionnaires that assessed problem behavior, peer delinquency, AU, and AUD. The families were compensated 75, 85, and \$120 at the first, second, and third assessment, respectively. At W4-W6, only substance use was measured, and adolescents entered their responses into an audio-Computer Assisted Self Interview (CASI) system that took 10-15 minutes to complete. The W7 measurement occurred 13 months after the W6 assessment. The procedures were similar to those that were used in W1-W3 and can be found in Colder et al. (2018). The adolescents were compensated \$125 for completing the full assessment. A small number of participants moved out of the area and were compensated \$50 for completing an online questionnaire (n = 18 or 5% of sample). The caregivers were compensated \$40.

## Measures

#### Adolescent Problem Behavior (W1–W3)

Problem behavior was assessed by using the Youth Self Report (YSR) form of the Achenbach System of Empirical Behavioral Assessment (Achenbach & Rescorla, 2001). The rule breaking and aggressive scales were used to measure externalizing problems, and the withdrawn depressed and anxious depressed scales were used to measure internalizing problems. The YSR has been used extensively and has been shown to have good reliability and validity (Achenbach & Rescorla, 2001). Cronbach  $\alpha$  for externalizing symptoms ranged from 0.87 to 0.90 at all three waves, while the value for internalizing symptoms ranged from 0.83 to 0.88. Item parcels were bundled to form indicators to reduce the complexity of the model. These bundles were based on our prior work at the item level of the YSR (Colder et al., 2013). Furthermore, different bundling strategies produced similar findings in prior work (see Scalco et al., 2014) and also showed excellent construct validity at W1 (see Colder et al., 2013; Scalco et al., 2012). The T-scores for our sample were similar to those that were reported by Achenbach and Rescorla (2001) in their nonreferred sample. For example, 11- to 18-year-old males and females were reported to have an average T-score of approximately 54 for anxious depressed, withdrawn depressed, rule breaking, and aggressive behavior scales, and in the current sample, these T-scores ranged from 51 to 55 for males and females.

#### Child Substance Use at W1–W6

Items from the National Youth Survey (NYS) were used to assess lifetime AU at W1 and past-year quantity and frequency of AU (Elliott & Huizinga, 1983) from W3 to W6. Lifetime use was assessed with one dichotomous item (no/yes), while past-year frequency was assessed by using a fill-in-the-blank response. Quantity by frequency  $(Q \times F)$  indices were created at each wave from W3 to W6. Self-reports of adolescent SU, such as the NYS, have been shown to be valid when the adolescent perceives them to be anonymous and confidential (Winters, Stinchfield, Henly, & Schwartz, 1991). Rates of AU initiation in our sample were comparable to national and state epidemiological studies (see Scalco et al., 2016). From W1 to W6, 3, 11, 24, 29, 39, and 50% reported AU. Means of the Quantity × Frequency indices from W3 to W6 were 0.07 (SD = 0.23), 0.33 (SD = 0.86), 0.84 (SD = 2.25), and 1.77 (SD = 4.01), respectively. Skewness ranged from 4.3 at W1 to 3.01 at W6, while kurtosis ranged from 18.92 at W1 to 8.55 at W6. The distribution of these variables suggested some extreme observations at each wave. Accordingly, values beyond three standard deviations above the mean were recoded to three standard deviations above the mean to reduce the undue influence of a few cases (Tabachnick & Fidell, 2001).

#### Peer Delinquency (W1–W3)

Peer delinquency was assessed by using both target adolescent report and peer report. For target report, adolescents reported whether any of their three closest friends have ever engaged in 14 delinquent and rule breaking behaviors (Fergusson, Woodward, & Howard, 1999). Sample items are (a) "Sold marijuana or hashish," (b) "Purposefully set fire to a building, a car, or other property, or tried to do so," and (c) "Been in trouble with the police." Items also included perception of peer AU and other substance use ("used alcohol," "used marijuana," and "used tobacco"). Items from the scale were randomly divided to form three bundles that would serve as indicators for the target-reported peer delinquency latent factor from W1 to W3. Cronbach  $\alpha$  ranged from 0.80 to 0.87. Peer-reported peer delinquency was assessed by using three scales: the rule breaking scale of the YSR (Cronbach  $\alpha$ : 0.67 to 0.75), the sum of self-reported alcohol, tobacco, and marijuana use, and the peer's report of delinquency for close friends (excluding the target adolescent), using the same measure that the targets completed (Fergusson et al., 1999). Cronbach  $\alpha$  ranged from 0.80 to 0.88.

#### Alcohol Use Disorder (W3, W7)

At W3 youth were 13.4 on average with a range of 12 to 15. As such, a developmentally appropriate set of items were taken from Windle and Windle (1996) to measure alcohol-related problems. The items assess a range of consequences and symptoms. Examples include "Drank before school," "Got into trouble with the law," "Missed school because of drinking," "Drank alcohol to get rid of hangover," "Thought about cutting down on your drinking," "Got drunk or high from alcohol several days in a row," and "Passed out from drinking." The item pool did not contain items that assess craving and failed attempts to quit AU, but they otherwise reflect AUD criteria that are relevant to early adolescence. Cronbach  $\alpha$  was large (0.93), and the items were randomly assigned to 3 bundles to serve as indicators of the W3 AUD factor.

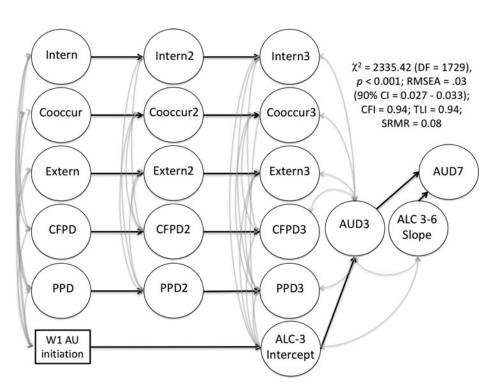
Two measures were used to assess AUD symptoms at W7. First, the Mini-International Neuropsychiatric Interview for children and adolescents (MINI 6.0) was used (Sheehan, Shyte, Milo, & Lecrubier, 2006); a question assessing craving ("Did you crave alcohol or have a strong desire or urge to drink?") was added

and the legal question was dropped, consistent with DSM-5. Second, the Young Adult Alcohol Consequences Questionnaire (YAACQ; 47 consequences) scale was also used (Read, Wood, & Capone, 2005). An exploratory factor analysis on the subscales of the YAACQ suggested two factors. The first factor represented social/interpersonal consequences, impaired control, risky behaviors, and experiences with blackouts, while the second factor represented self-perception, self-care, academic and occupational consequences, and psychological and physical dependence. The MINI for alcohol and the two consequences measures from the EFA of the YAACQ served as three indicators of AUD at W7.

For descriptive purposes, we used a two-symptom cutoff on the MINI and diagnostic proportions from our sample map on to large epidemiological studies (Colder et al., 2018; Wakefield & Schmitz, 2015). For instance, using DSM-5 criteria, the National Comorbidity Study and the National Epidemiologic Study of Alcoholism and Related Conditions found that between 11.7% and 19.5% had AUD (Wakefield & Schmitz, 2015), while the value for our sample was 17.1%. Using the harmful dysfunction model proposed by Wakefield and colleagues and a twosymptom cutoff also resulted in consistent diagnostic proportions across several samples (National Comorbidity Study: 6.8%; National Epidemiologic Study of Alcoholism and Related Conditions: 1.8–6.7%; current sample: 6.3%).

## Data Analysis

Our hypotheses were tested by using (a) a bifactor confirmatory factor model (CFA) for internalizing and externalizing symptoms, (b) CFA for target and close friend reports of peer delinquency, (c) a latent growth curve model (LGCA) for changes in AU and CFA for W3 and W7 AUD, and (d) a final structural regression model in which nested tests were computed to evaluate whether adding lagged paths between constructs improved model fit. All of the models were tested in Mplus version 7.3 (Muthén & Muthén, 1998–2007) and were estimated by using maximum



likelihood robust, which has been shown to provide more accurate estimates when variables deviate from normality (Finch, West, & MacKinnon, 1997). Furthermore, skew and kurtosis among our indicators were within the range tested in Finch et al. (1997), suggesting the appropriateness of maximum likelihood robust for handling the observed skew among our indicators. The root mean square error of approximation (RMSEA), comparative fit index (CFI), Tucker-Lewis index (TLI), and standardized root mean squared residual (SRMR) as well as model residuals were all used to test model fit for all of the models. As setting specific cutoffs for assessing "good" model fit cannot be generalized across all models (Hu & Bentler, 1999; Marsh, Hau, & Wen, 2004), ranges were used (for RMSEA, .08 is poor, .05-.07 is acceptable, and < .05 is excellent; for CFI and TLI, < .9 is poor, .9-.94 is acceptable, and > .95 is excellent; and for SRMR, .09 is poor, .06-.09 is acceptable, and < .06 is excellent).

Given the complexity of the final model, we were motivated to build our model in a sequence of steps and to reduce the number of parameters being estimated. First, we estimated three measurement models separately and tested autocovariances among the indicators and measurement invariance over time by using Satorra–Bentler nested chi-square tests.

Second, final measurement models were combined into a baseline structural regression model, which is depicted in Figure 1. At this step, Satorra-Bentler nested chi-square tests were used to assess whether adding parameters improved fit. The baseline model included stability coefficients and within-wave covariance's and was compared with the subsequent models in which crosslagged paths were added. Two final nested tests determined whether endogenous variances and within-wave covariances were time invariant. Third, 95% confidence intervals (CI) from the standardized final model were used to assess the effect size for each path. Inferences on competing theoretical paths were made based on the CI's. If a given CI did not contain 0, the path was deemed supportive of a given theory, and if the CI included 0, the path was deemed to be unsupportive of a given

> Figure 1. Baseline structural model before adding lagged paths. Age and gender are included in the model as statistical control variables, but they are not presented in the figure. Age and gender covaried with all W1 constructs and were regressed on all outcomes after W1. The gray lines reflect covariances, and all variables within waves were allowed to covary with the exception of the problem behavior factors. Extern = pure externalizing, Intern = pure internalizing, Cooccur = co-occurring internalizing and externalizing symptoms, CFPD = close friend self-report of peer delinquency, PPD = Perceived Peer Delinquency or target report of peer delinquency, ALC Intercept = Alcohol Use at W3, ALC 3-6 Slope = growth curve for alcohol use, AUD = alcohol use disorder symptoms, and W = wave. The number behind each factor labels reflects wave of measurement.

theory (Cummings, 2008, 2014). Effect size cutoffs for the standardized beta coefficients (small: Bs > .10 but < .30; medium: Bs > 0.30 but < 0.50; or large: Bs > 0.50) were used to describe point estimates for effect size (Cohen, 1988). Fourth, we estimated the final model again using 15,000 bootstraps and maximum likelihood with bias-corrected *SEs* to assess indirect effects, which spanned from W1 to W7.

