



Article

# News Personalization and Public Service Media: The Audience Perspective in Three European Countries

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Abstract: By shining a light on the previously neglected combination of public service media (PSM) and the audience perspective, this paper adds to the debate on (algorithmic) news personalization. While news personalization may offer new opportunities, it can clearly also conflict with the PSM mission of universality of access, reach, and content. This empirical study compares the audience perspective on the news personalization of users and non-users of public service news in Germany, France, and the UK. Overall, the findings of the online survey show that users of public service news in Germany and the UK—in comparison to non-users of these services—perceive more risks such as missing out on certain topics or viewpoints, place greater value on a shared public sphere, and more strongly prefer a news selection primarily made by professional news editors. In France, however, the differences between users and non-users of public service news are rarely significant, which is interpreted against the background of the different media systems and the role of PSM. The findings add to the understanding of what public service news audiences expect PSM organizations to provide while keeping the difficult balance between personalization and universality.

Keywords: news personalization; algorithms; public service media; universality; audience perspective



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## 1. Introduction

The digital transformation has led to a multiplication of available news media and, consequently, of the journalistic offerings that (particularly younger) recipients consume (mostly) online, often accessing them via intermediaries, especially social media platforms (Newman et al. 2022). This can be seen as a driving force behind the development of individual forms of personalization through the algorithmic selection and the presentation of content. Following the lead of search engines and social media platforms, journalistic providers are increasingly offering personalization options for their content, such as options to receive (more) news on personalized topics through algorithms that take on selection tasks previously reserved for editors.

The introduction of news personalization has led to an ongoing discussion in recent decades about the advantages and, particularly, the risks of an algorithmic personalization of news (for an overview, see e.g., Stark et al. 2020). When it comes to public service media (PSM) in particular, there is an evident tension between their obligation to universality on the one hand and the opportunities of personalizing their digital offerings on their own distribution platforms (Helberger 2015; Sørensen 2019; Van den Bulck and Moe 2018) and third-party platforms on the other hand (Sehl et al. 2018).

Despite the importance of discussing the use of news personalization in an online environment, only some studies describe users' attitudes, concerns, and expectations regarding different news recommender systems. Research is even more scarce in the context of PSM where there are special requirements to be fulfilled as outlined above. In general, existing research focuses on the supply side, i.e., journalists (Walters 2022) and news organizations (Thurman and Schifferes 2012), or the overall perception of news personalization

(Monzer et al. 2020; Reiss et al. 2021; Wang and Diakopoulos 2020), especially on social media (Swart 2021). The differences between human and algorithmic recommendations are also a topic of scientific interest (Araujo et al. 2020; Thurman et al. 2019).

This paper adds to this ongoing debate on (algorithmic) news personalization by focusing on (1) PSM and their audience expectations from (2) a national-comparative perspective—a previously neglected combination. This study aims to compare the situation in France, Germany, and the UK to identify differences in attitudes towards, and perceived opportunities and risks of, news personalization between the two groups of users and non-users of PSM news on various platforms. For PSM, these possible differences are essential to work on personalization solutions that balance audience expectations, concerns, and attitudes with PSM requirements, such as universality. On the one hand, differences in the significance of PSM in the selected countries (Hallin and Mancini 2004) might lead to the expectation of differences in audience expectations; algorithmic isomorphism (Caplan and Boyd 2018) resulting from cross-cutting experiences with social media, on the other hand, could lead to a leveling of these expectations.

Based on an online survey conducted in each of the three countries (each N=1010), the present study finds that users of public service news in Germany and the UK—in comparison to non-users of these services—perceive more risks such as missing out on certain topics or viewpoints, place greater value on a shared public sphere, and more strongly prefer a news selection made primarily by professional news editors. In France, however, the differences between users and non-users of public service news are rarely significant, which is interpreted against the background of the different media systems and the role of PSM. The findings add to the understanding of what the public service news audience expects PSM organizations to do to achieve the difficult balance between personalization and universality.

# 2. Types of News Personalization

The introduction of news recommender technologies changed the way we look at online news today. News content can be adjusted to any reader's interests, preferences, values, location, and other characteristics so that news organizations can tailor their content to meet individual consumer expectations (Thurman and Schifferes 2012). This is important because news recommender systems could provide new opportunities to engage with audiences and foster news diversity (Helberger et al. 2018). Although early attempts to personalize news date back more than 25 years (Negroponte 1995), such personalization became more relevant with advancing digital technologies (Chan-Olmsted and Park 2000), especially news algorithms.

Against this background, what does news personalization mean? This study adopts the widely used definition by Thurman and Schifferes (2012), which described news personalization as "[a] form of user-to-system interactivity that uses a set of technological features to adapt the content, delivery, and arrangement of a communication to individual users' explicitly registered and/or implicitly determined preferences" (p. 776). There is thus a distinction to be made between two main types of personalization: explicit and implicit personalization, both of which allow the user to receive news content tailored to their interests (Thurman and Schifferes 2012). Explicit personalization, also described as self-selected or direct personalization, entails users setting up their preferred types of content, for example by selecting keywords or a location. Implicit (or indirect) personalization, on the other hand, "infers preferences from data collected [ . . . ] via the use of software that monitors user activity" (Thurman 2011, p. 397).

