#### Publication Patterns in the Humanities: Generational 1 Shifts and Changing Research Agendas 2

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#### Abstract 12

13 The humanities have distinct publication practices compared to the sciences, with books and 14 local language literature being essential. This study aims to identify and analyze the 15 publication patterns of humanities scholars in Spanish-speaking countries, revealing unique 16 publication behaviors and fostering diverse perspectives rather than linear knowledge 17 progression. We analyzed the publication histories of approximately 40,000 scholars from 1950 to 2021 using data from the Dialnet database. By identifying archetypal publication 18 profiles, we explored their distribution across generational cohorts and research topics. Our 19 20 findings reveal substantial generational shifts towards journal-centric publication patterns 21 probably influenced by bibliometric-driven evaluation systems. The also show a relation 22 between publication patterns and research topics. This highlights the need for more inclusive 23 assessment practices that recognize the diverse nature of humanities scholarship. We 24 contribute to ongoing discussions on promoting bibliodiversity in research assessment and 25 the potential impacts of current policies on the humanities.

#### **Keywords** 26

27 humanities, publication patterns, bibliodiversity, research evaluation, Spanish-speaking 28 countries, generational shifts 29 30 31 32 33 34 35 36 37 38 39 40 41 This is a preprint and has not undergone peer review 42 The final published version may differ (cc 43 10.5281/zenodo.13969299



44 The humanities are distinct from other sciences. Unlike other disciplines, books remain an essential format of scientific publishing<sup>1–3</sup>, and their target audience is often more scattered 45 46 and diverse<sup>4,5</sup> with non-English literature playing an important role in its dissemination<sup>6</sup>. They 47 exhibit different citation patterns compared to those in other research fields<sup>7</sup>: older works are 48 more likely to still be cited<sup>5</sup>, and research primarily involves exploring new perspectives and fostering the coexistence of competing knowledge rather than following a linear process of 49 50 development characterized by big breakthroughs<sup>8</sup>. Furthermore, solo research is still 51 common<sup>9</sup>. This leads to diverse valuation regimes<sup>10,11</sup> making research evaluation a highly controversial issue<sup>12,13</sup>. This lack of consensus is related to the social structure of these fields, 52 generally organized around schools of thought or 'tribes'<sup>14</sup> which compete, contrasting with 53 the 'paradigmatic' organization of the Natural and Exact Sciences<sup>15</sup>. These differences have 54 sometimes been interpreted as weakness of humanities<sup>16,17</sup>, rather than merely different 55 56 research styles.

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58 Given the particularities of the humanities, a body of literature has been built within the fields 59 of scientometrics and research evaluation over the last twenty years trying to tackle such 60 challenges. There is a widespread recognition of the need to better understand the dynamics 61 of humanities<sup>18</sup>. For this, studies have focused mainly on three issues: differences on 62 publication patterns, database coverage limitations <sup>19–22</sup>, and the validity of citations as a *proxy* 63 for impact or quality<sup>8,23</sup> proposing a range of alternative indicators<sup>3,24,25</sup>.

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This study is framed within the first stream of literature, that is, the understanding of publication patterns within the Humanities. Our goal is to identify types of humanists based on their publication patterns and understand the factors underlying the differences between these types. We want to understand to what extent humanists tend to publish in a diverse range of outlets. Is it common to all fields? How is a journal-centric evaluation culture affecting their publishing habits<sup>26</sup>? What is the role played by language<sup>27</sup>, database indexing<sup>28–30</sup>, scope<sup>31,32</sup> or research topic<sup>28,31,33</sup>?

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73 To this aim, we analyze publication patterns of individual scholars during their complete 74 academic career. We examine the publication history of 39,753 scholars from Spanish 75 speaking countries who started publishing from 1950 onwards up to 2021. We consider around 76 1.2 million publications in all outlets and languages, studying 13 different fields from the 77 humanities. Our dataset is extracted from Dialnet (https://dialnet.unirioja.es/), a specialized 78 bibliographic database focused on the social sciences and humanities, maintained by the Dialnet Foundation<sup>34,35</sup>. The uniqueness of this data lies not only on the richness of publication 79 types and languages, but also by the fact that author profiles are manually curated and 80 81 regularly updated by Spanish university, public and special libraries related to the Dialnet Foundation through a consortium agreement. This allows us tracking their complete 82 83 publication history, identify their starting publishing date, compute their career length or differentiate between outputs indexed and non-indexed publications in mainstream 84 85 bibliometric databases (i.e., Scopus and Web of Science).