## Results

## Measurement Models

Tests of measurement invariance, fit, and figures for each of the three measurement models can be found in Appendix A (see Figures A1-A3). Briefly, fit was excellent for all three measurement models. The problem behavior measurement model was consistent with configural, metric, and scalar measurement invariance across waves, while perceived peer delinquency (PPD) was consistent with configural and metric measurement invariance but not scalar invariance. The close friend peer delinquency factors (CFPD) were consistent with configural but not metric and scalar invariance. The lack of measurement invariance for CFPD factors and lack of scalar invariance for PPD factors may be a function of normative age-related increases in peer delinquency. The AU LGCA suggested significant nonlinear increases in drinking that were steepest when youth entered high school. The intercept and slope had significant variability in levels of AU at W3 and growth in AU thereafter. The measures of AUD were different at W3 and W7, precluding tests of measurement invariance for the third

measurement model. Next, these models were combined into a baseline structural regression model.

#### Full Structural Model

#### Baseline Model

The baseline model consisted of all measurement models with only paths from the covariates to all factors after W1, covariances between the covariates and the factors at W1, and the stability coefficients for all constructs. A nested test suggested that constraining stability paths for the bifactors did not result in a decrement in model fit,  $\Delta \chi^2$  (3) = 0.78, p = .85, and these constraints were retained. The covariances between the problem behavior factors were constrained to be 0 within waves and a nested test supported the constraint,  $\Delta \chi^2$  (3) = 2.71, p .44. However, adding the other within-wave covariances improved model fit,  $\Delta \chi^2$  (22) = 221.91, p < .001. This model served as the baseline model with which subsequent models with lagged paths were compared (see Figure 1).

## Adding Lagged Paths and Path Invariance

Next, lagged paths were added among the W1–W3 constructs to test specific theorized pathways. Added paths were tested for equality across waves. The nested tests are shown in Table 1, with labels for the theory that each set of paths tested. The final model is shown in Figure 2, with 95% confidence intervals for the standardized coefficients. The final model provided an excellent fit to the data,  $\chi^2$  (1,723) = 2230.39, p < .001; RMSEA = .028, 90% CI = [0.024, 0.031]; CFI = .96; TLI = .96; SRMR = .05. Furthermore, measurement for problem behavior and PPD was

Table 1. Nested Satorra-Bentle	er chi-square difference tests and	I associated <i>df</i> and <i>p</i> values f	for adding lagged paths	between constructs across waves
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Adding Lagged Paths	df	$\Delta \chi^2$	p	Relevant Theory
1. Extern, Intern $\rightarrow$ CO	4	13.98	0.01	Dual-Failure, Socialization
2. Extern $\rightarrow$ Intern; Intern $\rightarrow$ Extern	4	1.23	0.87	NA
3. CO $\rightarrow$ Intern, Extern	4	2.07	0.72	NA
4. CO, Intern, Extern $\rightarrow$ AU	6	56.66	>.001	CO, Delayed Escalation, PBT
5. CO, Intern, Extern $\rightarrow$ AUD	6	26.01	>.001	CO, Delayed Escalation, PBT
6. CO, Intern, Extern $\rightarrow$ PPD, CFPD	12	22.50	0.03	Problem Behavior Selection
7. PPD, CFPD $\rightarrow$ CO, Intern, Extern	12	6.37	0.78	Socialization of PB
8. CFPD $\rightarrow$ PPD	2	12.32	0.002	NA
9. PPD $\rightarrow$ CFPD	2	2.29	0.32	Peer Norms Selection
10. PPD $\rightarrow$ AU	2	22.34	>.001	Peer Norms Socialization
11. CFPD $\rightarrow$ AU	2	1.74	0.42	Peer Behavior Socialization
12. PPD $\rightarrow$ AUD	2	1.35	0.51	Peer Norm Socialization
13. CFPD $\rightarrow$ AUD	2	0.38	0.83	Peer Behavior Socialization
Constraining Parameters over time				
Constrain (1.)	2	3.19	0.20	
Constrain (6.)	6	8.50	0.23	
Constrain (8.)	2	1.51	0.47	
Constrain endogenous variances	5	6.64	0.25	
Constraining covariance's	14	12.61	0.56	

Note:  $\rightarrow$  = direction of effect, Extern = externalizing symptoms, Intern = internalizing symptoms, Co = Co-occurring internalizing and externalizing symptoms, AU = alcohol use, AUD = alcohol use disorder, PPD = perceived peer delinquency, CFPD = close friend peer delinquency, df = degrees of freedom,  $\Delta \chi^2$  = Santora–Bentler chi-square difference test, NA = not available, Delayed Escalation = Delayed onset and escalation theory, PB = Problem Behavior, PBT = Problem Behavior Theory, CO = co-occurring hypothesis. Total sample size = 387.

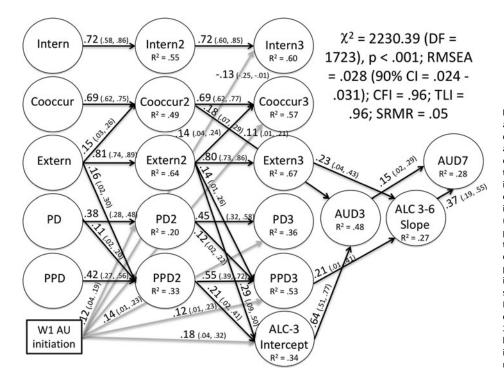


Figure 2. Estimated standardized path coefficients and 95% confidence intervals for the full model predicting alcohol use and alcohol use disorder. Age and gender were included in the model as statistical control variables, but they are not presented in the figure. With the exception of the problem behavior factors, all of the constructs were allowed to covary within waves. All coefficients are standardized and only those that were deemed significant (CI did not contain 0) are shown. The interval in parentheses after each standardized coefficient is the 95% confidence interval for the standardized coefficient. Extern = pure externalizing, Intern = pure internalizing, Cooccur = co-occurring internalizing and externalizing symptoms, CFPD = close friend self-report of peer delinquency, PPD = Perceived Peer Delinquency or target report of peer delinquency, ALC-3 Intercept = Alcohol Use at W3, ALC 3-6 Slope = growth curve for alcohol use, AUD = alcohol use disorder symptoms, and W = wave. The trailing number of each factor label reflects wave of measurement.

equivalent across waves while all lagged paths and effects of covariates were time invariant, suggesting consistent measurement and structural paths across measurement periods. The within-wave correlations among the latent constructs can be found in Table 2. Interestingly, pure externalizing and co-occurring symptoms had similar-sized correlations with both AU and PPD (small to large), but not with CFPD, while the correlations between pure internalizing symptoms and all of the constructs with the exception of AU at W3 were so small that they were not detectable with our sample. Pure internalizing symptoms had a small negative correlation with AU at W3.

## Final model

Figure 2 depicts the final model, with path coefficients and 95% confidence intervals (CI) for the paths in which the effect size estimates did not contain zero. Pure externalizing symptoms had the largest stability coefficients (large), followed by pure internalizing (large), co-occurring symptoms (large), PPD (moderate

to large), and CFPD (moderate to large). Pure externalizing symptoms had a positive and consistent effect on co-occurring symptoms in the small-effect size range, while the association of pure internalizing symptoms with later co-occurring symptoms was too small to be detected with our sample,  $\beta = 0.08$ , 95% CI [-0.02, 0.17]. These paths support the dual failure model, but they do not support the notion that pure internalizing symptoms can lead to co-occurring symptoms. Pure externalizing symptoms also had a small to moderate and consistent effect on PPD such that high levels of externalizing symptoms were prospectively associated with higher levels of peer delinquency. In contrast, the association between internalizing symptoms and PPD was too small to be detected by our sample,  $\beta = -0.01$ , 95% CI [-0.09, 0.07]. The results support prior literature linking externalizing problems to the perception that peer delinquency is normative but did not support the notion that internalizing symptoms alone lead to perceived peer delinquency. Close friend peer delinquency had a small, consistent effect on PPD, suggesting that

Table 2. Within-wave correlations between problem behavior factors, peer delinquency, and alcohol use

	Int	Ext	Со	Int2	Ext2	Co2	Int3	Ext3	Co3
AU	-0.07	0.22	0.20	-	-	-	-	-	-
CFPD	0.02	0.11	-0.02	_	_	_	_	-	-
PPD	0.04	0.43	0.32	-	_	-	_	-	-
CFPD2	-	-	_	0.02	0.15	-0.02	_	-	-
PPD2	-	-	-	0.04	0.53	0.30	-	-	-
AU3	-	-	_	_	_	_	-0.19	0.40	0.32
CFPD3	-	-	_	_	_	_	0.02	0.15	-0.02
PPD3	-	-	-	-	-	-	0.04	0.53	0.30

Note: Bolded correlations are significant (p < 0.05). Int = internalizing symptoms, Ext = externalizing symptoms, Co = Co-occurring internalizing and externalizing symptoms, AU = alcohol use, PPD = perceived peer delinquency, CFPD = close friend peer delinquency, Total sample size = 387.

prior peer self-reported delinquency precedes perceptions of peer delinquency (socialization).

Pure externalizing symptoms at W2 predicted the AU intercept at W3, pure externalizing symptoms at W3 predicted the AU slope (W4–W6), and the same pattern was observed for PPD at W2 and W3. High levels of externalizing symptoms and PPD were associated with higher levels of AU at W3 and steeper growth in AU thereafter. The effect sizes ranged from small to moderate. In contrast, the associations of internalizing symptoms alone with the AU intercept at W3,  $\beta = -0.01$ , 95% CI [-0.18, 0.16], and the AU slope (W4–W6),  $\beta = -0.13$ , 95% CI [-0.29, 0.03], were too small to be detected with our sample. These paths support problem behavior and socialization theories by demonstrating consistent cross-lag paths between pure externalizing symptoms, peer delinquency, and AU, but they did not support the delayed onset and rapid escalation hypothesis.

