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FULL-LENGTH REPORT



How have excessive electronics devices and Internet uses been concerned? Implications for global research agenda from a bibliometric analysis

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ABSTRACT

Background and aims: Excessive use of electronic devices has become a major global problem. However, little is known about the development and current landscape of research concerning this field. This study aimed at exploring the overall publication trend and topics of research on the overuse of electronic devices and the Internet from 1971 to 2017. *Methods:* We systematically searched the Web of Science (WoS) and Scopus databases for published articles on the excessive use of electronic devices and the Internet. Data regarding the publication volume, international collaborations, and geographical locations were analyzed by bibliometrics analysis. Latent Dirichlet Allocation (LDA) was undertaken to categorize publications into different research topics. *Results:* A total of 2,276 papers from the WOS and 600 papers from the Scopus were included. We found a dramatic increase in the number of scientific papers towards addiction to electronic devices and the Internet. The United State led in all publication parameters including the total number of papers and total citations. China, Korea and Taiwan were among the most prolific countries/regions. Smartphone addiction was the main concern, and the relationship between the overuse of electronic devices and the Internet and mental health issues have been highlighted. On the other hand, our study found a limited appearance of discussion on effective treatment and intervention. *Discussion and Conclusion:* The findings of this study call for more national and international cooperation in evaluating and intervening addiction to electronic devices and the Internet to gather more knowledge about this phenomenon and evaluate the effectiveness of treatment.

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KEYWORDS

bibliometrics, PIU, Internet addiction, gambling disorder, gaming disorder, text mining

INTRODUCTION

The drastic advancement of the Internet has dramatically changed the lives of people worldwide in both positive and negative ways. With over 2.5 billion users estimated by the end of 2019 (Statista), the Internet has undeniably significant role in everyday life (Deetjen & Powell, 2016; Jung et al., 2014); however, it has also led to issues that have not existed before the era of the Internet, such as excessive Internet use or electric-related addictions. Problematic Internet use (PIU) has been documented as a common phenomenon in both developed and developing countries, causing health and social problems. Previous studies conducted in some European countries have found the prevalence of PIU to be between 0.7%, and 18.3% (Bakken, Wenzel, Gotestam, Johansson, & Oren, 2009; Billieux et al., 2013). In Asia, the prevalence of PIU was reported to vary from 2% to 21.2% (Ha et al., 2006; Ko et al., 2005; Mak et al., 2014; Mythily, Qiu, & Winslow, 2008; Tran et al., 2017; Wu, Chen, Tong, Yu, & Lau, 2018). A recent study by Cheng et al. in 2014 showed the varying prevalence of PIU in 31 countries across regions: 8.0% in the United States, 7.1% in Asian countries, and 10.9% in the Middle East countries (Cheng & Li, 2014). Existing literature has also provided evidence indicating that age and gender did not account for the high heterogeneity in the prevalence of PIU (Zhang, Lim, Lee, & Ho, 2018).

The kind of activity that can be classified as excessive or pathological use of computers and the Internet has been the topic of discussion in the last few decades, along with the development of computers and the Internet. In the United States, the first publication on the topic was by Young et al. in 1996 which reported as a case of a woman with email addiction (Young, 1996), followed by the first seminar on Internet Addiction (Young, 1998). In Europe, Griffiths (1995) first described “technological addiction” as a “non-chemical addiction involving human-machine interaction”, followed by a general paper on the Internet and Internet gambling addiction (Griffiths, 1995, 1996). In 1980, pathological gambling was first added to the *Diagnostic and Statistical Manual of Mental Disorders (DSM)*, which was classified as an impulse control disorder. After that, in *DSM-V* in 2015, pathological gambling was renamed to the “Gambling disorder”, and re-classified as “Substance-Related and Addictive Disorders” (Rennert et al., 2014).

In this study, we used the definition and diagnosis of the *International Classification of Diseases (ICD-11)*, which includes gambling disorder (pathological gambling in *ICD-10*) and gaming disorder as two diagnostic categories (Fauth-Bühler, Mann, & Potenza, 2017). The inclusion of gaming disorder in the *ICD-11* and the *DSM-5* has raised

some arguments. A number of researchers call for exclusion due to, among other reasons, the lack of general agreement regarding the symptoms or predictions of the health issue (Aarseth et al., 2017) that makes it insufficient to be regarded as a mental health disorder (Dullur & Starcevic, 2018). On the other hand, some supported the inclusion (Griffiths, Király, Pontes, & Demetrovics, 2015; Griffiths et al., 2016; King, Delfabbro, Doh, et al., 2018a; King, Delfabbro, Potenza, et al., 2018b; Kiraly & Demetrovics, 2017). Thus, the inclusion of GD in *ICD* and *DSM* could be considered a common starting point for researchers in upcoming research and monitoring (Király & Demetrovics, 2017).

Despite having received seemingly significant attention, PIU has yet to have a formal definition that was agreed among academia. To date, a range of different definitions has been given to this phenomenon, notably compulsive computer use (Black, Belsare, & Schlosser, 1999), Internet dependency (Sherer, 1997), pathological Internet use (Davis, 2001), and Internet addiction (Young, 1998). Shapira et al. characterized PIU as an inability to control Internet use (Shapira et al., 2003), while Black et al. indicated that compulsive computer use meant psychiatric illness (Black et al., 1999). Davis (2001) proposes a theoretical cognitive and behavioral model of pathological Internet use (PIU), identifying the PIU into two categories: Generalized Problematic Internet Use (GPIU) and Specific Problematic Internet Use (SPIU) (Davis, 2001). Alternatively, Young (1999) divided PIU into five subtypes: cyber-sexual addiction, cyber-relationship addiction, net compulsions, information overload, and computer addiction (Young, 1999).

