# **Prior Delinguency and Depression Differentially Predict Conditional Associations Between Discrete Patterns of** Adolescent Religiosity and Adult Alcohol Use Patterns

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ABSTRACT: Prior research has demonstrated that adolescent delinquency and depression are prospectively related to adult alcohol use and that adolescent religiosity may influence these relationships. However, such associations have not been investigated using person-centered approaches that provide nuanced explorations of these constructs. Using data from the National Longitudinal Study of Adolescent to Adult Health, we examined whether adolescent delinquency and depression differentiated typologies of adult alcohol users and whether these relationships varied across religiosity profiles. Three typologies of self-identified Christian adolescents and 4 types of adult alcohol users were identified via latent profile analysis. Delinquency and depression were related to increased likelihood of membership in heavy drinking or problematic alcohol use profiles, but this relationship was most evident among those likely to be involved in religious practices. These results demonstrate the importance of person-centered approaches in characterizing the influences of internalizing and externalizing behaviors on subsequent patterns of alcohol use.

KEYWORDS: latent profile analysis, alcohol use, adolescence, delinquency, depression, religiosity

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# Introduction

A recent national survey estimated that 139.7 million individuals over 12 years of age currently drink alcohol, accounting for a substantial portion (43.6%) of the total US population.<sup>1</sup> Although most individuals consume alcohol in moderate amounts with no adverse effects, others use alcohol to a problematic degree. Excessive alcohol use has been correlated with 200 other health problems, and deaths involving alcohol use are the fourth leading preventable cause of death in the United States.<sup>2,3</sup> In addition, early initiation into alcohol use is related to increased likelihood of heavy drinking and alcohol-related problems.<sup>4</sup> As such, identifying behavioral antecedents in adolescence, a developmental period in which alcohol initiation frequently occurs, has particular importance for preventing the development of problematic alcohol use. Research that establishes identifiable behavioral antecedents to alcohol use in adolescence, and in turn distinguishes those most at risk of developing subsequent alcoholrelated problems, may lead to preemptive interventions that prevent escalation into problematic drinking.

# Pathways to alcohol use

Robust evidence for 2 distinct but related behavioral pathways to alcohol use has emerged within the literature. The first, an externalizing pathway, is characterized by impulsive, antisocial, and/or delinquent behavior and is posited to result

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from behavioral undercontrol or dysregulation.<sup>4,5</sup> Such conduct is presumed to be some of the first behaviorally maladaptive correlates of later substance use. Indeed, previous research demonstrates that childhood and early adolescent externalizing problems are predictive of an earlier initiation into substance use,6 late adolescent alcohol use,7 and alcohol dependence in young adulthood.8 Specifically, delinquent behavior is frequently antecedent to substance use, suggesting that adolescents may typically begin to use alcohol only after previous engagement in delinquent activity; longitudinal studies have further substantiated this temporal ordering.9,10 Thus, previous research suggests not only that delinquency and alcohol use are correlated but also that delinquency is often temporally precedent to alcohol use.

An alternate, *internalizing pathway* to alcohol use, wherein individuals use alcohol as a purported means of coping with symptoms of negative emotionality and behavioral inhibition, has also been reflected in the literature.<sup>11</sup> Prospective analyses point to positive associations between major depressive disorder at age 11 and the initiation and regular use of alcohol by age 14.5 In addition, a cross-lagged panel analysis designed to explore direction of causation suggested that depression at age 12 was positively associated with alcohol use at age 15, but that the reverse did not hold true.<sup>12</sup> Moreover, the influence of adolescent internalizing problems on alcohol use appears to persist into adulthood, but with different effects. Evidence from 2

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Creative Commons Non Commercial CC-BY-NC: This article is distributed under the terms of the Creative Commons Attribution-NonCommercial 3.0 License (http://www.creativecommons.org/licenses/by-nc/3.0/) which permits non-commercial use, reproduction and distribution of the work without further permission provided the original work is attributed as specified on the SAGE and Open Access pages (https://us.sagepub.com/en-us/nam/open-access-at-sage). separate large-scale, longitudinal studies report that early adolescent internalizing problems<sup>13</sup> and late adolescent depressed affect<sup>14</sup> were negatively related to alcohol use throughout early and mid-adulthood. It would seem that while early internalizing symptoms are generally associated with increased risk of alcohol use within adolescence, they are conversely somewhat protective of the same alcohol-related behaviors in adulthood. These findings highlight the complex role of internalizing symptoms in the development of alcohol use.

Although both pathways have been linked to alcohol use separately, it is unlikely that either pathway operates in isolation. Rather, internalizing and externalizing problems are dynamic and tend to co-occur,15-19 evidenced by frequent comorbidity of conduct disorder and depression in adolescents.<sup>20,21</sup> In addition, the emergence of both internalizing and externalizing problems predates adolescent alcohol use.<sup>22,23</sup> In instances when internalizing and externalizing problems cooccur, the specific interplay between these behaviors may differentially affect the likelihood of alcohol use. For example, one study found that while the presence of both internalizing and externalizing problems was predictive of later adolescent alcohol use, this relationship was not as strong as the relationship between displaying only externalizing problems and later alcohol use.<sup>24</sup> It appears that in this case, internalizing problems may interact with externalizing problems in such a way that this conditional association selectively functions as a protective factor against alcohol use. Such findings demonstrate that these constructs operate in synchrony and that an individual's pathway to alcohol use may vary as a function of both internalizing and externalizing problems.<sup>17,24</sup>

# Heterogeneity of alcohol use

Just as the various pathways leading to alcohol use are not homogeneous, patterns of alcohol use behaviors (eg, frequencies and quantities of consumption, and frequencies of binge drinking or intoxication) are more complex than a dichotomy of problematic or nonproblematic use. To capture these nuances, researchers have used person-centered approaches to identify typologies of alcohol users. Person-centered approaches, including cluster analysis and latent class analysis, among others, identify homogeneous subgroups of individuals who share similar characteristics within a heterogeneous population; in turn, we can assess whether and how different subgroups are qualitatively different from other subgroups.<sup>25,26</sup>

Person-centered approaches have been used to identify subgroups of individuals with similar patterns of alcohol use behaviors.<sup>27–30</sup> In their recent study, Donovan and Chung<sup>28</sup> used latent profile analysis (LPA) to identify 4 prototypical response patterns across a set of alcohol use indicators, which they conventionally referred to as the *abstainers, low-intake drinkers, nonproblem drinkers*, and *problem drinkers*. Given such heterogeneity in patterns of alcohol use, as well as the complex interplay among behavioral antecedents associated with increased alcohol use, it is of interest to identify additional behavioral antecedents that may be related to greater odds of nonproblem drinking or abstinence, remembering that such antecedents may be equally nuanced.