Although co-occurring symptoms at W2 did predict the AU intercept at W3 before the paths from W2 PPD were added, the point estimate dropped and the 95% CI was wider in the final model when PPD was added,  $\beta = 0.01$ , 95% CI [-0.14, 0.15]. This suggests that perceptions of peer delinquency outperformed and confounded co-occurring symptoms in the prediction of AU. However, co-occurring symptoms did have a direct effect on AUD at W3, and this was the only problem behavior factor to have had a direct effect on AUD. Higher levels of co-occurring symptoms were associated with higher levels of AUD symptoms with small effect size. Co-occurring symptoms at W3 did not predict growth in AU,  $\beta = -0.03$ , 95% CI [-0.16, 0.11]. The pattern of results suggests that the association of co-occurring symptoms and not pure internalizing symptoms,  $\beta = -0.08$ , 95% CI [-0.19, 0.04] with AUD was large enough to be detectable in our sample, providing more empirical support for the co-occurring hypothesis than for the delayed onset rapid escalation hypothesis.

The AU intercept at W3 had a strong effect on AUD at W3, the AU slope had a moderate effect on AUD at W7, and AUD at W3 had a small effect on AUD at W7. Perhaps not surprisingly, early AU was also related to later problem behavior, but the pattern was different than that shown in prior studies (e.g., Hicks et al., 2012). That is, early AU had a small negative effect on W3 pure internalizing symptoms and a small positive effect on W3 co-occurring symptoms.

#### **Testing Mediation**

Of interest were several paths that map on to hypothesized cascades from externalizing to AU and AUD through peer delinquency (a large literature), from pure internalizing/externalizing to AU and AUD through co-occurring symptoms (dual failure model, co-occurring hypothesis, as well as delayed onset and rapid escalation), and from early AU to AUD through problem behavior and the two measures of peer delinquency (selection and socialization). Stability paths were also of interest. For instance, paths from W1 pure internalizing to W2 pure internalizing to W3 pure internalizing to AU and AUD can provide a test of whether stability in pure internalizing symptoms leads to increases in AU and AUD later in adolescence and whether the effects are mediated by peer delinquency (delayed onset and escalation).

Table 3 contains estimates, 95% bias corrected confidence intervals for the indirect effects, and the specific theory or theories that each path tested. Consistent with prior literature, peer delinquency mediated the effect of pure externalizing symptoms on levels of AU at W3 as well as growth in AU from middle to late adolescence and AUD at W7. Furthermore, these effects were consistent across the repeated measures of both pure externalizing symptoms and peer delinquency. In contrast, pure internalizing symptoms did not consistently predict any peer

Table 3. Indirect effects and associated 95% confidence intervals using 15,000 bootstraps and bias-corrected SEs.

Peer Delinquency as a Mediator					IE	LL	UL	Theory	
Extern1	PPD2	AU-I	AUD3	AUD7	0.03	.001	0.26	PB Select/Social	
Extern1	PPD2	PPD3	AU-S	AUD7	0.07	0.01	0.46	PB Select/Social	
Extern1	Extern2	PPD3	AU-S	AUD7	0.09	0.01	0.47	PB Select/Social	
Extern2	PPD3	AU-S	AUD7		0.11	0.01	0.51	PB Select/Social	
W1 AU	PPD3	AU-S	AUD7		0.05	0.01	0.23	Select/Social	
W1 AU	CFPD2	PPD3	AU-S	AUD7	0.006	0.001	0.036	Select/Social	
CFPD1	PPD2	AU-I	AUD3	AUD7	0.03	0.002	0.16	Socialization	
CFPD1	PPD2	PPD3	AU-S	AUD7	0.06	0.01	0.26	Socialization	
CFPD1	CFPD2	PPD3	AU-S	AUD7	0.05	0.01	0.21	Socialization	
CFPD2	PPD3	AU-S	AUD7		0.09	0.01	0.26	Socialization	
Problem Beh	avior as a Mediat	tor							
Extern1	Co2	AUD3	AUD7		0.04	0.001	0.20	Dual-Failure/Co	
Stable Problem Behavior Symptoms and AUD									
Extern1	Extern2	AU-1	AUD3	AUD7	0.24	-0.01	0.93	Problem Behavior	
Extern1	Extern2	Extern3	AU-S	AUD7	0.59	-0.02	1.90	Problem Behavior	
Col	Co2	AUD3	AUD7		0.16	0.01	0.49	Problem Behavior	

Note: Extern = externalizing symptoms, Co = Co-occurring internalizing and externalizing symptoms, PPD = perceived peer delinquency, CFPD = close friend peer delinquency, AU-I = alcohol use intercept (W3), AU-S = alcohol use slope (W3-W6), AUD = alcohol use disorder, # reflects measurement wave, IE = indirect effect, LL = lower limit, UL = upper limit, PB = Problem Behavior, Select/Social = Selection then Socialization, Co = co-occurring hypothesis. Total sample size = 387.

delinquency or AU outcome, nor did pure internalizing symptoms consistently predict co-occurring symptoms. Results for internalizing were also consistent across the repeated measures, and the lack of associations suggested that the mediation paths involving pure internalizing symptoms were too small to be detected with our sample. These results support problem behavior theory and socialization theory, but they did not support the delayed and rapid escalation hypothesis. There were additional mediated effects from early AU (W1) to AUD (W7) through both PPD and CFPD, supporting selection/homophily models in which adolescents choose friends based on common engagement in AU or delinquent behavior. Furthermore, these effects were replicated across reporters. With respect to peer delinquency, CFPD also affected AUD at W3 and W7 through PPD and these results were consistent across repeated measures as well, suggesting that peer reports of their own behavior only had an effect on AU and AUD through perceptions of peer delinquency.

Given that levels of co-occurring symptoms were the only problem behavior factor that had a detectable direct effect on an AUD (W3) outcome, co-occurring symptoms was the only candidate for problem behavior mediation of AUD. Co-occurring symptoms mediated the effect of pure externalizing symptoms on later AUD suggesting that a dual-failure pattern is one mechanism of the relationship between pure externalizing symptoms and AUD. In fact, pure externalizing symptoms only had indirect effects on AUD through either peer delinquency  $(M_{age} = 12.6 \text{ and } 13.6 \text{ at } W2 \text{ and } W3$ , respectively), the AU intercept ( $M_{age} = 13.6$ ), co-occurring symptoms ( $M_{age} = 12.6$ ), or growth in AU (growth from 13.6 to 17.9 on average). Although chronic problem behavior symptoms have been argued to be particularly risky for youth (Hussong et al., 2011), the indirect effects assessing stability in problem behavior symptoms to AU and AUD were not tenable for pure internalizing symptoms given that associations involving internalizing symptoms and our outcomes were too small to be detected. Furthermore, the 95% CI for the mediated effect from stable pure externalizing symptoms to AU and AUD overlapped with zero. However, stable co-occurring symptoms did have a small direct effect on AUD at W3, which predicted AUD at W7. The results suggest that co-occurring symptoms explained variance in AU and AUD, whereas this was not the case for pure internalizing or externalizing symptoms. The pattern of results provided support for the co-occurring hypothesis, while providing limited support for the delayed onset and rapid escalation hypothesis.

## Alternative Models

Two-Factor Model for Internalizing and Externalizing Symptoms Similar to all modeling approaches, bifactor models have limitations. They are subject to overfitting and nuance covariance (Bonifay, Lane, & Reise, 2018). Therefore, we estimated an alternative model in which only two factors were modeled for internalizing and externalizing symptoms. Subsequently, we went through a similar series of nested tests to determine pathways between problem behavior, peer delinquency, AU and AUD (see Appendix B for details). Although some of the path coefficients in this model differed from those found in our main analysis, they all point to similar inferences regarding the theories tested. Externalizing symptoms initiates a cascade that affects peer delinquency and subsequent AU, both of which make AUD more likely. In contrast, associations between internalizing symptoms and peer delinquency, AU, and AUD were either undetectable or protective depending on whether a bifactor or a two-factor model was used to test hypotheses. Importantly, there is a limitation of the two-factor model: co-occurring variance is being partialled out of beta coefficients and indirect effects. When this is considered in the context of the bifactor model, it suggests that externalizing symptoms suppress the effect of internalizing symptoms when co-occurring symptoms aren't modeled explicitly (see Foster et al., 2018 for a similar pattern). Furthermore, by not considering co-occurring symptoms, less overall variance was explained in problem behavior and AUD.

### Hierarchical Model and Other Models

Mediation pathways and stability coefficients were used to test the effect of chronic problem behavior symptoms on AU and AUD. A better method would be to create higher-order factors for each longitudinal construct (pure internalizing symptoms, pure externalizing symptoms, co-occurring symptoms, and both peer delinquency constructs) and to test paths from the hierarchical factors to AU and AUD. We tested such a model, and the results can be found in Appendix B. Here again, the bifactor model fit better and the results lead to the same basic conclusions. Chronic co-occurring symptoms directly predicted AUD, while associations between chronic pure internalizing and externalizing symptoms and AUD were undetectable.

## Discussion

In this study, we tested different theoretical conceptualizations of developmental pathways from problem behavior to AUD through theoretical mediators such as changes in problem behavior, changes in peer delinquency (perceived and actual peer behavior), and changes in AU. The results supported three pathways that were consistent with four theories: the problem behavior theory, the dual failure model, the co-occurring hypothesis, and selection and socialization theory. To simplify, the mediation pathways were labeled according to the theories they supported and will be discussed in separate sections below. First, the externalizing pathway, started with pure externalizing symptoms and ended with AUD, but it was mediated by the development of co-occurring symptoms and peer delinquency. The former finding is novel in that it links the development of internalizing symptoms secondary to externalizing symptoms to early AUD symptoms while simultaneously supporting prior research on the importance of peer delinquency as a mediator of externalizing symptoms and AU and AUD (Dishion, 2000; Dishion & Skaggs, 2000; Scalco et al., 2014; Zucker, 2016). The second pathway was labeled the stable co-occurring pathway and involved stable co-occurring symptoms affecting AUD directly in early to middle adolescence. Taken together, these two pathways involving problem behavior suggest that internalizing and externalizing pathways are not distinct in adolescence, as is often discussed in the literature, and that externalizing symptoms in the presence of internalizing symptoms bifurcates in early adolescence. Third, there were pathways from early AU and peer delinquency through later peer delinquency (across reporters) and AU, respectively, consistent with both selection/homophily and socialization/ influence theories. Each of these pathways were associated with a small to moderate effect size and produced confidence intervals that ranged from small to moderate.