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Based on this dataset, we built eight variables for each scholar, defining their publication patterns by publication type, language, and database indexing. We then computed an archetypal analysis<sup>36</sup> per discipline. This allows us to identify prototypical types of humanists based on their publication patterns. A hierarchical clustering analysis allowed us to group archetypes across fields, identifying six distinct publication profiles in the humanities. We then

92 computed distance measures between each scholar and archetype to measure their 93 resemblance to them. Furthermore, we assigned scholars to their most similar archetype and 94 explored differences between archetypes in terms of generational cohort, and research topic. Topics were identified by applying the Leiden community detection algorithm<sup>37</sup> to a co-95 96 occurrence network based on keywords extracted from publication titles. Then, we computed 97 the Jaccard distance between archetypes across fields in order to identify differences in the topics studied by humanists based on their publication profiles. Further details are provided in 98 99 the Data and Methods section.

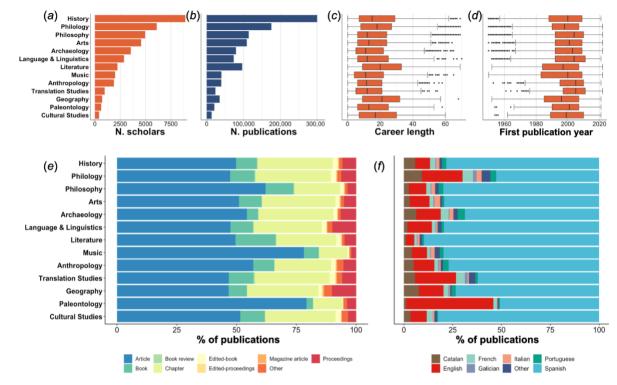
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101 We contribute to current literature in several ways. First, we analyze publication patterns at 102 the author level, revealing the extent of variation and contributing to the debate on the diverse literatures within the humanities<sup>9,38</sup>. Second, we offer novel insights into current research 103 104 policy discussions on promoting bibliodiversity in research assessment and the potential risks 105 of policies that alter publication habits<sup>26,39</sup>. Finally, we examine the relationship between 106 research topics, language and geographic outreach —an under-researched issue often 107 mentioned to resist changes in publication patterns within the humanities <sup>6,31</sup>.

### **Results** 108

#### Distribution of scholars by field and general publication trends 109

110 We explore the publication patterns of 39.753 humanists distributed among 13 research fields (Fig. 1). Historians, philologists, and philosophers represent half of the population (50.2%). 111 112 whereas Geography, Paleontology and Cultural Studies account for less than 5% of the 113 population (a). This distribution is modified slightly when looking at productivity differences 114 among fields (b). The proportion of outputs from the three largest fields increases slightly to 115 52.7%, with History representing more than a guarter of the publications (26.8%), that is 4.3% higher than expected. Literature also produced more publications than expected compared to 116 117 other fields, with a difference of 3.0 points. Conversely, Philosophy constitutes 12.4% of the 118 workforce but accounts for only 10.2% of all publications.



**Fig. 1 Descriptives of population of scholars and outputs by field.** (a) Distribution of scholars by research field and (b) publications. (c) Boxplot of academic ages by field. Career length refers to the difference between their first and last years of publication. (d) Boxplot of the distribution of first year of publication by field. This is used to describe generational differences among scholars. (e) Distribution of publications by publication type and field. (f) Distribution of publication by language and field. Data filtered to scholars with publications since 1950 and with more than one publication and include all publication types.