Literature highlighted that excessive Internet use could lead to a range of psychiatric disorder including attention-deficit/hyperactivity disorder (ADHD) (Yen et al., 2017), conduct problems (El Asam, Samara, & Terry, 2019), borderline personality disorder (Lu et al., 2017), impulsivity (Zhang et al., 2015), generalized anxiety disorder (Wang et al., 2017), social anxiety (Ko, Yen, Yen, Chen, & Chen, 2012), premenstrual dysmorphic disorder (Ko et al., 2014), anhedonia (Guillot et al., 2016), depression (Chou et al., 2015), suicidality (Harris, Starcevic, Ma, Zhang, & Aboujaoude, 2017; Lin et al., 2014) and lifestyle problems such as sleeping disturbance (Park et al., 2018; Zhang et al., 2017), harmful alcohol use (Ko et al., 2009), decreased time spent on exercising (Dang et al., 2018; Kojima et al., 2019) and schizophrenia (Lee et al., 2018).

Several systematic reviews and meta-analyses have been conducted in the field of Internet addiction and problematic Internet use (Anderson, Steen, & Stavropoulos, 2017; Breslau, Aharoni, Pedersen, & Miller, 2015; Kuss & Lopez-Fernandez, 2016). Although these studies provided insights into treatment to people with Internet-addictions and Internet Gaming Disorder (Kuss & Lopez-Fernandez, 2016) or PIU behaviors among adolescents (Anderson et al., 2017), their focuses were on specific topics without allowing for comparison between papers of different topics and over time. Meanwhile, when attempting to obtain a broad view of research development concerning certain topics, researchers



have generally adopted bibliometrics analytic. The limitation of bibliometrics, however, has been in its lack of power to discover the landscape of research topics hidden in the publications. In this study, we attempted to overcome such limitations by combining bibliometrics and text mining (of titles and abstracts) of publications on the overuse of electronic devices and the Internet. Findings of this study can potentially support the development of the research agenda in this field, policy formulation and the design and implementation of prevention approaches for PIU from an international perspective (King, Delfabbro, Doh, et al., 2018a).

METHODS

Data source

We obtained research publications focused on all forms of addiction involving the Internet and electronics. The Web of Science (WOS) and Scopus are the two most massive databases with various research fields (Guz & Rushchitsky, 2009). Meanwhile, PubMed covers mostly biomedical literature (Kokol & Vošner, 2018), PsycINFO focuses on behavioral science and mental health (EBSCO). In this kind of study, we wanted to explore the excessive use of electronic devices and the Internet in all research areas. Therefore, we decided to collect data from the two online databases: WOS and Scopus. Our aims are 1) focusing on all forms of electronic and Internet addiction published from inception to December 31st, 2017 in a peer-reviewed journal; and 2) comparing the results of the same set of keywords between the two databases. The searching process was conducted in August 2018, thus, we decided to exclude the 2018 articles because any capture from that period forward would include incomplete bibliometric data for that year. We did not include gray literature, conference proceedings, or books/book chapters in our analysis. For filter processing, articles written in any language other than English were excluded.

Search strategy

First, the literature from the WOS and Scopus were retrieved using a developed set of search terms, focused on five subtypes of Internet addiction: 1) Cybersex Addiction, 2) Cyber Relationships, 3) Computer Addiction (Game online addiction), 4) Net compulsion, 5) Informational overload. Besides, to qualify other types of addiction related to electronic devices, we applied in our search query 6) Mobile phone overuse, 7) Game machine addict, 8) Gambling machine addiction. Synonyms for search terms were designed by our team. The following search terms were combined with the above keywords, and their synonyms: “excessive”, “problematic”, “compulsive”, and “addictive” (see Tables S1 and S2 Supplementary).

Secondly, we excluded 1) articles published on January 1st, 2018 onwards, 2) unrelated document types, such as book chapters, and conference proceedings, 3) items with anonymous authors in WOS or “undefined” fields in subject

areas, country field, or author field in Scopus and 4) studies written in any language other than English.

After running our search with the above criteria, we downloaded 2,732 papers from WOS and 614 papers from Scopus. Two team members read the abstract, and keywords to filter the unrelated documents. The two other team members verified the data to minimize the errors. All potential discrepancies were resolved via discussion.

After filtering, 2,276 papers from WOS and 600 papers from Scopus were downloaded for further analysis. Each article included the following information: document title, authors, author address, publication year, author keywords, research area, source title, and times of citation. All the data were downloaded in text format and stored in MS Microsoft Excel (see Figs. S1 and S2 Supplementary).

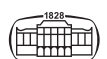
Bibliometric analysis

We performed this bibliometric analysis by using the bibliometric package in R (Aria & Cuccurullo, 2017). The metadata in the WOS and Scopus was used to calculate and rank authors' articles, country production and collaborations, and journal publication.

Country production in R was defined by the corresponding author's country. The number of publications was used as an indicator of research productivity. For author production, we applied the number of papers and h-index to identify the contribution of that author to the research field (Opthof & Wilde, 2009). In the case of collaborative papers, we applied full counting for the geographical distribution of citations and country collaborations network (Perianes-Rodriguez, Waltman, & van Eck, 2016).

The general characteristic of the dataset including journals, countries distributions, and author keywords identified the changes in the research trend of this topic.

Visualization, which might be labeled as a part of visual analytics, has been considered “a new research discipline” in the last 20 years. For the large volumes of data such as bibliographic data, visualization is an effective way to analyze information from the abstracts and help the analysts to make decisions based on the data (Yu & Hayes, 2018). We then visualized the collaboration of the most productive countries using VOSviewer software (<http://www.vosviewer.com/>) to 1) create visualization maps representing the contributions, and collaboration efforts of countries in the two databases, and 2) visually describe research efforts directed towards interrelated research subjects by mapping out terms in the title and abstracts. In the country cooperation network, the closer two countries are located to each other, the stronger their collaboration. In the network visualization, items are represented by their label and by a circle. The size of the label and the circle of an item is determined by the weight of the item. The higher the weight of an item, the larger the label and the circle of the item. The technique using for constructing co-occurrence networks of terms extracted from title and abstracts of publications can be found elsewhere (van Eck & Waltman, 2011; van Eck, Waltman, Dekker, & van den Berg, 2010).