The integration of news personalization is often an editorial decision driven by economic pressure stemming from the business model of news organizations (Cherubini and Nielsen 2016, p. 38). Several points thus must be taken into consideration when analyzing the field (Bodó 2019, pp. 1055–56). Firstly, news personalization is deeply embedded in news production and distribution. Since digital and legacy media alike have started to change their business models from free, or ad-financed, to paid models with subscriptions

or paywalls (Petre 2021; Sjøvaag 2016); in addition, new possibilities for editorial processes are emerging. User data and profiles can be used not just to personalize news content but also for digital advertising, which may lead to conflicts between commercial and editorial considerations regarding news and entertainment value (Bodó et al. 2019; Møller 2022a). A potential user's resistance to personalized advertising and other commercial-driven activities may also have to be considered (Boerman et al. 2021). Secondly, news personalization includes two different types of personalization, both with their specific factors. One type of personalization depends on the logic inherent to the platform. The main characteristics are "an abundance of user data; an immense user and content base; an aggressive and successful ad-based business model; almost limitless financial and technological resources; and a strong resistance to any editorial control or oversight of the algorithmic recommendations" (Bodó 2019, p. 1070). The other type of personalization is driven by news logic, which includes "a limited set of data on users (curtailed by limited financial resources and concerns about trust); a limited user base and content base; a struggling ad-based business model, with paid news emerging as an alternative; limited financial and technological resources; strong editorial control and a professional culture" (Bodó 2019, p. 1070).

The adoption process of such algorithmic systems may be different across countries, types of organizations (e.g., PSM versus private-sector media), and organizations depending on economic resources and organizational culture (Mitova et al. 2022), but nevertheless shaped by isomorphism where institutional dependencies force news organizations to follow the data-driven and algorithmic logic of social media platforms such as Facebook and Twitter or news aggregators such as Google News (Caplan and Boyd 2018).

# 3. Opportunities and Risks of News Personalization

As news personalization systems and algorithms have become more sophisticated in recent years and have spread to the mobile environment (Kunert and Thurman 2019), the literature discusses several challenges on different levels of the media system, especially about when these tools should be used and to what degree the user should be informed about them, as well as information obligations in general (Diakopoulos and Koliska 2017).

### 3.1. Opportunities

Various stakeholders involved in news processes can benefit from news personalization: "the media to serve users. For users to receive information. For public policy to contribute to informed citizens, and diverse information choices" (Helberger 2016, p. 198). As previously outlined, analyzing the news consumption behavior of individuals and their friends or people with similar interests has made it possible to get a clearer picture of what audiences want and thus to create more opportunities for tailored content (Malik and Fyfe 2012; Negroponte 1995), meaning "the system can predict what will be relevant for the user, filtering out the irrelevant information, increasing relevance and importance to an individual user" (Bozdag 2013, p. 211).

News personalization could also empower the public by enhancing people's news autonomy. In fact, pre-selected personalization can foster more diverse news choices (Heitz et al. 2022; Zuiderveen Borgesius et al. 2016), while creating opportunities for users to "encounter different opinions, self-reflect on their viewpoints, enhance social and cultural inclusion tolerance, increase one's familiarity with views oppositional to one's own" and to perceive public opinion more accurately (Bodó et al. 2019, p. 208). Möller et al. (2018) suggested that there is no reduction in diversity over non-personalized recommendations and that algorithmic news recommendation systems match the diversity of journalistic recommendations. Studies even found that the use of both (online) news sources and categories of news increased (Beam and Kosicki 2014; Wang and Diakopoulos 2020). This may be explained by incidental exposure to news on social networks (Fletcher and Nielsen 2018; Valeriani and Vaccari 2016).

#### 3.2. Risks

There are also concerns associated with news personalization. At the micro level of the individual user, these concerns focus on privacy (Nielsen 2016, p. 113). At the meso level of media organizations, there are fears that news personalization could lead to a loss of control over an organization's brand and content (Thurman 2011), or their role as information gatekeepers (Møller 2022b). This is especially relevant for PSM, as their public service mission does not necessarily align with the self-interested objectives of third-party platforms (Sørensen and Hutchinson 2018). On a macro level, several concerns have been raised about the societal implications of news personalization. Sunstein argued that a diverse democratic society needs shared experiences as "social glue" (Sunstein 2018, p. 143). This builds on Habermas's understanding of a public sphere as "a realm of our social life in which something approaching public opinion can be formed" while the "[a]ccess is guaranteed to all citizens" (Habermas 1989, p. 136). Contrary to this understanding of a shared public sphere, algorithmic infrastructures of social media and digital platforms increasingly channel and shape the process of public opinion formation. This could even lead to an unstable post-public sphere (Schlesinger 2020), where more isolated audiences encounter fewer opinions and topics, which in turn could result in a polarization of the public sphere (Couldry and Turow 2014; Pariser 2011; Sunstein 2018) and citizens being less well-informed and becoming disengaged from the political process (Zuiderveen Borgesius et al. 2016). In this respect, the debate about filter bubbles is important, although findings suggest that the phenomenon may be overestimated (Dahlgren 2021; Zuiderveen Borgesius et al. 2016) and that the magnitude of these overall effects can be seen as relatively modest (Flaxman et al. 2016, p. 318; Geiß et al. 2021; Haim et al. 2018).

## 4. What Users Think of News Personalization

As the logic of news recommender systems is becoming more central to everyday decision-making in newsrooms (Walters 2022), research into the user perspective on (algorithmic) news selection and audience expectations regarding content, or the quality of such content, has also increased.

Research by Kozyreva et al. (2021) on public attitudes towards personalization revealed a nuanced picture: Personalization of political advertising and news sources were considered unacceptable in Germany and the UK, while personalized services (e.g., customized search, commercial advertising, or entertainment recommendations) were seen as more acceptable. Nevertheless, the use and collection of personal information and data were unpopular (e.g., personal interests or location history, religious or political views, personal events, and personal communications).