# Religiosity as a protective factor

Previous research has identified contextual factors correlated with lower levels of alcohol use, as well as decreased prevalence of delinquency and depression. Religiosity is one such factor that is generally considered to serve a protective function with respect to alcohol use and its developmental correlates<sup>31–35</sup> and for which small but significant negative associations with delinquency,<sup>36-40</sup> depressive symptoms,<sup>41-44</sup> and alcohol use<sup>45-47</sup> have been identified via cross-sectional and prospective analyses. Most studies have used single item or composite measures as indicators of one's religiousness, typically reflecting one's frequency of religious service attendance, or how important religion is to an individual. Even though these studies have attempted to examine associations with various aspects of religiosity, the analyses have primarily been variable centered. However, several recent studies have sought to examine typologies of individuals with qualitatively distinct patterns of responding to religiosity-focused indicators.48-51 Results of these studies suggest the presence of between 3 and 5 prototypical latent religiosity groups during adolescence; the discrepancies in the number of religiosity profiles identified across these analyses may be the result of considerable heterogeneity in the religiosity indicators used in each analysis. Further investigation into latent typologies of religious individuals based on commonly used indicators of religiosity is needed to elucidate the number and specific characteristics of adolescent religiosity typologies.

In addition, some research has invoked variable-centered approaches to explore the ways in which members of religiosity profiles differ in terms of delinquency, depression, and alcohol use. For example, Salas-Wright et al<sup>51</sup> found that adolescents who were members of latent profiles with high levels of both public and private religiosity had the lowest levels of alcohol use and delinquency. In addition, Park et al49 identified 4 groups of religious/spiritual individuals; interestingly, those most likely to be members of the highly religious and minimally religious profiles had the lowest levels of depressive symptoms. However, the associations with religiosity examined in each of these studies were exclusively cross-sectional, thereby precluding any examination of developmentally informative associations between typologies of religiosity and behavioral correlates. We expanded on this limitation in this study by examining cross-temporal associations among patterns of religiosity, behavioral antecedents, and subsequent patterns of alcohol use.

# The present study

In this study, we provided a number of contributions to the literature on these processes. First, we examined typologies of

#### Table 1. Specific items used for delinquency and depression at wave 1.

DELINQUENCY (W1)	DEPRESSION (W1)
Deliberately damage property that did not belong to you Steal something worth more than \$50 Steal something worth less than \$50 Go into a house or building to steal something Sell marijuana or other drugs	You were bothered by things that did not usually bother you You felt that you could not shake off the blues You felt that you were just as good as other people <sup>a</sup> You had trouble keeping your mind on what you were doing You felt depressed You felt that you were too tired to do things You enjoyed life <sup>a</sup> You felt sad You felt that people disliked you

All delinquency items were on a scale of 0="never," 1="1 or 2 times," 2="3 or 4 times," and 3="5 or more times." All depression items were on a scale of 0="never or rarely" to 3="most or all of the time."

<sup>a</sup>The item was reverse scored.

both religiosity and alcohol use to uncover nuances across homogeneous subgroups of self-identified Christian adolescents and adult alcohol users. Next, we explored relationships between adolescent delinquency/depressive symptoms and adulthood alcohol use typology in response to a void of longitudinal examinations of behavioral antecedents to patterns of alcohol use. Finally, these relationships were further examined within the context of latent profiles of religiosity to determine the extent to which the associations between delinquency, depression, and alcohol use varied across discrete patterns of religiosity. Given that there is variation in the characteristics of typologies of both religiosity and alcohol use in the literature,<sup>27–29,49–51</sup> and that it would be difficult to make predictions about the relationships among all nuances within typologies of these constructs, all analyses were considered exploratory.

# Methods

#### Sample

The National Longitudinal Study of Adolescent to Adult Health (Add Health) is a nationally representative survey of American adolescents, providing data on a wide range of health behaviors, attitudes, and environmental factors, including demographics, family relationships, sexual behavior, deviance, and substance use.<sup>52</sup> The first wave of data collection consisted of in-school surveys of more than 90 000 US students in 7th to 12th grades during the 1994-1995 school year. Approximately 12 000 of these students were randomly selected to participate in detailed in-home interviews. These adolescents were followed up at wave 2 (1996, approximately ages 12-20), wave 3 (2001-2002, approximately ages 18-26), and wave 4 (2008-2009, approximately ages 24-32). For detailed sampling information, see Harris et al.<sup>52</sup>

The data from a portion of the in-home sample were deidentified and made available for public use. We reduced this sample to consist only of white, African American, or Hispanic individuals who self-reported Catholic or Protestant religious affiliation and had no missing responses to any of the 5 religiosity items at waves 1 and 2. We also restricted the sample to individuals who had complete responses to alcohol use items at wave 4. These restrictions were put into place to use the maximal amount of complete data, as religiosity items were not assessed among those who did not report a religious affiliation. The final sample consisted of 2610 individuals (55.5% female). These adolescents had a mean age of 15.57 years at wave 1 and consisted of 63.2% white, 24.4% African American, and 12.5% Hispanic individuals. Nearly three-fourths (73.1%) of the sample identified as Protestant at wave 1. The sample had a moderate average adulthood alcohol intake (measured at wave 4), drinking approximately 60 days per year (just more than once per week), consuming an average of 2.75 drinks per occasion.

# Measures

*Demographics*. All demographic data reflect adolescent responses at wave 1. Sex was dummy coded (female = 1). Age was calculated by subtracting participants' date of birth from the date of their in-home interview. Effect coding was used to derive 2 indicators of race, with whites serving as the reference group in comparison with both African Americans and Hispanics.

Delinquency. Nonviolent delinquent behavior was assessed via 5 items in the wave 1 in-home interview, reflecting the frequency of engagement in these behaviors within the previous 12 months (see Table 1 for item wording). These items were selected from a study by Kuhl et al.<sup>53</sup> Individuals responded on a scale where 0 = "never," 1 = "1 or 2 times," 2 = "3 or 4 times," and 3 = "5 or more times" ( $\alpha = .63$ ).

*Depression.* Depressive symptoms were assessed via the Center for Epidemiologic Studies Depression Scale (CES-D).<sup>54</sup> Nine items from this scale were selected for analysis, as Jacobson and Newman<sup>55</sup> demonstrated that a reduced number of items in the CES-D reflect a unidimensional depression construct. Participants were asked how often a number of statements were true of them during the past week (on a scale from 0="never or rarely" to 3="most or all of the time,"  $\alpha$ =.78) (see Table 1 for specific item wordings). Items were recoded, so higher values represented more frequent presence of depressive symptoms.