Analysis of abstracts/titles

To discover the hidden terms in the titles and abstracts, we applied a text-mining tool: topic modeling technique. Specifically, we chose Latent Dirichlet allocation (LDA) which is one of the most widely used and helpful methods to classify papers into similar topics (Chen et al., 2017; Li, Rapkin, Atkinson, Schofield, & Bochner, 2019; Valle, Albuquerque, Zhao, Barberan, & Fletcher Jr, 2018; Wang, Joo, & Lu, 2014). LDA used a probabilistic model of the text data and groups different documents into topics. Since authors would use similar words for a same topic, LDA would use co-occurrences of words to identify each topic as a probability distribution over words (Schwarz, 2018).

We decided to visualize data (title, and abstracts) using VOSviewer, a distance-based visualization of bibliometric networks, to explore high-quality information. Visualizing networks has received attention from scientists. It has been a powerful method to identify the hidden topics of a large dataset (Van Eck & Waltman, 2014). The papers were then classified into four research areas: co-comorbidity; methods used to identify Internet addiction prevalence; the impact of IA and the treatment; the main subject of studies.

LDA has been considered a productive technique for modeling text data, including research articles (Jelodar et al., 2019). Besides, the text mining function of VOSviewer, which here we applied to titles and abstracts of the selected publication, offers a powerful approach to analyze and visualize topic mapping scientific literature (Van Eck & Waltman, 2014). While VOSviewer evaluates the co-occurrence of the terms to conduct the clusters for a quick and clear overview of the research topics, LDA provides a deeper analysis of the terms' meaning and categorizes the papers into different groups of research topics (Van Eck & Waltman, 2014). In order to cross-check and confirm the results of the two methods as well as demonstrate a multi-level analysis for the research terms, both techniques were used in this study.

RESULTS

The quantity of literature and the growth trend

Fig. 1 summarizes characteristics of the research output of the current excessive use of electronic devices and the Internet during the period from 1971 to 2017. Although the number of papers in the WOS was more than that in Scopus, both showed a similar trend over the study period. The annual total of publication, total citation, and citation per article author, the number of countries, and the average author per paper publishing literature related to the overuse of electronic devices and the Internet rose significantly in both databases (Fig. 2, Fig. S3 and Table S3 Supplementary). The first item was published in 1971 but rose to 469 in 2011 in WOS, and 102 in Scopus. In both datasets, the earliest reports on this aspect dated back to 1971 when Levine and Stephens expressed their concern with addiction to street

games (Levine & Stephens, 1971). Raubolt and Bratter mentioned group treatment applying for games addicts play in his 1974 research paper "Games addicts play: Implications for group treatment". Besides, the average number of the author in 1971 was two, this figure significantly increased double by 2017. The article with the highest number of authors (31) in WOS, published in *Addiction* (2012), provided the prevalence of PIU (4.4%) among adolescents in European countries (Durkee et al., 2012). Meanwhile, the article with the most authors (14) in Scopus, published in *Psychiatry Research* (2016), identified the association between problematic alcohol and PIU among adolescents due to common psychopathological factors (Wartberg et al., 2016). The number of countries that involved in this study rose speedily during the period, starting with a minimum of 1 country in 1971 for both datasets, and increased to a maximum of 63 in 2017 (WOS) and 27 countries in 2016 (Scopus) (see Table S4 in Supplementary). The total citation of WOS increased dramatically while that of Scopus rose slightly. The average citation per article per year shows the impact of a publication. The papers in the year 2004 (WOS dataset) and the papers in the year 2007 (Scopus dataset) had the highest impact with the average citation per article per year were 17.93 and 11.86, respectively.

Journals, and categories distribution

Based on the classification of the research areas in WOS and Scopus, we selected four categories with the highest number of publications from 2000–2017 (Fig. S4a and b Supplementary). The number of papers per category presented a continued growth, which indicates that these research topics have been steadily emerging in various categories. The four most common categories throughout 17 years in WOS dataset were: Psychology, Psychiatry, Substance abuse and Neurosciences & Neurology. In the same line with WOS, Psychology and Neurosciences & Neurology were in the top four, the others were Medicine and Computer Science.

Fig. 3 shows the number of papers and citations attributing to the 15 most prolific journals, which included productivity and the ranking of the journal. In total, 2,276 articles were published in 666 journals (WOS), 600 articles were published in 261 journals (Scopus). Based on the total number of papers and its growth trend, we defined a popular journal as a journal that contributed at least ten articles in the field. As a result, 633 (95%) journals in WOS dataset and 253 (96%) journals in the Scopus data, published less than ten articles. As the leader of this research topic, the *Computers in Human Behavior* published the most research papers (264; 11.6% in WOS, and 87; 14.5% in Scopus), followed by *Cyberpsychology, Behavior, and Social Networking* (WOS: 124; 5.5%; Scopus: 87; 5.8%); *Journal of Behavioral Addictions* (WOS: 87; 3.8%); *Addictive Behavior* (17; 2.8%). Throughout the research field, the highest impact factor (IF) journal was *Addiction* (Scopus; 5.953), and *Journal of behavioral addictions* (3.628; WOS). In WOS database, the most frequently cited journal was *Cyberpsychology and Behavior* with a total of 8,175 citations during