In interpreting the results in reference to theory, it also important to consider the paths that did not account for variance in AU and AUD. For instance, in no case did internalizing symptoms alone have a consistent positive or negative effect on any outcome related to co-occurring symptoms (development of externalizing symptoms), peer delinquency, AU, or AUD. Furthermore, the confidence intervals suggest that the effect of internalizing symptoms on peer delinquency, AU, or AUD will most often be close to zero or negative and small. Peer delinquency also did not have a consistent positive or negative effect on later problem behavior, yet it consistently predicted AU and AUD with a small effect size. The results supported the integration of (a) the dual failure model (Capaldi, 1991, 1992); (b) theories that emphasize externalizing symptoms, peer problems, and the negative sequelae of both externalizing symptoms and early AU (Chassin et al., 2016; Dodge et al., 2009; Lahey & Waldman, 2017; Zucker, 2016); and (c) the chronic co-occurring hypothesis, which is based on prior empirical work demonstrating the importance of co-occurring symptoms and lack of an effect of internalizing symptoms alone (Colder et al., 2013, 2018; Fosters et al., 2018; Mason et al., 2008; Scalco et al., 2014). However, the results did not support the delayed onset and rapid escalation hypothesis (Hussong et al., 2011, 2017). Each of these pathways and their implications are discussed in turn.

#### Externalizing Symptoms Pathway

Pathways from externalizing symptoms alone to co-occurring symptoms and peer delinquency and then to AUD and AU, respectively, link different literatures on AU and AUD. The first is on the development of internalizing symptoms as a function of both pure externalizing symptoms (Capaldi, 1991, 1992; Chassin et al., 1999; Lahey & Waldman, 2017) and early AU (Hicks et al., 2012; Scalco, 2017). The second literature is the welldocumented externalizing pathway in which peer factors (rejection and selection) mediate increases in AU (Dishion, 2000; Dishion & Skaggs, 2000; Jessor & Jessor, 1977; Scalco et al., 2014) as well as other substances (Chassin et al., 2016; Dodge et al., 2009; Scalco et al., 2014). Perhaps internalizing symptoms that develop as a function of pure externalizing symptoms combined with AU and peer delinquency creates a context that supports negative reinforcement of AU (e.g., self-medication) and positive reinforcement of AU behaviors by peers, resulting in rapid escalation in AU and eventually AUD during adolescence.

Another interesting pattern may be related to this externalizing pathway. In our model, pure externalizing symptoms at W1 were moderately correlated with early AU, while early AU had a small effect on later co-occurring symptoms. Neurobiological theories emphasize that exposure to AU results in neurobiological changes that strengthen negative reinforcement pathways to AUD (Everitt & Robins, 2005; Khantzian, 1997; Koob & LeMoal, 2008). The behavioral manifestations of these neurobiological changes overlap with both internalizing and externalizing symptoms (e.g., anhedonia, irritability, frustration, anxiety, rigidity) providing credence to the finding that early AU predicted co-occurring symptoms and not pure internalizing or externalizing symptoms. This line of reasoning would suggest that pure externalizing symptoms bifurcate into different developmental pathways in adolescence depending on AU and the development of co-occurring internalizing symptoms. One pathway involves pure externalizing behavior and peer problems while the other pathway involves the same starting point, but it results in the development of co-occurring symptoms and earlier AUD and does not involve close friend delinquency.

#### Stable Co-Occurring Symptoms Pathway

Stable co-occurring symptoms across late childhood and early adolescence, but not stable internalizing symptoms, predicted AUD directly, while neither set of chronic symptoms prospectively predicted AU. However, co-occurring symptoms at W1 had a moderate association with early AU, whereas pure internalizing symptoms did not. As such, some youth with co-occurring symptoms initiated drinking early ( $M_{age} = 12$ ) and had stable co-occurring symptoms, which had a direct effect on early AUD symptoms ( $M_{age} = 14$ ). Furthermore, early AU exacerbated later co-occurring symptoms, which suggests a transactional relationship between co-occurring symptoms and AU and AUD in early adolescence.

Given the complexity of interpreting the co-occurring factor (Snyder, Young, & Hankin, 2017) and bifactors in general (see Bonifay, Lane, & Reise, 2017), there are several possible interpretations of this pathway. First, it is possible that this pattern of associations is best accounted for by self-medication. That is, negative affect has a stronger correlation with co-occurring symptoms than pure internalizing or externalizing symptoms alone (Tacket et al., 2013) and co-occurring symptoms are also associated with social stress including alienation from parents and rejection from peers (Keiley et al., 2003; Ingoldsby et al., 2006; Scalco et al., 2012). The combination of negative affect and social stress may lead to drinking alcohol to cope with emotional distress (Hussong et al., 2011), and coping-motivated drinking is more strongly associated with problems than levels of drinking (Kuntsche, Knibbe, Gmel, & Engels, 2005). Second, there is empirical evidence and theory suggesting that the co-occurring factor reflects stable dysregulation in cognitive, behavioral, and emotional domains (Caspi et al., 2014; Haltigan et al., 2018; Laceulle, Vollebergh, & Ormel, 2015; Snyder et al., 2017). Moreover, validity analyses in the current sample support this point (see Appendix A). For example, co-occurring symptoms were related to facets of effortful control and impulsivity similar to pure externalizing symptoms but were also related to social anxiety and fear similar to pure internalizing symptoms. Therefore, an alternative interpretation is that youth with co-occurring symptoms have higher levels of dysregulation across multiple domains that would increase risk for AUD even in the absence of peers that are engaging in AU or in the absence of higher levels of AU.

#### Selection and Socialization Pathways

Pathways from peer delinquency (perceived peer delinquency and peer-reported peer delinquency) and early AU to early AU and peer delinquency, respectively, add to the literature linking friend selection and socialization/influence to increases in both peer delinquency and AU (Dishion & Skaggs, 2000; Haynie & Osgood, 2005; Osgood et al., 2013; Scalco et al., 2015). In some pathways selection preceded socialization, while in others socialization preceded AU and the perception that peer delinquency was normative. First, pure externalizing symptoms and early alcohol use (age = 12)were associated with the perception that peer delinquency was normative and the tendency to affiliate with friends who engage in delinquency, respectively. Subsequently, perceived peer delinquency demonstrated a socialization/influence effect, which increased AU and AUD repeatedly from early to middle adolescence. Second, socialization effects were mediated by the perception that delinquency was normative. Social norms are likely an important driver of behavior in late childhood and early adolescence given the increased salience of peers that is associated with pubertal development (Spear, 2011; Steinberg, 2008).

#### **Developmental Considerations and Future Directions**

Interestingly, neither measure of peer delinquency was associated with later problem behavior and the overall pattern of findings suggests two important conclusions. First, peer delinquent behavior and perceptions of peer delinquency, including peer AU, mediates the heterotypic continuity of risky behavior from late childhood to middle adolescence. Second, the results supported multifinality and equifinality for AU and AUD. With respect to multifinality, externalizing symptoms alone led to a diversity of outcomes, including co-occurring symptoms, peer delinquency, AU, and AUD. The pathways that were related to equifinality were even more complex. Youth endorsing higher levels of pure externalizing, co-occurring symptoms, peer delinquency across reporters, and early AU were at higher risk for increases in AU and AUD in early and later adolescence. In fact, there were 12 pathways to AUD, four of which involved systematic mediation of problem behavior and AU and AUD by peer delinquency, seven of which did not involve problem behavior (selection and socialization pathways), and one in which problem behavior had a direct effect on AUD and therefore did not involve peer delinquency. In addition to supporting equifinality and multifinality, our results point to the importance of peer delinquency (perceived and peer behavior) as peer delinquency initiated or mediated every pathway but one (the chronic co-occurring pathway).

Mediation pathways in the current study assessed betweensubject mediation from orthogonal dimensions of problem behavior (bifactor model) through peer delinquency from late childhood to middle adolescence. Furthermore, we assessed how the dynamics between these constructs in early adolescence affected later within person changes in AU and AUD in middle to late adolescence. Prior research indicates that problem behavior, peer delinquency, and AU transact into later adolescence and young adulthood (e.g., Reinke, Eddy, Dishion, & Reid, 2012). Furthermore, it is possible that a self-medication pathway to AU and AUD and support for the delayed onset hypothesis may emerge later in young adulthood once alcohol is legal to drink. Future work may benefit from considering sequential mediation with problem behavior and peer delinquency into late adolescence and through young adulthood.

Given our motivation to assess sequential mediation and delineate pure and continuous dimensions of problem behavior, we focused our data-analytic approach on between-person associations and did not address within-subject change in problem behavior or peer delinquency. Different methods (growth modeling, growth mixture modeling, latent state-trait models, and latent transition analysis) of modeling the heterogeneity of problem behavior, peer delinquency, and AU within and across time may yield a different pattern of results. Along these lines, future work may benefit from considering latent difference score or latent growth curve models with structured residuals to better model between- and within-subject change within the same model (Curran, Howard, Bainter, Lane, & McGinley, 2014; McArdle, 2009).

#### Limitations

As with any empirical examination, the results should be understood within the context of certain limitations. First, our sample spanned late childhood to late adolescence and our results may not generalize to older samples. There is evidence that internalizing problems more consistently predict substance use in young adulthood (Hussong et al., 2011, 2017), although this has not been uniformly supported (Colder et al., 2018). It is possible that different age samples may yield different results. Perhaps when youth enter the legal drinking age, the theorized delayed onset with rapid escalation pathway would emerge.

Second, internalizing and externalizing problems are higherorder factors that are composed of multiple subdomains (e.g., anxiety, depression, rule breaking, aggression, etc.). Although there is little reason to suspect that the subdomains of externalizing problems in the present study would be differentially related to AU or AUD, subdomains of internalizing symptoms have been argued to be differentially related to AU and AUD across development (Hussong et al., 2011, 2017; Kaplow, Curran, Angold, & Costello, 2001). If different patterns of co-occurrence across subdomains of internalizing problems and externalizing problems were uniquely related to AU, peer delinquency, or AUD, our results may mask those effects. Future research may benefit from considering more specific patterns of co-occurrence, AU, peer delinquency, and AUD.

Third, self-medication theories posit that alcohol use relieves a negative emotional state in the moment, so it is negatively reinforcing given the emotional context. Such reinforcement patterns occur on a time scale of days and not years, as we have modeled. Future work may consider measuring internalizing and externalizing symptoms by using ecological momentary assessment during critical periods of development for initiation and escalation of AU to continue to disentangle the relationship between problem behavior, AU, and AUD.

Finally, although we did adjust for gender as a covariate, we were unable to test for gender differences given the complexity of our structural model and the sample size. Some work suggests that males are at increased risk for the development of externalizing symptoms and AUD, while females are at increased risk for the development of internalizing symptoms. Future work may benefit from considering gender as a moderator of the pathways that we tested.