*Religiosity*. Religiosity was assessed from items in the wave 2 questionnaire. Items consisted of frequency of religious service attendance and frequency of attendance at other religiously

affiliated activities, such as youth group or choir (both on a scale from 1 = "once a week or more" to 4 = "never"), frequency of personal prayer (1 = "at least once a day" to 5 = "never"), belief in the inerrancy of scripture (1 = "agree" or 2 = "disagree"), and importance of religion in one's life (1 = "very important" to 4 = "not important at all"). All items were recoded, so higher response values indicated more frequent practice or stronger belief. Coefficient alpha for these items indicated good internal consistency ( $\alpha$  = .70). In addition, a single item asked about respondent's religious affiliation and was dichotomously coded into Catholic = 0 and Protestant = 1.

Alcohol use. Items to assess adulthood alcohol use were taken from the wave 4 questionnaire and were identical to those used in a study by Donovan and Chung.<sup>28</sup> The first item asked whether the participant had ever had a drink of alcohol more than 2 or 3 times, to which respondents could answer "yes" or "no." Three separate items measured the number of days in the past year on which the respondent (1) drank alcohol, (2) drank 5 or more drinks in a row, and (3) was drunk or very high on alcohol. Response categories consisted of 0 = "none," 1 = "1 or 2 days," 2 = "once a month or less," 3 = "2 or 3 days a month," 4 = "1 or 2 days a week," 5 = "3 to 5 days a week," and 6 = "every day or almost every day." One item asked about the quantity of alcohol consumed per drinking occasion, to which participants responded with a number from 1 to 18.

Alcohol-related consequences were also assessed at wave 4. Four items asked about the frequency of experiencing consequences, and each item was responded to on a 3-point scale, where 0 = "never," 1 = "1 time," and 2 = "more than 1 time." These 4 items covered the frequency with which consuming alcohol (1) disrupted responsibilities in school or the workplace, (2) led to situations that may have put oneself or others at risk, (3) led to legal problems or arrest, and (4) led to relationship problems with family, friends, or colleagues. Coefficient alpha across all items was .62.

A composite measure of adolescent alcohol use was created by multiplying the quantity of alcohol consumed by frequency of alcohol use at wave 1. This was used as a control variable in all analyses predicting wave 4 alcohol use, as quantity by frequency indices of alcohol use is one of the easiest ways to assess total volume of alcohol consumption and is commonly used in alcohol research.<sup>56</sup>

#### Analytic plan

A number of steps were taken to reduce the data before the final models were constructed. All analyses were conducted in Mplus version 7.2.<sup>57</sup> First, factor scores of delinquency and depression were extracted via confirmatory factor analysis (CFA). We also performed exploratory factor analyses (EFAs) to substantiate the unidimensionality of both constructs; this was done to ensure that the items used to extract factor scores via CFA were definitively representative of a single latent construct within the sample of interest.

Next, LPAs were conducted with respect to wave 2 religiosity and wave 4 alcohol use indicators. LPA is a person-centered analytic technique that examines response patterns across a set of items, classifying cases based on the likelihood of sharing discrete homogeneous patterns of responses.<sup>58</sup> In doing so, LPA tests a series of models comparing k profiles with k-1profiles (eg, a 2-profile model compared with a 1-profile model), proceeding until the extraction of an additional profile (ie, 3 versus 2 profiles and 4 versus 3 profiles) results in a significant decrement in model fit. Importantly, each model yields posterior probabilities of membership for every individual with respect to each of the k prototypical item response patterns (ie, profiles), such that the sum of those probabilities equals 1.

In the absence of a *criterion standard* for determining the best number of profiles in LPA, model selection was based on several criteria. Bayesian information criterion (BIC) is an indicator of model fit where decreased values across successive models suggest improved fit.59 Because BIC may continue to decrease across successive models in large samples, additional fit measures were also considered. Entropy measures the amount of organization or accuracy in determining profile membership on a scale from 0 to 1, with increasing values indicating better classification of profile membership.<sup>60</sup> The theoretical fit of the model, number of individuals in resulting profiles, and significance levels (P-values) from the Vuong-Lo-Mendell-Rubin Likelihood Ratio test were also considered.<sup>61,62</sup> For a complete list of considerations in identifying appropriate profile structure in LPA, see Nylund et al.59

After the best fitting models were selected, we assessed main effects via multinomial logistic regression, wherein the latent categorical variable representing alcohol use response patterns was regressed on delinquency, depression, and a delinquency by depression interaction term. Demographic covariates of age, race, and sex, in addition to covariates of wave 1 alcohol use and Catholic/Protestant identification, were included in these and all subsequent models. We ran comparable models with multiple reference profiles to obtain odds ratios (OR) of all pairwise comparisons among the alcohol use profiles. Although logistic regression is most commonly carried out using a single reference profile, having multiple reference profiles allowed us to understand the likelihood of demonstrating any one pattern of alcohol use in comparison with any other pattern of alcohol use; using a single reference profile would limit our ability to examine the relative risk of developing a particular pattern of alcohol use in relation to other patterns. Next, we examined these same effects among those who were most likely to be members of each religiosity profile. These conditional effects were accounted for by separate model specifications for each religiosity latent profile; that is, the multinomial logistic regression of the latent categorical variable representing alcohol use on depression and delinquency was conditioned on the profile-specific parameters of each religiosity latent profile.57,63

Table 2. Model selection criteria for latent profile analysis of wave 4 alcohol use variables.

	NUMBER OF PROFILES					
	2	3	4	5		
BIC	26325.62	23980.23	23027.89	23041.55		
Entropy	1.00	0.89	0.91	0.89		
P-value ( $k$ versus $k-1$ )	.00	.00	.00	.00		

Abbreviation: BIC, Bayesian information criterion.

P-values are derived from Vuong-Lo-Mendell-Rubin Likelihood Ratio Test. Boldface type denotes criterion values for selected model.

# Results

#### Data reduction

Delinquency and depression factors. Exploratory factor analyses confirmed unidimensional delinquency and depression constructs. Factor loadings for the 5 delinquency items ranged from 0.65 to 0.87, and factor loadings for the 9 depression items ranged from 0.39 to 0.89. Eigenvalues for the delinquency items supported a 1-factor model with an eigenvalue of 3.38 accounting for 67.6% of the variance, and the depression items similarly loaded onto a single factor; the eigenvalue for the 1-factor model was 4.28 and accounted for 47.5% of the variance.

