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Article

# Generalized and Specific Problematic Internet Use in Central Siberia Adolescents: A School-Based Study of Prevalence, Age-Sex Depending Content Structure, and Comorbidity with Psychosocial Problems

Sergey Tereshchenko\*, Edward Kasparov, Nadezhda Semenova, Margarita Shubina, Nina Gorbacheva, Ivan Novitckii, Olga Moskalenko and Ludmila Lapteva

<sup>1</sup> Federal Research Center "Krasnoyarsk Science Center of the Siberian Branch of the Russian Academy of Sciences", Research Institute of Medical Problems of the North, Krasnoyarsk, Russian Federation; [impn@imppn.ru](mailto:impn@imppn.ru)

\* Correspondence: [legise@mail.ru](mailto:legise@mail.ru); Tel.: +7(391)228-06-62

**Abstract:** We aimed to assess the prevalence, content structure and psychological comorbidity of PIU in Russian adolescents. In addition, the design of our research provided an opportunity to compare demographic and psychological patterns of different forms of PIU: generalised (PIUgen) and specific – problematic video game use (PUgame) as well as problematic social media use (PUsocial). **Methods:** This is a one-stage cross-sectional observational study of school sampling in three major Siberian cities. A total of 4514 schoolchildren aged 12-18 (mean age 14.52±1.52 years) were surveyed. Chen Internet Addiction Scale, Game Addiction Scale for Adolescents, and The Social Media Disorder Scale were used to identify PIU and its types. **Results:** The prevalence of PIUgen among adolescents in Central Siberia was 7.2%; the prevalence of PUgame was 10.4%; the prevalence of PUsocial was 8.0%. The results of structural equation modelling, as well as the correlation analysis data, suggest two possible patterns of psychosocial problems with PIU – the first one characteristic of both PIUgen and PUsocial, the second one, significantly different, – of PUgame. **Conclusions:** Urban adolescents in Central Siberia do not differ significantly from their Asian and European peers. Our findings support the concept of rejecting the term “generalised PIU” as a single psychological construct.

**Keywords:** adolescents, Internet addiction, problematic Internet use, game addiction, social media addiction, Russia

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## 1. Introduction

The last two decades have been characterized by the avalanche-like increase in Internet use in all social groups, especially among adolescents and young adults [1]. The phenomenon of Internet addiction, or “pathological/compulsive Internet use,” occurs in a number of predominantly adolescent and young adult Internet users, which is characterized by loss of control over online activities, compulsive craving for various Internet activities, often causing a wide range of psychosocial and psychosomatic problems.

First described in the mid-1990s, the phenomenon of Internet addiction [2-4] has generated numerous scientific, clinical and social debates since its emergence till the present. From the point of view of classical psychology and psychiatry, addictive online behaviour is a relatively new phenomenon that has, to date, no generally accepted formal definition. Some interchangeable terms can be found in specialized literature, such as the recently proposed “problematic interactive media use” [5], as well as more traditional “problematic Internet use” (PIU), “pathological Internet use”, “compulsive Internet use”, and finally “Internet addiction.” All of these are “umbrella” terms reflecting generalized

problematic Internet use (PIUgen) without reference to specific content. By the present time, five specific types of online activity can be considered potentially addictive: problematic video game use (PUgame), problematic social media use (PUsocial), problematic Internet pornography use, Internet gambling and compulsive Internet searching and surfing [6]. Only one of these five addictive types of behaviour, namely PUgame, is now officially considered to be a mental disorder (Internet Gaming Disorder, DSM-5; American Psychiatric Association, 2013; Gaming Disorder, ICD-11, 2019).

PIU prevalence figures in respect of adolescents, published in global literature, vary widely depending on explored ethno-social groups, diagnostic criteria and questionnaires – from 1% to 50% [1,7]. In Europe, for instance, the prevalence of PIU among adolescents is 1-11%, with an average of 4.4% [8]. In the United States, the prevalence of PIU in the total sample is 0.3-8.1% [9]. At the same time, the prevalence of PIU in Asian countries (China, South Korea, Singapore, etc.) is much higher among adolescents and young adults, ranging from 8.1 to 26.5% [10,11].

A large number of studies have convincingly demonstrated strong comorbidity of PIU with a wide range of psychopathological conditions [12,13]. For instance, a meta-analysis by Ho et al. [14] demonstrated comorbidity of PIU with depression (Odds Ratio (OR) = 2.77, Confidence Interval (CI) = 2.04-3.75), anxiety disorders (OR = 2.70, CI = 1.46-4.97), attention deficit hyperactivity disorder (ADHD) (OR= 2.85, CI = 2.15-3.77). Carli et al. in their systematic review showed that depressive disorder and ADHD have the highest association with PIU, while anxiety disorder, obsessive-compulsive disorder, social phobia and aggressive behaviour, have a smaller but significant association. The same conclusions were reached in a recent systematic review [12]. The Durkee et al. research [15], which included a representative sample of 11,356 adolescents from 11 European countries, conclusively showed a correlation between PIU and self-harming and suicidal behaviour, as well as depression and anxiety. The same findings were obtained in a recent study by Jiang et al. [16]. In addition, PIU in adolescents was found to be associated with chronic conditions (OR=1.58 CI=1.11-2.23), back pain (OR=1.46 CI=1.04-2.05), overweight (OR=1.74 CI=1.03-2.93), musculoskeletal pain (OR=1.36 CI=1.00:1.84) and sleep disturbance (OR=2.16 CI=1.62-2.88) [17,18].

As far as we know, Russia is a “blank spot” with regard to the scientific findings described above – so far no data on the prevalence, structure and psychiatric comorbidity of PIU in Russian adolescents have been published in the global English-language literature. We believe that such data should be available to the global scientific community, at least in the context of comparing different populations.

An important aspect and trend in contemporary PIU research is the attempt to move away from the study of solely generalized, undifferentiated PIU content, towards the analysis of specific types of PIU, such as PUgame and PUsocial [19,20]. It remains unclear to what extent these types of pathological Internet activity are related to PIUgen and to each other. Sample analysis, using simultaneous screening tools for PIUgen, PUgame and PUsocial, could represent a new approach in this direction [21]. We are aware of only two studies with a simultaneous analysis of PIUgen, PUgame and PUsocial; both of them were based on adult population groups [22,23]. Adolescent population groups have not been investigated in studies with a similar design, which conditions the need for such analysis.

The present study aims to be the first attempt in the global English-language literature to assess the prevalence, content structure and psychological comorbidity of PIU among Russian adolescents by the example of unbiased school sampling. Furthermore, the design of this study provides an opportunity to systematically explore how different forms of PIU (PIUgen, PUgame and PUsocial) relate to each other, to what extent they are similar or different in prevalence, demographic characteristics and psychological patterns.

## 2. Materials and Methods

### 2.1. Participants.

The research represents a cross-sectional observational study of an unbiased school sample in three large cities of Central Siberia. The research objects were represented by adolescents aged 12-18 ( $n = 4514$ ; mean age  $14.52 \pm 1.52$  years, boys/girls ratio 46.4% / 53.6%) – students of 10 comprehensive schools in Krasnoyarsk, Russia ( $n = 2901$ ), 4 comprehensive schools in Abakan, Russia ( $n = 1400$ ) and 2 comprehensive schools in Kyzyl, Russia ( $n = 213$ ).

### 2.2. Measurement.

After obtaining informed parental consent, the learners were notified that the survey was voluntary and confidential and they were asked to complete self-report questionnaires in paper form, in a common classroom area for 45 minutes. The survey was conducted in spring 2019. The study was approved by the Ethics Committee of the Federal Research Centre “Krasnoyarsk Science Centre of the Siberian Branch of the Russian Academy of Sciences” (Conclusion of the expert commission No. 12 dated December 10, 2018).

#### 2.2.1. Internet addiction measurement.

To identify the presence of Internet-dependent behaviour, the Chen Internet Addiction Scale (CIAS) was used [24]. The CIAS covers five symptomatic criteria of addictive behaviour, among them compulsive symptoms, withdrawal symptoms, signs of tolerance, the presence of psychological or somatic problems and time management difficulties. The questionnaire comprises 26 statements, each rated according to the 4-score Likert scale: “not at all suitable” (1 point), “slightly suitable” (2 points), “partially suitable” (3 points) and “totally suitable” (4 points). The overall CIAS score  $\geq 65$  was treated as the presence of PIUgen.