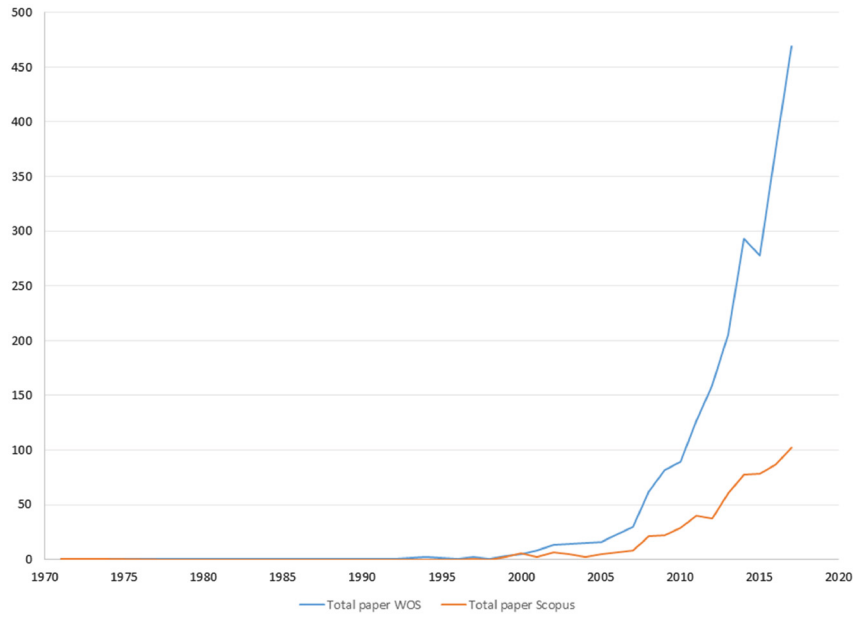


Fig. 1. Number of publications in WoS and Scopus

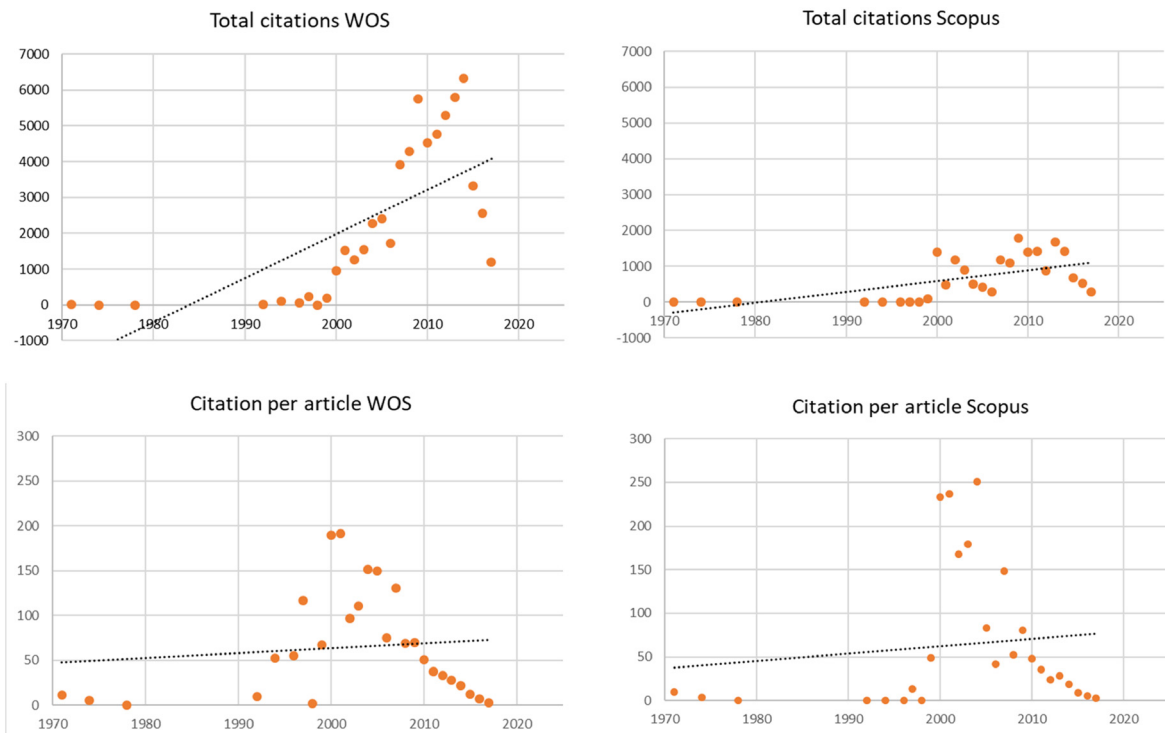


Fig. 2. Total number of citations and citations per article of WoS, and Scopus

the given period, and it ranked first with the average citation score (113.54) among the core journals. In Scopus, Computers in Human Behavior had the highest number of total citations, however, the highest average citation per article was Cyberpsychology and Behavior (138.96). However, the average citation per article of Computer in Human Behavior was higher than that of Addiction while its IF was slightly lower than that of Addiction (5.953).

For global collaboration, the top 15 countries/regions were ranked by productivity, total citations, and global cooperation in articles (see Table S4 Supplementary). The number of papers and total citations in WOS was higher than those of Scopus. Some countries in North America countries, Europe (WOS: 10 countries, Scopus: 9 countries), Asia (WOS: 7 countries, Scopus: 8 countries), as well as Australia were in the top 20 countries based on the number