Alcohol use model selection and identification. Prior to inclusion in LPA, the wave 4 alcohol use items were recoded in accordance with thresholds previously determined to be empirically significant in the Add Health sample at wave  $1.^{28}$  Whether an individual had ever had a drink was dichotomously recoded (0="No" and 1="Yes"). The items capturing drinking frequency, frequency of getting drunk, and frequency of binge drinking were recoded into 3 response categories (0="None," 1="Once/year to 2-3 days/month," and 2="Once/week plus"). The item measuring the average consumption during a single drinking episode was recoded into 4 response categories (0="None," 1="1 drink," 2="2-6 drinks," and 3="7+drinks"). Finally, the sum of negative consequences was dichotomously recoded (0="0-2 consequences" and 1="3+consequences").

Model selection criteria for 2-profile LPA model through 5-profile LPA model can be found in Table 2. All fit indices (except for entropy, which did not substantially change) consistently improved across the 2-profile LPA model through 5-profile model. However, the 4-profile model was selected over the 5-profile model, as the 5-profile model produced one profile containing 34 individuals (0.01% of the sample), which was insufficient to draw any meaningful comparisons. (We did not include respondents who reported having no religion in any of the analyses. However, a separate LPA of wave 4 alcohol use items did demonstrate that a 4-profile model also fits best among these individuals, suggesting that these results are robust to the exclusion of nonreligious respondents. The result of this analysis is available from the authors upon request.) Average alcohol use characteristics of the resulting 4 response patterns are graphically depicted in Figure 1, and Table 3 provides the same characteristics in their original units. We adopted the profile names provided by Donovan and Chung<sup>28</sup> to facilitate comparison between our analyses.

The profile that best characterized the largest portion of the sample (N=894, 34.3%) yielded mean item responses that were consistently 0.5 SD above the sample means. This response pattern was referred to as the *nonproblem drinkers*. Individuals most likely to demonstrate this pattern on average consumed nearly 4 drinks per drinking occasion and drank just more than 85 days per year (approximately 25% of days per year). In addition, they reported being intoxicated 10 days per year and engaging in binge drinking nearly 14 days per year on average, but reported experiencing 1 to 2 alcohol-related consequences in their lifetime.

A second response pattern was representative of 26.9% of the sample (N=705) and was named the *abstainers*. This profile was characterized by those who rarely or never drank alcohol, as demonstrated by average reports of both quantity and frequency of alcohol use nearly 2 full SDs below those most likely to be members of the *nonproblem drinkers*. On average, individuals most likely to be members of the *abstainers* reported no instances of binge drinking or intoxication, nearly 1 SD below the sample mean.

The next response pattern was representative of a similar proportion of the sample (N=696, 26.6%). This profile was referred to as the *low-intake drinkers* and was characterized by individuals who, on average, reported comparatively modest quantities (2.5 drinks) and frequencies (26 days per year) of alcohol consumption, both of which were 1.5 SDs above those most likely to be members of the *abstainers*. In contrast, these individuals were similar to members of the *abstainers* profile with respect to average levels of binge drinking, intoxication, and alcohol-related consequences.

The final profile was representative of the smallest proportion of the sample (N=317, 12.1%) and was characterized by holding the highest mean frequencies across all alcohol use items. Compared with those most likely to be members of the *nonproblem drinkers*, individuals most likely to display this response pattern (named *problem drinkers*) were on average 1.5 SDs higher on binge drinking frequency (154 days per year), a full standard deviation higher on frequency of intoxication (104 days per year), and nearly 0.5 SD higher on number of alcohol-related consequences (2.72).



Table 3. Characteristics of wave 4 alcohol use profiles in original units.

	ALCOHOL USE PROFILES							
	ABSTAINERS LOW-INTAKE		NONPROBLEM	PROBLEM				
Days drink	0.00	25.77	85.20	203.93				
Drinks	0.00	2.47	3.87	6.33				
Days 5+drinks	0.00	1.03	13.75	153.63				
Days drunk	0.00	0.70	10.47	103.94				
Consequences	0.23	0.35	1.62	2.72				

Days drink=number of days per year participants drink alcohol; Drinks=number of drinks per drinking occasion; Days 5+drinks=number of days per year participants drank 5 or more drinks in a single drinking occasion; Days drunk=number of days per year participants became intoxicated or were very high on alcohol; Consequences=sum of alcohol-related consequences (range from 0 to 8).

Religiosity latent profile model selection and identification. We explored models for 2 through 4 profiles of religiosity items. As seen in Table 4, BIC values continually decreased across the 2-profile model to 4-profile model, but the 4-profile model exhibited a significant decrement in model fit (P=.66). Thus, the 3-profile model was selected. To facilitate comparison among the profiles, mean item responses among individuals most likely to be members of each religiosity profile based on their highest posterior probability of membership are graphically depicted in Figure 2. In addition, the proportions of item response endorsements among those most likely to be members of each profile for the proportions of the profile are available in Table 5.

The most representative profile accounted for 49.0% of the sample (N=1279) and was characterized by the highest mean levels of religiosity. This profile was conventionally referred to

as the *loyal*. On average, members of this profile prayed and attended religious services and activities more frequently than members of any other profile, demonstrating item frequencies consistently 0.5 SD above the sample mean.

The next most representative profile accounted for 37.9% of the sample (N=989) and demonstrated at or slightly below mean levels of religiosity. Specifically, individuals most likely to display this response pattern (referred to as the *reserved*) were a full standard deviation below likely members of the *loyal* group with respect to both the importance of religiosity and attendance at religious activities. However, those most likely to be members of the *reserved* were on average less than 0.5 SD below those most likely to be members of the *loyal* regarding belief in the inerrancy of scripture. Table 4. Model selection criteria for latent profile analyses on wave 2 religiosity variables.

	NUMBER OF PROFILES			
	2	3	4	
BIC	33448.94	33124.07	33012.90	
Entropy	0.74	0.69	0.66	
<i>P</i> -value ( $k$ versus $k-1$ )	.00	.00	.66	

Abbreviation: BIC, Bayesian information criteria.

P-values are derived from Vuong-Lo-Mendell-Rubin Likelihood Ratio Test. Boldface type denotes criterion values for selected model.