Focusing specifically on algorithmic personalization of political and societal news, a non-representative online survey by Oertel et al. (2022) with over 1700 participants in Germany found that most of the respondents wanted to know the selection criteria and how the sorting of content is done. Furthermore, they wished to be able to decide which criteria would be used to display news. At the same time, around three-quarters of respondents were against algorithmic personalization (p. 68). Over 80 percent of the respondents saw the risk that it would intensify social polarization, limit informedness, and reinforce existing opinions (p. 69).

Looking at whether users want to personalize news content, Groot Kormelink and Costera Meijer (2014) found limited public interest in directly personalizing or interacting with the news. Instead, audiences wanted to access all content whenever and wherever they choose, and have a personalized user experience without having to make the necessary choices and selections themselves.

The audience's perceptions of news recommenders seem to depend on audience characteristics such as news information overload and concerns about missing out on challenging viewpoints (Joris et al. 2021). Hendrickx et al. (2021) even argued that "while academia, (media) policy makers and practitioners in general appear to agree that diversity is important" (p. 516), it might not be desirable in all cases. A study by Bodó et al. (2019)

about Dutch news users indicated that personalization's value depended on various factors, such as concerns about a shared news sphere and the depth and diversity of recommendations. Younger, less educated users with little exposure to non-personalized news expressed little concern about diverse news recommendations.

Powers (2017) and Swart (2021) showed an overall problem awareness for low opinion diversity in newsfeeds. Especially younger age groups were aware of possible data misuse and the sharing of their data between companies. However, data-collection practices were not common knowledge, and algorithmic awareness was context-dependent: the more platforms participants used, the more extensively they could reflect on what algorithms are and what they do. Findings by Monzer et al. (2020) emphasized an awareness of the relevance of online news recommendation systems when it comes to filtering through an abundance of information. However, the participants expressed concerns about privacy and data misuse by third parties, while also being worried that their profiles might fail to capture their full complex identities and therefore deliver a poor-quality experience.

Regarding the question of what news content algorithms should recommend, a study by Joris et al. (2021) found that the audience preferred content-based similarity, which was valued over collaborative similarity and content-based diversity. The first two types of preference were based on the recommendation principle of similarity, i.e., the similarity between news content and users, while the third type of preference was focused on diversity. Wieland et al. (2021) also found a preference based on a similarity between articles and the perceived level of novelty of a recommended article. However, personal characteristics such as feeling obligated to stay informed and needing cognitive closure affected these evaluations. These findings imply a risk of creating a filter bubble through selective exposure and a favoring of information that reinforces pre-existing views.

One key to benefitting from news recommender systems as a user is to have a basic understanding of how these systems work to adjust one's own expectations and use strategies to find content accordingly. The so-called algorithm awareness describes a general understanding of the way information is compiled in newsfeeds and the resulting implications (Hamilton et al. 2014). Conversely, algorithmic literacy is "the combination of *being aware* of the use of algorithms in online applications, platforms, and services and *knowing* how algorithms work" (Dogruel et al. 2022, p. 116). However, users seem to be only vaguely aware of how news personalization mechanisms are used by intermediaries (Gran et al. 2021; Powers 2017).

# 5. Public Service Media and Personalization

Universality has long been a core value of PSM, i.e., since PSM still had a monopoly on broadcasting in many European countries. The remit of PSM is to provide a range of programs that inform, educate, and entertain all citizens of a country while reflecting the diversity of society in their journalistic offerings. The idea is to enable citizens to stay informed on relevant societal topics, to form an opinion, and consequently to be able to actively participate in a democracy (Born and Prosser 2001). This was initially achieved by representing diversity in one program or channel. Later, PSM added diversified programs and channels to their generalist channels to serve different audiences and tastes (Van den Bulck and Moe 2018, pp. 876–77). However, these were choices made by editors for imagined audiences, and it was up to the audience to decide whether to consume a certain offering. In recent years, PSM acknowledged the potential of social media platforms and distributed content there as well, while ensuring that public value is not diminished (Stollfuß 2022; Sehl et al. 2018, 2021).

### 5.1. New Technologies for News

New technological opportunities in digital journalism have changed this situation, as nowadays users can consume many programs on demand, and PSM can use new tools, often based on algorithms. Hjarvard (2008) stated that there is "a greater measure of receiver steering of the media [such as PSM], in the sense that attention to receivers has

taken precedence over deference to other social institutions" (p. 119), which favors the selection and presentation of content tailored to the needs and interests of an individual instead of on an aggregate level as discussed above. Beyond these self-build recommender systems to personalize the individual news experience, algorithmic news selection on third-party platforms such as social media has led to several challenges for PSM's core value of universality (for a systematization see, Sørensen and Hutchinson 2018, pp. 100–2).

An interview-based study with PSM representatives across Europe showed that data scientists within PSM organizations were aware of the effects personalization can have on media consumption, and tried to bring it in line with their requirement to distribute diverse content (Hildén 2022). In addition, the above-discussed question of possible filter bubbles versus a shared public sphere, where everyone has access to more or less the same news base to form an opinion on relevant societal issues, also feeds in here. Consequently, Andersson Schwarz (2016) argued, based on a study of PSM in Sweden, that PSM still "counteract[s] acquiescence to algorithmically aided personalization" (p. 124).

While some research exists on the organizational side, the audience side of PSM users is neglected. However, it is important to understand their specific expectations (e.g., regarding the extent of personalization, form(s) of personalization, etc.), concerns, and attitudes for PSM organizations to work on personalization solutions that balance audience expectations and attitudes with their requirements such as universality.

