Subgrouping University Students Based on Substance Use Pattern: A Latent Class Analysis

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Purpose: High-risk behaviors are the main causes of death and disability among youth and adults. Entering university might cause students to go through their first-hand experience of using substances.

Aim: This study aimed to detect the subgroups of students based on substance use and assess the effects of religiosity and parental support as well as other related factors on the membership of students in each latent class.

Methods: Using a multistage sampling method, this cross-sectional study was conducted in 2016 in Hormozgan University of Medical Sciences (n=524). All students completed a self-report questionnaire. This questionnaire contained questions about substance use, religious beliefs and familial support. The questions of substance use were prepared using the World Health Organization Alcohol, Smoking and Substance Involvement Screening Test (WHO ASSIST). To analyze the data, PROC LCA statistical method was run in SAS9.2.

Results: Three latent classes were identified: 1) nonuser (87.5%), 2) tobacco and illicit drug user (8.7%) and 3) polydrug user (3.8%). Having extramarital sex in the last month (OR=28.29, 95% CI; 8.45–94.76), living alone (OR=4.29, 95% CI; 1.01–18.35) and having a higher score of familial support (OR=0.94, 95% CI; 0.89–0.98) were associated with the polydrug user class. Hookah smoking had the highest (11.1%) and non-medical methylphenidate use had the lowest (2.3%) prevalence among the participants of the study.

Conclusion: This study revealed that 12.5% of the students were either tobacco and illicit drug users or polydrug users. Thus, focusing on the religiosity and familial support may help design some preventive programs for this stratum of young adults.

Keywords: latent class analysis, substance use, religiosity, familial support, university students

Introduction

High-risk behaviors are the main causes of death and disability among youth and adults. The United Nations Office on Drug and Crime (UNODC) has reported that one-fourth of a billion 15–64-year-old people in the world used drugs at least once in 2016.1

In the 21st century, adolescents and youths have encountered multiple social changes that may contribute to potential substance use.2 One of the most important stages in the lives of these young adults can occur when they enter a university, which is associated with separation from family, facing peer pressures and exposure to new experiences, in turn leading to increased stress and behavioral problems such as substance use. Substance use can result in physical injuries and irreparable educational, psychological, socioeconomic and occupational failure.3,4
Previous literature has already focused on the prevalence of substance use and its related factors as well as the introduction of high-risk groups and the consequences of engaging in substance use, but showing the possibility of simultaneous occurrence of different substances and the classification of students based on substance use are less taken into account.1,5,6

Although the trend of substance use is decreasing in European countries and the US, this issue has remained a major problem among young people and students in these countries.7,8 Among Iranian students, the prevalence of substance use is relatively high.7,5 For example, in a study conducted in six universities in Tehran, a relatively high prevalence of hookah, smoking and alcohol use was reported.9

Important factors contributing to substance use include gender, high stress, the family history of substance use, family conflicts and protective factors such as religion, parental support and the high level of parental education.10–14 Religious beliefs have been identified as a protective factor against substance use. Prior studies have suggested that individuals with higher religiosity tend to demonstrate a range of healthy behaviors.15,16 Parental support is another factor that protects students against risky behaviors. Individuals from more cohesive families are less likely to try illegal drugs and substances.16,17 The relationship among the above-mentioned factors has been assessed by variable-centered studies considering each substance separately. As a result, there is no information on the association of these variables with the subgroups of substance use. For assessing the simultaneous effects of related factors on all types of substance, there are new approaches, one of which is Latent Class Analysis (LCA). LCA is a form of cluster analysis used as a tool to identify the latent subgroup specifications or classes of individuals with common characteristics.18

It should be noted that the prevalence of illicit drug and alcohol use among Iranian students could be different from other countries especially the western ones. Such a difference is mostly related to these factors: 1) religious and legal prohibition of alcohol and illicit drug use; 2) the cultural stigma against alcohol and illicit drug use and 3) the disapproval of alcohol and illicit drug by parents.12

Based on the above-mentioned introduction, this study aimed to investigate students’ subgroups according to the substance use pattern using the LCA statistical method. Also, the effects of religious beliefs, familial support and some demographic characteristics on the probability of the membership of students in each class were evaluated.