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129 The distribution of career lengths and first publication years of scholars across fields reveals 130 significant variations. In terms of career length (c), Literature and Geography stand out with 131 the highest mean values (21.7 and 21.2 respectively), indicating the presence of more senior 132 scholars in these fields. By contrast, scholars from fields such as Translation Studies, 133 Anthropology, and Music have shorter career lengths on average, indicating a younger 134 academic workforce. Regarding generational differences (d), most scholars began their 135 academic career during the 1990s and 2000s; however notable differences exist across fields. 136 Translation Studies and Anthropology show the most recent mean entry points into academia, 137 with means around 2003 and 2002, and medians both in 2005. On the other hand, Literature 138 and Geography have the oldest mean first publication years, around 1995, indicating a more 139 established cohort of scholars.

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141 Regarding publication patterns (e), articles are the predominant publication type across most fields, particularly in Paleontology (79.2%) and Music (78.1%). Philosophy also shows a high 142 143 proportion of articles (62.0%). In contrast, fields like Philology and History, while still favoring articles (47.4 and 49.7%, respectively), show a larger presence of book chapters (31.6 and 144 31.4% respectively). The prevalence of books is particularly notable in Literature (16.8%) and 145 146 Philosophy (11.7%). Fields like Anthropology and Archaeology exhibit a balanced distribution 147 between articles and chapters, with Translation Studies showing 46.8% articles and 31.3% 148 chapters, Philology with 47.4% articles and 31.6% chapters, and Geography with 46.6% of

articles and 29.8% of chapters. In terms of publication language (f), Spanish is the dominant
language in most fields. It accounts for 89.8% of publications in Literature, 82.6% in Cultural
Studies and 79.9% in Philosophy. In contrast, Paleontology stands out with a significant
proportion of outputs in English language publications (44.5%). English also plays a notable
role in fields like Translation Studies (30.0%) and Philology (20.8%). Other languages such as
Catalan, French and Portuguese are also present but to a lesser extent. Catalan is particularly

155 present in Philology (9.2%) and Geography (7.6%).

## 156 Humanists' publication profiles

157 For each scholar, we defined eight variables to describe their publication patterns to better 158 understand their preferred outlets. Six of these variables relate to publication types: four relate 159 to authored publications (journal articles, books, chapters and proceedings), and two with edited publications (edited conference proceedings and edited books). The other two variables 160 161 relate to the geographic scope of the output. One relates to the number of non-English 162 publications and the second to the number of publications indexed in mainstream international 163 scientific databases (i.e., Scopus and Web of Science). Further details on the data processing 164 and methodological design are provided in the Data and Methods section.

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166 Using these variables, we applied an archetypal analysis to identify the types of publication profiles exhibited by humanists. Archetypal analysis<sup>36,40</sup> is a methodology used to identify 167 extreme points in a multidimensional dataset that best represent the diversity of the data. 168 169 Unlike traditional clustering methods, which group similar data points into clusters, this method identifies pure or idealized examples within the data, providing a convex hull that 170 171 encompasses the dataset. Furthermore, it provides a similarity measure, called the  $\alpha$ -score, 172 which indicates how similar each case is to the identified archetypes. The number of archetypes is defined by following an elbow criterion after plotting the screeplot of a residual 173 174 sum of squares (RSS) analysis (Appendix, Fig. A1-14). Hence, the number of archetypes identified varies per discipline, with 8 disciplines exhibiting three different archetypes and 5 175 176 disciplines exhibiting 2. In order to identify similarities across fields, we conducted a 177 hierarchical clustering analysis of all archetype-discipline combinations. In this way, we are 178 able to identify commonalities and differences of profiles across and within disciplines.

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180 Overall, we have identified six profiles which are spread across the humanities. Figure 2 181 displays a heatmap with the parameters for all archetypes. Archetypes are sorted and grouped 182 according to the hierarchical clustering analysis. Fields on the right side of the y-axis are 183 numbered according to the archetype assigned. To enhance readability and engagement, we gave each cluster of archetypes or profile, a descriptive name that reflects its core 184 characteristics. These are the following: the bridger, the cosmopolitan, the local chronicler, the 185 sage, the polymath and the collaborator. By naming these profiles, we aim to provide a clearer 186 understanding of the diverse publication practices in the humanities and highlight the 187 188 generational and cultural shifts influencing these patterns.