#### Conclusions

Notwithstanding the limitations, the results provide evidence that supports the integration of several theories and hypotheses in the literature on the development of AU and AUD during adolescence. These theories include problem behavior theory, the co-occurring hypothesis, the dual failure hypothesis, and socialization and selection theory. The results supported externalizing symptoms in the absence of internalizing symptoms as being the riskiest dimension of problem behavior symptoms, with moderate effects (problem behavior theory). While co-occurring internalizing and externalizing symptoms also conferred risk for AUD (co-occurring hypothesis), internalizing symptoms in the absence of externalizing symptoms did not provide risk, resulting in limited support for the delayed onset and rapid escalation hypothesis. In addition to supporting theories that emphasize externalizing symptoms, our results identified specific mediators: (a) increases in internalizing symptoms or the development of co-occurring symptoms (dual-failure hypothesis and consequences of aggressive and rule breaking behavior) and (b) peer delinquency (selection and socialization theory).

Early AU negatively predicted later internalizing symptoms alone, suggesting that early AU reduced risk for pure internalizing symptoms. In contrast, early AU increased risk for later co-occurring symptoms, suggesting a transactional relationship between AU, co-occurring symptoms, and AUD. Given that co-occurring symptoms may more consistently map on to the affective changes posited to result from heavy AU and AUD (e.g., Koob & Le Moal, 2008), our results suggest that future work should carefully model the distinction between internalizing and externalizing problem behavior when assessing cross-sectional, longitudinal, and transactional effects between problem behavior, AU, AUD, and peer delinquency. We used a bifactor model to test our hypotheses, and this approach has the advantage of allowing researchers to consider co-occurring symptoms and lagged associations from pure forms of problem behavior to co-occurring symptoms while maintaining continuous dimensions and latent constructs.

Our results also have implications for prevention and treatment. It may be best for substance use prevention programs to focus on youth with pure externalizing symptoms and youth with co-occurring internalizing and externalizing symptoms. Youth with these symptom presentations may benefit from specific treatments given the identified pathways. First, youth with externalizing symptoms alone and youth with co-occurring symptoms may benefit from normative feedback interventions, which seek to correct adolescent misperceptions of peer substance use and other peer behaviors (Lewis & Neighbors, 2006). It is important to note that normative feedback interventions have demonstrated iatrogenic effects in some instances (Miller, Meier, Lombardi, & Leffingwell, 2015; Schultz, Nolan, Cialdini, Goldstein, & Griskevicius, 2007), so they should only focus on youth with specific symptom constellations. Treatments for adolescence substance use disorder may also benefit from adding interventions that target friend selection in late childhood as well as ameliorating co-occurring symptoms (anhedonia, irritability, and rigidity). Given the pathways that were identified in the present analysis, integrating cognitive-behavioral therapies for internalizing symptoms, family therapies (multidimensional family therapy) and behavioral therapies (dialectic behavioral therapy) for externalizing symptoms, and normative feedback interventions for perceptions of peer delinquency may be relevant to both prevention and treatment efforts (Hawkins, 2009; Hulvershorn, Quinn, & Scott, 2015; Liddle, 2010; Waldron & Turner, 2008).

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#### References

- Achenbach, T. M., & Rescorla, L. A. (2001). Youth Self-Report for ages 11–18. Burlington, VT: ASEBA.
- Bonifay, W., Lane, S. P., & Reise, S. P. (2017). Three concerns with applying a bifactor model as a structure of psychopathology. *Clinical Psychological Science*, 5, 184–186.
- Brook, D. W., Brook, J. S., Rubenstone, E., Zhang, C., & Saar, N. S. (2011). Developmental associations between externalizing behaviors, peer delinquency, drug use, perceived neighborhood crime, and violent behavior in urban communities. *Aggressive Behavior*, 37, 349–361.
- Burt, S. A., McGue, M., & Iacono, W. G. (2009). Nonshared environmental mediation of the association between deviant peer affiliation and adolescent externalizing behaviors over time: Results from a cross-lagged monozygotic twin differences design. *Developmental Psychology*, 45, 1752–1760.
- Capaldi, D. M. (1991). Co-occurrence of conduct problems and depressive symptoms in early adolescent boys: I. Familial factors and general adjustment at Grade 6. *Development and Psychopathology*, 3, 277–300.

- Caspi, A., Houts, R. M., Belsky, D. W., Goldman-Mellor, S. J., Harrington, H., Israel, S., ... Moffitt, T. E. (2014). The p factor: One general psychopathology factor in the structure of psychiatric disorders? *Clinical Psychological Science*, 2, 119–137.
- Chassin, L., Colder, C. R., Hussong, A., & Sher, K. (2016). Substance use and substance use disorders. In A. J. Sameroff (Ed.), *Developmental psychopathology* (3rd ed, pp. 833–897). Hoboken, NJ: Wiley.
- Chassin, L., Pitts, S. C., DeLucia, C., & Todd, M. (1999). A longitudinal study of children of alcoholics: Predicting young adult substance use disorders, anxiety, and depression. *Journal of Abnormal Psychology*, 108, 106–119.
- Cohen, J. . (1988). Statistical power analysis for the behavioral sciences (2nd ed.). Hillsdale, NJ: Erlbaum.
- Colder, C. R., Chassin, L., Lee. M. R., & Villalta, I. K. (2010). Developmental perspectives: Affect and adolescent substance use. In Jon D. Kassel (Ed.) *Substance Abuse and Emotion* (pp. 109–135). Washington, DC: American Psychological Association.
- Colder, C. R., Frndak, S., Lengua, L. J., Read, J. P., Hawk, L. W., & Wieczorek, W. F. (2018). Internalizing and externalizing problem behavior: A test of a latent variable interaction predicting a two-part growth model of adolescent substance use. *Journal of Abnormal Child Psychology*, 42, 319–330.
- Colder, C. R., Scalco, M. D., Trucco, E. M., Read, J. P., Lengua, L. J., & Wieczorek, W. F. (2013). Prospective associations of internalizing and externalizing problems and their co-occurrence with early adolescent substance use. *Journal of Abnormal Child*, 41, 667–677.
- Colder, C. R., Trucco, E. M., Lopez, H. I., Hawk, L. W., Read, J. P., et al. (2011). Reinforcement sensitivity theory and laboratory assessment of BIS and BAS in children. *Journal of Research in Personality*, 45, 198–207.
- Copeland, W. E., Shanahan, L., Costello, E. J., & Angold, A. (2009). Childhood and adolescent psychiatric disorders as predictors of young adult disorders. *Archives of general psychiatry*, 66, 764–772.
- Costello, E. J., Erkanli, A., Federman, E., & Angold, A. (1999). Development of psychiatric comorbidity with substance abuse in adolescents: Effects of timing and sex. *Journal of Clinical Child Psychology*, 28, 298–311.
- Cruz, J. E., Emery, R. E., & Turkheimer, E. (2012). Peer network drinking predicts increased alcohol use from adolescence to early adulthood after controlling for genetic and shared environmental selection. *Developmental Psychology*, 48, 1390–1402.
- Cumming, G. (2008). Replication and p intervals: P values predict the future only vaguely, but confidence intervals do much better. *Perspectives on Psychological Science*, *3*, 286–300.
- Cumming, G. (2014). The new statistics: Why and how. *Psychological Science*, 25, 7–29.
- Curran, P. J., Howard, A. L., Bainter, S. A., Lane, S. T., & McGinley, J. S. (2014). The separation of between-person and within-person components of individual change over time: A latent curve model with structured residuals. *Journal of Consulting and Clinical Psychology*, 82, 879.
- Curran, P. J., Stice, E., & Chassin, L. (1997). The relation between adolescent alcohol use and peer alcohol use: A longitudinal random coefficients model. *Journal of Consulting and Clinical Psychology*, 65, 130–140.
- Dishion, T. J. (2000). Cross-setting consistency in early adolescent psychopathology: Deviant friendships and problem behavior sequelae. *Journal of Personality*, 68, 1109–1124.
- Dishion, T. J., & Medici Skaggs, N. (2000). An ecological analysis of monthly 'bursts' in early adolescent SU. *Applied Developmental Science*, 4, 89–97.
- Dodge, K. A., Malone, P. S., Lansford, J. E., Miller, S., Pettit, G. S., & Bates, J. E. (2009). A dynamic cascade model of the development of substance-use onset. *Monographs of the Society for Research in Child Development*, 74, 1–134.
- Elliott, D. S., & Huizinga, D. (1983). Social class and delinquent behavior in a national youth panel. *Criminology: An Interdisciplinary Journal*, *21*, 149–177.
- Evans, M. L., Scalco, M. D., Lengua, L, & Colder, C. R. (2019). Is psychopathology two factors or three? Using the youth self-report to compare a bifactor and two-factor model of psychopathology in early adolescence using multiple waves of longitudinal data. Poster session presented at the Association for Psychological Science, Washington, DC.