The final profile was representative of the smallest proportion of the sample (N=342, 13.1%) and was referred to as the *apathetic*. The defining characteristics of this response pattern were mean frequencies of attendance at religious services and prayers that were 2 full SDs below the means for those most likely to be members of the *loyal*. Interestingly, those most likely to be members of the *apathetic* profile were similar to members of the *reserved* regarding importance of religion, but were on average at least 0.5 SD lower than members of the *reserved* on all other items.

### Prediction of alcohol use profiles

First, the predictive effects of delinquency and depression on alcohol use profiles were examined. Table 6 provides the ORs related to likelihood of membership in the alcohol use profiles as predicted by delinquency and depression separately, as well as the interaction between them. Delinquency differentiated between likelihood of membership in nearly all comparisons between adult alcohol use profiles. Specifically, each increase of 1 SD in delinquency was associated with more than a 2-fold increase in the likelihood of membership in the *problem drinkers* group relative to both the *abstainers* (OR=2.14, P < .01) and the *low-intake drinkers* (OR=2.35, P < .01). Odds of membership in the *nonproblem drinkers* group evidenced similar, though somewhat more modest increases per unit change in delinquency relative to the *abstainers* (OR=1.76, P < .01) and the *low-intake drinkers* (OR=1.94, P < .01). Adolescent delinquency did not, however, significantly differentiate membership in the *problem drinkers* versus *nonproblem drinkers*, or in the *abstainers* versus *low-intake drinkers*.

The effects of depression on alcohol use were more obscure. Depression did not appear to differentiate between those most likely to be *low-intake drinkers* and members of the other 3 profiles, as well as between those most likely to be members of the *problem drinkers* and the *abstainers*. Interestingly, however, for every



ITEM	M (SD)	RESPONSE	LOYAL	RESERVED	APATHETIC
Frequency of religious service attendance	3.10 (1.02)				
		1	0.3	3.1	61.4
		2	0.4	39.1	33.0
		3	16.6	37.0	3.5
		4	82.7	20.5	1.8
Frequency of attendance at other religiously affiliated activities, such as youth group or choir	2.31 (1.24)				
		1	13.9	55.0	93.6
		2	9.6	26.8	2.9
		3	25.9	14.0	1.5
		4	50.5	4.2	1.8
Frequency of personal prayer	4.01 (1.26)				
		1	0.3	3.1	44.7
		2	1.1	13.1	26.9
		3	1.3	19.0	6.4
		4	22.6	36.6	5.8
		5	74.7	28.1	16.1
Belief in the inerrancy of scripture	1.81 (0.39)				
		1	5.9	24.5	46.8
		2	92.3	71.4	44.7
Importance of religion in one's life	3.48 (0.62)				
		1	0	0	0
		2	0.2	6.1	35.1
		3	14.1	73.2	28.7
		4	85.8	20.7	36.0

Frequency of religious service attendance and frequency of attendance at other religiously affiliated activities are on a scale from 1="never" to 4="once a week or more." Frequency of personal prayer is on a scale of 1="never" to 5="once a day or more." Belief in the inerrancy of scripture is on a scale of 1="disagree" or 2="agree." Importance of religion is on a scale of 1="not important at all" to 4="very important." Columns with religiosity profile names represent the proportion of individuals most likely to be members of that profile endorsing each item response.

unit increase in depressive symptomatology, individuals were slightly less likely to be members of the *nonproblem drinkers* in comparison with the *abstainers* (OR=0.78, P=.02), but equally more likely to be members of the *problem drinkers* when compared with the *nonproblem drinkers* (OR=1.35, P=.02). The delinquency by depression interaction did not significantly differentiate among likelihood of membership in adult alcohol use profiles.

# Religiosity profile–specific prediction of alcohol use profiles

Next, we assessed the extent to which the relationship between delinquency and depression and likelihood of membership in

alcohol use profiles differed among those most likely to be members of discrete religiosity profiles (ie, these relationships were conditioned on posterior probabilities of religiosity profile membership). Table 6 also provides ORs and significance levels for associations between delinquency and/or depression and alcohol use profiles when conditioned on membership in each religiosity profile. When conditioned on likelihood of membership in the *loyal* religiosity profile, each unit increase in delinquency was associated with an increased likelihood of membership in the *problem drinkers* and *nonproblem drinkers* relative to both *abstainers* and *low-intake drinkers*. For example, given membership in the *loyal* religiosity profile, individuals were nearly 3 times as likely to be members of the *nonproblem* 

PREDICTOR	CONDITION	ABSTAI	ABSTAINERS REFERENCE			LOW-INTAKE REFERENCE				NONPROBLEM REFERENCE			
		PROBL	EM	NONPROBLEM LOW-INTAKE PROBLEM NONPROBLEM		PROBLEM							
		OR	Р	OR	Р	OR	Р	OR	Р	OR	Р	OR	Р
Delinquency	Unconditional	2.137	.000	1.761	.000	1.103	.530	2.353	.000	1.942	.000	1.212	.184
	Loyal	8.264	.002	2.674	.035	1.000	.999	8.264	.002	2.882	.036	3.086	.104
	Reserved	1.214	.511	1.443	.146	1.170	.527	1.418	.227	1.686	.043	0.841	.508
	Apathetic	1.656	.075	1.420	.186	1.239	.480	2.049	.013	1.761	.043	1.164	.515
Depression	Unconditional	1.059	.681	0.782	.019	1.076	.482	1.139	.361	0.532	.129	1.353	.023
	Loyal	4.831	.004	0.386	.031	1.008	.974	4.878	.001	0.386	.046	12.500	.000
	Reserved	0.779	.418	0.980	.921	1.112	.616	0.890	.679	1.091	.688	0.776	.428
	Apathetic	0.647	.074	0.484	.000	1.256	.309	0.813	.415	0.608	.024	1.339	.203
Del.×dep.	Unconditional	1.003	.992	0.929	.779	0.843	.509	1.190	.526	1.101	.712	1.081	.790
	Loyal	_	_	2.410	.515	0.007	.015	-	-	333.333	.014	-	-
	Reserved	1.056	.926	0.772	.627	0.519	.270	1.786	.227	1.304	.567	1.370	.574
	Apathetic	1.178	.720	1.079	.869	1.772	.168	0.665	.264	0.609	.208	1.092	.839

Table 6. ORs for membership in alcohol use profiles conditioned on religiosity latent profile memberships, predicted by delinquency and depression.

Abbreviation: ORs, odds ratios.

Condition refers to the conditions under which the relationship between delinquency/depression and alcohol use was examined. Unconditional models reflect the effect of the predictor on differentiation among alcohol use profiles among all members of the sample. Loyal, Reserved, and Apathetic conditions reflect the effect of the predictor on differentiation among alcohol use profiles, conditioned on the religiosity profile of interest (ie, the effect of delinquency on alcohol use only among those most likely to be members of the *loyal* religiosity profile). All models control for demographic covariates.

