MOOC SUCCESS FACTORS: PROPOSAL OF AN ANALYSIS FRAMEWORK

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ABSTRACT

Aim/Purpose From an idea of lifelong-learning-for-all to a phenomenon affecting higher education, Massive Open Online Courses (MOOCs) can be the next step to a truly universal education. Indeed, MOOC enrolment rates can be astoundingly high; still, their completion rates are frequently disappointingly low. Nevertheless, as courses, the participants’ enrolment and learning within the MOOCs must be considered when assessing their success. In this paper, the authors’ aim is to reflect on what makes a MOOC successful to propose an analysis framework of MOOC success factors.

Background A literature review was conducted to identify reported MOOC success factors and to propose an analysis framework.

Methodology This literature-based framework was tested against data of a specific MOOC and refined, within a qualitative interpretivist methodology. The data were collected from the ‘As alterações climáticas nos média escolares - Clima@EduMedia’ course, which was developed by the project Clima@EduMedia and was submitted to content analysis. This MOOC aimed to support science and school media teachers in the use of media to teach climate change.

Contribution By proposing a MOOC success factors framework the authors are attempting to contribute to fill in a literature gap regarding what concerns criteria to consider a specific MOOC successful.

Findings This work major finding is a literature-based and empirically refined MOOC success factors analysis framework.

Recommendations for Practitioners The proposed framework is also a set of best practices relevant to MOOC developers, particularly when targeting teachers as potential participants.

Recommendation for Researchers This work’s relevance is also based on its contribution to increasing empirical research on MOOCs.

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MOOC Success Factors

Impact on Society  By providing a proposal of a framework on success factors for MOOCs, the authors hope to contribute to the quality of MOOCs.

Future Research  Future work should refine further the proposed framework, by testing it against data collected in other MOOCs.

Keywords  distance education, lifelong learning, Massive Open Online Courses (MOOCs), success factors, framework, content analysis, climate change

INTRODUCTION

The term Massive Open Online Course (MOOC) was coined for the 2008 edition of the course ‘Connectivism and Connective Knowledge’ (Kady & Vadeboncoeur, 2013). In less than a decade, the MOOC movement evolved from an idea of lifelong-learning-for-all to a phenomenon affecting higher education on a global scale (Walker & Loch, 2014). High-profile universities, such as Stanford and Harvard, were among the early providers, introducing extra attention and media coverage (Bates, 2014; Kovanović, Joksimović, Gašević, Siemens, & Hatala, 2015) and, thus, created an unprecedented public interest. Nowadays, MOOCs can be described as articulated sets of learning activities and resources, web-based, usually free-of-charge and with no prerequisites, which can be accessed simultaneously by hundreds of users.

Several advantages of MOOCs are pointed out in the literature, as they can:

- provide high quality, low cost and high scale education (Saadatdoost, Sim, Jafarkarimi, & Mei Hee, 2015; St Clair, Winer, Finkelstein, Fuentes-Steeves, & Wald, 2015);
- increase the access to higher-education learning (St Clair et al., 2015; Walker & Loch, 2014);
- promote autonomous, independent and flexible learning (Kady & Vadeboncoeur, 2013; Saadatdoost et al., 2015);
- allow learners to focus on learning rather than on getting a qualification (Walker & Loch, 2014); and
- promote the provider - institution, professor or study programme (Saadatdoost et al., 2015; St Clair et al., 2015; Walker & Loch, 2014).

Hence, MOOCs seem to have the potential for a truly universal education as they allow delivering high-quality learning content to individuals that usually cannot access higher education (Bates, 2014). However, the typical course registrant of, for example, Harvard and MIT Open Online Courses is a well-educated young male from a developed country (Ho et al., 2015; Ho et al., 2014). Hence, one might argue that MOOCs have not delivered yet the promise of providing education to the individuals who could benefit the most from their openness and free features (Christensen et al., 2013). Additionally, according to a study of 221 MOOCs, completion rates vary from 0.7% to 52.1%, with a disappointing median value of 12.6% (Jordan, 2015). Kovanović et al. (2015) claim that low completion rates created the need of understanding the factors that drive students’ success in MOOCs. Other authors, however, are questioning if the high dropout ratio should be considered an issue in this context (Ho et al., 2015; Saadatdoost et al., 2015) and, hence, other dimensions need to be taken into consideration.

STATEMENT OF PROBLEM, PURPOSE AND MANUSCRIPT’S ORGANIZATION

From the discussion above, there is insufficient literature reporting factors that influence MOOCs’ success and further research is needed to fully understand what makes a specific MOOC successful. Aiming to contribute to the literature, the authors sought to identify a set of success factors that may affect the enrolment, continuance, and learning of MOOC participants, in order to propose a MOOC success factors framework. This framework can be used both to support MOOC providers in the development of their courses and in the analysis of their MOOC’s success. With that aim, firstly, a literature review of MOOC success factors is presented and discussed (in the following sec-
tion of this paper), in order to propose an initial framework. Secondly, in a qualitative interpretivist approach, this framework was used in a content analysis of data collected from the MOOC ‘As alterações climáticas nos média escolares - Clima@EduMedia’ [Climate change in the school media - Clima@EduMedia]. The context of this MOOC, the data collection and analysis techniques, as well as the limitations of this study are described in the ‘Methodology’ section. The analysis allowed us to test and refine the framework, which is of particular importance since we face a scarcity of empirical research on the MOOC phenomenon (Kady & Vadeboncoeur, 2013), particularly considering the participants’ perspectives (Gamage, Fernando, & Perera, 2015). The results of this analysis are presented and discussed in the presentation and discussion of the results’ section. Finally, in the ‘concluding remarks’ section, a reflection of what success factors were more relevant for the participants of the selected MOOC is also presented.