**Methods**

**Study Population and Sampling Framework**

The present cross-sectional study was conducted in 2016 in Hormozgan University of Medical Sciences. To sample students, we used a multistage sampling scheme. This university has six faculties all of which were considered as strata. The proportion of students in different faculties was calculated (stratified sampling). Then, the number of classes was extracted. In the selection process, some classes were selected randomly in each faculty. In selected classes, all students were recruited to participate in the study. Finally, 580 students were invited to participate. Before the distribution of the questionnaires, the research team explained some needed explanations in each selected class on the aims of the study, the anonymity of the questionnaires and the voluntary nature of participation in the study. Moreover, the research team asked students not to include their names and other personal information in the questionnaire. To gain the students’ trust and maintaining their confidentiality, pens with the same color were distributed among them to complete the questionnaire.

To obtain information about risk-taking behaviors, students completed a self-administrated questionnaire that was previously developed in another study19 in their class. More information on this questionnaire has been reported in previous studies.12,20

In this questionnaire, the questions designed to obtain information include the following topics: cigarette and hookah smoking, prescription-type opioids use, methylphenidate and sedative-hypnotics use, illicit drug use, having extramarital sex and some demographic characteristics.

To assess religious beliefs, a 28-item scale of Kendler’s general religiosity was used. In this scale, a 5-point Likert-type scaling was used. As a result, the final score of religiosity for each student ranged between the minimum and maximum amounts (28 to 140). In this scoring system, the higher scores showed a higher level of religious beliefs. Parental support was assessed by the Persian version of Aneshensel and Sucoff’s 13-item questionnaire. In this questionnaire, a 5-point Likert-type scaling was used. The final score of parental support for each student ranged between 13 to 65 (the lowest and highest scores) in which higher scores showed a higher level of parental support. More information about these two questionnaires has been provided in other studies.16,21 Extramarital sex has been
defined as having sex with someone else out of marriage. As a result, extramarital sex includes having a sexual relationship with someone other than his/her spouse and also having pre-marital sex with someone.

The Ethics Committee of Hormozgan University of Medical Sciences approved the study. All students had signed an informed consent form.

Statistical Analysis

We used LCA to analyze the data. This approach is a latent categorical variable model that identifies individuals with similar characteristics and classifies similar participants. Considering the measurement error, this model assumes that the association of indicator variables (observed variables) could be stated by the categorization of the latent variable. LCA performs different iterations for all models of identified classes. Comparing the frequencies of response patterns (observed vs expected), LCA specifies the best model. This model calculates some indices that help select the best model such as $G^2$, Akaik information criterion (AIC) and Bayesian information criterion (BIC). It should be noted that AIC and BIC are calculated based on the $G^2$ statistic. For these criteria, a smaller value shows more goodness of the model. As a result, a model with the lowest value of AIC or BIC might be selected. In order to perform LCA in the current study, seven observed variables were used to assess the profile of substance use as a latent variable. These observable variables or indicators were cigarette and hookah smoking, alcohol use, prescription-type opioids use, methylphenidate use, sedative-hypnotics and illicit drug use. To assess the role of some other related factors regarding clustering the students, after finalizing the model, we entered age, gender, having extramarital sex, living alone, religious beliefs and parental support into the LCA model as covariates. To perform all analyses, we used PROC LCA in SAS 9.2 software (SAS Institute Inc. Cary, NC, USA).

Results

From 580 distributed questionnaire, a total of 524 (90.3% response rate) were completed by the students. The results showed that the mean age of the students was 23.0±4.2. The lowest and highest age was 18 and 47 years old, respectively. Also, 58.2% of the participants were male, and only a few were married (19.8%).

Table 1 shows the prevalence of each substance use. This table indicates that among all students, hookah smoking in the last month had the highest prevalence among all types of substance. Likewise, non-medical methylphenidate use had the lowest prevalence. Besides, the results showed that men used more substances than women did.

Moreover, we fit the LCA models with different classes, ranging from one to eight. For each latent model, the needed indices were calculated. Table 2 shows these models. Given these indices and interpretability of the results of the models, we selected three latent-class models. Table 3 demonstrates the results of the three latent-class models of substance use pattern among students. This table contains three sections. The first section shows latent-class prevalence. The second one shows item-response probabilities, and the last one indicates odds ratios with a 95% confidence interval for covariates.