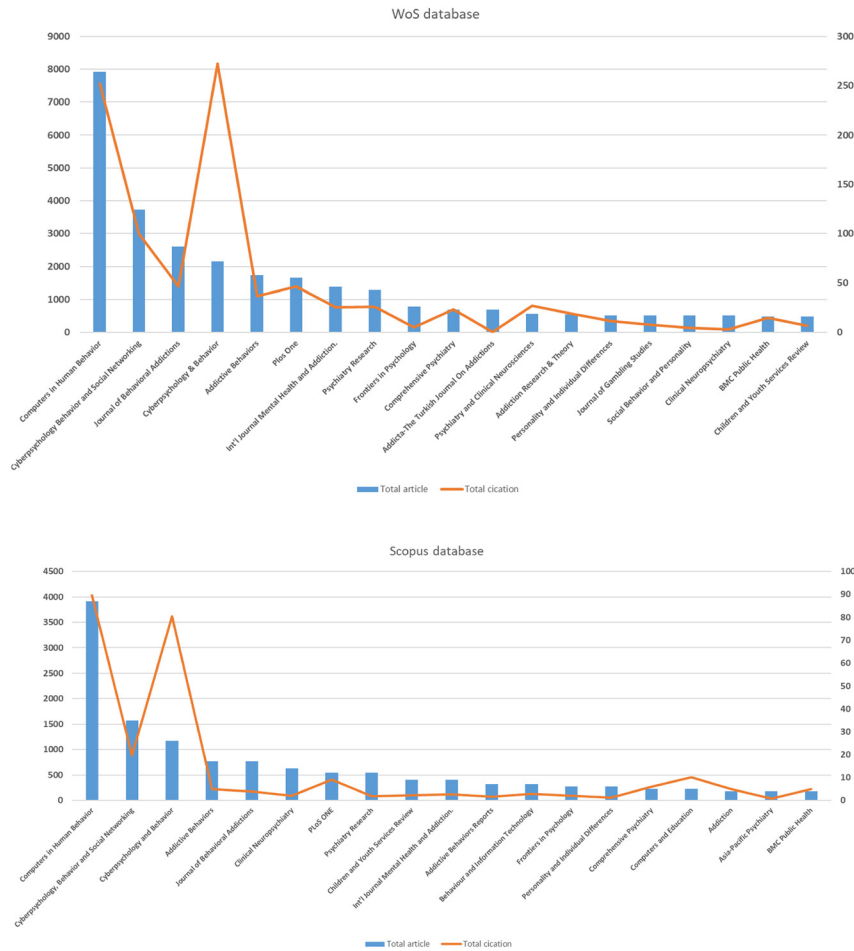


Fig. 3. Most active journals in the field of excessive electronic devices and Internet uses (based on the total number of articles and total citations)

of publications. Surprisingly, there was no representative country from Africa among the top 25 of the most productive countries in both databases. The top 20 productive countries contributed 67% (Scopus), and 86.4% (WOS) of total articles. Furthermore, 20.4% (WOS), and 17.5% (Scopus) were global articles, which indicated these countries having great cooperation in this research field. Interestingly, two Asian countries (China, and South Korea) appeared in the top five of the most prolific countries, which accounted for 21.1% (WOS), and 13% (Scopus) in the total number of publications. The top 5 of the most prolific countries were the USA (WOS: 373, Scopus: 88), China (WOS: 283, Scopus: 34), Korea (WOS: 198, Scopus: 44), Turkey (WOS: 158, Scopus: 26), and United Kingdom (WOS: 140, Scopus: 30). In the WOS dataset, six countries published papers only with the cooperation to other countries (Qatar, Scotland, Macedonia, Slovenia, United Arab Emirates, and Vietnam) meanwhile 18 countries only had domestic cooperation (South Africa, Cyprus, Croatia, Kuwait, Bangladesh, Denmark, Estonia, Peru, Romania, Thailand, Chile, Egypt, Indonesia, Iraq, Lithuania, Mexico, Tanzania, Tunisia). In both databases, the US ranked first in terms of total citations (WOS: 14,456, Scopus: 5,595) while Czech Republic (Scopus), and Poland (WOS) had the lowest total citation among

the top 20 most prolific countries (see Table S3 Supplementary).

Fig. 4 shows the international collaboration of 69 countries (WOS) and 46 countries (Scopus). The size of nodes is proportional to the relative contribution based on the number of papers, and the line thickness represents the strength of international collaboration. The United States was the largest contributor in this field, followed by China and South Korea.

Based on the WOS data, the United States closely collaborated with Canada, England, and Australia. The clusters of collaboration were also seen among countries located in Asia, and Europe. For instance, South Korea, China, Taiwan, Japan, and Malaysia were proximally located with one another, indicating the Asian collaboration. Clustering was also seen between Switzerland, Belgium, Poland, Israel, France, and Brazil.

Based on the Scopus data, there was the main group which included seven countries having the closest collaboration: the US, South Korean, Turkey, Malaysia, Singapore, Japan, the Philippines. Some of the European countries (Switzerland, Belgium, Poland, France) formed research collaboration with Canada and Israel. Northern European countries (Italy and Portugal) and Southern European