The content consumption patterns in adolescents with Internet addiction were analyzed using the Russian-language version of the “Game Addiction Scale for Adolescents” (GASA) questionnaire [25] and “The Social Media Disorder Scale” (SMDS) questionnaire [26].

GASA questionnaire comprises 7 questions relating to behavioural disorders in adolescents caused by excessive preoccupation with Internet gaming. Each question was rated on a 5-score Likert scale: “never” (0 points), “rarely” (1 point), “sometimes” (2 points), “often” (3 points), “very often” (4 points). According to the criteria proposed by the authors [25], two options were identified – a polythetic format of addiction or PUgame (if any 4 or more of the 7 questions were answered as “sometimes”, “often” or “very often”) and a monothetic format of addiction (if all the questions were answered “sometimes” or “often” or “very often”).

SMDS questionnaire consists of 9 questions relating to behavioural disorders caused by excessive use of social networking sites. Each question has two answer options: “no” and “yes.” Five or more positive answers out of nine points to the presence of PUsocial [26]. A recent cross-national analysis of adolescents’ psychometric characteristics in 44 countries showed a high level of validity and reliability of SMDS [27].

#### 2.2.2. Psychosocial problems assessment.

The Strengths and Difficulties Questionnaire (SDQ) was developed by Goodman et al. [28] as a brief psychopathological screening tool that has been recommended for the detection and classification of psychosocial problems in adolescents. The SDQ is widely used today both in clinical practice and scientific research and is characterized by concision coupled with reliability and a possibility to assess various aspects of the adolescent’s psychosocial condition. An indisputable advantage of the SDQ is its wide accessibility – it has been translated into more than 80 languages and is freely available on the developers’ website (<https://sdqinfo.org>), allowing for cross-cultural comparison. The Russian-language version of the SDQ has been thoroughly validated by Ruchkin et al. [29] and Slobodskaya et al. [30] through a sample of Siberian schoolchildren (Novosibirsk, Russia).

One-sided self-rated SDQ for children aged 12-17 was used. The SDQ consists of 25 statements relating to the adolescent's mischief and socially acceptable behaviour over the past 6 months. The answers are scored on a 3-point scale (0 = not true, 1 = somewhat true, and 2 = certainly true; the points are assigned in forward or reverse order for each question in accordance with the authors' instructions [28]) and are grouped under five scales: Emotional symptoms, Conduct problems, Hyperactivity/inattention, Peer problems, and Prosocial behaviour. As provided by the instructions of the questionnaire authors [28], statement points are summed up and grouped to calculate an index for every scale: Emotional symptoms – statements 3, 8, 13, 16, 24; Conduct problems – 5, 7, 12, 18, 22; Hyperactivity/inattention – 2, 10, 15, 21, 25; Peer problems – 6, 11, 14, 19, 23. The score summary value reflects the severity of the problems in a particular area for a particular adolescent. Besides, a resulting scale, the Total Difficulties Score, can be calculated by summing up the first four scaled scores. Separately, the Prosocial Behavior Score is calculated, based on the summary score of statements 1, 4, 9, 17 and 20. We used the Russian version of the questionnaire which can be freely downloaded from the developers' website <https://sdqinfo.org/>.

The psychometric characteristics of the questionnaires included in the study are presented in Table 1.

**Table 1.** Psychometric characteristics of the questionnaires included in the study.

| Questionnaire                                  | Cronbach's alpha | $\chi^2$<br>df, p   | CFI   | TLI   | RMSEA<br>(90% CI)      |
|--|------------------|---------------------|-------|-------|------------------------|
| Chen Internet Addiction Scale (CIAS)           | 0.909            | 5890<br>299, < .001 | 0.837 | 0.823 | 0.064<br>(0.063-0.066) |
| Game Addiction Scale for Adolescents (GASA)    | 0.917            | 688<br>14, < .001   | 0.968 | 0.952 | 0.103<br>(0.097-0.110) |
| Social Media Disorder Scale (SMDS)             | 0.679            | 464<br>27, < .001   | 0.898 | 0.865 | 0.060<br>(0.055-0.065) |
| Strengths and Difficulties Questionnaire (SDQ) | 0.656            | 8272<br>275, < .001 | 0.528 | 0.485 | 0.080<br>(0.079-0.081) |

Note: CFI – comparative fit index; TLI – Tucker–Lewis index; RMSEA – root means a square error of approximation; CI – confidence interval.

### 2.3. Statistical Analysis.

The statistical analysis of the results was performed using the IBM SPSS Statistics for Windows, v20.0 with the Statistical Package for the Social Sciences and AMOS 21.0 (IBM Corp, Armonk, NY). The confirmatory factor analysis was carried out in the statistical computing system R [31], the Lavaan package [32], implemented in the Jamovi graphical interface (ver. 2.0 [33]). The quality of the models' fit with empirical data was assessed using the following indicators:  $\chi^2$ , root mean square error of approximation (RMSEA), comparative fit index (CFI), Tucker-Lewis index (TLI). The association of different types of problematic internet use with relevant variables was assessed with the use of multiple regression analysis within structural equation modelling (SEM). The regression

coefficients were estimated while controlling all other predictors in the model. Odds ratios (ORs) were calculated by multiple logistic regression with adjustment for covariates. The strength of the relationship between the two variables was determined using Spearman's rank correlation coefficient ( $r$ ). The student's  $t$ -test was used to compare the quantitative data. The comparison of groups by the qualitative binary data was performed using the Pearson  $\chi^2$  test with Yates correction.

### 3. Results

#### 3.1. Descriptive statistics.

The original sample comprised 4838 students. After removing those who were not able to complete all sections of the questionnaire ( $n = 324$ , 6.7%), the sample comprised 4514 adolescents. Thus, the response rate in this study amounted to 93.3%.

The demographic characteristics of the sampled adolescents in the present study, along with the main descriptive statistics of the generalized and specific PIU parameters (PIUgen, PUgame and PUsocial) used in the research, as well as the mean SDQ scales values, are presented in Table 2. The mean age of the 4514 tested adolescents was  $14.52 \pm 1.52$  years, with the boy/girl ratio of 2,092 (46.4%) / 2422 (53.6%).

#### 3.2. Prevalence and age-sex depending content structure.

The prevalence of PIUgen, as estimated based on the CIAS questionnaire, was 7.2% of the total sample and was higher in the girls than in the boys (8.9% vs. 5.2%,  $p < 0.001$ ). The prevalence of PUgame, as estimated based on the GASA questionnaire results, was 10.4% of the total sample, being more than twofold higher in the boys compared to the girls (15.7% vs. 5.9%,  $p < 0.001$ ). The prevalence of PUsocial, as estimated based on the SMDS questionnaire, was 8.0% of the total sample, being more than three times higher in the girls compared to the boys (11.8% vs. 3.5%,  $p < 0.001$ ). Compared with the boys, the girls in our sample scored higher on the emotional symptoms and prosocial behaviour scales of SDQ (Table 2). Similar gender differences were described in other adolescent populations surveyed with the SDQ [29,34].

The age-specific characteristics of generalized and specific PIU (PIUgen, PUgame and PUsocial), with stratification by gender, are presented in Table 3. The boys showed no age differences in PIUgen prevalence (5.7% in 12-14 years old vs. 4.8% in 15-18 years old,  $p = 0.404$ ), whereas the prevalence of PIUgen in the girls increased with age (7.7% in 12-14 years-old vs. 10.1% in 15-18 years-old,  $p = 0.042$ ).