### 5.2. Country-Specific Expectations

This study analyzes expectations, concerns, and attitudes towards the news personalization of PSM users and non-users in three European countries: France, Germany, and the UK. The three countries were strategically chosen as each represents a different Western media system (Büchel et al. 2016; Hallin and Mancini 2004). As such, the survey covers media markets with varying conditions, including Germany, where the well-funded PSM represent what Hallin and Mancini (2004) labeled the democratic corporatist model, the UK, as a representative of their liberal model, and France, as an example of the polarized pluralist model in which commercial media are often dominant. A differentiation between media systems is also relevant because media usage differs depending on media system characteristics, and strong PSM also leads to higher news usage (Wallner 2022). However, not only is PSM usage higher in the UK and Germany than in France (Newman et al. 2022), but citizens also rate PSM performance better in the first two countries (Sehl 2020).

The audience expectations in France, Germany, and the UK regarding PSM are especially relevant as a high information quality standard is attributed to PSM, and a clear distinction from other (digital) media offerings is expected (Sehl 2020). In this respect, it can be expected that there are differences between the expectations, concerns, and attitudes of PSM users and non-users when it comes to news personalization as well as between the three countries following the different significance of PSM in their national media systems.

#### 6. Research Questions

This empirical study seeks to compare the audience perspective on news personalization of users and non-users of PSM news in three European countries. This is relevant because, as outlined above, PSM has a special public service mission that is characterized by universality in access, reach, and content. While news personalization may offer opportunities in this respect, it can also conflict with the principle of universality (Sørensen and Hutchinson 2018; Van den Bulck and Moe 2018). The aim of this study is thus to compare weekly users and non-users of PSM news on various platforms (radio, TV, online) in France, Germany, and the UK in order to identify differences in expectations, concerns, and attitudes towards news personalization for PSM organizations to work on solutions that balance audience perspective with their PSM requirements. At the same time, the comparative design allows the comparison of the findings for the three countries, interpreting them against the background of different media systems (Büchel et al. 2016; Hallin and Mancini 2004) versus algorithmic isomorphism (Caplan and Boyd 2018) as outlined above.

Building on the literature, the research questions for this three-country study are as follows:

RQ1a: How do users of public service news offerings assess the opportunities and risks of personalizing news compared to non-users of public service news offerings?

RQ1b: And how do they especially rate the importance of a shared public sphere compared to non-users of public service news offerings?

RQ2: Which type(s) of personalization do users of public service news offerings prefer compared to non-users of public service news offerings (i.e., no, direct, or various forms of indirect personalization)?

# 7. Method

The study is based on an online survey conducted in France, Germany, and the UK. In each of the three countries, 1010 citizens, representative in terms of gender and age (18–69 years in 10-year groups, e.g., 30–39 years), were sampled and surveyed via an ISO-certified online access panel provider in January 2021. The online access panel included a pool of individuals who agreed to participate in online surveys. Participants received a small incentive to undertake the survey, as is common with online access panel providers. The questionnaire was professionally translated into the relevant languages and scheduled to take 15 min to complete.

The sample consists of 65%, N = 1010 (FR)/77%, N = 1010 (GER)/80%, N = 1010 (UK) public service news users (weekly; radio, TV, and/or online) versus 35% (FR), 23% (GER), 20% (UK) of non-users of those offerings. While the overall sample is representative in terms of gender and age (18–69 years in 10-year groups, e.g., 30–39 years), the sub-groups consisting of users of public service news services are skewed slightly male in all three countries (FR: 53%, n = 655 vs. 50%, N = 1010; GER: 52%, n = 782 vs. 49%, N = 1010; UK: 51%, n = 655 vs. 49%, N = 1010), and are an average of one or two years older than the overall sample (FR: M = 46.61 years (SD = 14.670) vs. 44.18 years (SD = 14.569); GER: M = 46.10 years (SD = 14.595) vs. 44.31 years (SD = 14.562); UK: M = 44.40 years (SD = 14.393) vs. 43.52 years (SD = 14.245)).

This article is based on the following variables:

Sources of news—To be able to differentiate weekly users of public service news offerings from non-users, respondents were asked where they get information about current events at least once a week. Multiple answers were possible. Examples for each media type, public service radio stations, public service television stations, and public service media online, along with categories of commercial media, were explicitly provided to each country (e.g., for PSM in France: France 2; France 3, etc.; France Inter, France Info, France Bleu; franceinfo.fr; in Germany: das Erste, ZDF, BR, etc.; Bayern 1; WDR 2, SWR 3, etc.; tagesschau.de, zdf.de, etc.; and the UK: BBC Radio 1, BBC Radio 2, etc.; BBC One, BBC Two, etc.; bbc.com). For the UK, Channel 4 (a publicly owned and commercially funded public service broadcaster) was treated as a special and separate case. The answer format for the multi-item questions was dichotomous. Questions about the different platforms of PSM, i.e., radio, TV, or online were asked separately, and the responses were aggregated for the analysis below.

Shared public sphere—The perceived impact of news personalization on the public sphere (see Section 3.2) was measured with two statements ("There are news and current affairs that everyone should be familiar with" and "Everyone should have access to more or less the same news base") adapted from Bodó et al. (2019). Where they measured the agreement on a seven-point scale, this study used a five-point scale.

Perceived opportunities and risks of news personalization and preferred form(s) of news selection—Building on Sections 3 and 4, the perceived opportunities and risks of news personalization, and preferred form(s) of news selection were measured by statements taken from a study by Oertel et al. (2018, 2022), which was commissioned by the Office of Technology Assessment at the German Bundestag (TAB). They developed their statements based on extensive research of previous studies and literature on algorithmic

personalization. Respondents were asked to rate their agreement with each statement on a five-point scale.