- Everitt, B. J., & Robbins, T. W. (2005). Neural systems of reinforcement for drug addiction: From actions to habits to compulsion. *Nature Neuroscience*, 8, 1481–1489.
- Fergusson, D. M., Woodward, L. J., & Horwood, L. J. (1999). Childhood peer relationship problems and young people's involvement with deviant peers in adolescence. *Journal of Abnormal Child Psychology*, 27, 357–370.
- Finch, J. F., West, S. G., & MacKinnon, D. P. (1997). Effects of sample size and nonormality on the estimation of mediated effects in latent variable models. *Structural Equation Modeling*, 4, 87–107.
- Fite, P. J., Colder, C. R., & O'Connor, R. M. (2006). Childhood behavior problems and peer selection and socialization: Risk for adolescent alcohol use. *Addictive Behaviors*, 31, 1454–1459.
- Foster, K. T., Hicks, B. M., & Zucker, R. A. (2018). Positive and negative effects of internalizing on alcohol use problems from childhood to young adulthood: The mediating and suppressing role of externalizing. *Journal of Abnormal Psychology*, 12, 394–403.
- Haltigan, J. D., Aitken, M., Skilling, T., Henderson, J., Hawke, L., Battaglia, M., ... Andrade, B. F. (2018). "P" and "DP": Examining symptom-level bifactor models of psychopathology and dysregulation in clinically referred children and adolescents. *Journal of the American Academy of Child & Adolescent Psychiatry*, 57, 384–396.
- Hawkins, E. H. (2009). A tale of two systems: Co-occurring mental health and substance abuse disorders treatment for adolescents. *Annual Review of Psychology*, 60, 197–227.
- Haynie, D. L., & Osgood, D. (2005). Reconsidering peers and delinquency: How do peers matter? Social Forces, 84, 1109–1130.
- Hicks, B. M., Durbin, C. E., Blonigen, D. M., Iacono, W. G., & McGue, M. (2012). Relationship between personality change and the onset and course of alcohol dependence in young adulthood. *Addiction*, 107, 540–548.
- Hill, J., Emery, R. E., & Harden, K. P., Mendle, J., & Turkheimer, E. (2008). Alcohol use in adolescent twins and affiliation with substance using peers. *Journal of Abnormal Child Psychology*, 36, 81–94.
- Hu, L., & Bentler, P. M. (1999). Cutoff criteria for fit indexes in covariance structure analysis: Conventional criteria versus new alternatives. *Structural Equation Modeling*, 6, 1–55.
- Hulvershorn, L. A., Quinn, P. D., & Scott, E. L. (2015). Treatment of adolescent substance use disorders and co-occurring internalizing disorders: A critical review and proposed model. *Current Drug Abuse Reviews*, 8, 41–49.
- Hussong, A. M., Ennett, S. T., Cox, M. J., & Haroon, M. (2017). A systematic review of the unique prospective association of negative affect symptoms and adolescent substance use controlling for externalizing symptoms. *Psychology of Addictive Behaviors*, 31, 137–147.
- Hussong, A. M., Jones, D. J., Stein, G. L., Baucom, D. H., & Boeding, S. (2011). An internalizing pathway to alcohol use and disorder. *Psychology of Addictive Behaviors*, 25, 390–404.
- Ingoldsby, E. M., Kohl, G. O., McMahon, R. J., & Lengua, L. (2006). Conduct problems, depressive symptomatology and their co-occurring presentation in childhood as predictors of adjustment in early adolescence. *Journal of Abnormal Child Psychology*, 34, 603–621.
- Jessor, R., & Jessor, S. L. (1977). Problem behavior and psychosocial development: A longitudinal study of youth. New York: Academic Press.
- Kaplow, J. B., Curran, P. J., Angold, A., & Costello, E. J. (2001). The prospective relation between dimensions of anxiety and the initiation of adolescent alcohol use. *Journal of Clinical Child Psychology*, 30, 316–326.
- Keiley, M. K., Lofthouse, N., Bates, J. E., Dodge, K. A., & Pettit, G. S. (2003). Differential risks of covarying and pure components in mother and teacher reports of externalizing and internalizing behavior across ages 5 to 14. *Journal of Abnormal Child Psychology*, 31, 267–283.
- Khantzian, E. J. (1997). The self-medication hypothesis of substance use disorders: A reconsideration and recent applications. *Harvard Review of Psychiatry*, 4, 231–244.
- Knecht, A. B., Burk, W. J., Weesie, J., & Steglich, C. (2010). Friendship and alcohol use in early adolescence: A multilevel social network approach. *Journal of Research on Adolescence*, 21, 475–487.
- Koob, G. F., & Le Moal, M. (2008). Addiction and the brain antireward system. Annual Review of Psychology, 59, 29–53.
- Kuntsche, E., Knibbe, R., Gmel, G., & Engels, R. (2005). Why do young people drink? A review of drinking motives. *Clinical Psychology Review*, 25, 841–861.

- Kushner, M. G., Maurer, E., Menary, K., & Thuras, P. (2011). Vulnerability to the rapid ("telescoped") development of alcohol dependence in individuals with anxiety disorder. *Journal of Studies on Alcohol and Drugs*, 72, 1019–1027.
- Laceulle, O. M., Vollebergh, W. A., & Ormel, J. (2015). The structure of psychopathology in adolescence: Replication of a general psychopathology factor in the TRAILS study. *Clinical Psychological Science*, 3, 850–860.
- Lahey, B. B., & Waldman, I. D. (2017). Oppositional defiant disorder, conduct disorder, and juvenile delinquency. In T. P. Beauchaine, & S. P. Hinshaw (Eds.), *Child and adolescent psychopathology* (3rd ed., pp. 449–496). Hoboken, New Jersey: John Wiley & Sons.
- Lewis, M. A., & Neighbors, C. (2006). Social norms approaches using descriptive drinking norms education: A review of the research on personalized normative feedback. *Journal of American College Health*, 54, 213–218.
- Liddle, H. A. (2010). Multidimensional family therapy: A science-based treatment system. The Australian and New Zealand Journal of Family Therapy, 31, 138–148.
- Little, K., Hawkins, M. T., Sanson, A., O'Connor, M., Toumbourou, J. W., Smart, D., & Vassallo, S. (2013). Longitudinal predictors of alcohol-related harms during the transition to adulthood: Longitudinal antecedents of alcohol-related harms. *Australian Psychologist*, 48, 270–280.
- MacKinnon, D. P. (2008). Introduction to statistical mediation analysis. Mahwah, New Jersey: Erlbaum.
- Markon, K. E., Chmielewski, M., & Miller, C.J. (2011). The reliability and validity of discrete and continuous measures of psychopathology: A quantitative review. *Psychological Bulletin*, 137, 856–879.
- Marmorstein, N. R., White, H. R., Loeber, R., & Stouthamer-Loeber, M. (2010). Anxiety as a predictor of age at first use of substances and progression to substance use problems among boys. *Journal of Abnormal Child Psychology*, 38, 211–224.
- Marsh, H. W., Hau, K., & Wen, Z., (2004). In search of golden rules: Comment on hypothesis-testing approaches to setting cutoff values for fit indexes and danger in overgeneralizing Hu and Bentler's (1999) findings. *Structural Equation Modeling*, 11, 320–341.
- Martel, M. M., Pan, P. M., Hoffmann, M. S., Gadelha, A., do Rosário, M. C., Mari, J. J., ... Salum, G. A. (2017). A general psychopathology factor (P factor) in children: Structural model analysis and external validation through familial risk and child global executive function. *Journal of Abnormal Psychology*, 126, 137–148.
- Mason, W. A., Hitchings, J. E., & Spoth, R. L. (2008). The interaction of conduct problems and depressed mood in relation to adolescent substance involvement and peer substance use. *Drug and Alcohol Dependence*, 96, 233–248.
- McArdle, J. J. (2009). Latent variable modeling of differences and changes with longitudinal data. *Annual Review of Psychology*, 60, 577–605.
- McElroy, E., Shevlin, M., & Murphy, J. (2017). Internalizing and externalizing disorders in childhood and adolescence: A latent transition analysis using ALSPAC data. *Comprehensive Psychiatry*, 75, 75–84.
- Miller, M. B., Meier, E., Lombardi, N., & Leffingwell, T. R. (2015). Theories of behaviour change and personalised feedback interventions for college student drinking. *Addiction Research & Theory*, 23, 322–335.
- Muthén, L.K., & Muthén, B.O. (1998–2007). Mplus User's Guide. Fifth Edition. Los Angeles, CA: Muthén and Muthén.
- Osgood, W. D., Ragan, D. T., Wallace, L., Gest, S. D., Fienberg, M. E., & Moody, J. (2013). Peers and the emergence of alcohol use: Influence and selection processes in adolescent friendship networks. *Journal of Research* on Adolescence, 23, 500–512.
- Owens, E. B., & Hinshaw, S. P. (2016). Pathways from neurocognitive vulnerability to co-occurring internalizing and externalizing problems among women with and without attention-deficit/hyperactivity disorder followed prospectively for 16 years. *Development and Psychopathology*, 28, 1013–1031.
- Read, J. P., Wood, M. D., Capone, C. (2005). A prospective investigation of relations between social influences and alcohol involvement during the transition into college. *Journal of Studies on Alcohol*, 66, 23–34.
- Reinke, W. M., Eddy, J. M., Dishion, T. J., & Reid, J. B. (2012). Joint trajectories of symptoms of disruptive behavior problems and depressive symptoms during early adolescence and adjustment problems during emerging adulthood. *Journal of abnormal child psychology*, 40, 1123–1136.

- Sameroff, A. J., & MacKenzie, M. J. (2003). Research strategies for capturing transactional models of development: The limits of the possible. *Development and Psychopathology*, 15, 613–640.
- Scalco, M. D. (2017). Moderators and mediators of the effect of early substance use on later substance use disorder: Can developmental and neuropsychological theories of substance use and substance use disorder be integrated?. (Unpublished doctoral dissertation, SUNY Buffalo).
- Scalco, M. D., Colder, C. R., Hawk, L. W., Read, J. P., Wieczorek, W. F., & Lengua, L. J. (2014). Internalizing and externalizing problem behavior and early adolescent substance use: A test of a latent variable interaction and conditional indirect effects. *Psychology of Addictive Behaviors*, 28, 828–840.
- Scalco, M. D., Meisel, S. N., & Colder, C. R. (2016). Misperception and accurate perception of close friend substance use in early adolescence: Developmental and intervention implications. *Psychology of Addictive Behaviors*, 30, 300–311.
- Scalco, M. D., Trucco, E. M., Coffman, D. L., & Colder, C. R. (2015). Selection and socialization effects in early adolescent alcohol use: A propensity score analysis. *Journal of Abnormal Child Psychology*, 43, 1131–1143.
- Scalco, M. D., Trucco, E. M., Colder, C. R., Lengua, L. J., Wiezcorek, W. F., & Hawk, L.W. (2012, March). The prospective effect of co-occurring internalizing and externalizing symptoms on adolescent substance use. Poster presented at the Biennial Meeting of the Society for Research on Adolescence, Vancouver, Canada.
- Schafer, J. L., & Graham, J. W. (2002). Missing data: Our view of the state of the art. Psychological Methods, 7, 147–177.
- Schultz, P. W., Nolan, J. M., Cialdini, R. B., Goldstein, N. J., & Griskevicius, V. (2007). The constructive, destructive, and reconstructive power of social norms. *Psychological Science*, 18, 429–434.
- Sheehan, D. V., Shytle, D., Milo, K., & Lecrubier, Y. (2006). The Mini-International Neuropsychiatric Interview (M.I.N.I.) for children and adolescents. English Version 5.0 (M.I.N.I. Kid), USA: University of South Florida–Tampa & France: Hôpital de la Salpétrière–Paris.
- Snyder, H. R., Young, J. F., & Hankin, B. L. (2017). Strong homotypic continuity in common psychopathology-, internalizing-, and externalizing-specific factors over time in adolescents. *Clinical Psychological Science*, 5, 98–110.
- Spear, L. P. (2011). The behavioral neuroscience of adolescence. New York: W. W. Norton & Company.
- Steinberg, L. (2008). A social neuroscience perspective on adolescent risk taking. Developmental Review, 28, 78–106.