**Table 2.** Descriptive statistics for major study variables.

| Variables  | All participants | Boys          | Girls        | p (Boys vs. Girls) |
|--|------------------|---------------|--------------|--------------------|
| Age 12–14  | 2217             | 1003 (45.2%)  | 1214 (54.8%) | —                  |
| Age 15–18  | 2297             | 1089 (47.4 %) | 1208 (52.6%) | —                  |
| Total  | 4514             | 2092 (46.4%)  | 2422 (53.6%) | —                  |
| <b>City</b>  |                  |               |              |                    |
| Krasnoyarsk  | 2901             | 1327 (45.7%)  | 1574 (54.3%) | —                  |
| Abakan   | 1400             | 674 (48.1%)   | 726 (51.9%)  | —                  |
| Kyzyl  | 213              | 91 (42.7%)    | 122 (57.3%)  | —                  |
| <b>Ethnicity</b>   |                  |               |              |                    |
| Russians   | 3546             | 1656 (46.7%)  | 1890 (53.3%) | —                  |
| Khakass  | 164              | 66 (40.2%)    | 98 (59.8%)   | —                  |
| Tuvans   | 397              | 179 (45.1%)   | 218 (54.9%)  | —                  |
| Others   | 407              | 191 (46.9%)   | 216 (53.1%)  | —                  |
| <b>CIAS results (n = 4514)</b>   |                  |               |              |                    |
| Chen Internet addiction Scale (CIAS), score                              | 44.3±12.5        | 42.5±12.0     | 45.8±12.7    | 0.009              |
| Generalized problematic Internet use (PIUgen), CIAS score ≥ 65           | 324 (7.2%)       | 109 (5.2%)    | 215 (8.9%)   | <0.001             |
| <b>GASA results (n = 4514)</b>   |                  |               |              |                    |
| Game Addiction Scale for Adolescents (GASA), score                       | 9.6±6.7          | 12.1±6.03     | 7.5±6.3      | <0.001             |
| Problematic computer game use (PUgame), 4/7 GASA items endorsed          | 471 (10.4%)      | 329 (15.7%)   | 142 (5.9%)   | <0.001             |
| <b>SMDS results (n = 4514)</b>   |                  |               |              |                    |
| Social Media Disorder Scale (SMDS), score                                | 1.7±1.8          | 1.1±1.5       | 2.1±1.9      | <0.001             |
| Problematic social media use (PUsocial), 5/9 SMDS items endorsed         | 359 (8.0%)       | 73 (3.5%)     | 286 (11.8%)  | <0.001             |
| <b>Strengths and Difficulties Questionnaire (SDQ) results (n = 4514)</b> |                  |               |              |                    |
| Total difficulties score   | 11.4±5.4         | 10.4±5.2      | 12.3±5.4     | <0.001             |
| Emotional symptoms score   | 3.1±2.5          | 2.1±2.1       | 3.8±2.5      | <0.001             |
| Hyperactivity score  | 3.3±2.0          | 3.1±2.0       | 3.4±2.1      | <0.001             |
| Conduct problems score   | 2.3±1.5          | 2.3±1.5       | 2.3±1.5      | 0.955              |
| Peer problem score   | 2.8±1.8          | 2.8±1.8       | 2.8±1.8      | 0.687              |
| Prosocial behavior score   | 7.1±2.1          | 6.8±2.2       | 7.4±2.1      | <0.001             |

Note: Data are presented as n (%) and Mean ± SD. Pearson  $\chi^2$  test and Student's t – tests were used, respectively.

**Table 3.** Age-specific features of generalised and specific PIU with stratification by gender (n = 4514).

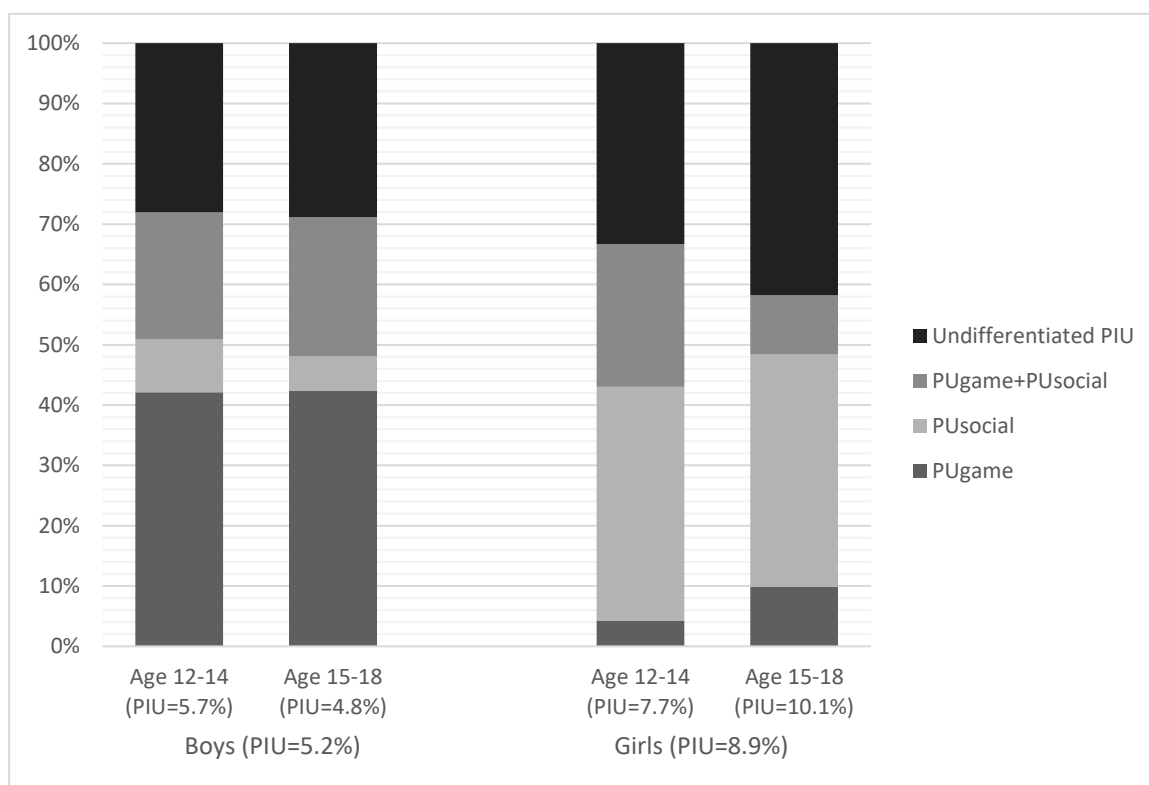
|   | Age 12–14     |                |                 |                            | Age 15–18     |                |                 |                            |
|---|---------------|----------------|-----------------|----------------------------|---------------|----------------|-----------------|----------------------------|
|   | All<br>n=2217 | Boys<br>n=1003 | Girls<br>n=1214 | p<br>(Boys vs. Girls)      | All<br>n=2297 | Boys<br>n=1089 | Girls<br>n=1208 | p<br>(Boys vs. Girls)      |
| Generalized problematic Internet use (PIUgen), CIAS score $\geq$ 65 | 150 (6.8%)    | 57 (5.7%)      | 93 (7.7%)       | 0.078<br>$\chi^2 = 3.1$    | 174 (7.6%)    | 52 (4.8%)      | 122 (10.1%)     | <0.001<br>$\chi^2 = 22.4$  |
| Game users (computer game playing during past month)                | 1795 (81.0%)  | 930 (92.7%)    | 865 (71.3%)     | <0.001<br>$\chi^2 = 162.9$ | 1809 (78.8%)  | 1089 (89.5%)   | 720 (59.6%)     | <0.001<br>$\chi^2 = 263.7$ |
| Problematic computer game use (PUgame), 4/7 GASA items endorsed     | 261 (11.8%)   | 174 (17.4%)    | 87 (7.2%)       | <0.001<br>$\chi^2 = 53.8$  | 210 (9.1%)    | 155 (14.2%)    | 55 (4.6%)       | <0.001<br>$\chi^2 = 63.5$  |
| Computer game addiction, 7/7 GASA items endorsed                    | 21 (1.0%)     | 11 (1.1%)      | 10 (0.8%)       | 0.660<br>$\chi^2 = 0.2$    | 27 (1.2%)     | 21 (1.9%)      | 6 (0.5%)        | 0.003<br>$\chi^2 = 8.9$    |
| Social media users (social media using during past year)            | 2112 (95.3%)  | 933 (93.0%)    | 1179 (97.1%)    | <0.001<br>$\chi^2 = 19.5$  | 2224 (96.8%)  | 1045 (96.0%)   | 1179 (97.6%)    | 0.034<br>$\chi^2 = 4.5$    |
| Problematic social media use (PUsocial), 5/9 SMDS items endorsed    | 214 (9.7%)    | 44 (4.4%)      | 170 (14.0%)     | <0.001<br>$\chi^2 = 57.1$  | 145 (6.3%)    | 29 (2.7%)      | 116 (9.6%)      | <0.001<br>$\chi^2 = 45.5$  |
| Social media addiction, 9/9 SMDS items endorsed                     | 10 (0.5%)     | 4 (0.4%)       | 6 (0.5%)        | 0.988<br>$\chi^2 < 0.1$    | 8 (0.4%)      | 3 (0.3%)       | 5 (0.4%)        | 0.836<br>$\chi^2 < 0.1$    |

The adolescents who played computer games within the month before the research were more numerous among the boys than the girls (91.6% vs. 65.4%,  $p < 0.001$ ). With age, the number of active computer game users decreased slightly among the boys (92.7% in 12-14 years old vs. 89.5% in 15-18 years old,  $p = 0.013$ ) and to a greater extent among the girls (71.3% in 12-14 years old vs. 59.6% in 15-18 years old,  $p < 0.001$ ). Consistently, the PUgame prevalence hardly decreased with age in the boys (17.4% in 12-14 years old vs. 14.2% in 15-18 years old,  $p = 0.058$ ) and was 1.5 times lower in older girls than in younger ones (7.2% in 12-14 years old vs. 4.6% in 15-18 years old,  $p = 0.008$ ). Interestingly, the relative number of adolescents with marked computer games addiction (7/7 GASA items endorsed) was almost identical in the boys and girls of the younger age group (1.1% vs. 0.8%,  $p = 0.660$ ) and 4 times higher in the boys of the older age group compared to the girls (1.9% vs. 0.5%,  $p = 0.003$ ).