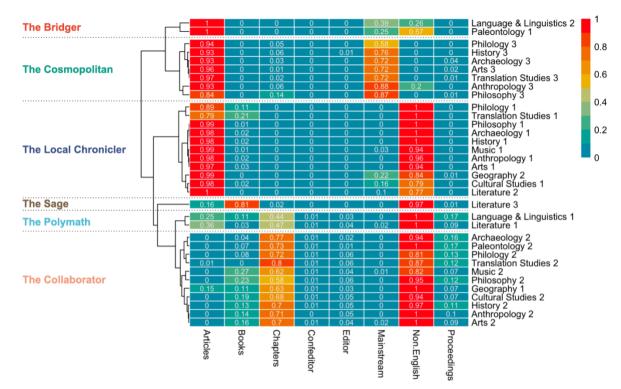


Fig. 2 Clustering of archetypes in the humanities. Description and characterization of the six clusters of archetypes identified for the complete population of scholars. Rows show the parameters associated with each archetype, with labels on the right side of the heatmap indicating the discipline and a number which corresponds with each of the archetypes identified within the discipline. Rows are grouped based on a hierarchical clustering with labels on the left side indicating the name of the cluster. Values are normalized 0-1 based on the proportion of output expected by scholars based on the eight variables (columns) analyzed.

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The most widespread profiles are those of the collaborators and the local chroniclers, which 199 200 are both present across 11 of the 13 disciplines analyzed. In the case of the collaborators, the 201 two fields in which they are absent are Language & Linguistics, and Literature. This profile is 202 characterized by publishing in national languages mainly. We name them collaborators as 203 they tend to participate in collaborative works with book chapters as their preferred publication 204 venue. However, researchers exhibiting a collaborator publication profile will occasionally use 205 any of the other publication venues analyzed, except for journal articles indexed in Web of 206 Science or Scopus. In the case of the local chroniclers, these are present in all disciplines 207 except for Language & Linguistics, and Paleontology. They are characterized by publishing 208 mainly journal articles in national language (i.e., non-English), and only occasionally books or 209 in indexed journals.

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211 The third most common profile is that of the cosmopolitans. Named like that due to the high 212 proportion of publications which are placed as articles in mainstream journals. Cosmopolitans 213 are present in 7 disciplines, these are: Philology, History, Archaeology, Arts, Translation 214 Studies, Anthropology and Philosophy. Next, we observe two publication profiles which are 215 only present in two disciplines respectively. These are the bridgers and the polymaths. 216 Bridgers are scholars who primarily publish journal articles, engaging with both national and 217 mainstream communities by publishing in both, in national and English languages, as well as 218 in indexed and non-indexed journals. These scholars are present in the disciplines of 219 Language & Linguistics, and Paleontology. On the other hand, polymaths tend to use a wide

variety of publication venues, similarly to the profile of the collaborators, although with a lesser
emphasis on book chapters. And again, they publish in non-English languages and in nonmainstream journals. These scholars are present in Language & Linguistics, and Literature.
Finally, we observe one profile which is distinctive of just one of the disciplines in the
Humanities, that is the sage, which is only present in Literature. These scholars are
characterized by publishing mainly monographs in national language, although occasionally
also publishing journal articles.

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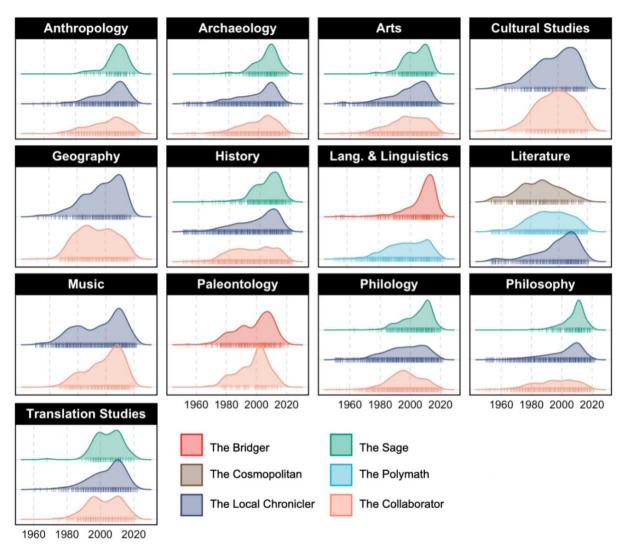
Overall, we observe how publication choices are varied within the humanities, with different publication patterns observed within and across fields. While many similarities exist among some of the identified profiles, others are unique to specific disciplines, reflecting the richness and diversity of publication habits.