The authors consider that the literature-based and empirically refined MOOC success factors framework, presented in Table 1 (in the ‘Methodology’ section), is an important contribution of this work and can be used as a guide for best practices for MOOC providers. This framework is particularly relevant in the field of teacher development, as this was the context of this study.

**LITERATURE REVIEW**

MOOCs were born from connectivism, which was proposed by George Siemens in 2005 as a learning theory of the digital era. The author argued connectivism overcomes limitations of three of the main broad learning theories – behaviourism, cognitivism, and constructivism – namely, not considering the current fast development of technology and knowledge-base, as well as learning as a phenomenon that can occur outside people and within organizations. In his first published reflection on this theory, Siemens highlights the increasing need to assess the learning worthwhile of pursuing, in a society where access to information, and to knowledge, increases exponentially. Not being able to learn all, people need to filter information and learn how to access the information they need. Thus, in connectivism the focus is on the connections that enable the individual to learn, rather than his or her current state of knowing (Siemens, 2005). Despite an increasing acceptance of this learning theory, connectivism has not been widely accepted and some critical voices have emerged. Some authors argue it is not a learning theory, but rather a curriculum theory. Others claim that connectivism (i) cannot explain a range of learning phenomena, (ii) is void of new ideas, (iii) presents an ill-defined teacher role, and (iv) requires from the learner a high motivation level for autonomous engagement with the resources and for maintaining interaction with others MOOC participants (Anderson, 2016).

A consequence of the above is that connectivism has not been adopted by all MOOC providers and this mode of education delivery soon evolved into different configurations. In fact, MOOC literature frequently distinguishes between cMOOCs and xMOOCs. cMOOCs are associated with connectivism, as learners are asked to contribute to the course’s development by discussing topics and bringing in various forms of relevant content (Admiraal, Huisman, & Pilli, 2015; Kennedy, 2014; Saadatdoost et al., 2015; St Clair et al., 2015) and frequently use distributed online platforms (Kennedy, 2014). These courses have a social approach to education (Liyanagunawardena, Adams, & Williams, 2013) and require innovative ways of teaching (Saadatdoost et al., 2015). xMOOCs are highly structured and instructor guided, usually including a set of video lectures, recommended readings, and different forms of assignments and assessments in a centralized platform (Kennedy, 2014). These courses have an individualist learning approach (Liyanagunawardena et al., 2013) and are grounded in cognitive-behaviourism (Stacey, 2014). Alternative terms and classification systems have been proposed, due to the high diversity of MOOC designs and purposes (Admiraal et al., 2015; Drake, O’Hara, & Seeman, 2015), although their usefulness can be rather limited.

It is fairly acknowledged that different stakeholders have different motivations regarding MOOCs, making success and quality assessment challenging. For example, a MOOC success can be linked to creating a good image of the MOOC promoter (Walker & Loch, 2014) or to each learner meeting his
MOOC Success Factors

or her own goals (Downes, 2016). In this last example, pass rates are not be a reasonable success indicator for a MOOC, as course completion may not be the enrollee’s major goal (e.g., Alraimi, Zo, & Ciganek, 2015; Rosewell & Jansen, 2014). Yet, the question remains: what elements should be considered when analysing a MOOC success?

Currently, several authors are discussing MOOC quality-related topics, including Downes (2016), Yang, Shao, Liu, and Liu (2017), and Creelman, Ehlers, and Ossiannilsson (2014). Not many are discussing success factors (some exceptions are Alraimi et al., 2015, Nagashima, 2014, and Poy & Gonzales-Aguilar, 2014); hence, the need for research in this area.

The MOOC success factors framework presented in this paper (in Table 1) was organised according to Nagashima’s (2014) proposal of three sets of categories of success factors for open education initiatives, including MOOC aggregators: organisational, pedagogical, and social. Each of these sets includes several success factors identified either in the literature, in the data collected or in both. Below, the authors discuss the literature-based MOOC success factors.

**LITERATURE-BASED MOOC SUCCESS FACTORS**

Downes (2016) stresses the relevance of identifying what a successful MOOC ought to produce as an output, particularly, participants’ autonomy, allowing diversity, openness, and interactivity. ‘Autonomy’ is essential for participants being able to pursue their own goals (and not necessarily the ones pointed by the MOOC providers). ‘Diversity’ refers to the different approaches MOOC participants have when engaging with MOOC’s activities. This factor allows the MOOC to be relevant for people with different cultures, time zones, available technologies, learning styles, and other distinctive characteristics. ‘Openness’ highlights the free flow of people and of information in the MOOC, that is, people are free to join the MOOC, leave it, access produced content, and bring in their own resources. Finally, ‘interactivity’ allows the emergence of new learning within the network of participants of the MOOC (MOOC tutors and providers included). Hence, these three aspects contributed to the definition of the categories ‘Flexibility and Scaffolding for Diversity’, ‘Openness’, and ‘Interactivity and Peer-to-Peer Pedagogy’, respectively, all included in the framework summarised in Table 1. Rooij and Zirkle (2016) and Nagashima (2014) also refer to interactivity, that is, the connections among all MOOC participants, as an enhancer of student engagement. Furthermore, this factor’s effect can be increased by knowing other learners in the MOOC, who can promote engagement with the course resources (Kizilcec & Schneider, 2015). Therefore, ‘Acquaintances’ was another success factor presented in Table 1.