Siberian adolescents, regardless of gender and age, are very active in using the social resource of the Internet: 93.0%-97.6% reported using social media over the year. The prevalence of PUsocial decreased with age in both the boys (4.4% in 12-14 years old vs. 2.7% in 15-18 years old,  $p = 0.043$ ) and the girls (14.0% in 12-14 years old vs. 9.6% in 15-18 years old,  $p = 0.001$ ). The relative number of adolescents with a strong social media dependence (9/9 SMDS items endorsed) was registered in the interval of 0.3-0.5%, not depending on gender or age (Table 3).

The content consumption structure among the adolescents with a positive CIAS test ( $\geq 65$ ), as a function of gender and age, is presented in Figure 1. It can be seen from the presented data that at least 60-70% of adolescents with PIUgen, according to the CIAS results, had PUgame, PUsocial or their combination. Whereas the content consumption structure remained virtually unchanged with age in the boys, the girls show a significant increase in the relative share of undifferentiated PIU with age (none-PUgame and none-PUsocial among CIAS positive – 2.6% in 12-14 year-old girls vs. 4.2% in 15-18 year-old girls,  $p = 0.003$ ).

Overlaps between PIUgen, PUgame and PUsocial are shown in Tables 4-6. Only a small proportion of adolescents demonstrated a combination of PIUgen traits with positive tests for PUgame (2.7%) and PUsocial (3.3%), as well as a combination of PUgame and PUsocial traits (2.4%). However, while the PIUgen+PUgame share accounted for only 26% of the entire group with PUgame, the PIUgen+PUsocial proportion accounted for as much as 41% of the entire group with PUsocial. Thus, PUsocial correlates more with the positive results confirming the presence of PIUgen as assessed by the CIAS questionnaire.



**Figure 1.** Content consumption patterns among adolescents with positive CIAS test ( $\geq 65$ ) by gender and age.

**Table 4.** Contingency table showing the overlap between generalized problematic Internet use (generalized PIU) and problematic computer game use (PUGame),  $n = 4514$ .

| Generalized Problematic Internet Use (generalized PIU) | Problematic computer game use (PUGame) |             |              |
|--|--|-------------|--------------|
|  | No                                     | Yes         | Total        |
| No   | 3839 (85.1%)                           | 351 (7.8%)  | 4190 (92.8%) |
| Yes  | 204 (4.5%)                             | 120 (2.7%)  | 324 (7.2%)   |
| Total  | 4043 (89.6%)                           | 471 (10.4%) | 4514 (100%)  |

**Table 5.** Contingency table showing the overlap between generalized problematic Internet use (generalized PIU) and problematic social media use (PUSocial),  $n = 4514$ .

| Generalized Problematic Internet Use<br>(generalized PIU) | Problematic social media use (PUsocial) |            |              |
|---|---|------------|--------------|
|   | No                                      | Yes        | Total        |
| No  | 3980 (88.2%)                            | 210 (4.6%) | 4190 (92.8%) |
| Yes   | 175 (3.9%)                              | 149 (3.3%) | 324 (7.2%)   |
| Total   | 4155 (92.1%)                            | 359 (7.9%) | 4514 (100%)  |

**Table 6.** Contingency table showing overlap between problematic computer game use (PUgame) and problematic social media use (PUsocial), n = 4514.

| Problematic computer game use<br>(PUgame) | Problematic social media use (PUsocial) |            |              |
|---|---|------------|--------------|
|   | No                                      | Yes        | Total        |
| No  | 3792 (84.0%)                            | 251 (5.6%) | 4043 (89.6%) |
| Yes                                       | 363 (8.0%)                              | 108 (2.4%) | 471 (10.4%)  |
| Total                                     | 4155 (92.0%)                            | 359 (8.0%) | 4514 (100%)  |

### 3.3. Comorbidity problematic Internet use with psychosocial problems.

#### 3.3.1. Logistic regression analysis.

The results of logistic regression analysis showed a high degree of PIU associated with adolescent psychosocial problems (Table 7). The highest association for all PIU detection questionnaires was found with the presence of emotional problems and hyperactivity. The highest degree of association was found for the CIAS questionnaire assessing PIUgen: OR = 3.65 (CI 2.89-4.64) for emotional symptoms and OR = 4.56 (CI 2.89-4.64) for hyperactivity. The same predictors were highly associated with the presence of PUsocial and – to a somewhat lesser extent – with the presence of PUgame (Table 7). The only factor that did not show any association with PIU was the low level of prosocial behaviour in the presence of PUsocial.

**Table 7.** Logistic regression estimates for generalized problematic Internet use (CIAS scale), problematic computer game use (GASA scale), and problematic social media use (SMDS scale) according to psychosocial problems evaluated with SDQ in Russian adolescents (crude and adjusted odds ratios, n = 4514).

|                                 | Generalized problematic Internet use (PIU) |                   |         | Problematic computer game use (PUgame) |                   |         | Problematic social media use (PUsocial) |                   |   |
|---------------------------------|--|-------------------|---------|--|-------------------|---------|---|-------------------|---|
|                                 | OR crude                                   | OR adjusted       | p       | OR crude                               | OR adjusted       | p       | OR crude                                | OR adjusted       | p   |
| Total difficulties              | 4.58<br>3.62-5.79                          | 4.47<br>3.52-5.67 | < 0.001 | 3.02<br>2.45-3.71                      | 3.79<br>3.05-4.71 | < 0.001 | 3.84<br>3.06-4.81                       | 3.48<br>2.76-4.38 | < 0.001                                       |
| Emotional symptoms              | 3.83<br>3.05-4.82                          | 3.65<br>2.89-4.64 | < 0.001 | 1.77<br>1.45-2.16                      | 2.89<br>2.32-3.60 | < 0.001 | 4.07<br>3.26-5.07                       | 3.31<br>2.63-4.16 | < 0.001                                       |
| Hyperactivity                   | 4.50<br>3.36-6.03                          | 4.56<br>3.38-6.13 | < 0.001 | 3.04<br>2.30-4.00                      | 3.55<br>2.66-4.75 | < 0.001 | 4.09<br>3.07-5.46                       | 3.90<br>2.89-5.24 | < 0.001                                       |
| Conduct problems                | 2.95<br>2.32-3.73                          | 3.10<br>2.44-3.94 | < 0.001 | 2.34<br>1.91-2.88                      | 2.34<br>1.90-2.90 | < 0.001 | 2.38<br>1.89-3.00                       | 2.44<br>1.93-3.09 | < 0.001                                       |
| Peer problem                    | 2.12<br>1.73-2.73                          | 2.17<br>1.73-2.73 | < 0.001 | 1.25<br>1.18-1.31                      | 1.25<br>1.19-1.32 | < 0.001 | 1.14<br>1.08-1.21                       | 1.14<br>1.08-1.21 | < 0.001                                       |
| Low level of prosocial behavior | 1.83<br>1.36-2.46                          | 1.97<br>1.46-2.67 | < 0.001 | 1.86<br>1.44-2.40                      | 1.71<br>1.32-2.22 | < 0.001 | 1.13<br>0.81-1.56                       | 1.33<br>0.95-1.85 | 0.476<br>(OR crude)<br>0.098<br>(OR adjusted) |

Note: ORs with 95% confident intervals are shown. Crude ORs were adjusted for sex, age, city (Krasnoyarsk, Abakan, Kyzyl), and ethnicity (Russians, Khakass, Tuvans, others).