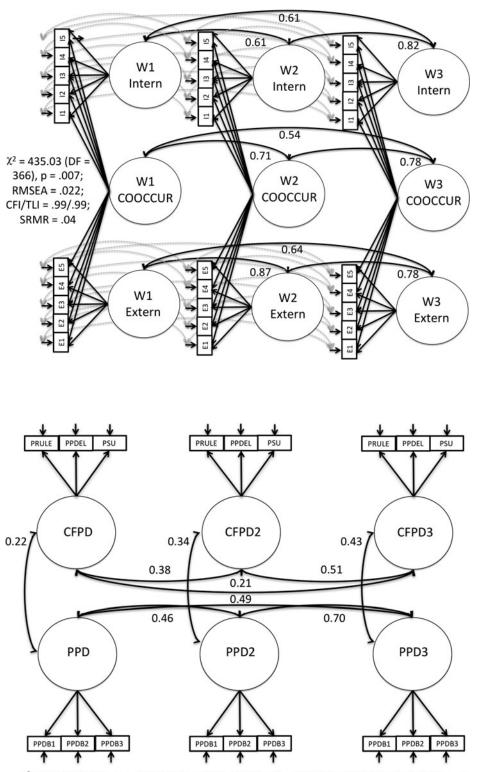
- Stice, E., Barrera, M., & Chassin, L. (1998). Prospective differential prediction of adolescent alcohol use and problem use: Examining the mechanisms of effect. *Journal of Abnormal Psychology*, 107, 616–628.
- Sung, M., Erkanli, A., Angold, A., & Costello, E. J. (2004). Effects of age at first substance use and psychiatric comorbidity on the development of substance use disorders. *Drug and Alcohol Dependence*, 75, 287–299.
- Tabachnick, B. G., & Fidell, L. S. (2001). Using multivariate statistics (Vol. 5). Nedham Heights, MA: Allyn & Bacon.
- Tackett, J. L., Lahey, B. B., Van Hulle, C., Waldman, I., Krueger, R. F., & Rathouz, P. J. (2013). Common genetic influences on negative emotionality and a general psychopathology factor in childhood and adolescence. *Journal* of Abnormal Psychology, 122, 1142.
- Trucco, E. M., Colder, C. R., & Wieczorek, W. F. (2011). Vulnerability to peer influence: A moderated mediation study of early adolescent alcohol use initiation. Addictive Behaviors, 36, 729–736.
- Wakefield, J. C., & Schmitz, M. F. (2015). The harmful dysfunction model of alcohol use disorder: Revised criteria to improve the validity of diagnosis and prevalence estimates. *Addiction*, 110, 931–942.
- Waldron, H. B., & Turner, C. W. (2008). Evidence-based psychosocial treatments for adolescent substance use. *Journal of Clinical Child and Adolescent Psychology*, 37, 238–261.
- Windle, M., & Windle, R. C. (1996). Coping strategies, drinking motives, and stressful life events among middle adolescents: Associations with emotional and behavioral problems and with academic functioning. *Journal of Abnormal Psychology*, 105, 551–560.
- Winters, K. C., Stinchfield, R. D., Henly, G. A., & Schwartz, R. H. (1991). Validity of adolescent self-report of alcohol and other drug involvement. *The International Journal of the Addictions*, 25, 1379–1395.
- Witkiewitz, K., King, K., McMahon, R. J., Wu, J., Luk, J., & the Conduct Problems Prevention Research Group. (2013). Evidence for a multidimensional latent structural model of externalizing disorders. *Journal of Abnormal Child Psychology*, 41, 223–237.
- Zehe, J. M., Colder, C. R., Read, J. P., Wieczorek, W. F., & Lengua, L. J. (2013). Social and generalized anxiety symptoms and alcohol and cigarette use in early adolescence: The moderating role of perceived peer norms. *Addictive Behaviors*, 38, 1931–1939.
- Zucker, R. A. (2016). Alcoholism; a life span perspective on etiology and course. In A. J. Sameroff (Ed.), *Developmental psychopathology* (2nd ed., pp. 569–585). New York: Kluwer Academic/Plenum Publishers.

### **Appendix A**

# Measurement Models for Problem Behavior, Peer Delinquency, AU, and AUD

Figure A.1 shows the basic measurement model for the problem behavior factors. Satorra-Bentler nested chi-square tests suggested that adding auto-covariances among the same indicators across waves improved model

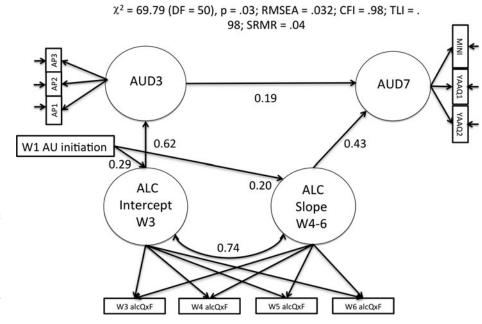
fit,  $\Delta \chi^2$  (30) = 265.29, p < .01, while constraining factor loadings, error variances, intercepts and autocovariances to be equal across time did not result in a decrement in model fit,  $\Delta \chi^2$  range (df range = 16–34) = 0.59–33.50, all ps > .17. The final model with factor loading, error variance, intercepts, and autocovariance equality constraints fit the data well:  $\chi^2$  (366) = 435.03, p = .007; RMSEA = .022, 90% CI = [.013, .029]; CFI = .99; TLI = .99; and SRMR = .04. The standardized factor loadings ranged from 0.05 to



 $\chi^2$  = 131.92 (119), p = .20; RMSEA = .017 (90% CI = 0 - .03); CFI = .99; TLI = .99; SRMR = .04

**Figure A1.** Bi-factor confirmatory factor analysis for problem behavior across three waves of longitudinal data and spanning ages 10–15. Statistically significant (p < .05) standardized coefficients are presented. Extern = pure externalizing, Intern = pure internalizing, Cooccur = co-occurring internalizing and externalizing symptoms, W = wave, I = internalizing bundle, and E = externalizing bundle.

Figure A2. Confirmatory factor model for close friend report of peer delinguency and perceived peer delinquency across three waves. Age and gender were included as statistical control variables, but they are not presented in the figure. Standardized statistically significant (p < .05) coefficients are presented. CFPD = close friend self-report of peer delinquency and PPD = Perceived Peer Delinquency or target report of peer delinquency, AU = Alcohol Use, PRULE = YSR Rule Breaking scale, PPDEL = peer report of their close friends delinquency excluding the target, PSU = peer selfreport of alcohol, tobacco, and marijuana use, and PPDB = perceived peer delinquency or target report of peer delinquency bundles. The trailing number for each factor label reflects wave of measurement.



**Figure A3.** Factor model for alcohol use and alcohol use disorder across seven waves of longitudinal data. Age and gender were included as statistical control variables, but they are not presented in the figure. Standardized statistically significant (p < .05) coefficients are presented. AU = Alcohol Use, ALC = growth curve for alcohol use, AUD = alcohol use disorder symptoms, alcQxF = alcohol quantity and frequency index, W = wave, AP = alcohol problems bundle, MINI = MINI diagnostic Interview, and YAAQ = Young Adult Alcohol Consequences Questionnaire. The trailing number for each factor label reflects wave of measurement.

 $0.62^1$  for the pure internalizing and externalizing factors, respectively, while loadings ranged from 0.44–0.81 for the co-occurring factors.

Prior analysis of this sample assessed the validity of the problem behavior factor model (Evans, Scalco, Lengua, & Colder, 2019). Repeated measures of parent-reported problem behavior and temperament and psychosocial risk reported by the adolescent from W1-W3 were used to assess the convergent and divergent validity of the bifactor model relative to a two-factor model in which internalizing and externalizing symptoms were modeled separately with no bifactor. Interestingly, when comparing the bifactor models with the two-factor models many of the correlations changed (78%), and in most cases the correlation flipped signs. As an example, the facets of effortful control were negatively related to internalizing symptoms in the two-factor model, but they were positively related to pure internalizing symptoms in the bifactor model, while other measures of internalizing symptoms had positive relationships with externalizing symptoms in the two-factor model but negative or nonsignificant relationships with pure externalizing symptoms in the bifactor model. Co-occurring symptoms were related to more overall psychosocial impairment than were the pure factors, but each pure factor was also related to impairment. For instance, co-occurring symptoms and pure externalizing symptoms similarly correlated with peer delinquency (across multiple reporters), alcohol, and tobacco use (small effects), while pure internalizing symptoms did not. In contrast, co-occurring symptoms and pure internalizing similarly correlated with social anxiety and social exclusion, while pure externalizing symptoms did not. Finally, co-occurring symptoms had a large correlation with peer victimization while both pure factors had small correlations. Overall, the results suggest that the bifactor model of problem behavior demonstrated much stronger divergent validity than the two-factor model yet both had consistent relationships with validators over time (convergent validity). Although each of the factors in the bifactor model were related to impairment, co-occurring symptoms had more and stronger relationships.

Next, we estimated the measurement model for perceived peer delinquency (PPD) and close friend peer delinquency (CFPD). Satorra-Bentler nested

chi-square tests suggested that adding auto-covariances among the same indicators across waves improved model fit for PPD and CFPD,  $\Delta \chi^2$  (11) = 56.90, p < .01. Constraining factor loadings for the PPD factors to be equal across time did not change model fit,  $\Delta \chi^2$  (4) = 1.42, p = .84, while the same constraints for CFPD resulted in a decrement to model fit,  $\Delta \chi^2$  (4) = 57.14, p < .01. Constraining residual variances and intercepts to be equal across time also resulted in a decrement to model fit for both PPD and CFPD,  $\Delta \chi^2$  (6) range = 53.53–289.40, *ps* < .01 and  $\Delta \chi^2$  (6) range = 19.29–128.41, *ps* < .01, respectively. Constraining autocovariances to be equal for PPD did not change model fit,  $\Delta \chi^2$  (3) = 5.12, p > .05, while the same constraint for CFPD did result in a decrement in model fit,  $\Delta \chi^2$  (3) = 49.22, p < .01. Fit for the final model with supported constraints was excellent,  $\chi^2$  (119) = 131.92, *p* = .20; RMSEA = .017, 90% CI = [0, .03]; CFI = .99; TLI = .99; SRMR = .04. The standardized factor loadings ranged from 0.78-0.81 for PPD and from 0.58-0.82 for CFPD. The covariances among the latent factors can be found in Figure A.2. Interestingly, the variance in both sets of constructs increased across the waves (PPD W1-W3 variance: 0.1-0.4; CFPD W1-W3 variance: 0.01–0.02) as did the cross-reporter correlation, W1 r = 0.21; W2 r = 0.34; W3 r = 0.43.