## 8. Findings

The first research question (RQ1a) deals with perceived risks and opportunities of indirect personalization from the audience's perspective. The awareness of such was measured in two questions in the survey. First, respondents were asked if they had heard of indirect personalization after it was explained to them what it meant. The following question in the survey was aimed at whether they have already noticed indirect personalization and various examples of this were given in sub-questions (news websites or -apps, social media platforms, search engines, or ads). Across all three countries, most respondents have heard of the phenomenon (FR: 64%, *N* = 1010; GER: 78%, *N* = 1010; UK: 75%, *N* = 1010), with a few giving no indication (FR: 8%, GER: 3%, UK: 4%). In addition, most respondents say they have noticed it in their own usage (FR: 71%, N = 1010; GER: 78%, N = 1010; UK: 76%, N = 1010). Regarding the question of how users of public service news offerings assess the opportunities and risks of personalizing news in comparison to non-users of public service news offerings reveals that the attitudes towards news personalization and the perceived opportunities and risks also vary between the two groups of users. In Germany and the UK, users of public service news offerings are significantly more concerned that they could miss out on some important information because of personalized news and that personalized news could mean that they are unaware of other standpoints. In France, on the other hand, there is a significant difference between users and non-users of public service news offerings regarding fears about personalized news endangering privacy. Public service news users are more sensitive to this issue than non-users (see Table 1).

Table 1. Risks associated with the personalization of news.

		France		Germ	any	UK	
	PSM as Source of News (Radio, TV, and/or Online) <sup>§</sup>	M (SD)	п	M (SD)	n	M (SD)	п
I am afraid that I might miss some important information as a result of	no	3.89 (0.895)	334	3.85 (1.04)	218	3.69 (1.07)	192
personalized news. <sup>a</sup>	yes	3.91 (0.966)	637	4.02 (0.984)	750	3.93 (0.961)	782
I am afraid that personalized news might mean that I am not aware of other	no	3.85 (0.925)	326	3.86 (1.08)	216	3.71 (0.979)	190
standpoints. b	yes	3.88 (0.979)	634	4.07 (1.00)	<i>7</i> 55	3.98 (0.917)	779
I am afraid that more personalized news	no	3.67 (1.04)	326	3.69 (1.11)	218	3.63 (0.940)	192
might mean that my privacy is increasingly endangered. <sup>c</sup>	yes	3.81 (0.973)	632	3.65 (1.11)	744	3.60 (1.05)	766

Note: Question: "Focusing now on personalized news, please indicate the extent to which you agree with the following statements." (Scale from 1 = completely disagree to 5 = completely agree); \* p < 0.05, \*\*\* p < 0.01, \*\*\* < 0.001; § in the UK: only the BBC. Superscript letter is used for the F-values.

$A_{FR}$ $F(1.969) = 0.129$	$a_{GER}$ $F(1.966) = 5.156 *$	$a_{UK}$ $F(1.972) = 9.669 **$
$b_{FR}$ $F(1.969) = 0.341$	$b_{GER}$ $F(1.969) = 7.291 **$	$b_{UK}$ $F(1.967) = 12,556 ***$
$c_{FR}$ $F(1.958) = 3.709 *$	$c_{GER}$ $F(1.960) = 0.222$	$c_{UK}$ $F(1.956) = 0.107$

In Germany and the UK, users of public service news offerings agree significantly more than non-users that the personalization of news on the internet leads to existing opinions being reinforced among the public and that this increases the danger of societal polarization. In both countries, there are also significant differences between how the two groups respond to the statement that news personalization on the internet leads to reports

from tabloids about trivial matters being displayed as a priority. Users of public service news agree more than non-users of these offerings. For France, the differences are not significant (see Table 2).

Table 2. Opportunities and risks associated with automated news personalization.

		Fran	France Germany		any	UK	
	PSM as Source of News (Radio, TV, and/or Online) §	M (SD)	п	M (SD)	п	M (SD)	n
stimulates balanced public debate. <sup>a</sup>	no	2.82 (1.07)	305	2.74 (1.20)	202	2.67 (1.07)	183
	yes	2.80 (1.05)	618	2.48 (1.14)	719	2.69 (1.18)	739
prevents people being provided with comprehensive information. <sup>b</sup>	no	3.68 (0.989)	311	3.79 (1.05)	204	3.71 (0.978)	185
with comprehensive information.	yes	3.70 (1.01)	619	3.91 (1.05)	735	3.90 (0.914)	739
leads to reports from tabloids about trivial matters being displayed as	no	3.30 (0.984)	305	3.43 (0.973)	184	3.63 (0.948)	182
a priority. c	yes	3.38 (0.967)	602	3.67 (0.994)	675	3.82 (0.917)	725
is helpful to ensure that an overview is retained in relation to complex	no	3.00 (0.995)	303	2.90 (1.10)	202	2.87 (0.986)	178
matters. d	yes	3.02 (1.03)	607	2.84 (1.10)	715	3.00 (1.08)	737
leads to existing opinions being reinforced among the population. e	no	3.47 (0.973)	305	3.80 (0.965)	203	3.61 (0.943)	183
remiorced among the population.	yes	3.51 (0.962)	620	3.97 (0.888)	714	3.89 (0.865)	740
favors news providers who already enjoy a high level of recognition. <sup>f</sup>	no	3.67 (0.962)	307	3.77 (0.932)	189	3.67 (0.920)	180
enjoy a mgn iever or recognition.	yes	3.68 (0.981)	614	3.83 (0.882)	697	3.76 (0.882)	721
increases the danger of	no	3.63 (0.950)	297	3.83 (0.998)	200	3.72 (0.899)	173
societal polarization. <sup>g</sup>	yes	3.73 (0.931)	612	4.01 (0.911)	716	3.87 (0.929)	725

Note: Question: "To what extent do you agree with the following statements? The automatic personalization of news on the internet . . . " (Scale from 1 = completely disagree to 5 = completely agree); \* p < 0.05, \*\*\* p < 0.01, \*\*\* < 0.001; § in the UK: only the BBC. Superscript letter is used for the F-values.