The second section of Table 3 contains the conditional probabilities of using each substance. It should be noted that the probability of non-using each substance can be calculated by subtracting the item response probabilities as shown in this table from 1. For labeling and interpreting each latent class, these item response probabilities were used. To show and highlight the overall pattern, the larger item response probabilities appear in bold font. For example, we named latent class 3 as “polydrug user” because this class was characterized by a high probability of using all substances. Similarly, latent class 1 was named as “non-user” and characterized by a low probability for using all substances. In contrast to these classes, another class showed a different pattern of substance use among students of this study. Latent class 2 was named as “tobacco and illicit drug user” and showed individuals high likely to smoke cigarettes and hookah along with illicit drug use.

The last section of Table 3 shows the odds ratio of membership in each latent class. We considered latent class 1 (non-user) as a reference class. This table indicates that having extramarital sex in the last month increased the odds of membership in latent class 2 and 3 compared to class 1. Similarly, living alone increased the odds of membership in latent class 2 and 3 compared to class 1. In contrast to these two factors, having a higher familial support score decreased the odds of membership in latent class 2 and 3 compared to class 1. Although having a higher score of religiosity could decrease the membership in latent class 2 compared to class 1.

Discussion

In this study, we examined substance use patterns and identified three latent classes among university students.
in the city of Hormozgan. These three latent classes are the following: 1) Nonuser (87.5%), 2) tobacco and illicit drug user (8.7%) and 3) polydrug user (3.8%). Among the students belonging to the latent class 2 (tobacco and illicit drug user), the probability of cigarette and hookah smoking as well as illicit drug use was high. Also, among the students of the latent class 3 (polydrug users), the probability of engaging in all types of substance-related behavior was high.

Considering the legal and religious prohibition of substance use in Iran and the negative stigma against substance use among Iranian people, it seems that a considerable number of students fell under “tobacco and illicit drug user” and “poly drug user” classes.

The results of multinominal regression indicated that a higher score of religiosity beliefs (only in tobacco and illicit drug user) and familial support decreased the odds of membership in the latent class 2 and 3 in comparison to the first class. In the previous variable and person-centered research, the preventive effect of religiosity on engaging in high-risk behaviors has been documented among university students.\textsuperscript{16,22-25} As for the person-centered studies, for example, Afrashteh et al showed that religious beliefs decrease the odds of membership in the high-risk class, somewhat high-risk class, hookah user class and very high-risk class compared to the low-risk class.\textsuperscript{25} Similarly, Mohammadpoorasl et al indicated that among male students, religious beliefs can decrease the odds of membership in the sexual and drinking risk takers class and high-risk class compared to the low-risk class.\textsuperscript{16} Previous research also demonstrates that among female students, a higher score of religiosity decreases the odds of membership in the cigarette and hookah smoker class, sexual risk-taker class and high risk class compared to the low-risk class.\textsuperscript{16}

Additionally, this study revealed that familial support acts as a protective factor on the membership of students in second and third classes. The preventive role of familial support in substance-related behaviors have been reported in numerous variable-centered studies.\textsuperscript{21,26,27} But few studies have examined the effect of this factor on the person-centered analysis.\textsuperscript{16,25} For example, Afrashteh et al showed that familial support decreases the odds of membership in the high-risk class, somewhat high risk class, hookah user class and very high risk class compared to low-risk class.\textsuperscript{25}

Religious beliefs and familial support could be considered as critical and influential factors in substance use preventive programs in university students. These factors along with other related variables can act as a marker for initiation of engaging in substance-related behaviors and finally for identification and implementation of the interventions among this stratum of the society.