## 232 Generational differences on publication patterns by field

Next, we hypothesize the existence of different profiles within disciplines as a reflection of a generational shift, where publication patterns respond to the context in which they are produced. Phenomena such as bibliometric-driven evaluation systems, a Publish or Perish culture, and a generation of digitally native scholars who may prioritize novelty and shorter communication formats over longer, more reflective works, could be driving these differences across cohorts.

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240 We explore this in Figure 3, which plots the distribution of publication profiles across disciplines 241 over time. The x-axis represents scholars' first publication year which is used as a proxy for 242 their generational cohort, ranging from 1960 to 2020. The data reveals that generational shifts 243 are taking place both, in terms of dominant archetypes within disciplines, and the emergence 244 of new publication profiles. Similarities can be found in the fields of History, Anthropology, 245 Archaeology and the Arts, where there is a significant rise of the cosmopolitan profile among 246 younger scholars, indicating a stronger preference for publishing articles in indexed journals 247 and engaging in a global academic discourse. Meanwhile, the other two profiles, the 248 collaborator and the local chronicler, remain cross-generational, suggesting a more stable 249 presence in these fields across different cohorts. A similar trend is observed in Philology and 250 Philosophy, where the cosmopolitan profile has become more prominent among newer 251 generations. However, these show that the collaborator profile is adopted by older scholars, 252 with a marked decline especially in Philology since the late 1990s, indicating a shift from 253 publishing in collective monographs.



255 1960 1980 2000 2020
 256 Fig. 3 Generational shifts in publication profiles across disciplines. Density plots by discipline on
 257 the distribution of scholars based on their first publication year. The color of the density plots

the distribution of scholars based on their first publication year. The color of the density plots corresponds to the publication profiles identified in Fig. 2 to facilitate comparisons within and across fields.

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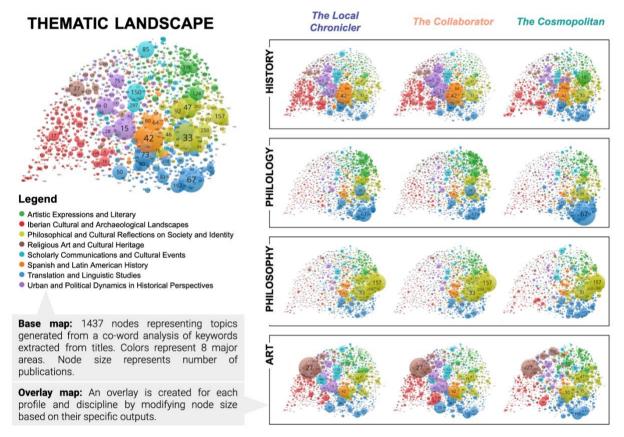
261 In Cultural Studies and Geography, we observe a clear generational shift from the collaborator 262 profile, characterized by publishing mainly book chapters, to the local chronicler, which 263 prioritizes journal articles in national language. This transition is more pronounced in 264 Geography, whereas in Cultural Studies, the shift peaks for scholars who began publishing in 265 the 2010s. But there is no dominant pattern across fields, reflecting the richness and diversity 266 of the humanities in terms of publication patterns. In the case of Music, for instance, the pattern 267 is somewhat the reverse, with the local chronicler being a cross-generational profile and the 268 collaborator profile being adopted by younger generations.

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Paleontology is a unique case, showing distinct patterns compared to other disciplines. Here the bridger—who combines publishing in national language with mainstream journals—, and the collaborator profiles are present across multiple generations, showing a more balanced distribution of these archetypes. But we do notice a shift between the 2000s and the 2010s generations towards the bridger profile which could reflect an effort in the field towards internationalization.