Nagashima (2014) also acknowledges other success factors, such as:

- the MOOC’s funding strategies, as the MOOCs are frequently offered without charging frequency fees, this is a relevant factor for MOOC providers. This led to the success factor ‘Funding’ (Table 1);
- localisation, to get around disparities in technological infrastructure, language, and, even, culture of MOOC participants, leading to the success factor with the same designation in Table 1;
- focus of subjects, a factor driven by the learners’ reasons for taking these courses, as their motivations for enrolment might be different for different subject areas. This factor originated the success factor with the same name in Table 1;
- social view of open education, that is, the way society responds, recognizes, and accepts the idea of open education. This factor originated the factor ‘Learning View’ in Table 1, after testing the literature-based framework against this study’s empirical data. This change was due to the fact that the user’s view of open education as having, or not, high quality can be related with his or hers perspective regarding learning and the strategies to achieve it.
The provider’s reputation, as perceived by the user, is a factor worth taking into account as it may influence the decision of enrolling in a specific MOOC (Alraimi et al., 2015); hence, the inclusion of the success factor ‘Reputation or Brand’ in Table 1. Moreover, according to Yang et al. (2017), the learners’ decision of continuance in a MOOC seems to be influenced by several factors, such as:

- system quality, that is, the functionality and reliability of the MOOC’s supporting technologies;
- course quality, defined by the knowledgeable authority of course content, and lecturers’ teaching attitudes;
- service quality, or the support from the MOOC’s provider or other MOOC learners, e.g., to help users to engage in learning tasks;
- perceived ease of use of the online system; and
- perceived usefulness of the online system in achieving own goals.

These factors, proposed by Yang et al. (2017), contributed to originate several success factors in Table 1: ‘Technology’, ‘Quality Resources’ and, again, ‘Interactivity and Peer-to-Peer Pedagogy’.

Kizilcec and Schneider (2015) found that the intention to earn a certificate promotes students’ assignment attempt. Therefore, offering learning recognition seems to be a strong predictor of user participation and continuance in the MOOC, and it was included in the framework as the success factor ‘Credits Recognition’.

In the quality discussion thread, under the MOOC quality project, Creelman et al. (2014) propose some key areas related to the perception of MOOC quality, such as providing clear pre-course information, such as the course’s structure or the expected workload, to set adequate expectations (originated the factor with the same name in Table 1) and mixing formal (for credits) and informal learners (for self-development). In the same context, Rosewell and Jansen (2014) distinguish eight relevant key principles suited to MOOCs, namely, openness to learners (related with the free admission of participants and to different ways of participation) and media-supported interaction (referring to the use of rich media, namely video and audio, and to the interactivity the online medium supports). Walker and Loch’s (2014) study pointed out some features that can contribute to MOOC quality in the perspective of academics as MOOC users. They mentioned the need to design the course accounting for its potential massive enrolments (hence, the factor ‘Scale or Massiveness’ in Table 1) and the importance of effective feedback regarding the participants’ learning (included in the factor ‘Interactivity and Peer-to-Peer Pedagogy’, mentioned before). In a pedagogical focused perspective, Stacey (2014) presented five recommendations, including (i) promoting peer-to-peer pedagogies, where participants can provide feedback or assessment comments to other participants; if enough support is given, this peer-to-peer interaction can allow MOOC sustainability even at a large scale; (ii) openness of course resources, leveraging the entire web instead of just the content in the MOOC platform and publishing its resources under Creative Commons licences, and (iii) openness to enrolments.

In a more comprehensive approach, Gamage et al. (2015, p.227) sought “to identify the factors affect to quality of MOOC.” From their literature review, they argue that factors with a significant role in making a MOOC effective to a learner are (i) interactivity (with resources, instructor and peers), (ii) collaborativeness, which allows learning through social interactions; (iii) pedagogy (namely learning pace), and (iv) technology (particularly the support regarding hardware and software). On the other hand, there are challenges that need to be adequately addressed, such as information overload and its relation to MOOC participation. All these factors were integrated in the framework summarised in Table 1.

More recently, Yepes-Baldó et al. (2016) present a 14 dimensions evaluation system of MOOC quality that included, for example, a proper selection and organization of the MOOC’s contents and a temporary configuration allowing customisable schedules and autonomous rhythms. These factors
contributed to include the success factors ‘Content Organisation and Access’ and ‘Timing’, respectively, in Table 1.

In sum, based on this literature review and departing from Nagashima’s (2014) general categories of success factors, we developed an analysis framework of MOOC success factors, which is presented bellow in Table 1 (first two columns). Other literature (DeBoer, Ho, Stump, & Breslow, 2014; Drake et al., 2015; Hernández, Morales, Mota, & Teixeira, 2014; Kennedy, 2014) not directly on success factors or quality of MOOCs was considered, as their findings seemed to support some items of our literature-based analysis framework. As mentioned in the previous section, the model was used to analyse data from a specific MOOC, as will be explained hereinafter.

**METHODOLOGY**

The aim of this study was to propose a MOOC success factors framework, as the literature has not provided, so far, such a proposal. For this initial proposal, and as both numerical and non-numerical data from a specific MOOC were viewed as symbolic representations of the studied phenomenon requiring interpretation, a qualitative interpretivist approach was conducted (Twining, Heller, Nussbaum, & Tsai, 2017). This approach allowed identifying and empirically validating a set of factors that may affect the enrolment, continuance, and learning of MOOC participants, an unusual but needed approach in MOOC research (Gamage et al., 2015). The framework proposed in this study, as will be discussed further, should be refined in future work.

**CONTEXT – THE MOOC ‘AS ALTERAÇÕES CLIMÁTICAS NOS MÉDIA ESCOLARES - CLIMA@EDUMEDIA’**

We used data from the first MOOC provided by the University of Porto (Portugal). This Portuguese language MOOC was offered through the online MOOC platform miríada x. The main aim was to support science and school media teachers in the development of the skills needed to use media to teach climate change. Although this MOOC was open to anyone interested, both its structure and strategy of information diffusion to promote enrolments attracted mainly teachers, especially of the 3rd cycle and secondary levels of the Portuguese education system. The course’s goals included (i) disseminating a set of documents with proposals of teaching strategies and (ii) promoting ideas and experiences sharing among the participants. The choice of this MOOC was based on the access to the data, as this paper’s authors were part of its teaching team.