### 3.3.2. Correlation analysis.

The correlation analysis results of explored psychometric characteristics are presented in Table 8. Like the results of logistic regression, the correlation analysis showed a high association of emotional symptoms and hyperactivity scales with the presence of PIUgen and PUsocial. At the same time, the presence of PUgame demonstrated a significantly lower Spearman's rank correlation coefficient with the CIAS scales which in no case exceeded the minimal level of association ( $> 0.3$ ). We also found no significant correlation between the total GASA scores and the CIAS scales ( $r = 0.292$ ,  $p < 0.001$ ) and SMDS ( $r = 0.159$ ,  $p < 0.001$ ).

### 3.3.3. Multiple regression analysis within structural equation modelling.

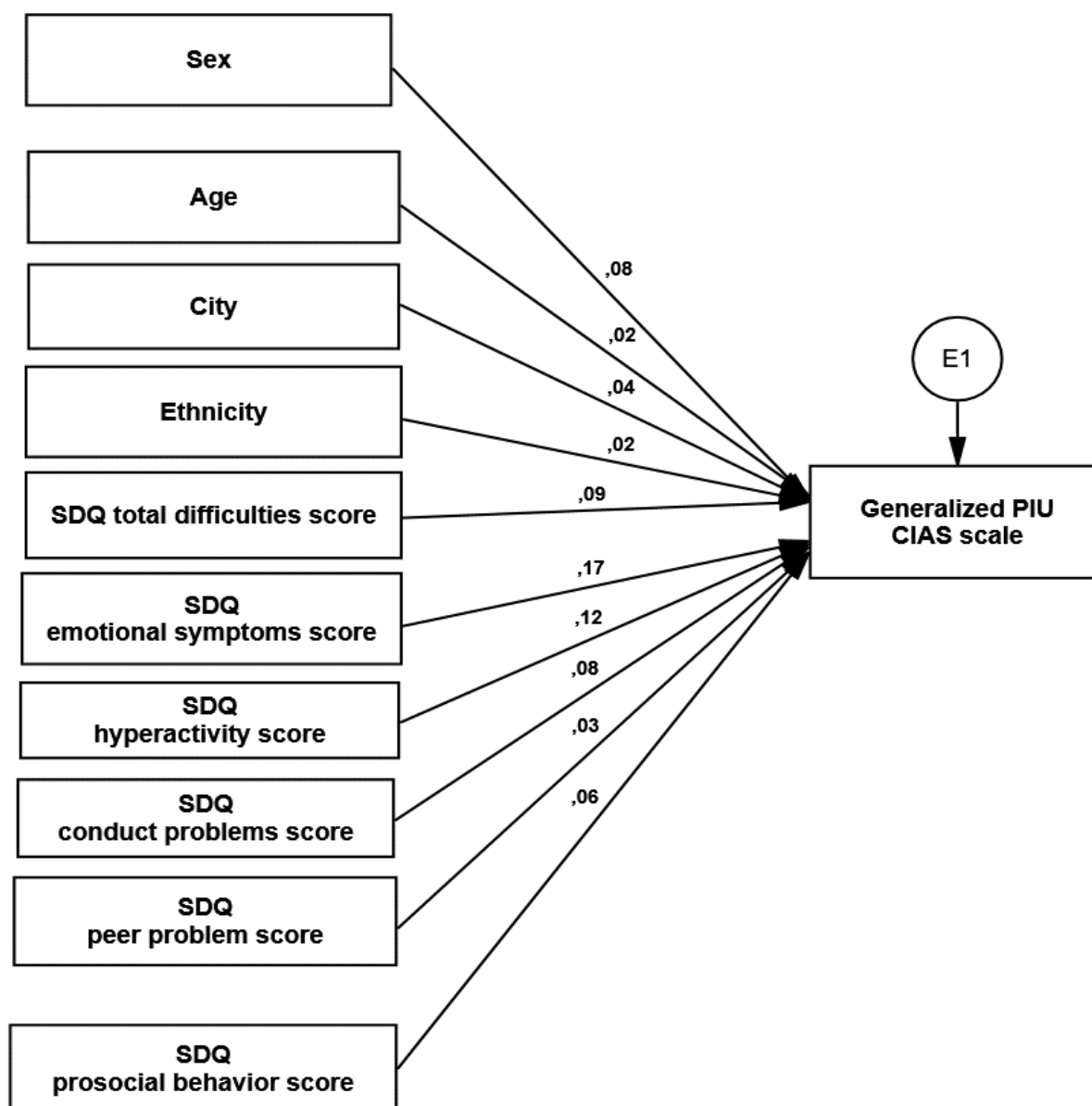
In order to compare the link of PIUgen, PUgame and PUsocial with relevant predictor variables, including demographic and psychosocial characteristics based on the SDQ, we undertook a separate multiple regression analysis within structural equation modelling (Figures 2-4). The results demonstrated evident distinct associations of certain predictor variables with the explored outcome variables. Thus, the male gender representatives showed a very high association with PUgame ( $\beta = -0.37$ ,  $p < 0.001$ ), whereas the female gender representatives demonstrated associations with PUsocial, although to a lesser extent ( $\beta = 0.22$ ,  $p < 0.001$ ). Age, city of residence and nationality of the adolescents showed a very weak association with all addiction scales.

Among the SDQ questionnaire scales, the greatest standardized effect was shown by the scales depicting the presence of emotional symptoms and hyperactivity for all outcome variables. Interestingly, the profile of psychosocial problems was extremely close in PIUgen and PUsocial, while PUgame was not. When analyzing the CIAS scale, the  $\beta$  effect strength was equal to 0.17 ( $p < 0.001$ ) for emotional symptoms and 0.12 ( $p < 0.001$ ) for hyperactivity, while as concerns the SMDS scale – 0.18 ( $p < 0.001$ ) and 0.10 ( $p < 0.001$ ) respectively. At the same time, when the GASA scale results were analyzed, the  $\beta$  coefficient was only 0.06 ( $p < 0.001$ ) for emotional symptoms and 0.05 ( $p < 0.001$ ) for hyperactivity; a nearly equivalent association with PUgame was demonstrated by conduct disorders and peer problems of 0.05 ( $p < 0.001$ ) and 0.04 ( $p < 0.001$ ) respectively. Thus, the associative links were largely similar for PIUgen and PUsocial, but quite different for PUgame.