277 Other distinct cases include Language & Linguistics, and Literature. In the case of the former, 278 two profiles are present: the polymath, who tends to use a diversity of publication venues and formats, and the bridgers. Scholars showcasing the polymath profile are cross-generational, 279 280 while there is a clear rise of scholars with a bridger profile among recent generations, pointing towards an effort to reach wider and more international audiences. Finally, Literature is the 281 282 only discipline exhibiting the sage profile, characterized by scholars who primarily publish 283 books. However, this profile is associated with older generations of scholars. In contrast, 284 newer generations in the field tend to exhibit a polymath and a local chronicler profile, 285 suggesting a shift in terms of publication practices. The dominance of the local chronicler 286 profile still suggests the importance of national-language journals within the field over 287 mainstream journals.

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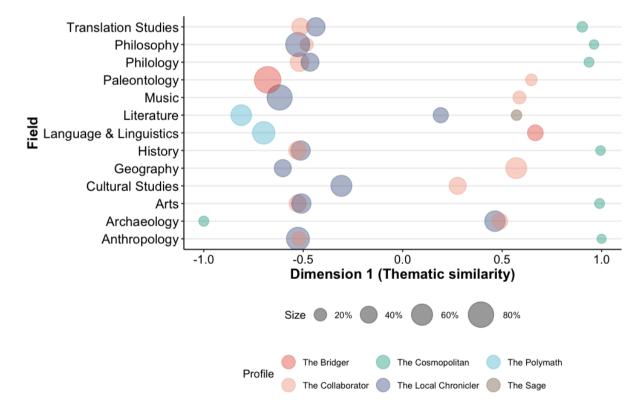
Fig. 4 Thematic landscape and comparison of research portfolios by archetype in History, Philology, Philosophy and Arts. Top-left shows the base thematic map based on a co-occurrence matrix of keywords extracted from titles for the complete population. Right side include the research portfolio of scholars in each discipline by publication profile.

## <sup>294</sup> The relation between research topics and publication patterns

Next, we explore how publication patterns may affect topic selection. We translated non-English titles into English and extracted keywords using the ChatGPT API<sup>41</sup>. We then applied the Leiden community detection algorithm<sup>37</sup> to group keywords into clusters or topics. We identified a total of 1,437 topics (see Supplementary material to read the list of topics) which were clustered into eight major areas. Based on these topics, we created a vector for each archetype-discipline combination, representing the distribution of records among topics. A detailed description of the methodological approach followed is provided in the Data andMethods section.

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304 Fig. 4 shows the resulting thematic landscape for the complete dataset along with overlayed 305 maps of different archetypes and fields as illustrative examples. The top-left of Fig. 4 shows 306 the thematic landscape for all fields, with numbered nodes representing topics, their size 307 indicating the number of publications within each topic and colors depicting major areas. The largest topics are Philosophical Approaches to Cultural Studies (node 33, 43,749 308 309 publications), followed by Historiographical Evolution in Spanish-Speaking Contexts (node 42, 310 43,474 publications) and Teaching and Learning Strategies in Second Language Acquisition 311 (node 67, 35,199 publications). Topics are linked based on the co-occurrence of keywords 312 across topics. The right side of Fig. 4 showcases the overlayed maps for the archetypes 313 identified in the fields of History, Philology, Philosophy and Arts. Overall, we observe how 314 different fields will concentrate their publications in different major areas. For instance, in the 315 case of History, we observe a larger concentration within the area of Spanish and Latin 316 American History, while in Philology, most of the publications revolve around the area of 317 Translation and Linguistic Studies. A visual inspection of the map within fields does not reveal 318 clear differences across publication profiles. For instance, archetypes in Philosophy seem 319 quite similar in terms of topic distribution. However, in the case of the cosmopolitan profile in 320 Arts or Philology, we do see some differences with the other two profiles. 321



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Fig. 5 Thematic similarity of profiles across academic fields. This figure shows the results of a onedimensional Multidimensional Scaling (MDS) analysis, which projects the thematic similarity between humanist profiles for each field. Points that are closer together on the X-axis indicate profiles that are thematically more similar within the same field. The color of each point represents the type of profile, and the size of the points indicates the percentage of humanists from each field associated with that profile.