*drinkers* as they were to be *low-intake drinkers* (OR=2.88, P=.04). Among those most likely to be members of the *reserved* religiosity profile, a 1 SD increase in delinquency was associated with an increased likelihood of membership in the *nonproblem* compared with *low-intake drinkers* (OR=1.69, P=.04). Finally, when conditioned on membership in the *apathetic* religiosity profile, a commensurate increase in delinquency was associated with an increased likelihood of membership in the *problem* drinkers (OR=2.05, P=.01) and *nonproblem drinkers* (OR=1.76, P=.04) in comparison with the *low-intake drinkers*.

Increased depression was associated with increased likelihood of membership in the *problem drinkers* when compared with the *abstainers* (OR=4.83, P=.01), *low-intake drinkers* (OR=4.87, P=.01), and *nonproblem drinkers* (OR=12.50, P<.01), but these relationships were only significant among those who were most likely to be members of the *loyal* religiosity profile. Among those most likely to be members of the *apathetic* profile, depression significantly differentiated between likelihood of membership in the *nonproblem drinkers* compared with the *abstainers* (OR=.48, P<.001) and in the *nonproblem drinkers* compared with the *lowintake drinkers* (OR=.61, P=.02). Depression did not differentiate between any of the alcohol use profiles when conditioned on the *reserved* religiosity profile.

The delinquency by depression interaction significantly predicted likelihood of membership in alcohol use profile when conditioned on likelihood of membership in the *loyal* 

religiosity profile. (Certain ORs were undefined [see Table 6]. This was due to an extremely small cell size when examining relationships between the delinquency by depression interaction predicting likelihood of membership in the problem drinkers when conditioned on likelihood of membership in the loyal religiosity profile [n = 8; see Table 7].) Among those most likely to be members of the loyal profile, the delinquency by depression interaction significantly differentiated among those most likely to be members of the low-intake drinkers compared with the nonproblem drinkers (OR=333.333, P=.01). This interaction is graphically depicted in Figure 3. Overall, the magnitude of the difference between probabilities of membership in each profile increased as a function of increasing delinquency, that is, individuals were more likely to be a member of the nonproblem drinkers and less likely to be a member of the low-intake drinkers as delinquency increased. However, at low levels of depression, individuals were always more likely to be members of the nonproblem drinkers, whereas at high levels of depression individuals were slightly more likely to be members of the lowintake drinkers when they engaged in low levels of delinquency, but were more likely to be members of the nonproblem drinkers when they had high levels of delinquency.

Also, only among those most likely to be members of the *loyal* religiosity profile, the delinquency by depression interaction differentiated between those who were more likely to be members of the *low-intake drinkers* compared with the

ALCOHOL USE PROFILE									
	LOYAL		RESERVED		APATHETIC		TOTAL		
Problem	8	2.5%	161	50.9%	147	46.5%	316	100.0%	
	1.4%		13.5%		17.5%				
Nonproblem	227	32.1%	305	43.1%	176	24.9%	708	100.0%	
	39.1%		25.6%		21.0%				
Low-intake	110	12.5%	439	49.7%	334	37.8%	883	100.0%	
	19.0%		36.9%		39.8%				
Abstainers	235	33.4%	286	40.7%	182	25.9%	703	100.0%	
	40.5%		24.0%		21.7%				
Total	580		1191		839		2610		
	100.0%		100.0%		100.0%				

Table 7. Numbers of individuals in religiosity-alcohol use profile combinations.

Religiosity profiles were derived from wave 2 responses ( $M_{age}$  = 16.5), whereas alcohol use profiles were derived from wave 4 responses ( $M_{age}$  = 28.5). Percentages to the right of the cell reflect proportion of the religiosity profile in the respective alcohol use profile; percentages below the cell reflect the proportion of the alcohol use profile in that particular religiosity profile. Percentages may be off by 0.1% due to rounding. These *n*s were taken from the full model; they will not match with the unconditional latent profile analysis models in Figures 2 and 3.



**Figure 3.** Delinquency by depression interaction in predicting likelihood of membership in the *low-intake drinkers* compared with the *nonproblem drinkers*. Figures depict this interaction only among those most likely to be members of the *loyal* religiosity profile. High/low values of delinquency and depression are based on median splits and are presented for illustrative purposes only.

*abstainers* (OR=.01, P=.02; see Figure 4). Regardless of depression level, the likelihood of membership in the

*low-intake drinkers* and *abstainers* decreased with increasing delinquency. However, among those with high levels of depression, individuals were always more likely to be a member of the *abstainers*, whereas at low levels of depression individuals were more likely to be members of the *abstainers* when they also engaged in low levels of delinquency, but were more likely to be members of the *low-intake drinkers* when they engaged in high levels of delinquency.

#### Discussion

This examination of behavioral antecedents to adulthood alcohol use suggests that adolescent delinquency and depression may serve to differentiate typologies of alcohol users in adulthood and that the magnitude of these relationships may be associated with one's likelihood of exhibiting unique patterns of religious behaviors among self-identified Christians.

#### Delinquency

First, engaging in delinquent activities during adolescence was related to an increased likelihood of heavier drinking in adulthood, irrespective of experiencing alcohol-related consequences (represented by a high likelihood of membership in the *nonproblem drinkers* and *problem drinkers*). However, these effects were seen primarily among those who were likely to demonstrate high mean item responses to religiosity-focused indicators. These results support previous literature linking adolescent delinquency to adult alcohol use<sup>64</sup>; however, these results are indicative of a more nuanced relationship with religiosity than has been expressed in previous literature.<sup>33,34,38,48,65,66</sup> For instance, some may suggest that





**Figure 4.** Delinquency by depression interaction in predicting likelihood of membership in the *abstainers* compared with the *low-intake drinkers*. Figures depict this interaction only among those most likely to be members of the *loyal* religiosity profile. High/low values of delinquency and depression are based on median splits and are presented for illustrative purposes only.

encountering only a few individuals who were likely to be members of both the *loyal* profile and *problem drinkers* is indicative of a protective effect of religiosity against the effect of delinquency on the development of problematic drinking patterns (see Table 7). However, we see differential effects of delinquency on likelihood of membership in the *problem drinkers* across religiosity profiles, demonstrating that delinquency is still a risk factor for development of particular patterns of alcohol use, and the extent of this risk may be associated with particular patterns of religiosity.