**Table 8.** Correlation matrix of studied variables.

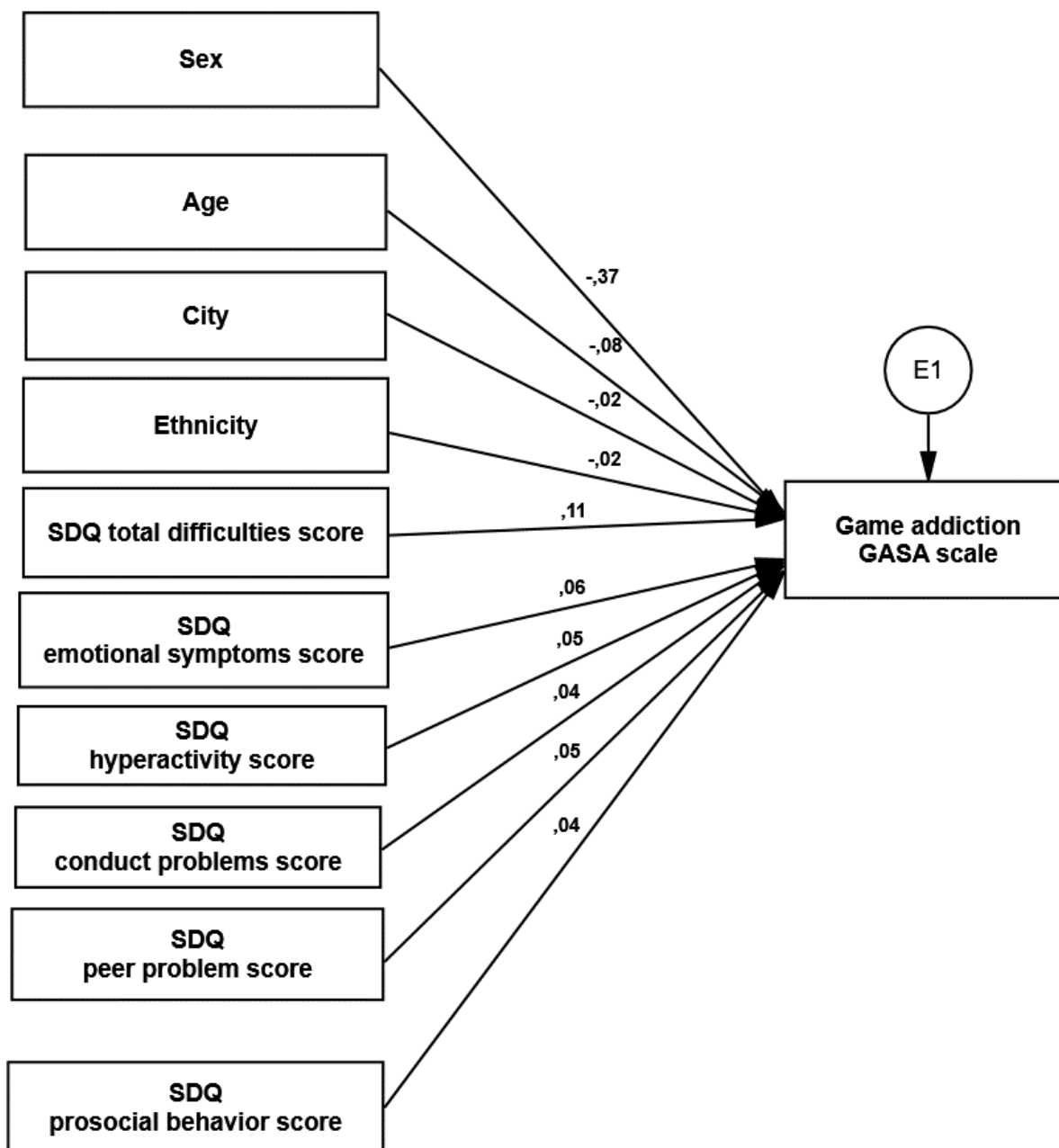
| Variables          | CIAS  | GASA  | SMDS         | Total difficulties | Emotional symptoms | Hyperactivity | Conduct problems | Peer problem | Prosocial behavior |
|--------------------|-------|-------|--------------|--------------------|--------------------|---------------|------------------|--------------|--------------------|
| CIAS               | –     |       |              |                    |                    |               |                  |              |                    |
| GASA               | 0.292 | –     |              |                    |                    |               |                  |              |                    |
| SMDS               | 0.592 | 0.159 | –            |                    |                    |               |                  |              |                    |
| Total difficulties | 0.430 | 0.181 | 0.367        | –                  |                    |               |                  |              |                    |
| Emotional symptoms | 0.376 | 0.043 | 0.370        | 0.767              | –                  |               |                  |              |                    |
| Hyperactivity      | 0.358 | 0.176 | 0.271        | 0.698              | 0.346              | –             |                  |              |                    |
| Conduct problems   | 0.234 | 0.161 | 0.194        | 0.597              | 0.270              | 0.364         | –                |              |                    |
| Peer problems      | 0.156 | 0.163 | 0.099        | 0.588              | 0.309              | 0.180         | 0.211            | –            |                    |
| Prosocial behavior | 0.088 | 0.134 | <u>0.023</u> | 0.174              | <u>0.007</u>       | 0.147         | 0.188            | 0.187        | –                  |

Note: All values are significant at  $p < 0.001$ , except for underlined values ( $p > 0.05$ ). Gray colour marks Spearman's rank correlation coefficient  $> 0.3$ .



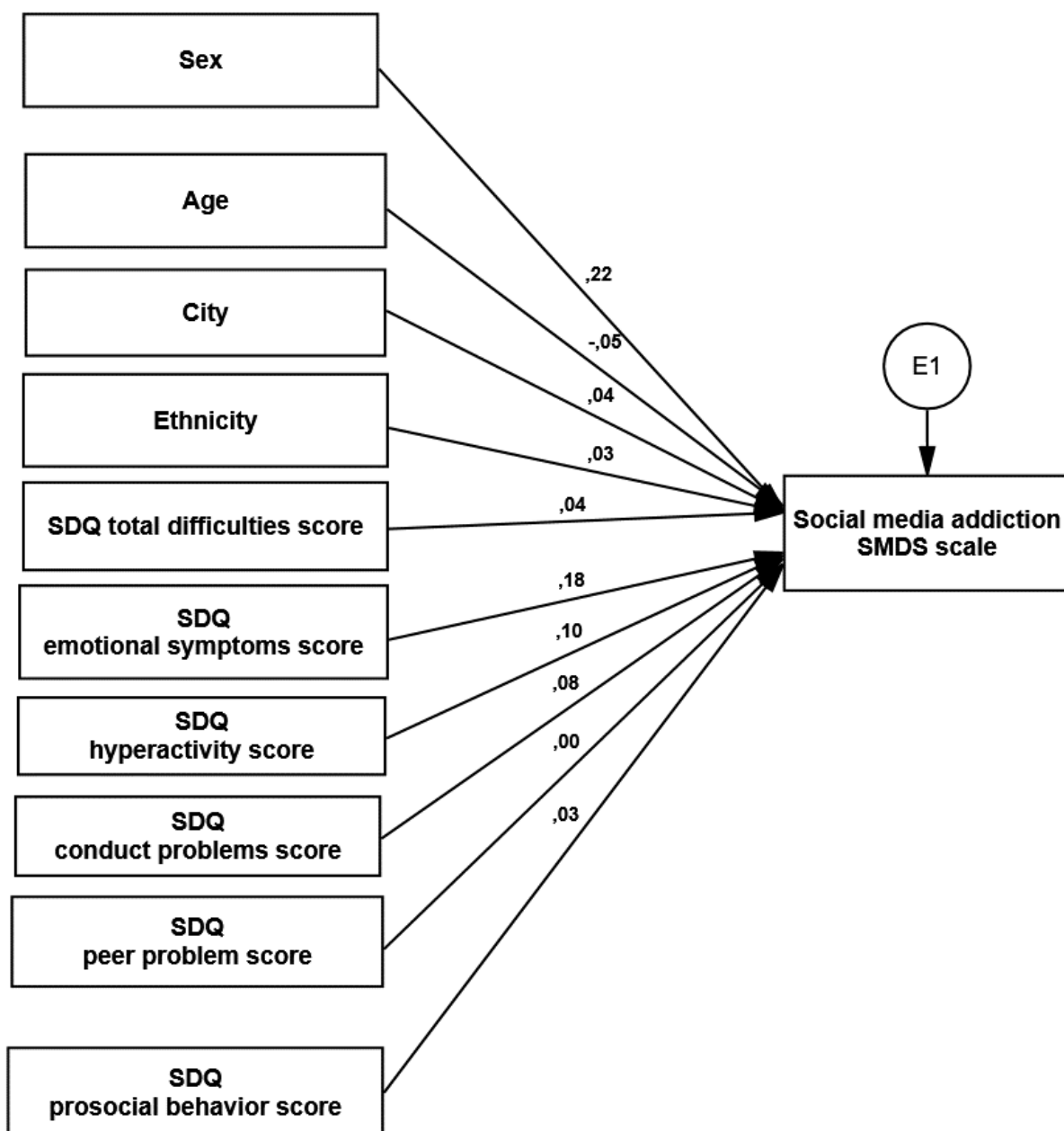
**Figure 2.** Multiple regression model for generalized problematic Internet use (PIUgen), n = 4514.

Note: Standardized regression weights are shown. Variables were coded as: boys – 1, girls – 2; age 2-14 – 1, age 15-18 – 2; City: Krasnoyarsk – 1, Abakan – 2, Kyzyl – 3; Ethnicity: Russians – 1, Khakass – 2, Tuvans – 3, Others – 4. Model fit parameters: CFI=0.985, TLI=0.965, RMSEA=0.029,  $p < 0.001$ .



**Figure 3.** Multiple regression model for problematic video game use (PUgame),  $n = 4514$ .

Note: Standardized regression weights are shown. Variables were coded as: boys – 1, girls – 2; age 2-14 – 1, age 15-18 – 2; City: Krasnoyarsk – 1, Abakan – 2, Kyzyl – 3; Ethnicity: Russians – 1, Khakass – 2, Tuvans – 3, Others – 4. Model fit parameters: CFI=0.986, TLI=0.966, RMSEA=0.029,  $p < 0.001$ .