330 In Fig. 5 we look systematically into such differences. For this, we vectorize the distribution of 331 topics among archetype-discipline combinations and compute within each discipline, the 332 similarity between thematic profiles using the Jaccard distance. The distances are available in 333 Table A1. In this way, we assess the extent to which scholars associated with different 334 archetypes share common research topics. To visualize such distance, we apply a one-335 dimensional Multidimensional Scaling (MDS, see the Data and Methods section). Fig. 5 shows 336 the relative position of each profile within their respective fields, with the x-axis representing 337 the thematic similarity and the size of each bubble corresponding to the proportion of scholars 338 exhibiting each profile.

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340 As observed, clear thematic distinctions emerge between publication profiles. Scholars 341 exhibiting a cosmopolitan profile tend to publish on topics that are distinctly different from those 342 associated with other profiles. In contrast, when the local chronicler and collaborator profiles 343 coexist, they generally engage with similar research topics, with the notable exceptions of 344 Geography and Cultural Studies, where their thematic focus diverges more substantially. The 345 polymath profile is also another which clearly distinguish itself thematically from other 346 publication profiles. For instance, in Literature we observe a greater similarity between the 347 sage and the local chronicler than with the polymath. Again, the same kind of distinction can 348 be observed in the case of the bridger, which remain thematically distinct from the collaborator 349 and the polymath in Paleontology and Language & Linguistics respectively. In all, this shows 350 a link between publication patterns and research topics.

# 351 Discussion

Research evaluation systems have historically mistreated the humanities<sup>17</sup>, often pushing 352 them to adopt the same publication patterns as the sciences and other fields<sup>28,29</sup>. This trend 353 354 has persisted despite widespread recognition that the humanities exhibit distinct publication 355 behaviors driven by their unique audiences and communication goals<sup>9</sup>. Our analysis of 356 publication patterns across humanists' publication histories reflects such pressure as well as 357 the coexistence of different profiles of scholars. Through the examination of a large dataset 358 covering the publication history of nearly 40,000 scholars across 13 fields within the humanities, we can identify and point to factors affecting these differences in the choice of 359 360 publication outlets by humanists.

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362 The humanities have traditionally been portrayed as exhibiting a broad spectrum of publication patterns across fields and specialties<sup>42</sup>. In fact, different studies have highlighted the 363 distinction between journal-based and book-based disciplines <sup>5,30</sup>. A key insight from our study 364 365 is that there is heterogeneity in publication patterns within the humanities with notable 366 differences across disciplines. This challenges the reasoning behind aggregating them and treating them uniformly in most studies. We observe six publication profiles, ---the bridger, the 367 368 cosmopolitan, the local chronicler, the sage, the polymath and the collaborator-, each of them 369 representing different preferences in terms of publication patterns. The collaborator and local 370 chronicler profiles are widely spread, as they are common in 11 of the 13 disciplines analyzed. 371 The cosmopolitan profile is present in more than half of the disciplines. The remaining profiles 372 seem to be more field-specific with the sage profile as the one that is only observed in 373 Literature.

375 Our findings highlight distinct generational transitions in publication practices across 376 disciplines. Examples of such changes are the transition from a preference for book chapters 377 (collaborator profile) to journal articles in national language (local chronicler profile) in fields 378 such as Cultural Studies or Geography. These shifts go in different directions and vary in 379 prominence by discipline. For instance, in the case of Music, the transition is observed, but 380 following the reverse direction, with younger generations showing a preference for publishing 381 book chapters in the national language. Hence, differences are not homogeneous across the 382 humanities. In fields such as Anthropology, Archaeology, and Arts, the rise of the cosmopolitan 383 profile among younger scholars indicates a strong orientation toward publishing in indexed journals and engaging in international discourse. Meanwhile, the collaborator and local 384 chronicler profiles remain cross-generational in these fields, suggesting a more stable 385 386 presence. These examples and many others reflect how different fields are confronting a 387 changing publishing and academic landscape in which internationalization and mainstream 388 publishing are becoming more important for younger generations, while traditional publication 389 outlets continue to play a significant role for scholars across cohorts in many disciplines. 390