$a_{FR}$	F(1.921) = 0.088	$a_{GER}$	F(1.919) = 7.587 **	$a_{UK}$	F(1.920) = 0.047
$b_{FR}$	F(1.928) = 0.009	$b_{GER}$	F(1.937) = 1.826	$b_{UK}$	F(1.922) = 6.245 **
$c_{FR}$	F(1.905) = 1.219	$c_{GER}$	F(1.857) = 8.210 **	$c_{UK}$	F(1.905) = 6.175 **
$d_{FR}$	F(1.908) = 0.508	$d_{GER}$	F(1.915) = 0.466	$d_{UK}$	F(1.913) = 2.273
$e_{FR}$	F(1.923) = 0.426	$e_{GER}$	F(1.915) = 5.237 *	$e_{UK}$	F(1.921) = 15.386 ***
$f_{FR}$	F(1.919) = 0.001	$f_{GER}$	F(1.884) = 0.664	$f_{UK}$	F(1.899) = 1.360
gfr	F(1.907) = 2.164	<b>g</b> GER	F(1.914) = 6.105 **	guk	F(1.896) = 4.007 *

In Germany, users of public service news offerings are significantly more skeptical than non-users that news personalization on the internet stimulates balanced public debate.

In the UK, there is a significant difference between the two groups in how they respond to the statement that the personalization of news on the internet prevents people from being provided with comprehensive information. Users of public service news offerings agree more strongly than non-users.

To answer the question of how users of public service news offerings rate the importance of a shared public sphere compared to non-users of public news services (RQ1b), an F-test comparing weekly users and non-users of various PSM platforms (radio, TV and/or, online) was conducted. The findings show that in Germany and the UK, users significantly value the idea of a shared public sphere more than non-users; a substantial majority of public service news users in all three countries even value a shared public sphere, i.e., the idea that there are news and current affairs everyone should be familiar with, and that everyone should have access to more or less the same news base. These users emphasize the PSM value of universality. However, in France, the difference is not significant (see Table 3).

**Table 3.** The importance of a shared public sphere.

		Fran	France		any	UK	
	PSM as Source of News (Radio, TV, and/or Online) <sup>§</sup>	M (SD)	п	M (SD)	n	M (SD)	n
There are news and current affairs that everyone should be familiar with. <sup>a</sup>	no	4.17 (0.045)	336	4.33 (0.844)	218	3.76 (0.884)	196
everyone should be failulat with.	yes	4.18 (0.034)	643	4.50 (0.736)	771	4.18 (0.794)	788
Everyone should have access to more or less the same news base. b	no	3.69 (0.054)	333	4.06 (1.02)	217	3.75 (0.902)	196
less the same news base.	yes	3.76 (0.041)	640	4.31 (0.866)	764	4.01 (0.896)	786

Note: Question: "Please indicate the extent to which you agree with the following statements." (Scale from 1 = completely disagree to 5 = completely agree); \*\* p < 0.01, \*\*\* p < 0.001; § in UK only BBC. Superscript letter is used for the F-values.

$a_{FR}$ $F(1.977) = 0.057$	$a_{GER}$ $F(1.987) = 7.994 **$	$a_{UK}$ $F(1.982) = 42.727 ***$
$b_{FR}$ $F(1.971) = 1.104$	$b_{GER}$ $F(1.979) = 13.229 ***$	$b_{UK}$ $F(1.982) = 12.684 ***$

The preferred type(s) of personalization (i.e., no, direct, or various forms of indirect personalization) by weekly public service news users (radio, TV, and/or online) compared to non-users of those services (RQ2) indicate(s) significant differences. The F-tests prove that in France and Germany, users of public service news offerings primarily prefer content from (professional) news editors more than non-users of public service news offerings and in this sense not personalization but professional selection. Accordingly, the weekly users of public service news offerings agree less than the non-users with the statement that content should be based primarily on the recommendations of family, friends, or acquaintances, although this is the statement with the lowest level of agreement from both groups. The differences in the French sample are not significant. For the UK, most surveyed criteria show significant differences between users and non-users of public service news services (see Table 4).

Across all three countries and both user groups, respondents express a desire to decide the criteria according to which news is displayed for themselves (i.e., hinting at a preference for direct personalization), and for transparency in how content is selected and sorted.

When asked how they rate the scope of personalization options offered by websites/apps of public service media, users of public service news offerings across the three countries are predominantly of the opinion that the scope of personalization is "just right" (FR: 64%, n = 644; GER: 62%, n = 595; UK: 66%, n = 673). Only around a fifth and a quarter feel that the websites/apps of public service broadcasters offer "too much" personalization (FR: 19%, GER: 26%, UK: 26%). Even fewer feel there is "too little" opportunity for personalization (FR: 17%, GER: 12%, UK: 8%).