There are a number of potential explanations for why such nuanced associations were uncovered in this analysis. First, it may be that those who are "more" religious (in this case, those who identify as Christian and participate frequently in religious services and activities) experience psychologic reactance. Reactance refers to one's tendency to act in a manner inconsistent with prescribed behavior as retaliation against feeling that one's autonomy has been challenged.<sup>67</sup> Strongly religious individuals may feel that the behavioral mandates set by their religion (such as proscribing the consumption of alcohol) challenge their individual autonomy and drink heavily as a response to this perceived deficit of control. Previous studies have also shown that national crime rates increase as a function of national religiosity<sup>68</sup> potentially due to religious individuals' expectations to receive grace or be forgiven for committing transgressions. It may be that individuals who are highly religious continue to take part in heavy drinking because they expect to be forgiven for such behavior. Another potential explanation is that those most likely to be members of the *loyal* religiosity profile demonstrate a more "mature" religiosity that permits nonhazardous drinking; future research should seek to substantiate this theoretical possibility.

However, it is most likely that the person-centered approach to examining religiosity in this study may provide a more robust explanation of our findings. Although Benda and Corwyn<sup>65</sup> posited that a multidimensional examination of religiosity may reveal complex ways through which religiosity protects against delinquency, previous studies have mainly applied variablecentered approaches, using single item or composite measures of religious service attendance, strength of evangelism (including identity as a born-again Christian), personal religiosity, and religious affiliation or church membership.<sup>38,48,65,66</sup> These variable-centered approaches assume that variables relate to each other in the same way across all types of individuals,<sup>25,26</sup> leaving the potential for interactions among underlying facets of these variables to remain latent. As such, it may be that the particular pattern of religiosity demonstrated by members of the loyal profile is not most effective in buffering against the influence of delinquent peers. Other studies using person-centered approaches to religiosity have inferred that qualitatively different types of religious individuals engaged in varying levels of delinquent behavior.<sup>51</sup> As such, our analysis has replicated this effect and has provided additional evidence that a synthesis of varying levels of religious beliefs and practices (as opposed to indices of low, medium, and high religiosity) could provide additional information about characteristics of diverse individuals that is complementary to that obtained by a variablecentered approach.

#### Depression

Depression was also predictive of particular types of adulthood alcohol use. Adolescents who experienced more symptoms of depression were (1) less likely to drink heavily and (2) more likely to either abstain from drinking or to demonstrate a problematic pattern of alcohol use. As with delinquency, these relationships varied across religiosity profiles. Given that previous research has found a negative relationship between adolescent depression and adult alcohol use,<sup>5,12-14</sup> the finding that depression in adolescence was related to decreased likelihood of membership in low-consuming or abstaining profiles is not surprising. Depressive symptoms, part of a larger category of internalizing symptoms, may be associated with decreased alcohol use in adulthood due to a later initiation into alcohol use. Initiation into alcohol use is strongly tied to social interaction,<sup>69</sup> and because adolescents with depressive symptoms may avoid social interaction, they may be less likely to begin drinking, in turn decreasing their risk of developing maladaptive

alcohol use patterns. However, that depression was also related to an increased likelihood of problematic drinking patterns, particularly among those who were most likely to demonstrate strong engagement with religious behaviors, is of interest. Although depression has been linked to an increase in problematic drinking, these effects have mainly been found during adolescence.<sup>16</sup> Future research must further investigate this association to substantiate the nature of the relationship between depression and alcohol use across time.

The results of this study do not necessarily provide support to the presence of a direct internalizing pathway to alcohol use<sup>11</sup> in the context of alcohol use operationalized as a latent categorical variable. Depression differentially predicted likelihood of membership in alcohol use profiles, and this change in operationalization of alcohol use (ie, examining latent profiles of alcohol use rather than indices of frequency/quantity of consumption) demonstrates that depression may be related to lower likelihoods of particular combinations of alcohol use behaviors, rather than indices or alcohol use composite scores used in previous research.<sup>70</sup> Given that these results also differ according to the pattern of religiosity one is most likely to exhibit, it may be that the particular pattern exhibited by those most likely to be members of the *loyal* religiosity profile is particularly protective against the effects of depression on alcohol use.

# Depression by delinquency interaction

Examination of the delinquency by depression interaction demonstrated that among those most likely to be members of the loyal religiosity profile, the likelihood of heavy drinking still increased as a function of delinquency, but those who also reported depressive symptoms were less likely to demonstrate heavy drinking patterns than those who did not experience depressive symptoms. These results suggest that delinquency may be a more robust predictor of particular kinds of alcohol use, such that delinquency is inversely related to abstaining or low levels of consumption, but that the extent to which delinquency predicts heavy alcohol use may be dependent on co-occurring depressive symptoms. These findings substantiate those of Colder et al,<sup>24</sup> who found that externalizing problems were more effective predictors of later alcohol use when adolescents were only displaying externalizing problems. However, when externalizing problems were coupled with internalizing problems, the relationship between these predictors and alcohol use was weaker. It appears that while delinquency in adolescence indicates that individuals may engage in some kind of alcohol use as an adult, as has been previously demonstrated,<sup>5,12</sup> the extent to which this alcohol use will consist of binge drinking and/or intoxication may be dependent on comorbid depression.

# Limitations

These findings must be appreciated in light of a number of limitations. First, membership in the *loyal* profile was related to

particularly strong and significant odds of membership in each alcohol use profile when compared with the *problem drinkers*; however, only 8 individuals were members of both the loyal religiosity profile and the problem drinkers (see Table 7). So, even though comparisons between the problem drinkers and any other alcohol use profile within the loyal profile resulted in extremely large and significant ORs, these results may be different if a larger cell size were available. However, considering that when conditioned on likelihood of membership in the loyal profile increased delinquency was still associated with increased likelihood of membership in the nonproblem drinkers when compared with the *abstainers* (a comparison with an appropriate cell size, albeit demonstrating a slightly weaker effect), it is likely that the general trend of results is valid, although the true extent of the effect is in need of further replication. As such, we suggest that definitive conclusions about the relationships between the predictors and alcohol use profiles using the problem drinkers as a reference group when conditioned on membership in the loyal religiosity profile should be made only after future work has replicated these results.