The course ran from October 5th to November 14th, 2015. It had five content modules, with a weekly staggered release. Online resources included content-videos, extension manuals, teaching strategies, discussion forum, peer assessment, and quizzes. Despite having a xMOOC configuration, some efforts were made to promote learners’ participation in the discussion of contents, and, hence, allowing some connectivism.

Free accreditation, relevant for Portuguese teachers, was also offered. To earn the accreditation, teachers were asked to attend a face-to-face session and writing a report about their MOOC experience. A hundred and fifty-nine teachers presented a report for accreditation and, of these, 83.5% stated this was the first time they participated in a MOOC.

With 720 enrolments, 551 users who logged in at least once, and 311 participants that finished all the mandatory activities, this MOOC completion rate was 43.19%, surpassing the literature reported median value (Jordan, 2015).

**DATA COLLECTION AND ANALYSIS**

As mentioned above, the teachers who aimed to get a professional development accreditation for the MOOC completion were asked to submit a written report through the online platform. The collection instrument was an open answer response box, although teachers were asked to describe their
motivation and expectations for the course, their appreciation of the work, as well as their learning and its usefulness for their teaching practice. These topics prompted teachers to mention factors influencing their enrolment, continuance, and learning within the MOOC. Gathering data from responses to open-ended questions is a frequent source of information in content analysis (Twining et al., 2017).

Each written report functioned as a case. The 159 reports presented by the teachers formed our data. The collected data were submitted to content analysis (Krippendorff, 2004a), supported by the software SPSS to compute descriptive statistics and determine inter-rater reliability (Krippendorff, 2004a). The aim was to check if the data supported the relevance of the literature-inspired analysis framework, presented in Table 1. The success factors (underlined text in the table) were grouped into three categories (in bold) inspired in Nagashima’s (2014) work. For each success factor a brief description, support from the literature, support from the data, or both, are presented. The exceptions are ‘Funding’, with no data occurrences, and ‘New experience view’, which was included in the analysis framework due to its recurrent appearance in the reports. The empirical contribution to the analysis framework is marked with text in italics in Table 1.

For the analysis, the authors assumed that each case could contain several units for coding, as each teacher could make reference to more than one success factor. Success factors were defined as factors influencing users’ enrolment, participation, or both in the MOOC. Being a more subjective concept than enrolment, participation was defined as taking part in activities, such as accessing and analysing the resources, reading and posting in the forum, or attempting quizzes.

The units for coding were defined as segments of text with the information needed for the analysis (Krippendorff, 2004a), in this study, information about success factors. Noncontiguous segments of text were considered in the analysis (Krippendorff, 2004a), as shows the following excerpt: “The motivations for the frequency of this course were: 1. …; 3. deepening of the scientific and pedagogical approach to the theme «Climate Change» through the use of the media” (Report 21).

Unreliable or ambiguous information was not considered, due to difficulties in including it in only one category (Krippendorff, 2004a). For example, in the quote “As aspects for improvement, I would say that it was not possible for me to see all the videos in a timely fashion” (Report 2), the teacher did not explicitly present the barrier to video watching (it could be time constraints, technological difficulties or other). Text segments without information about success factors were also not considered in the analysis. For example, segments with information about the participant’s identity, as illustrates the quote “Name: [name removed for anonymity]; Subject matter: Biology and Geology; School: [name removed for anonymity]” (Report 11), or general statements or reflections about education, such as “[We aim], to form citizens more democrat and tolerant to difference” (Krippendorff, 2004a).