A latent growth curve analysis (LGCA) was estimated for alcohol use (AU) and a CFA was estimated for alcohol use disorder (AUD). For the LGCA, the first and last indicator was coded 0 and 3 for W3 and W6 AU, respectively, while the middle two indicators were freely estimated to account for the nonlinear patterns of change in our data (see Colder et al., 2018). Age, gender, and W1 alcohol initiation were mean centered and regressed on all outcomes. The coefficients for the final model can be found in Figure A.3, and fit for the model was excellent,  $\chi^2$  (50) = 69.79, p = .03; RMSEA = .03, 90% CI = [0, .05]; CFI = .98; TLI = .98; SRMR = .03. Averaging across gender and age at baseline, youth who did not use alcohol at W1 (96% of the sample; M age = 11.6) had on average 0.03 drinks (p < .001) at W3 with significant residual variance (v = 0.03, p < .001) as well as growth in drinking of 1.59 drinks per year (p < .001) also with significant residual variance (v = 10.22, p < .001). Age (B = 0.22, p = 0.02) was associated with higher levels of W3 AU. Alcohol use at W1 was associated with higher levels of AU at W3 (B = 0.28, p = 0.03) and with a steeper increase in AU over time (B = 0.27, p = 0.03). Gender did not predict W3 AU or change in AU.

The factor loadings ranged from 0.77–0.98 for AUD symptoms at W3 and W7. When AUD symptoms at W7 was regressed on prior AUD (W3) and the AU growth factors, the slope for AU (moderate effect size) and AUD at W3 (small effect size) significantly predicted AUD at W7. The intercept of AU at W3 had a strong effect on AUD at W3. Age, gender, and W1 AU did not predict AUD at W3 or AUD at W7 beyond the AU growth factors.

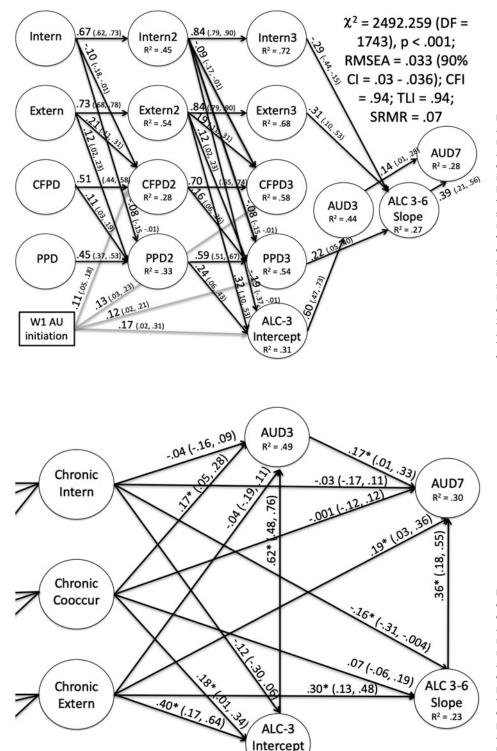
<sup>&</sup>lt;sup>1</sup>The two bundles that were formed from items on the YSR that did not load on the pure factors in prior analyses (see Colder et al., 2013) also did not load on the pure factors here, and this was consistent across waves: standardized loading for internalizing bundle from W1–W3 = 0.24, while for externalizing W1–W3 = 0.05. Both of these bundles loaded on the co-occurring factor = 0.45 and 0.74, respectively (see Table 1 in Colder et al., 2013 for the specific items in these bundles). Aside from these two indicators, the remaining indicators on the pure factors ranged from 0.44 to 0.62.

## **Appendix B**

## **Alternative models**

## **Two-Factor Model**

A simple two-factor model for internalizing and externalizing symptoms was estimated across the first three waves. Similar to the model reported in the manuscript, the two-factor model was measurement invariant. Subsequently, we went through a similar series of nested tests to determine pathways between



 $R^2 = .35$ 

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problem behavior, peer delinquency, AU, and AUD. The nested tests can be found in Table B1, while the path coefficients in which the standardized 95% CI did not contain 0 can be found in Figure B1. The final two-factor model had poorer fit,  $\chi^2$  (1743) = 2492.26, p < .001; RMSEA = .033, 90% CI = [0.030, 0.036]; CFI = .94; TLI = .94; SRMR = .07, than the bifactor model in our main analysis did,  $\chi^2$ (1723) = 2230.39, p < .001; RMSEA = .028, 90% CI = [0.024, 0.031]; CFI = .96; TLI = .96; SRMR = .05. Interestingly, the 90% CI for RMSEA barely overlaps between the two models, suggesting lower error for the bifactor model. In terms of pathways that had detectable effect sizes,

> Figure B1. Estimated standardized path coefficients and 95% confidence intervals for the two-factor model predicting alcohol use and alcohol use. Age and gender were included in model as statistical control variables, but they are not presented in the figure. With the exception of the problem behavior factors, all of the constructs were allowed to covary within waves. All of the coefficients are standardized, and only those that were deemed significant (CI did not contain 0) are shown. The interval in parentheses after each standardized coefficient is the 95% confidence interval for the standardized coefficient. Extern = pure externalizing, Intern = pure internalizing, CFPD = close friend self-report of peer delinquency, PPD = Perceived Peer Delinquency or target report of peer delinquency, ALC-3 Intercept = Alcohol Use at W3, ALC 3-6 Slope = growth curve for alcohol use, AUD = alcohol use disorder symptoms, and W = wave. The trailing number of each factor label reflects wave of measurement.

> Figure A.2.2. Estimated standardized path coefficients and 95% confidence intervals for the hierarchical bi-factor model predicting alcohol use and alcohol use. Age and gender were included in model as statistical control variables, but they are not presented in the figure. All of the coefficients are standardized, and only those that were statistically significant (p < .05) are shown. The interval in parentheses after each standardized coefficient is the 95% confidence interval for the standardized coefficient. Extern = pure externalizing, Intern = pure internalizing, ALC-3 Intercept = Alcohol Use at W3, ALC 3-6 Slope = growth curve for alcohol use, and AUD = alcohol use disorder symptoms. The trailing number of each factor label reflects wave of measurement.

perceived peer delinquency again serially mediated the effect of externalizing symptoms on AU and AUD and externalizing symptoms were again not associated directly with AUD. In contrast, internalizing symptoms were consistently protective against perceived peer delinquency, which reduced risk for AU and AUD. Internalizing symptoms were also not directly related to AUD but did have small to moderate negative effects on AU growth factors.

 Table B1. Nested Satorra-Bentler chi-square difference tests and associated df

 and p-values for adding lagged paths between constructs across waves

Adding Lagged Paths	df	$\Delta \chi^2$	р
1. Constrain Stabilities	2	0.98	0.61
2. Adding within wave covariances	16	265.55	<.001
3. Intern $\rightarrow$ Extern	2	0.32	0.85
4. Extern → Intern	2	0.20	0.90
5. Intern, Extern $\rightarrow$ AU	4	43.72	<.001
6. Intern, Extern $\rightarrow$ AUD	4	18.55	<.001
7. Intern, Extern $\rightarrow$ PPD, CFPD	8	16.20	0.04
8. PPD, CFPD $\rightarrow$ Intern, Extern	8	4.78	0.78
9. CFPD $\rightarrow$ PPD	2	12.32	0.002
10. PPD $\rightarrow$ CFPD	2	2.29	0.32
11. PPD $\rightarrow$ AU	2	24.77	<.001
12. CFPD $\rightarrow$ AU	2	5.77	0.06
13. PPD $\rightarrow$ AUD	2	3.84	0.15
14. CFPD $\rightarrow$ AUD	2	0.32	0.85
Constraining Parameters over time			
Constrain (7.)	2	1.95	0.38
Constrain (9.)	1	0.41	0.52
Constrain Intern/Extern variances	2	7.01	0.03
Constraining PPD/CFPD variances	2	3.47	0.18
Constrain endogenous covariances	7	9.49	0.22

Note:  $\rightarrow$  = direction of effect, Extern = externalizing symptoms, Intern = internalizing symptoms, AU = alcohol use, AUD = alcohol use disorder, PPD = perceived peer delinquency, CFPD = close friend peer delinquency, df = degrees of freedom,  $\Delta \chi^2$  = Satorra-Bentler chi-square difference test. Total sample size = 387.

#### Hierarchical Factor model

To better capture stable problem behavior variance, we estimated a hierarchical model in which each problem behavior factor at each wave was allowed to load on a hierarchical factor. In the first series of models, we excluded peer delinquency and estimated paths between stable problem behavior factors and AU and AUD. Fit for this model was excellent:  $\chi^2$  (988) = 1693.73, p < .001; RMSEA = .043, 90% CI = [0.040, 0.050]; CFI = .95; TLI = .95; SRMR = .05. The path coefficients for this model suggested that stable pure externalizing symptoms affected AU but not AUD, while stable pure internalizing symptoms had an undetectable effect on AUD and a small negative effect on AU at W3. Two differences between this model and the bifactor model presented in the manuscript are that in addition to stable co-occurring symptoms' having an effect on AUD (small), stable co-occurring symptoms had an effect on AU at W3. Furthermore, stable pure externalizing symptoms had an effect on AUD at W7. Next, stable peer delinquency factors were added to the model and all hierarchical factors were used to predict AU and AUD. Here again, fit for the final model was excellent but not as strong as the bifactor model presented in the manuscript:  $\chi^2$  (1739) = 2451.42, p < .001; RMSEA = .033, 90% CI = [0.029, 0.035]; CFI = .94; TLI = .94; SRMR = .06. After adding stable peer delinquency factors, co-occurring symptoms no longer had a detectable effect on AU at W3,  $\beta = 0.02$ , 95% CI [-0.16, 0.19], while co-occurring symptoms still had an effect on AUD at W3,  $\beta = 0.14$ , 95% CI [0.02, 0.26], each of which replicated the main analysis. Similar to the analysis in the manuscript, stable perceived peer delinquency had a large effect on AU at W3, ß = 0.50, 95% CI [0.02, 0.98], and stable pure externalizing symptoms no longer had a detectable effect on AUD at W7,  $\beta = 0.20$ , 95% CI [-0.05, 0.45]. Similar to the primary analysis, this suggests that stable externalizing symptom variance has large overlap with stable peer delinquency and peer delinquency confounds the relationship between co-occurring symptoms and AU.