**Figure 4.** Multiple regression model for problematic social media use (PU<sub>social</sub>), n = 4514.

Note: Note: Standardized regression weights are shown. Variables were coded as: boys – 1, girls – 2; age 2-14 – 1, age 15-18 – 2; City: Krasnoyarsk – 1, Abakan – 2, Kyzyl – 3; Ethnicity: Russians – 1, Khakass – 2, Tuvans – 3, Others – 4. Model fit parameters: CFI=0.986, TLI=0.966, RMSEA=0.029,  $p < 0.001$ .

#### 4. Discussion

The PIU prevalence figures for adolescents published globally vary depending on explored ethno-social groups and used diagnostic criteria and questionnaires, from 1% to 50% [1,7]. In Europe, for instance, the prevalence of PIU among adolescents is 1-11%, averaging 4.4% [8]. In contrast, the PIU prevalence in Asia (India, China, Japan, South Korea, Thailand, Taiwan) is much higher among adolescents and young adults, 7.9-49.4% [10,11,35,36]. The meta-analysis data on the prevalence of PIU among those under 25 in the Gulf countries (Bahrain, Iraq, Kuwait, Oman, Qatar, Saudi Arabia and the United Arab Emirates) also show high values of up to 33% [37]. One may conclude, based on recent major systematic reviews and meta-analysis data, that the global average prevalence of PIU in adolescents and young adults is about 5%, with some exceedance in Asia and North America [1,38-40].

Our data show that the overall prevalence of PIUgen among urban adolescents in Central Siberia is 7.2%, differing little from the global average prevalence of PIU (see above) and from the data previously obtained for the East Asian region with the CIAS questionnaire. For instance, a meta-analysis by Shao et al., using CIAS-based data from three studies of Chinese adolescents, calculated an average prevalence of PIUgen – 9.0% [41]. A recent CIAS testing of 8,098 Chinese students aged 17-25 also showed similar figures on the prevalence of PIUgen – 7.7% [42].

In our sample, the PIUgen prevalence, as assessed by the CIAS questionnaire, was higher in the girls than in the boys, which is somewhat contrary to the findings of other studies – a meta-analysis by Wenliang et al. showed that males have a higher propensity for Internet addiction than females [43]. However, this proportion is not universal. As shown by the aforementioned study by Shen et al. based on the CIAS questionnaire, the frequency of PIUgen was slightly higher in girls than in boys (8.2% vs. 7.2%,  $p = 0.11$ ) [42]. A higher prevalence of Internet addiction in the Gulf countries was found in women compared with men (48% vs. 24%,  $p = 0.05$ ) [37]. Finally, a recent CIAS-based Russian testing of adolescents in the Ural also found a higher prevalence of PIUgen in girls compared to boys [31].

We hypothesise that the socio-cultural characteristics of the target population, which determine the predominantly consumed Internet content, can play a significant role in the gender distribution of adolescents with generalised PIU. Possibly, the gender differences we have identified are related to gender specifics of content consumption in Siberian adolescents: the girls showed threefold-intensity social media addiction, whereas the boys demonstrated two times more intense gaming addiction (Table 2). Since, as shown below, the CIAS questionnaire, designed to identify generalised Internet addiction that is undifferentiated in content, correlates more with social media addiction, the gender distribution of PIUgen prevalence identified in our study has an obvious logical justification.

As shown in a systematic review by Mihara and Higuchi [44], PUgame prevalence ranges from 0.7% to 27.5% and, like generalised PIU, is highly dependent on the used questionnaires and evaluative dependence criteria. Like the case of generalised PIU, the prevalence of PUgame shows a higher prevalence in Asian countries compared to other regions [45]. As shown by our sample, 79.8% of adolescents played computer games during the month before the review, 10.4% were categorised as PUgame adherents (4/7 GASA items endorsed) and 1.1% were characterised as having computer game addiction (7/7 GASA items endorsed; Table 3). Our results are close to those obtained by the authors of GASA questionnaire for a Dutch adolescent sample (9.3-9.4% in terms of the first mode of assessment and 0.55-0.65% for the second evaluative method) [25], being as well much similar to other population-based studies using GASA in adolescent samples from Hong Kong [46], Finland [46] and Norway [47,48]. Like in most other studies [44], the prevalence of PUgame in our sample was significantly higher in the boys when compared to the girls ( $p < 0.001$ , Table 2).

According to our data, the prevalence of PUsocial among Siberian adolescents was 8.0%, which is not practically different from the prevalence data obtained by the authors

of the SMDS questionnaire for a Dutch teenage cohort (7.3-11.6) [26], as well as other works using the SMDS: a Dutch sample in a longitudinal study (9.9-10.0%) [49], a representative sample of 3,408 Finnish adolescents – 9.4% [50]. However, the SMDS results for the representative sample of German adolescents ( $n = 1001$ ) were much lower, with a prevalence of 2.6% [51]. Interestingly, the same study also reported a significantly lower prevalence of PUgame (3.5%) compared with our data. This essential distinction may be explained by significant differences in data collection methodology – the German researchers used a telephone survey and some specific methods to ensure population representativity over a wide socio-geographic range, whereas our research was based on a school survey of adolescents having similar social characteristics. Interestingly, other studies providing representativity also identified significantly lower prevalence rates of PUgame and PUsocial compared with convenience sampling [52,53]. A recent systematic review by Cheng et al. [57] showed high heterogeneity in PUsocial prevalence within 5-26%: the major modifying factors comprised the addiction classification method (monothetic/polythetic models and cut-offs) and geographic/cultural factors. The highest prevalence rates of PUsocial are registered in collectivist nations within Asian and African countries [54]. The average PUsocial prevalence in 29 European countries was 7.4% [55].

In our sample of Siberian adolescents, the girls were significantly more likely to meet the criteria of PUsocial presence. At the same time, the aforementioned studies of Dutch adolescents did not find any correlation between the prevalence of PUsocial and gender [26,49]. However, the data presented in several studies correlate with our findings: the PUsocial prevalence in girls was also found in German [51], Hungarian [53], Finnish [50], South Korean [37] adolescents, as well as in Spanish 17-25-year-olds [56]. Interestingly, gender differences in content consumption persist into adulthood: a survey of 23,533 adults in Norway showed PUgame association with males and PUsocial with females [57].

As to age-related dynamics of addiction, our data showed that the prevalence of PUgame decreased weakly with age in the boys ( $p = 0.058$ ) and lowered significantly in the girls ( $p = 0.008$ ). The prevalence of PUsocial decreased with age in both the boys ( $p = 0.043$ ) and the girls ( $p = 0.001$ ). A higher prevalence of PUsocial (but not PUgame) in younger learners, compared to the older ones, was also shown in a recent survey of German schoolchildren [51]. The same, but less pronounced tendency was demonstrated in a recent study of a representative sample of German adolescents [21].

These facts may indicate a low degree of symptom stability and remission in a significant proportion of adolescents. Since our study is not longitudinal and representative research, our data on age-related dynamics of generalised and specific PIU should be interpreted with a certain caution. However, some longitudinal studies undertaken for other populations show similar dynamics – the prevalence of PIU decreases slightly with age, although longitudinal stability for PUgame in adolescence can be quite high, while the remission rate may be low [44,45]. The findings on the natural course and stability of PIU symptoms are very important. This was emphasised by a research team that developed the PUgame diagnostic criteria for DSM-5 [58]. If the core symptoms of generalised and specific PIU are transient and have a self-repairing nature, these conditions should not be treated as a separate clinical area. We deem that the introduction of an additional criterion for Internet addiction in adolescents is worth discussing – stability of symptoms, e.g., within 3 years, to establish a clinical diagnosis. In the absence of this criterion and the presence of other symptoms, adolescents should be classified as an at-risk group, without a definite clinical addiction diagnosis, in order to avoid psychiatric stigmatization.

In our opinion, the data on PIU structure age dynamics, presented in Figure 1, seems to be quite interesting. As to the boys, we recorded a fairly stable structure not changing within the age interval 12-18. At the same time, the share of PIU not differentiated in this research (non-PUgame and non-PUsocial PIU) increased in the girls significantly with age. At present, we cannot judge definitely on older girls' change of interests – into which area of Internet activity they are shifting. These can represent online chatting, consumption of audio and video content available exclusively on the Internet, online shopping, permanent news search in fear of missing out, compulsive little-minded Internet surfing,

use of the Internet for educational purposes, or a combination of the above. This unresolved issue should be a subject of further research.