Our results indicate that hookah smoking is a more common behavior compared to other substance-use behaviors. In the same vein, the results of national STEPS surveys have indicated that the prevalence of hookah smoking in Iranian adults ranges from 1.7 to 10.9% among men and from 0 to 16.8% among women. Besides, this study revealed that this behavior is common in the south and southeast of Iran.\textsuperscript{28} As can see in Table 3, hookah smoking cooccurred with other types of behavior and there is no specific class of students that only used hookah. Previous person-centered research in Iran has reported inconclusive findings. For instance, in a similar study in the south of Iran, Afrashteh et al\textsuperscript{25} reported that there is a specific group of students that are only hookah smokers. Nevertheless, other studies among students in Tabriz\textsuperscript{16} (the northwest of Iran) demonstrated that there is only one group of students (also in male and female students) that used cigarette and hookah

<table>
<thead>
<tr>
<th>Items</th>
<th>Male (n=215)</th>
<th>Female (n=305)</th>
<th>Total (n=524)</th>
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<tbody>
<tr>
<td>Cigarette smoking (last month)</td>
<td>36</td>
<td>13</td>
<td>49</td>
</tr>
<tr>
<td>Hookah smoking (last month)</td>
<td>45</td>
<td>13</td>
<td>58</td>
</tr>
<tr>
<td>Alcohol use (last month)</td>
<td>24</td>
<td>12</td>
<td>36</td>
</tr>
<tr>
<td>Prescription-type opioids use (last month)</td>
<td>26</td>
<td>25</td>
<td>52</td>
</tr>
<tr>
<td>Methylphenidate use (last month)</td>
<td>8</td>
<td>4</td>
<td>12</td>
</tr>
<tr>
<td>Sedative-hypnotics use (last month)</td>
<td>15</td>
<td>17</td>
<td>32</td>
</tr>
<tr>
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<td>35</td>
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<td>51</td>
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<td>% 1.3</td>
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<td>% 5.6</td>
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<td></td>
<td>% 16.3</td>
<td>% 5.2</td>
<td>% 9.7</td>
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</tbody>
</table>
simultaneously. Likewise, research has shown that among students of medical sciences in Tehran (the capital of Iran) there was not a separated group of hookah smoker. Nevertheless, a study conducted in the U.S indicates that hookah smoking commonly cooccurs with other risk-taking behaviors, and there is no heterogenic group of students that use only hookah in the LCA model.

Previous variable-centered research has revealed that individuals who are hookah smokers are more likely to engage in using marijuana, cigarettes, alternative tobacco products and alcohol. However, consistent with other person-centered studies from Iran, this study showed that this may not be true for all hookah smokers. In other words, only the poly-drug user class had the highest risk. In the second class, hookah users were at the risk of using cigarettes and illicit drugs and not all behaviors.

In line with to prior studies the present study showed that hookah smoking exceeded cigarette smoking. The higher prevalence of hookah smoking can be due to the following reasons: age, availability and social setting and acceptance. Hookah smoking is more likely to be reported by younger students. Similarly, hookah smoking is a social activity for most young adults. For this reason,
many hookah smokers have reported using hookah while hanging out with others.34,36,37

The majority of hookah users think that this behavior is less lethal and addicting than cigarettes or other types of substance.38 Cobb et al suggested that hookah smoking analysis, user toxicant exposure and health effect research could contradict this misperception about hookah.39 Unfortunately, there is no formal and legal instruction or prohibition against hookah smoking in Iranian universities.

As previously mentioned, this study evaluated the substance use pattern in university students. We also assessed the effects of parental support and religiosity as well as other related factors on the membership of the students in various latent classes that were identified by the LCA model. The findings of this study showed that most of the students are nonusers. But about 9% and 4% are tobacco and illicit drug users and polydrug users, respectively. Based on the findings, focusing on the religiosity and familial support may help design preventive interventional programs for reducing substance use prevalence in university students. Such programs could be used in lower ages such as high school students.

The strengths of this study were its good sampling scheme, acceptable sample size and high response rate. This study had some limitations, though. The first limitation was using a self-administrated questionnaire which could lead to the underestimation of the prevalence rates. Additionally, due to the cross-sectional nature of the present study, causality could not be assessed. Another setback was associated with assumptions of the LCA model. One of the most important assumptions of this model is the local independence of indicator variables. It is probable that this assumption was not established among different substances. Finally, the generalization of the findings of this study is limited to the students in the city of Hormozgan.

Ethics Statement
The present study was approved by Hormozgan University of Medical Sciences. Informed consent was confirmed by the Ethics committee and this study was conducted in accordance with Declaration of Helsinki.

Disclosure
The authorsdeclare that there are no conflicts of interest for this work.

References