**Table 4.** Preferred criteria for news selection.

		Fran	ce	Germ	any	UK	
	PSM as Source of News (Radio, TV, and/or Online) <sup>§</sup>	M (SD)	п	M (SD)	п	M (SD)	п
Primarily content from (professional)	no	3.18 (1.01)	304	3.64 (1.17)	208	3.07 (0.971)	177
news editors. <sup>a</sup>	yes	3.26 (0.999)	606	4.00 (3.62)	751	3.34 (1.03)	747
Primarily content based on the recommendations of my family, friends,	no	2.70 (1.13)	308	2.38 (1.15)	207	2.57 (1.05)	182
or acquaintances. b	yes	2.64 (1.14)	610	2.14 (1.09)	738	2.46 (1.18)	758
Primarily reports from my region. <sup>c</sup>	no	3.40 (0.971)	309	3.37 (1.09)	211	3.01 (1.05)	181
	yes	3.44 (1.02)	625	3.25 (1.12)	757	3.16 (1.07)	760
Primarily content based on areas of	no	3.35 (1.02)	308	3.20 (1.14)	204	3.16 (0.959)	179
interest that I have specified. <sup>d</sup>	yes	3.31 (1.05)	618	2.99 (1.21)	753	3.33 (1.06)	764
I want to decide for myself the criteria	no	3.93 (0.890)	313	4.10 (0.952)	207	3.79 (0.935)	185
according to which news is displayed. <sup>e</sup>	yes	4.03 (0.889)	623	4.13 (0.940)	750	4.03 (0.911)	767
Primarily content from news editors selected by me in advance. <sup>f</sup>	no	3.34 (1.04)	303	3.24 (1.13)	206	3.03 (1.01)	177
selected by the in advance.	yes	3.28 (1.00)	617	3.17 (1.12)	737	3.10 (1.07)	749
I do not want content to be	no	3.66 (1.05)	314	3.87 (1.18)	212	3.85 (1.01)	185
personalized automatically. <sup>g</sup>	yes	3.76 (1.09)	626	3.97 (1.01)	750	3.91 (1.02)	760
I wish to be informed of the criteria used	no	3.62 (1.05)	306	3.75 (1.01)	204	3.73 (0.943)	183
for the selection and sorting of content. <sup>h</sup>	yes	3.80 (0.986)	618	4.00 (0.981)	747	3.94 (0.890)	755

Note: Question: "Which selection criteria do you favor?" (Scale from 1 = Completely disagree to 5 = Completely agree); \*p < 0.05, \*\*p < 0.01, \*\*\* < 0.001; § in the UK: only the BBC. Superscript letter is used for the F-values.

$a_{FR}$	F(1.908) = 1.179	$a_{GER}$	F(1.957) = 19.451 ***	$a_{UK}$	F(1.922) = 9.487 **
$b_{FR}$	F(1.916) = 0.576	$b_{GER}$	F(1.943) = 7.812 **	$b_{UK}$	F(1.938) = 1.486
$c_{FR}$	F(1.932) = 0.331	$c_{GER}$	F(1.966) = 1.820	$c_{UK}$	F(1.939) = 0.438
$d_{FR}$	F(1.924) = 0.303	$d_{GER}$	F(1.955) = 5.052 *	$d_{UK}$	F(1.941) = 4.053 *
$e_{FR}$	F(1.934) = 2.937	$e_{GER}$	F(1.941) = 0.156	$e_{UK}$	F(1.950) = 10.201 ***
	F(1.918) = 0.702	$f_{GER}$	F(1.960) = 0.548	$f_{UK}$	F(1.924) = 0.522
$g_{FR}$	F(1.938) = 1.844	<b>g</b> GER	F(1.949) = 1.394	guk	F(1.943) = 0.396
$h_{FR}$	F(1.922) = 6.669 **	$h_{GER}$	F(1.960) = 10.91 ***	$h_{UK}$	F(1.936) = 7.575 **

Overall, public service news users state significantly more often than non-users that they have not personalized information on news websites/-apps, social media platforms, or search engines (FR: 64%, n = 655 vs. 36%, N = 1010; GER: 76%, n = 782 vs. 24%, n = 1010; UK: 78%, n = 655 vs. 22%, N = 1010; p < 0.001).

To take further potential influencing into account and to test for a confoundation, a regression analysis of predictors for direct personalization was conducted in addition to the F-tests. The findings show that age and interest in politics are significant predictors in the

French sample if users have already directly personalized information on websites/apps, social media platforms, or search engines—but not the use of public service news. In the German sample, age and—different from the France sample—the use of public service news are significant predictors. In this sense, the other variables in the model, e.g., age, do not confound the effect of the use of public service news offerings here. In the UK, age, male gender, and an interest in politics are significant predictors. Public service news use is not a significant predictor when controlling for further variables (see Table 5). Although it has to be stated that the p-value of p = 0.071 is not far from the significant p-value threshold of  $\leq 0.05$ .

<b>Table 5.</b> Linear regression analysis of predictors for	or direct personalization.
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		ß (Std. Error)	
DV = Direct Personalization of Information (on News Websites/-Apps, Social Media Platforms, or Search Engines)	France	Germany	UK
PSM news use (weekly)	0.022 (0.028)	0.066 (0.037) *	0.056 (0.036)
Age	-0.154 (0.001) ***	-0.203 (0.001) ***	-0.209 (0.001) ***
Gender (male)	-0.002(0.027)	0.052 (0.032)	0.081 (0.031) *
Political interest	0.161 (0.013) ***	0.039 (0.016)	0.164 (0.014) ***
N	1002	1006	1006
Adjusted R2	0.040	0.033	0.067

Notes: Columns showing standardised beta coefficients. \* p < 0.05, \*\*\* p < 0.001. N differs by country due to missing data for "Do not know"-option for IV "Political interest".

These findings are partly in line with the results of the F-tests outlined above, which showed significant differences between users of public service news offerings in Germany and France. For the UK, following the F-tests, one could have expected that public service news use is also a significant predictor, but this effect disappears when controlling for the other variables. Possible reasons for the national differences, especially between France and Germany, will be discussed in the conclusion below.