The reports were coded according to the framework presented in Table 1. Only one code, or success factor, was attributed to each coding unit. A ‘+1’, ‘0’ or ‘-1’ was used when the reported success factor promoted, did not influence or inhibited the enrolment, the participation, or both, in the MOOC, respectively. However, the code ‘2’ was used when it was found contradictory information regarding the influence of a specific factor in a report. For example, the Report 74 was coded with ‘2’ in the ‘Technology’ category: “The platform, really well conceived, allows an efficient and fruitful use. It promotes interactivity and cooperation” and “As points for improvement, the platform could have had a way to better organise the forum contributions.” Hence, success factors were considered nominal variables.
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<tr>
<th>SET OF CATEGORIES OF SUCCESS FACTORS</th>
<th>ANALYSIS CATEGORIES OR SUCCESS FACTORS</th>
<th>SUPPORT FROM THE LITERATURE</th>
<th>SUPPORT FROM THE EMPIRICAL DATA</th>
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| **Social Factors**: related with the way society can influence a MOOC’s success | **Learning View**: Includes references to  
1) appreciation of learning opportunities outside of formal education; 2) acknowledgment of open education as potentially having high quality | e.g., ‘how society responds, recognizes, and accepts the idea of open education influences the evolution of the open education movement.’ (Nagashima, 2014, p.17-18) | e.g., ‘professional development, not out of obligation, but by the sheer desire to learn, must be part of a teacher-of-excellence’s path. Therefore, … I have enrolled’ (Report 126) |
|  | **Reputation or Brand**: Includes references to  
1) a high reputation of the provider (which can increase potential users’ awareness of the MOOC and its perceived quality) | e.g., ‘a brand or reputation makes initiatives widely spread, covered by media, and known by people in the world … an institution’s brand also affects the perceived quality of contents it offers.’ (Nagashima, 2014, p.16); Other authors: Alraimi et al. (2015, p.33), Drake et al. (2015) | e.g., ‘The possibility of learning and developing skills in this field within a prestigious institution added to my high expectations’ (Report 72) |
|  | **Localisation**: Includes references to  
1) different users’ features due to their diverse world locations, such as different access to technology, language skills, time zones, cultures, etc. | e.g., ‘To get around disparities in technological infrastructure and differences in language, some initiatives have attempted to localize their courses and have gained popularity.’ (Nagashima, 2014, p.18); Other authors: Downes (2016, para. 69), Drake et al. (2015, p.132), Kennedy (2014, p.8), Kizilcec & Schneider (2015, p.6:19), Rosewell & Jansen (2014, p.93) | e.g., ‘when the opportunity to do it [enrolling in a MOOC] came without the hindrance of the language … I decided to take it’ (Report 11) |
|  | **New Experience View**: Includes references to  
1) appreciation of new experiences for the novelty factor | --- | e.g., ‘exploring a new course format I did not know was a determinant factor for the enrolment’ (Report 44) |
|  | **Acquaintances**: Includes references to knowing someone  
1) participating in the same MOOC;  
2) with previous positive MOOC experience;  
3) that encouraged enrolment, participation, or both, in the MOOC; it can create some sort of local network towards MOOC completion | e.g., ‘learners who enrolled in a course with colleagues or friends were more likely to be engaged with course materials … it should be possible for learners to self-identify as a group taking the course together.’ (Kizilcec & Schneider, 2015, p.6:17) | e.g., ‘I was made aware of this course by colleagues … Their words of encouragement … incited my enrolment.’ (Report 66) |
| **Organisational Factors**: related with the MOOC format organisational features that can influence its success | **Scale or Massiveness**: Includes references to thousands of users being able to explore the MOOC simultaneously due to  
1) the technology;  
2) the way the course operates | e.g., ‘The other major issue was the lack of consideration of the size of the classes. For instance, some courses would have a single discussion board for the tens of thousands of participants.’ (Walker & Loch, 2014, p.58); Other authors: Drake et al. (2015, p.133) | e.g., ‘the MOOC format made it possible to establish communication among many hundred participants’ (Report 14) |
|  | **Openness**: Includes references to users’ freedom to  
1) enrol, as usually no prerequisites, fees or commutes are required; 2) participate, e.g., they can share content from the MOOC and from the exterior; 3) leave | e.g., ‘participants of the course are free to enroll or to leave as they wish, … share content they received from the course with each other (and outside the course), but also to bring into the course content they obtained from elsewhere.’ (Downes, 2016, para. 72); Other authors: Alraimi et al. (2015, p.33), Rosewell & Jansen (2014, p.93), Stacey (2014 , p.115) | e.g., ‘I enrolled in the course, without knowing for sure if I was going to attend it. I was immediately motivated by [it being] … voluntary, open, interdisciplinary, multifaceted, dynamic, free’ (Report 112) |
<table>
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<td>Technology: Requires references to 1) the course being supported by technology; 2) an easy use of online information and communication technologies (e.g., platforms) supporting the MOOC; 3) hardware and software support</td>
<td>e.g., ‘When users perceive that the MOOC platform provides a fully functioning system for learning, their continuance intentions toward participation in MOOCs will be positively influenced’ (Yang et al., 2017, p.6); Other authors: Gamage et al. (2015, p.227)</td>
<td>e.g., ‘However, the platform was somewhat confusing and counter-intuitive.’ (Report 144)</td>
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<td>Funding: Requires references to 1) MOOC providers’ need to find funding options other than users’ tuition fees</td>
<td>e.g., ‘they [initiatives of open education] do not charge users for taking courses or using materials [so they need to] find feasible funding strategies to maintain sustainability.’ (Nagashima, 2014, p.16); Other authors: Poy &amp; Gonzales-Aguilar (2014, p.110)</td>
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<td>Credits Recognition: Requires references to 1) credits attribution for MOOC accomplishments</td>
<td>e.g., ‘Learners who reported the intention to earn a certificate were not more likely to actually earn a certificate than those who did not intend to earn one – despite the fact that they were more likely to attempt assignments.’ (Kizilec &amp; Schneider, 2015, p.6:20); Other authors: Rosewell &amp; Jansen (2014, p.93), Yepes-Baldó et al. (2016, p.190)</td>
<td>e.g., ‘The expectations created with this MOOC are linked not only to …, but also to the possibility of doing an online certified course’ (Report 53)</td>