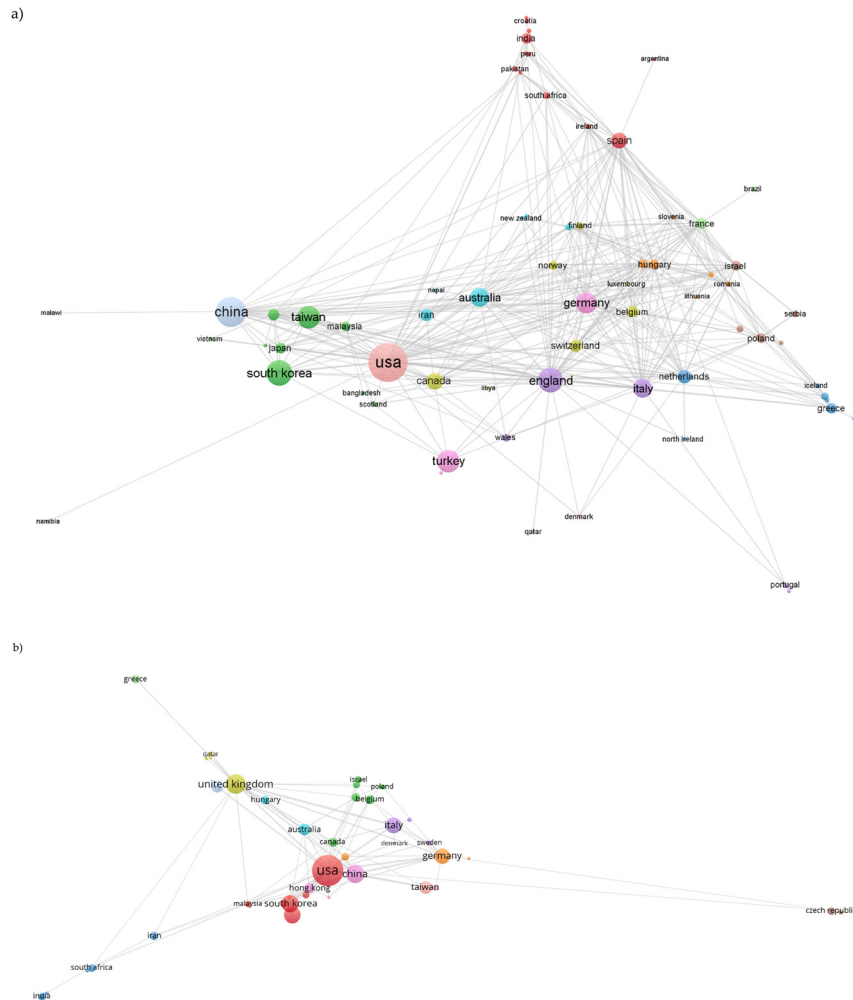


Fig. 4. (a). The global network among countries in WOS. (b). The global network among countries in Scopus

countries (Denmark and Sweden) formed a strong collaboration.

Fig. 2 shows the number of citations and citations per article. Those figures in the WOS database were more than those in Scopus. In both databases, it shows that almost one-third of all citations belonged to papers published by researchers in the USA which is the country that contributed the highest number of papers (see Fig. S1 Supplementary). Other significant contributors including researchers from China, Taiwan, and South Korea but less citation impact as compared to papers published by researchers in the USA.

Text analysis

Applying the text analysis on titles and abstracts, the WoS and Scopus database identified 31,710 terms and 11,454 terms, respectively. There were 145 terms in the WOS with the cut-off 100 times of appearance and 144 terms in the Scopus with the cut-off 31 times of appearance. Fig. S6a and b shows the co-occurrence network of terms extracting from titles and abstracts. The size of a term indicating the number of its appearance in the titles and abstracts.

“Problematic Internet use” (Scopus, 1,446 times of appearance), and “addiction” (WOS, 2,682 times of appearance), and “Internet addiction” (WOS, 1,842 times of appearance) were three central nodes. Four main clusters (four different colors) in two databases could be identified (see Fig. S6a and b):

Theme 1. The blue cluster (WOS) and the red one (Scopus) consist mainly of the co-comorbidity: Internet addiction was found to be associated with psychiatric comorbidity including ADHD, depressive disorder, social phobia, and hostility. Many studies confirmed the association between Internet addiction, and psychiatric illness (Caplan, 2007; Costa, Patrao, & Machado, 2018; Ko et al., 2012; Özdemir, Kuzucu, & Ak, 2014; Shapira, Goldsmith, Keck, Khosla, & McElroy, 2000; Yen, Ko, Yen, Wu, & Yang, 2007). When treating people with Internet addiction, these disorders should be adequately assessed and treated at the same time.

Theme 2. The green cluster (WOS) and the yellow one (Scopus) cover the topic: questionnaires for assessing Internet addiction. All questionnaires were self-administered and ranging from 6 to 20 items on dimensional scales. The

Table 1. Ten research topics classified by Latent Dirichlet allocation in WOS database

| Rank by the highest volume last 5 years | Research topics | N | Percent |
|---|---|-----|---------|
| Topic 1 | Smartphone addiction | 107 | 4.70% |
| Topic 2 | Internet addiction and mental health problems | 297 | 13.05% |
| Topic 3 | Internet addiction and depression among University Students | 385 | 17.00% |
| Topic 4 | Prevalence and risk factors of problematic Internet use among adolescents | 215 | 9.45% |
| Topic 5 | Social media and social network games | 178 | 7.82% |
| Topic 6 | Validity and Reliability Study of the Internet Addiction Test | 158 | 6.55% |
| Topic 7 | Brain Functional Network in Internet Addiction or Gaming disorder | 173 | 7.60% |
| Topic 8 | Internet pornography addiction and its consequences | 255 | 11.20% |
| Topic 9 | Treatment Interventions for Internet Addiction | 92 | 4.13% |
| Topic 10 | Gaming and Gambling disorder | 167 | 7.34% |

Internet Addiction Test (Young, 1998) with 20 questions was most frequently used. For gaming disorder, the Assessment of Internet, and Computer Game Addiction (AICA-S), a 14-item self-report scale was frequently used to assess computer game addiction.

Theme 3. The red cluster (WOS) and the blue one (Scopus) mentioned the impact of electronic divides overuse could cause to the youth. It can be seen that research of treatment focused on the Scopus database. Specific psychological therapies, such as social support, counseling, and cognitive behavior therapy were found to help young people to overcome addiction to electronic devices and the Internet as well as feelings of loneliness (Mak et al., 2014; Schimmenti, Passanisi, Gervasi, Manzella, & Fama, 2014). A strong

family relationship was found to be an excellent method to prevent Internet addiction (Yu & Shek, 2013). School-based support was required to support adolescents overcoming negative feelings (Özdemir et al., 2014). Another theme was psychoeducation to teach students to use the Internet effectively and supervise the time they spent online (Li, Zhang, Lu, Zhang, & Wang, 2014).