## 9. Conclusions and Discussion

New possibilities for news personalization through algorithms or by individuals themselves have led to an ongoing debate in academia and journalism about the resulting challenges and opportunities for media organizations. This paper added to this ongoing debate on (algorithmic) news personalization by focusing on (1) PSM and their audience expectations from (2) a national-comparative perspective, a combination previously neglected. This perspective is especially relevant as PSM are obliged to the universality of access, reach, and content, which stems from their special public service mission. While news personalization may provide opportunities in this respect, it can also conflict with the principle of universality (Sørensen and Hutchinson 2018; Van den Bulck and Moe 2018).

Building on previous research findings, we specifically explored attitudes towards and perceived opportunities and risks of news personalization among the two groups of weekly users and non-users of public service news on various platforms (radio, TV, online) by means of an online survey in January 2021. The survey was conducted with 1010 citizens in each of the three countries (France, Germany, and the UK).

The findings provided a nuanced picture of news personalization from an audience perspective. Overall, they showed that users of public service news in Germany and the UK—in comparison to non-users of these services—perceived more risks such as missing out on certain topics or viewpoints, placed greater value on a shared public sphere, and more strongly preferred a news selection made primarily by professional news editors. In France, however, the differences between users and non-users of public service news were rarely significant, which this study interpreted against the background of the different media systems and the role of PSM in these systems.

Across all three countries, users of public service news offerings generally considered the overall level of possible personalization to be "just right", but at the same time stated that they rarely used personalization options on websites/apps, social media platforms, or search engines, especially compared to non-users.

An additional regression analysis revealed that public service news use was a significant predictor of whether users had already directly personalized information on news websites/-apps, social media, or search engines in Germany, despite controlling for further variables including age, male gender, and political interest. As to be expected following the F-tests, this was not the case in France. However, also in the UK, public service news use was not a significant predictor when controlling for further variables. Although it has to be stated that the p-value of p = 0.071 was not far from the significant p-value threshold of  $\leq 0.05$ .

A possible explanation for this, especially for the consistent differences between France and Germany, could be the different media systems in these countries, which were a rationale behind the sampling. While this study considered the UK as representative of the liberal model and Germany as representative of the democratic-corporatist model in accordance with Hallin and Mancini's (2004) three models, other scholars have contested this classification for the UK because of its strong PSM (and polarized press) (Norris 2009, pp. 333–34). It is thus not surprising that in both countries the opinions of users and non-users of public service news offerings differed significantly.

In France, PSM have a different status in society. France belongs to the polarized pluralist model, in which commercial media are often dominant (Hallin and Mancini 2004). Also, while the direct influence of the political system on PSM content is unusual in Germany and the UK, in France PSM are effectively subject to greater influence by the state (Nord 2015, p. 184). This leads Kuhn (2006) to summarize: "France Télévisions does not enjoy the same status or legitimacy in the French media landscape that the BBC has in the UK equivalent" (p. 20). Consequently, this could explain why the findings for France differed.

The findings expand on previous studies, e.g., by Powers (2017) and Swart (2021), who compared different media users and concluded that the overall level of problem awareness about opinion diversity in newsfeeds is low. This study also confirms the finding of Groot Kormelink and Costera Meijer (2014) that there is a limited public interest in direct news personalization.

The findings add to the understanding of what public service news audiences expect from PSM organizations to achieve the difficult balance between personalization and universality. When it comes to personalizing their news services, PSM should thus be very cautious to ensure that they can meet not only their obligation but also the expectation of their users—e.g., regarding a diversity of topics and viewpoints. PSM users across the three countries stressed the importance of transparency in news personalization. Therefore, when PSM use recommender systems, they should explain how they work. Users who do not wish to get personalized news should also be able to opt out and get the full editorial selection.

This study focused on three countries with somewhat different media systems. By extending the study to more countries and including more aspects in the comparative design than our study did (the focus was primarily on the dimension of media users), future studies could further explore if and how the differences in findings are related to media systems.

Future research could also explore in more detail whether expectations of personalization (of PSM) depend on national contexts. This study has taken a first step towards surveying what PSM users, in particular, expect from personalization in public service news. These user expectations could be explored in more depth in subsequent qualitative research, which could also factor in media literacy and thus complement existing research on recommender systems by incorporating the normative perspective of democratic theory.

As is always the case, the present study's findings are subject to several limitations. It is still uncertain whether the participants clearly understood the concept of personalization. As stated by Monzer et al. (2020, pp. 1151-52), there is a knowledge gap when it comes to using options for news personalization, especially in the context of algorithms and social media (Eslami et al. 2015, p. 156; Fletcher and Nielsen 2019). At the same time, different levels of privacy concerns could also have had an influence, as people may be sensitive to privacy issues associated with third-party cookies or tracking, which are used to personalize news. In addition, the sample was only representative in terms of gender and age, specifically only for the age group of 18-69 years in 10-year groups, for example, 30-39 years. It would have been desirable to include representability in terms of other variables such as formal education and political leanings, amongst others. This must be kept in mind as a limitation when interpreting the findings. We also tied the use or non-use of PSM for news to an at least weekly use of public service news offerings (radio, TV, online). This threshold could also have been chosen differently, e.g., daily or monthly. Finally, our sample was based on three types of Western media systems. Based on work by Hallin and Mancini (2012) and Humprecht et al. (2022), it may well be assumed that the perception of news personalization in other regions is somewhat different on account of the specific conditions of the media systems in these regions. This perception could also be affected by aspects of digitalization.

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