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<td>Pedagogical Factors: related with MOOCs providers’ teaching decisions that can influence its success</td>
<td>e.g., ‘clear declaration of what sort of course they [potential registrants] are signing up for’ (Creezman et al., 2014, p.86); Other authors: Alraimi et al. (2015, p.35), Walker &amp; Loch (2014, p.59); Yepes-Baldó et al. (2016, p.190)</td>
<td>e.g., ‘In terms of expectations, the presentation video allowed us to guess the great quality of the work’ (Report 117)</td>
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<td>Focus of Subjects: Requires offering 1) course themes of personal or professional interest for specific target groups; 2) innovative themes (e.g., interdisciplinary). In the case of the MOOC ‘As alterações climáticas nos média escolares - Clima@EduMedia’ the subjects are climate change, media and teaching</td>
<td>e.g., ‘Deciding which subject to offer is a factor inevitably affecting the success of open education movements, which is driven by learners’ reasons for taking courses … acquiring knowledge for their jobs [in science-related courses or] … personal interest [in humanities]’ (Nagashima, 2014, p.17)</td>
<td>e.g., ‘The possibility of … autonomously managing the number and moment of dedicated hours was also another factor that motivated me to participate in this course.’ (Report 29)</td>
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<td>Pre-Course Information: Requires providing information before enrolment, regarding 1) the MOOC’s objectives and content; 2) the way it operates</td>
<td>e.g., ‘Coherence and adequacy of the timing’ (Yepes-Baldó et al., 2016, p.190); Other authors: Gamage et al. (2015, p.227)</td>
<td>e.g., ‘I also highlight the quality of this course’s structure, from a global approach to a more specific one.’ (Report 102)</td>
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<td>Timing: Requires meeting audiences needs in terms of 1) schedule; 2) duration; 3) self-managing the time needed for the course</td>
<td>e.g., ‘learners for whom course content was relevant to their current academic endeavors … use the environment as a reference source. … Breaking apart MOOC content into separately tagged modules would allow reference-style usage.’ (Kizilec &amp; Schneider, 2015, p.6:19); Other authors: Gamage et al. (2015, p.227); Kennedy (2014, p.8); Yepes-Baldó et al. (2016, p.190)</td>
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<td>Content Organisation and Access: Requires references to the way the selection and structure of the course content, e.g., 1) making content available in a timely manner; 2) organising content in a way that allow users to easily find the desired information and learn; 3) providing clear instructions on how to use the MOOC to achieve learning goals; 4) balancing the required workload to avoid overload.</td>
<td>e.g., ‘learners for whom course content was relevant to their current academic endeavors … use the environment as a reference source. … Breaking apart MOOC content into separately tagged modules would allow reference-style usage.’ (Kizilec &amp; Schneider, 2015, p.6:19); Other authors: Gamage et al. (2015, p.227); Kennedy (2014, p.8); Yepes-Baldó et al. (2016, p.190)</td>
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<tr>
<td>SET OF CATEGORIES OF SUCCESS FACTORS</td>
<td>ANALYSIS CATEGORIES OR SUCCESS FACTORS</td>
<td>SUPPORT FROM THE LITERATURE</td>
<td>SUPPORT FROM THE EMPIRICAL DATA</td>
</tr>
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<td>Quality Resources: Includes providing learning materials 1) with relevant and updated content; 2) designed specifically for the online format, with cognitive and meta-cognitive stimuli, short lectures on single topics and learning organisers</td>
<td>e.g., ‘Courses should provide high quality materials to enable an independent learner to progress through self-study.’ (Rosewell &amp; Jansen, 2014, p.93); Other authors: Drake et al. (2015, p.131-132), Gamage et al. (2015, p.227); Walker &amp; Loch (2014, p.58), Yang et al. (2017, p.6), Yepes-Bállo et al. (2016, p.190)</td>
<td>e.g., ‘the presented content and resources have a high quality.’ (Report 123)</td>
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<td>Flexibility and Scaffolding for Diversity: Includes providing 1) a range of possible learning paths in the MOOC (e.g., exploring content in a different order or only partially), accordingly to the users’ needs; 2) scaffolding skills needed for MOOC exploitation, such as self-organisation and technology skills</td>
<td>e.g., ‘the improvement of the quality of MOOC offering depends on how much more flexible and adjustable to different contexts and needs the learning opportunities provided can become. … the real success factor in a MOOC is the level of engagement obtained from course participants.’ (Hernández et al., 2014, p.140); Other authors: Creelman et al. (2014, p.85), Deboer et al. (2014, p.82), Drake et al. (2015, p.133), Kennedy (2014, p.8), Kizilcec &amp; Schneider (2015, p.617), Poy &amp; Gonzales-Aguilar (2014, p.110), Rosewell &amp; Jansen (2014, p.93), Yang et al. (2017, p.6), Yepes-Bállo et al. (2016, p.190)</td>
<td>e.g., ‘I participated in the MOOC for …, the learning autonomy and …’ (Report 19)</td>
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<tr>
<td>Interactivity and Peer-to-Peer Pedagogy: Includes providing feedback on learning (either from the provider or peers) through 1) interactive and rich media resources, such as interactive videos or self-grading quizzes; 2) communication strategies about the learning content (collaboration), such as discussion prompts for fora, local student meetings or peer assessments</td>
<td>e.g., ‘Course materials should make best use of online affordances (interactivity, communication, collaboration) as well as rich media (video and audio) to engage students with their learning.’ (Rosewell &amp; Jansen, 2014, p.93); Other authors: Creelman et al. (2014, p.86), Downes (2016, para. 75), Drake et al. (2015, p.132), Gamage et al. (2015, p.227); Hernández et al. (2014, p.140), Nagashima (2014, p.13, 17), Rooij &amp; Zinkle (2016, p.5), Stacey (2014, p.115), Walker &amp; Loch (2014, p.59), Yepes-Bállo et al. (2016, p.190)</td>
<td>e.g., ‘I emphasise the added value of the fora, which allowed the discussion of ideas, the explanation of some issues, and information exchange’ (Report 39)</td>
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</table>
Moreover, as the aim was to identify the presence and direction of influence of each success factor, only one occurrence was registered when a factor was recognised in more than one unit, within the same case. For example, Report 4 contained two different units recordable into the category ‘Quality Resources’ and was coded with ‘+1’: “I highlight the extension manuals as a resource that allowed me to better understand the concept of …” and “I analysed the proposals of teaching strategies, proposed by the MOOC team, with interest and verified they are well structured ….”