Theme 4. The yellow cluster (WOS) and the green one (Scopus) consist of the subjects of the papers: “adolescents”, “high school student”, “student”. Besides, the difference in using the Internet between two genders was mentioned. Male and female both use mobile phone, however, the purpose of using was quite different. Females used the mobile phone for social reasons meanwhile men used the mobile phone for business purposes. On one hand, two risk factors for Internet addiction were male gender and social factor (Müller, Glaesmer, Brähler, Woelfling, & Beutel, 2014; Yen et al., 2007). On the other hand, some studies show that young women tend to have a problem with Internet addiction (Derbyshire et al., 2013).

Topic modeling using Latent Dirichlet allocation (LDA)

Using LDA for text analysis in the titles and abstracts, we classified ten research topics in the WOS dataset (Table 1) and Scopus dataset (Table 2). In WOS dataset, topics with the highest number of publications were “Internet addiction and depression among University Students” ($n = 385$), “Internet addiction and mental health problem” ($n = 297$), and “Internet pornography addiction and its consequences” ($n = 255$). In Scopus dataset, “Internet addiction in adolescents and students: Prevalence and risk factors” ($n = 116$), “Problematic Internet use and mental health problems” ($n = 71$), “PIU and psychological effects among students” ($n = 68$). Both datasets show that the concern of the scientific community has been the effect of PIU on mental health, especially among students. Both WOS and Scopus share the same results when confirming that “Smartphone addiction” and the mental health illness affected by Internet addiction received the highest attention in the scientific community in the last five years (Figs. 5 and 6). Moreover, we provided 25 most cited papers in each database, which showed the highest attention of the researcher (Tables S5 and S6 Supplementary). The top three highest citation papers shared the same content with our research topics. The first and second publications in WOS focused on a framework for the development of cognitive-behavioral interventions for PIU (Caplan, 2002; Davis, 2001). The other papers reported the relations of PIU and com-morbidities (Kardefelt-Winther, 2014b; Shapira et al., 2000), theoretical development for PIU (Kardefelt-Winther, 2014a).

DISCUSSION

To the best of our knowledge, this study can be considered the first comprehensive and global bibliometric analysis on the excessive use of electronic devices and the Internet. Our

Table 2. Ten research topics classified by Latent Dirichlet allocation in Scopus database

| Rank by the highest volume last 5 years | Research topics | N | Percent |
|---|---|-----|---------|
| Topic 1 | Smartphone addiction in workplace | 39 | 6.50% |
| Topic 2 | Parental Control and Adolescent Internet Addiction | 19 | 3.17% |
| Topic 3 | PIU and psychological effects among students | 68 | 11.33% |
| Topic 4 | Treatment of Internet addiction | 62 | 10.33% |
| Topic 5 | Problematic Internet use and mental health problems | 71 | 11.83% |
| Topic 6 | Internet Addiction, Pathological Gambling and Psychiatric Comorbidity among Adolescents | 61 | 10.17% |
| Topic 7 | Internet addiction in adolescents and students: Prevalence and risk factors | 116 | 19.33% |
| Topic 8 | Online Social Gaming and Social Networking Sites | 28 | 4.67% |
| Topic 9 | Psychometric Properties of the Problematic Internet Use Questionnaire | 43 | 7.17% |
| Topic 10 | Smartphone and brain activity | 37 | 6.17% |

findings showed that there had been a steady increase in the number of publications and citations in this area from 1971 to 2017. Although the number of papers eligible to be selected for further analysis in WOS database was three times that in Scopus database, both datasets displayed the same trend in the development of scientific research papers in PIU. First, both datasets confirmed that the US was the leading country in this area, yet there was an emergence of publications from Asian countries. Secondly, keyword and text analysis found that excessive use of electronic devices and the Internet mainly affected young people and led to

psychiatric comorbidity. Various questionnaire assessments were developed to assess excessive use of electronic devices and the Internet as well as the mainstay of treatment is psychological intervention. Finally, there were limited publications looking into intervention or treatment for excessive use of electronic devices and the Internet.

Some of the global collaborations on excessive use of electronic devices and the Internet occurred among the following countries/regions: The United States, China, South Korea, and Taiwan. The presence of various Asian countries as major contributors for publication in this area reflected the growing concern of Asian society when facing the healthcare crisis associated with “Internet addiction” and excessive use of electronic devices. The excessive use of electronic devices and Internet has been considered a common problem in Vietnam, China, Taiwan, Hong Kong, and South Korea (Tran et al., 2017). To combat the rising prevalence of excessive use of electronic devices and the Internet in Asia, we call for new health policies and programs. Several Asian countries have established control and prevention measures. China, for instance, has applied tighter control on the Internet café and launched an anti-addiction program (Vondráčková & Gabrhelík, 2016), while South Korea has established a systematic approach program “Hospital + School + Counseling Center” for treating people with PIU (Koo, Wati, Lee, & Oh, 2011). Taiwan has revised the “Child, and Youth Welfare, and Protection Act” which requires the parents to pay a penalty of 1595 USD if their children become sick as a result of excessive use of electronic devices and Internet (Interior & Taiwan China, 2012).

Our analysis of text mining (titles and abstracts only) and the visualization of titles and abstracts identified the concerns on “comorbidities” associated with excessive Internet uses. By using LDA, we found that the number of publications focuses on the relationship between PIU and psychiatric is increasing (Table 1 and 2). PIU can be a reason leading to psychosocial issues, such as depression (Stetina, Kothgassner, Lehenbauer, & Kryspin-Exner, 2011), anxiety and loneliness (Schulz, Bergen, Schuhmann, & Hoyer, 2017), or even suicide (Durkee, Hadlaczky, Westerlund, & Carli, 2011). Most of the studies, however, were cross-sectional, such that confirmation on a causal relationship between PIU and mental health problems should be the aim of future researches (de Vries & Nakamae, 2018). Moreover, the number of papers discussing treatments of PIU (4.13% of the total number of publications in WOS dataset, 10.33% in Scopus dataset) was relatively small compared with other topics. In terms of available treatment, both databases mentioned non-medication therapy including cognitive-behavioral therapy (Young, 2007), family therapy (Zhong et al., 2011), self-discovery camp (Sakuma et al., 2017), Mindfulness-Oriented Recovery (W. Li et al., 2017) and pharmacotherapy. Although previous publications suggested the use of social support, counseling, or cognitive behavior therapy to treat excessive use of electronic devices and Internet, the efficiency of psychological interventions has not been well-discussed. Notably, there has been a lack of studies