The analysis of psychosocial problems in adolescents with PIU showed that the major identified association involved the presence of emotional problems, which may be, to a certain extent, due to the presence of anxiety-depressive disorders as well as hyperactivity problems, which may indicate that some adolescents have ADHD. Our findings are consistent with those of numerous other studies, both involving the SDQ questionnaire [42,59,60] and based on generalised analysis [45,61]. It is currently unknown whether anxiety-depressive disorders and ADHD are precedents of PIU or whether the symptoms appear or increase as a result of excessive use of the Internet – or whether we are dealing with a bilateral influence. Independent comorbidity with the influence of certain common risk factors provoking these disorders is not excluded as well. In order to clarify these issues, representative longitudinal research of different populations and age-sex groups, including content consumption, is essential.

Interestingly, low levels of prosocial behaviour seemed to be characteristic of PIUgen and PUgame, excluding PUsocial, which may testify to greater socialisation and empathy of adolescents actively engaged in social media activities. Similar results were also obtained in a recent study by Sümen & Evgin [60].

The results of structural equation modelling (SEM), the same as our data derived from logistic regression and correlation, suggest two patterns of psychosocial problems in the case of PIU – the first one characteristic of both PIUgen and PUsocial and the second one, significantly different – of PUgame.

The relationship between PIUgen and PUgame has been hotly debated in the literature in recent years: most experts believe that these are conceptually distinct psychological constructs [19,20]. Our data, like the data of other empirical studies, support this view. For instance, Király et al. convincingly showed the conceptual differences between PIUgen and PUgame and supported the need for a differentiated approach to these disorders [62]. The same data were obtained in the course of analysis of PIUgen and PUgame in medical school students; the authors believe that PUgame cannot be regarded as a subtype of PIUgen [63].

Moreover, our data, along with the data of other numerous research, point not only to conceptual differences between PUgame and PUsocial but also to the fact that the existing questionnaires identifying PIUgen are significantly more correlated with social network addiction rather than computer game addiction. For instance, Montag et al. demonstrated in their analysis of pooled data for young adult populations in Germany, Sweden, Taiwan and China that it is PUsocial, but not PUgame, that is associated with PIUgen [22]. Lopez-Fernandez, in a simultaneous survey of a sample of Belgian adults in respect of PIUgen, PUgame and PUsocial, obtained results completely similar to ours: PIUgen showed a strong association with PUsocial and a weak association with PUgame, both specific PIU types being independent of each other [23]. Andreassen et al., in their analysis of the association of different types of PIU with psychiatric disorders (ADHD, obsessive-compulsive disorder and anxiety disorder) in adults, also showed greater correlation values for PUsocial compared to PUgame, although depressive disorder was more specific of PUgame [57]. As shown by Wartberg et al., clinically significant depression in an adolescent population of German schoolchildren was identified in 34.6 % of cases with PUsocial and only in 14.3 % of cases with PUgame [51]. However, contrasting empirical evidence exists as well. For instance, a recent analysis of a representative sample of German adolescents showed no difference in the incidence of psychosocial problems between the PUgame and PUsocial groups, which is explained by the high prevalence of recently embedded gaming content in social networks, as viewed by the authors [21]. No significant differences were found in the frequency of anxiety and depression between the PUgame and PUsocial groups and in a study of English teenagers [64].

Although there are some inconsistencies in the empirical data, we believe that our findings, as well as the data of other researchers, support the concept of rejecting the term

PIU as a single psychological construct. Future research efforts should focus on studying specific forms of adolescents' addictive online behaviour.

This study has some limitations. The research was not anonymous; the questionnaires were completed not individually but in class groups. The research design was based on voluntary consent. It can be assumed that some adolescents with psychological problems might have been not truthful enough to answer the questions and/or could have avoided the survey explicitly or implicitly. This may be a consequence of social desirability, consent and memory recall biases that characterise many psychological studies involving voluntary self-administered questionnaires [65-68]. Secondly, the study was not a longitudinal one, which makes it impossible to assess the stability of symptoms and content structure with age. Finally, we did not assess the type of user devices (desktop computers/smartphones), technologies (e.g., a possible crossover between PUgame and PUsocial in games using active social communication), specific games and social networks.

## 5. Conclusions

The prevalence of generalized PIU among adolescents in Central Siberia, as assessed by the CIAS questionnaire, made a figure of 7.2%; the prevalence of PUgame assessed by the GASA questionnaire was 10.4%; the prevalence of PUsocial assessed by the SMDS questionnaire was 8.0%. Several significant gender differences in specific types of PIU were identified: predominance of gaming addiction among the boys and social networking addiction among the girls. According to the above indicators, urban adolescents in Central Siberia did not differ significantly from their peers from Asian and European countries. However, unlike the situation in most other countries, the prevalence of generalized PIU was higher among Russian girls compared to the boys.

Whereas the boys aged 12-18 showed no significant changes in the overall prevalence of PIU and content consumption patterns, the girls showed an increase in the relative prevalence of undifferentiated content consumption unrelated to computer games and social media addiction, along with an increasing prevalence of PIUgen with age.

The results of structural equation modelling (SEM), as well as the data of logistic regression and correlation analysis, suggest the presence of two possible patterns of psychosocial problems in PIU: the first – characteristic of both PIUgen and PUsocial, and the second, significantly different – of PUgame. In terms of psychological construct, PUgame and PUsocial appear to be distinct nosological entities. PUgame should be regarded as a subtype of general gaming addiction, possibly, with some features of problem gambling. At the same time, social networking addiction may show signs of a "fear of missing out" disorder and also be a cause or a consequence of more general anxiety and depression disorders.

Given the main findings of the present study, the identified different types of addictive online behaviour had a low degree of intercorrelation in terms of age-gender and psychological characteristics. This fact suggests that the concept of generalized Internet addiction (undifferentiated by content) has insignificant justification, while the term "Internet addiction" can be misused and misinterpreted in this regard [19,20]. Additional research is needed for better identification of commonalities and differences in different types of addictive online behaviour in the context of consumed content, used devices and technologies (desktop computers, tablets, smartphones), and changes in addiction over time (stability of symptoms, the possibility of remission and relapse). It is extremely important to carry out future research with the use of representative sampling and longitudinal design.

**Author Contributions:** Conceptualization, Sergey Tereshchenko, Edward Kasparov and Nadezhda Semenova; Data curation, Margarita Shubina; Funding acquisition, Sergey Tereshchenko; Investigation, Margarita Shubina, Nina Gorbacheva, Ivan Novitckii, Olga Moskalenko and Ludmila

Lapteva; Project administration, Sergey Tereshchenko; Writing – original draft, Sergey Tereshchenko; Writing – review & editing, Sergey Tereshchenko.

**Funding:** The work was carried out within the framework of the state budgetary theme 121022600087-7 for Federal Research Center “Krasnoyarsk Science Center of the Siberian Branch of the Russian Academy of Sciences”, Research Institute of Medical Problems of the North, Krasnoyarsk, Russia.

**Institutional Review Board Statement:** The study was approved by the Ethics Committee of the Federal Research Center “Krasnoyarsk Science Center of the Siberian Branch of the Russian Academy of Sciences”.

**Informed Consent Statement:** Informed consent was obtained from all subjects involved in the study.

**Data Availability Statement:** The datasets generated for this study are available on request to the corresponding author.

**Acknowledgments:** Authors would like to express our very great appreciation to Dr Elena Bronnikova for her valuable and constructive suggestions during the planning and development of this research work. Her willingness to give her time so generously has been very much appreciated.

**Conflicts of Interest:** The authors declare no conflict of interest.

#### Abbreviations:

|          |  |
|----------|--|
| PIU      | problematic Internet use                     |
| PIUgen   | generalized problematic Internet use         |
| PUgame   | problematic video game use                   |
| PUsocial | problematic social media use                 |
| ADHD     | attention deficit hyperactivity disorder     |
| CIAS     | Chen Internet Addiction Scale                |
| GASA     | Game Addiction Scale for Adolescents         |
| SMDS     | The Social Media Disorder Scale              |
| SDQ      | The Strengths and Difficulties Questionnaire |
| RMSEA    | root mean square error of approximation      |
| CFI      | comparative fit index                        |
| TLI      | Tucker-Lewis index                           |
| SEM      | structural equation modelling                |
| OR       | odds ratio                                   |

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