Two coders were trained in the tasks of unitizing, coding and making records in the SPSS. The training included familiarization with the analysis framework and collective open coding of a convenience sample of 15 cases. The coding process was discussed and both, the coding instructions and analysis framework, were refined. An independent coding of a convenience sample of 20 cases was performed, to refine further the analysis framework and ascertain the quality of the coding process. To determine the inter-rater reliability of nominal variables the Krippendorff’s alpha (α) or kalpha (Hayes & Krippendorff, 2007) is a suitable reliability index (Taylor & Watkinson, 2007). Hence, the kalpha coefficients for the success factors, regarding the initial coding, are presented in Graphic 1.

![Graphic 1. MOOC success factors’ kalpha coefficients for the 20 cases of the initial independent coding sample.](image)

Krippendorff (2004b) recommends considering $\alpha < 0.8$ as good reliability and $0.667 \leq \alpha \leq 0.8$ for drawing tentative conclusions. Six success factors presented no variation between coders. ‘Credits Recognition’ ($\alpha = 0.6486$) and ‘Quality Resources’ ($\alpha = 0.6549$) were slightly below the cut limit, so, considering the high subjectivity associated with a semantic approach to content analysis, independent coding of the remaining 124 cases was performed with the refined analysis framework.

This study complies with research ethics norms from the Research Ethics Guidebook, such as the voluntary participation, confidentiality, and participants’ anonymity.
STUDY’S LIMITATIONS

The authors acknowledge some limitations in this study, including:

- the possibility of bias in the teachers’ testimonies, as they were produced in the context of an accreditation process;
- the limited amount of reports, or sample (159, when the MOOC was finished by 311 users), hinders generalization of results, although offering relevant issues to consider even in different contexts; and
- the fact that this content analysis used data from only one MOOC.

Further research should include more data, e.g., data collected in other MOOC initiatives to check the framework adequacy against bigger samples in educational contexts, and should collect data produced outside an accreditation context as well to reduce the possible bias caused by this option. Additionally, this analysis framework should be the object of further empirical-led refinement to include reliable measurements of the participants’ learning, associated with their MOOC involvement, as in this study this was not possible: the collected data gave the authors access to the participants’ perspectives about their learning in this MOOC, but not to their actual learning. The refinement of this analysis framework should also include data from other (non-educational) contexts, to allow attempts of generalisation across contexts of study. Nevertheless, this study is a first step into the development of a useful analytical framework that will be able to contribute to the literature and will allow proposing a set of empirically based recommendations for MOOC providers.

PRESENTATION AND DISCUSSION OF THE RESULTS

A hundred and twenty-four teacher reports were considered in the main analysis. Inter-rater reliability was computed and presented in Graphic 2.

![Graphic 2. MOOC success factors’ kalpha coefficients for the 124 cases used in the independent coding.](image)

Similarly to the initial analysis, in the main one no units were coded in ‘Funding’. Therefore, this factor seems to be absent from the participants’ minds. Nevertheless, it can be a crucial factor for
MOOC providers (Nagashima, 2014). This result can be interpreted as supporting the claim that different MOOC stakeholders have different success and quality criteria (e.g., Downes, 2016; Walker & Loch, 2014).

‘Learning view’ and ‘Flexibility and scaffolding for diversity’ presented an α value well below 0.667, hence, these literature-based success factors were not considered for further analysis due to insufficient reliability.

With kalpha coefficients only slightly below 0.667, ‘Localisation’ (α = 0.6639), ‘Pre-course information’ (α = 0.6577), ‘Content organisation and access’ (α = 0.5740), and ‘Quality resources’ (α = 0.5715) were considered for further analysis, with reservations.

In the 124 reports considered for analysis, a total of 594 references (see Table 2) were made to factors influencing positively or negatively the enrolment, the MOOC continuance, users’ learning or all of these. It was possible to identify from one to ten factors in each report; however, 59.0% mentioned four or five success factors, and 93% mentioned between three and six factors. The distribution of the number of factors found in each report is presented in Graphic 3.

![Graphic 3. Number of influential factors per case](image)

Table 2 presents a synthesis of the frequency and of the relative importance of the considered MOOCs’ success factors. Noticeable, when a factor was mentioned, it usually had a positive effect (e.g., ‘Technology’ was reported as a positive influence in 31 reports, negative in 12, and contradictory in eight). The references were distributed in the three sets of categories of analysis (social, organisational, and pedagogical). In this table, for each set, we used italics for the success factor with the highest percentage of cases occurrence.

Table 2. Frequency and percentage of MOOCs’ success factors, present in the collected data.

<table>
<thead>
<tr>
<th>SOCIAL FACTORS</th>
<th>ORGANISATIONAL FACTORS</th>
<th>PEDAGOGICAL FACTORS</th>
<th>TOTAL</th>
</tr>
</thead>
<tbody>
<tr>
<td>R or B</td>
<td>Lo*</td>
<td>NE</td>
<td>Ac</td>
</tr>
<tr>
<td>Influence +</td>
<td>16</td>
<td>1</td>
<td>23</td>
</tr>
<tr>
<td>Influence - contrad.</td>
<td>0</td>
<td>0</td>
<td>1</td>
</tr>
<tr>
<td>Influence No</td>
<td>108</td>
<td>123</td>
<td>100</td>
</tr>
<tr>
<td>% of cases with influence</td>
<td>12.9</td>
<td>0.8</td>
<td>19.4</td>
</tr>
<tr>
<td>% of Cases</td>
<td>32.3</td>
<td>54.0</td>
<td>100.0</td>
</tr>
</tbody>
</table>
‘Social factors’ were referred by almost one-third of the teachers (32.3%); hence, this set of factors is fairly present in their minds. In this set of categories, the data-based factor ‘New experience view’ was the most influential one, with 19.4% of references. It was followed by the literature-based ‘Reputation or brand’, with 12.9%. These results show the relevance that both literature and empirical data have in an effort to identify success factors and, hence, good practices. This cohort of teachers seems to value new experiences, particularly when they can show them first-hand new ways of teaching and learning. Additionally, as reported in the literature (Alraimi et al., 2015; Nagashima, 2014), the way MOOC providers are perceived by the media and the public does affect the enrolment rates. This claim is reinforced by the high enrolment numbers in MOOCs provided by high profile American universities (Ho et al., 2015; Ho et al., 2014). Contrasting, ‘Localisation’ arises as a clearly no influential factor for this cohort of users.

The ‘Organisational factors’ seem more relevant for this cohort of users, as 54.0% mentioned the influence of these factors. Remarkably, ‘Technology’ was the most relevant one, with mentions in 41.1% cases. However, opinions were divergent, as positive references were frequently made to the platform’s intuitiveness of use and negative ones were made to technical problems encountered during navigation. This technical factor is an important one to consider by MOOC providers, as participants expressed expectations of spending their online time reaching their own goals, and not dealing with uneasy distance communication tools. The following citation illustrates: “I didn’t find the platform intuitive, as I spent a lot of time learning how to use it. I wrote comments in the forum that were lost twice” (Report 14).