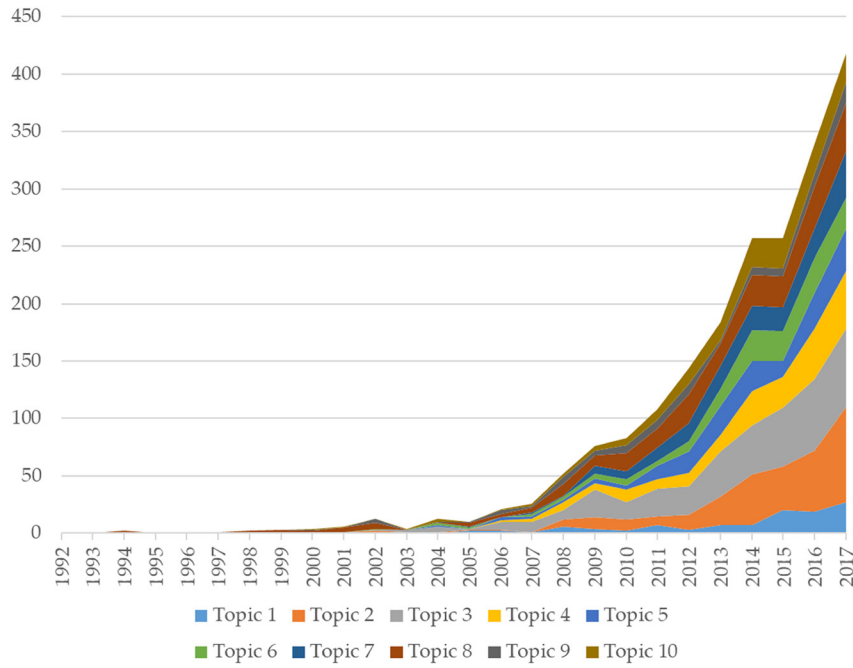


Fig. 5. Changes in research topics development in WOS

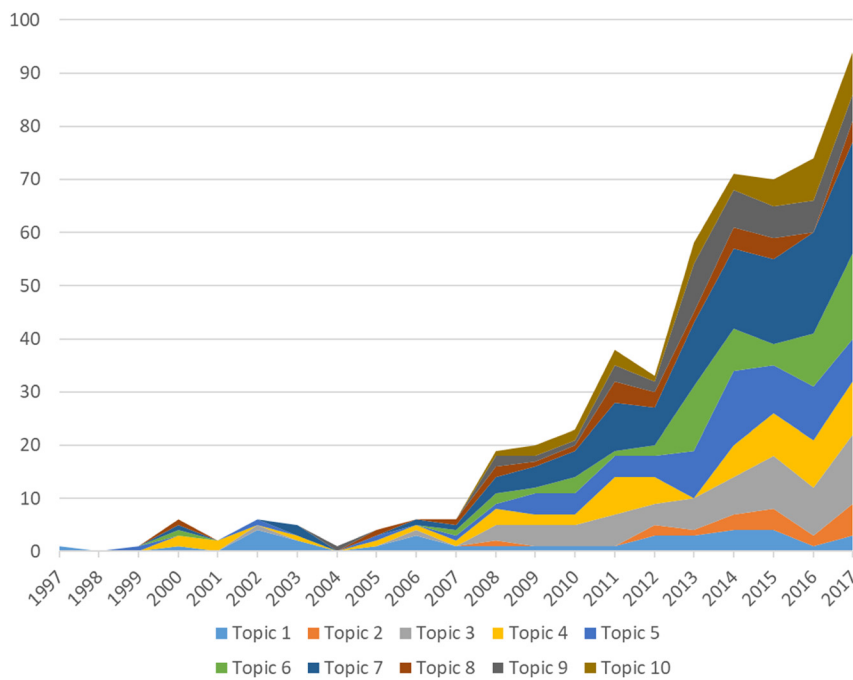


Fig. 6. Changes in research topics development in Scopus

focusing on pharmacological treatments for excessive use of the Internet and electronic devices. In both datasets, there were only three papers mentioned medication treatment. Further research thus may take the direction of evaluating the therapeutic effect of positivity which leads to a linear decrease in general distress and an indirect decrease in Internet addiction.

This bibliometric study has several limitations. Firstly, we were unable to present a “universal” definition or

classification of excessive use of electronic devices and Internet. In fact, the debate on the definition and diagnostic criteria of excessive use or addiction to electronic devices and Internet will possibly continue to go on worldwide. While some mental health practitioners and researchers considered PIU as a symptom of a primary psychiatric disorder such as anxiety or depression (Ko et al., 2012), others classified PIU as an impulse control disorder. Nevertheless, there is a growing consensus that PIU is



considered to be a form of addiction (Grant, Potenza, Weinstein, & Gorelick, 2010). Secondly, we excluded some document types such as government documents, books or book chapters, and letters to editors and kept only articles and reviews, that may affect the result. Finally, the exclusion of non-English articles might lead to selection bias and made the number of publications of English-speaking countries was more than that of Asia or Africa ones.

CONCLUSION

In conclusion, this study presents a comprehensive overview of global research trends and development on the excessive use of electronic devices and Internet. Furthermore, it highlights the need for increasing global awareness about the effects of addiction to electronic devices and Internet. The findings of this study will help researchers and health authorities to formulate new research strategies and policies respectively.

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