As with all secondary data analyses, we were limited to the items available in the Add Health questionnaire. The indicators used in the religiosity LPA assessed a limited number of religious beliefs and behaviors, and the resulting religiosity profiles should be appreciated in light of the specific indicators used. Along these lines, 2 available indicators reflect frequency of attendance at religious services and at religiously affiliated activities. These indicators may be more reflective of parents' religiosity and church attendance, rather than the adolescent's autonomous choice to attend services.<sup>33,71</sup> Consequently, the profiles may be different if other indicators were included. We encourage future research in this area to examine profiles of religiosity with different combinations of religious beliefs and practices. Given that religiosity indicators were not assessed among those who did not indicate affiliation with an established religious tradition, we are also missing a very specific demographic whose inclusion may have influenced the patterns of religiosity present in the latent profiles. The observed sample appeared to be quite religious, so these religiosity patterns may not be representative of more secular populations. In addition, religiosity was assessed in 1996, and the results may not generalize to adolescents today (see the Pew Research Center<sup>72</sup> for an examination of societal changes in religiosity). Finally, entropy in the religiosity LPA was lower than what is typically accepted (see Table 4). This entropy value suggests that we have greater classification error, which may cloud our predictive ability. Because we did not use the results of the religiosity LPA as a predictor or outcome in a 2-stage analysis where classification error is more costly, we accepted the low entropy value in this analysis with the understanding that cases may not be perfectly classified.

Although we were able to assess the effects of adolescent predictors on likelihood of membership in adult alcohol use

profiles across those who were likely to demonstrate 3 discrete patterns of religiosity, we were unable to conduct a formal test of moderation effects. Thus, care must be taken to avoid comparing the results of analyses conducted with respect to discrete religiosity profiles and/or between individual religiosity profiles and the full sample (ie, the unconditional model). This is a current limitation of mixture modeling, but suggestive of an area for potential methodologic development. Until such procedures are developed, we are precluded from formally assessing a mechanistic role of religiosity when conceptualized as a latent categorical variable via traditional mediation or moderation. Although our results are suggestive of a mechanistic role of religiosity as a moderator, it will be prudent for methodologists to reassess these results with additional methods. In addition, mixture modeling in general is a probabilistic technique, which means we do not have complete certainty in our religiosity profile assignments and alcohol use classifications. The profiles presented here should be regarded as prototypical item response patterns that have a high likelihood of existing in the population.

An additional limitation is related to our examination of delinquency and depression at baseline, religion 1 year post baseline, and alcohol use outcomes 13 years post baseline. This leaves a large period of time unaccounted for, in which significant events may have occurred but were not captured by data collection. For instance, it may be that some individuals became dependent on alcohol, subsequently went into treatment, and are now represented in the *abstainers*; these individuals may be qualitatively different from those who have never drank or drink infrequently. Also, the reciprocal effects of delinquency and depression may differentially influence adult alcohol use profiles.<sup>73</sup> Parallel process models that track these influences at each time point may provide a more nuanced understanding of how these intertwined factors predict alcohol use.

Other limitations include a reduction in sample from the original, nationally representative Add Health sample. Although such reductions were made to make meaningful comparisons using all available data, this practice reduces the generalizability of our findings. Such reduction in sample may have influenced the examination of the protective effects of religion on delinquency, similar to the ways in which the relationship between delinquency and religion varies depending on the region of the country in which the sample is taken.<sup>74</sup> Furthermore, the delinquency items had relatively low internal consistency reliability. Although these items were selected to specifically relate to dimensions of delinquency that have been previously shown to be associated with religiosity and alcohol use,36 future work should expand the dimensions of delinquency assessed to increase the reliability of this measure. In addition, we did not include measures of socioeconomic status in these analyses (eg, total household income and parental level of education) because examining the effects of these factors was beyond the scope of this project, thus limiting our ability to

account for additional environmental factors in the development of alcohol use and the initial levels of adolescent delinquency. Finally, we did not account for a number of other variables that have been related to the development of alcohol use, such as social support,<sup>31</sup> peer alcohol use,<sup>64</sup> and self-regulation.<sup>75,76</sup> Future research should include additional auxiliary variables, such as those just mentioned, to understand the complex mechanisms through which these typologies develop across time.

# Conclusions

This is the first attempt to examine the role of latent profiles of religiosity in internalizing and/or externalizing pathways to alcohol use patterns. The results of these analyses suggest that delinquency and depression are predictive of alcohol use patterns, but such associations appear to vary among individuals with different patterns of religiosity. Person-centered examinations of religiosity, such as that used in this analysis, are pertinent, considering a societal trend of decreasing affiliation with organized religion.<sup>50,72</sup> Even though fewer Americans are identifying with traditional religious denominations, this does not mean that they avoid existential thinking or attendance at religious activities; person-centered approaches will continue to be useful to identify nuances in such patterns of unorganized religious behaviors or beliefs. Future research should continue examining the composition of adolescent religiosity profiles across a wide range of religious and nonreligious individuals, psychosocial correlates of those profiles, and the stability of religiosity patterns over time.

In addition, we were able to replicate the alcohol use profile structure previously identified by Donovan and Chung<sup>28</sup> in wave 1 of Add Health using data from the same sample of individuals at wave 4. The persistence of this structure across a span of 13 years suggests that these profiles may remain stable over time. However, we did not assess stability/change in profile membership at the level of the individual (eg, were those most likely to be members of the *abstainers* at wave 1 still most likely to be members of the *abstainers* at wave 4?). By identifying such patterns, and factors that may accounting for individual variability in profile membership over time (eg, self-regulation, stressful life events, and treatment seeking), future studies may further inform our understanding of developmentally normative versus atypical drinking processes (eg, are early nonproblem drinkers at increased risk of being subsequent problem drinkers?).

These results highlight the nuanced pathways through which delinquency and depression influence subsequent patterns of alcohol use, demonstrating the importance of examining antecedents to alcohol use within an individual's unique environmental context. As such, to estimate the extent to which religiosity may function as a protective factor against alcohol use, those working with delinquent or depressed youth must assess an individual's entire pattern of religiosity-focused practices or behaviors. Further research is also needed to identify whether specific types of externalizing behaviors other than delinquency (eg. antisocial behavior, aggression, and drug use) or specific types of internalizing problems other than depression (eg, social anxiety and excessive withdrawal) are prospectively related to particular patterns of alcohol use so that these specific behavioral antecedents can also be targeted in prevention or intervention efforts.

# **Author Contributions**

MAH, WCR, and SJL conceived and designed the experiments. MAH and SJL analyzed the data. MAH wrote the first draft of the manuscript. SJL contributed to the writing of the manuscript. MAH, WCR, and SJL agree with manuscript results and conclusions. MAH, WCR, and SJL jointly developed the structure and arguments for the paper. MAH, WCR, and SJL made critical revisions and approved final version. All authors reviewed and approved the final manuscript.

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