On the other hand, the literature’s controversy regarding credit attribution in formal higher education (Creelman et al., 2014; Downes, 2016; St Clair et al., 2015) did not have an echo in our empirical data, as only 13.7% of the participants mentioned this factor. Even though this course was developed in a continuous teacher professional development context, rather than in a higher education one, this is a surprising result, as all the reports were written as a requirement to obtain a certification relevant in the Portuguese education system.

Finally, all the teachers pointed the influence of at least one ‘Pedagogical factor’ (100%). This result is not surprising for this cohort of teachers as MOOC participants. With 94.4% of mentions, ‘Focus of subjects’ is the most influential factor of all, closely followed by ‘Quality resources’, with 93.5%. The high frequency of references to personal or professional interest in the MOOC’s topic was expected. In our users’ testimonies, this influence was always positive: “The enrolment and attendance of this MOOC resulted from the interest and topicality of the theme, as it refers to a curricular topic of the subject I’m teaching … that concerns us all” (Report 26). ‘Quality resources’ was another clearly influential literature-based factor (e.g., Drake et al., 2015). Participants were satisfied with the materials they accessed in this MOOC and, being teachers, frequently mentioned their utility in their own classrooms: “The videos were enlightening and engaging. They are great resources for classroom use” (Report 126). Another example of teachers as MOOC participants using resources in their classrooms was reported in the literature and the potential of this course format for “disseminating course tools, pedagogical innovations, and teaching modules” (Ho et al., 2015, p.5) was acknowledged.

Also, worth noting with high percentage of mentions are the success factors ‘Interactivity and Peer-to-Peer Pedagogy’ (in 62.1% reports), ‘Content Organisation and Access’ (in 54.8%), and ‘Timing’ (in 51.6%).

To understand the relative importance of each MOOC’s success factor category, in the analysed data, the percentage of cases in each one, distributed by number of mentions in each report, was computed and presented in Graphics 4, 5 and 6.
Graphics 4, 5 and 6. Relative importance of each MOOCs’ success factor category (Social, Organisational and Pedagogical, respectively), in the empirical data analysed

Graphic 6 highlights the higher importance of ‘Pedagogical factors’, when comparing with ‘Organisational’ (Graphic 5) and ‘Social’ (Graphic 4) ones, for this cohort of teachers. Most did not acknowledge the influence of ‘Social factors’ (67.7%) or mentioned only one (25.0%). Similarly, but with higher percentages, the ‘Organisational factors’ were usually referred to only one time (34.7%) or none at all (46.0%). Contrasting with these scenarios, the ‘Pedagogical’ factors were usually mentioned four (38.7%) to three (29.0%) times per report. This result illustrates the importance of not neglecting pedagogical factors, particularly when the MOOC is targeting teachers as users.

Finally, the presented and discussed data did not give access to an important MOOC success factor: the participants’ learning; however, they provide an indicator of this factor: the participants’ perspective regarding their learning within the MOOC. Hence, the analysed data allowed to propose a framework for MOOCs’ success analysis, as they provided insights into the participants’ enrolment motivations, continuance factors and perceived learning within the MOOC.

CONCLUDING REMARKS

The literature does not present many studies on MOOC success factors. Presenting simple generic statements regarding MOOCs can be counterproductive due to their complexity and diversity (St Clair et al., 2015). For example, as different stakeholders are differently influenced by different issues, the aim of identifying relevant success factors becomes a challenging one. Nevertheless, to make some sense of the MOOC phenomenon and to support MOOC providers when designing, reviewing or running their courses, both the literature and empirical data are sources of good practices. This claim is supported by other authors (e.g., Yepes-Baldó et al., 2016). In this study, the authors present a MOOC success factors framework that was literature-based and empirically refined through
content analysis, in a qualitative interpretivist research approach. Among the identified set of MOOC success factors, the authors highlight the following (in order of relevance in the analysed data):

- ‘Focus of subjects’ seems to positively influence the participants’ enrolment in a MOOC, if they are interested in its topics, for personal or professional reasons, which can be reinforced when those topics are perceived as innovative;
- ‘Quality Resources’ seems to positively influence the participants’ continuance and learning in a MOOC, as they are perceived as relevant and updated, as well as adequate for the online format;
- ‘Interactivity and Peer-to-Peer Pedagogy’ also seems to positively influence the participants’ continuance and learning in a MOOC, particularly when feedback on learning is provided, either by interactive and rich media resources or by collaborative communication about the learning content;
- ‘Content Organisation and Access’ seems to positively influence the participants’ continuance and learning in a MOOC as well, as they perceive, for example, that they have timely access to desired content and are able to easily find desired information; and
- ‘Timing’ seems to influence both enrolment and continuance in a MOOC, as the participants’ needs, in terms of schedule, duration and self-managing of the time required for the course, are met.

Although the low barriers to enrolment and the asynchronous running of MOOCs typically encourage diversity in enrollees’ intentions and actions (DeBoer et al., 2014), the analysed MOOC targeted a specific audience: Portuguese school teachers, interested in climate change and media. This cohort certainly influenced our results.

Our literature review and data analysis allowed us to identify a set of factors influencing the enrolment, continuance and learning of MOOC participants. Following Nagashima (2014), these success factors were organised into three categories: ‘Social’, ‘Organisational’ and ‘Pedagogical’. This last type of factor was clearly the most influential for this cohort of teachers, particularly the MOOC’s subject and resources. However, other features also seem relevant, such as the interactivity among participants, the content organisation and access, and the course’s timing. This factor seems to influence MOOCs’ success, particularly for target groups with a professional life with peaks and lows of workload along the year, such as teachers. This issue was reported before (Marques, Loureiro, & Marques, 2016).

Noting that most of the highly valued ‘Pedagogical factors’ were based on the literature, some data-emergent factors were of social and organisational nature; hence, their relevance cannot be diminished. More specifically, while MOOCs are considered new positive experiences, the novelty factor can be a good stimulus for enrolment.

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MOOC Success Factors


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