- The preference for publishing venues is, in many cases, determined by the research topic, pointing towards a linkage with the potential audience addressed by humanists<sup>9</sup>. This is especially noticeable with profiles which show a preference for publication in English language or in journals indexed in Web of Science or Scopus, demonstrating that policies oriented towards these publications will inevitably bias the production of knowledge towards topics which may not reflect national interests<sup>28,43</sup>.
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398 Our study underscores the ongoing challenges in achieving bibliodiversity within the 399 humanities. Not only it confirms the recognized importance of books and publications in the 400 national language but shows how these publication patterns are evolving; highlighting the 401 importance of introducing policies that maintain such bibliodiversity in order to foster a rich 402 and varied topic portfolio in these fields. Our analysis of publication patterns in the humanities 403 reveals significant generational shifts and the influence of research evaluation policies on 404 shaping academic behavior. The findings suggest an unequal move towards journal-centric 405 publication practices among newer generations, driven by the pressures of current evaluation 406 systems. To foster a truly diverse and inclusive research environment, developing evaluation 407 frameworks that recognize the full spectrum of scholarly contributions in the humanities is 408 imperative. Further research is needed to explore the long-term implications of these trends 409 on the development of knowledge and the sustainability of diverse research agendas in the 410 humanities.

# 411 Data and methods

## 412 Data collection and processing

We used data from Dialnet, a bibliographic database which indexes social sciences and humanities literature from Spanish-speaking countries since 2001. The Dialnet Foundation provided data encompassing 825,604 publication records from 60,063 authors in the humanities. Our analysis focused on publications from 1950 to 2021, which narrowed the dataset to 806,378 publications and 57,742 researchers across 17 distinct disciplines. To standardize field sizes, some fields were consolidated, resulting in a total of 13 fields. Details
of these fields are provided in Table A2 in the Appendix. Additionally, we included only
scholars with at least two papers, reducing the final count to 39,753 scholars.

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Researchers' career length was calculated as the difference between the years of their first and last publications. We then categorized their outputs into six types: books, book chapters, articles, conference proceedings articles, edited books, and edited proceedings. Additionally, we examine the outreach of their outlets using two variables: indexing in mainstream databases, specifically Web of Science or Scopus; and publication language, distinguishing between English and non-English publications. It is important to consider that, in principle, these two variables are not mutually exclusive.

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430 All data processing tasks were conducted using Python (v. 3.11.5). Descriptives, statistical 431 analyses and visualizations were conducted in the R statistical computing language (v. 432 4.2.2)<sup>44</sup>. Thematic landscapes were generated using the visualization software VOSviewer<sup>45</sup>. 433 Data underlying this study and supplementary materials are available at https://doi.org/10.5281/zenodo.13905465. Code scripts are available at the GitHub repository 434 https://github.com/Wences91/humanities patterns. 435

## 436 Archetypal analysis

437 In this paper, we have implemented an archetypal analysis. Archetypal analysis does not aim 438 at classifying observations into distinct groups but rather represents each observation as a 439 convex combination of a few extreme points, known as archetypes. Given an  $n \times m$  matrix *X* 440 representing a multivariate data set with *n* observations and *m* attributes, the archetypal 441 analysis finds the matrix *Z* of k m –dimensional archetypes by minimizing the residual sum of 442 squares (RSS):

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### $RSS = |X - \alpha Z^{\mathsf{T}}|_2$

Here,  $\alpha$  represents the coefficients of the archetypes in an  $n \times k$  matrix. The elements of  $\alpha$  are non-negative and their sum must be 1, i.e.,  $\sum_{j=1}^{k} \alpha_{ij} = 1$  with  $\alpha_{ij} \ge 0$  for i = 1, ..., n.

Additionally, the archetypes *Z* are themselves convex combinations of the data points:

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### $Z = X^{\mathsf{T}}$

448 where  $\beta$  is an  $n \times k$  matrix of coefficients. The elements of  $\beta$  are also non-negative and their 449 sum must be 1, i.e.,  $\sum_{i=1}^{n} \beta_{ji} = 1$  with  $\beta_{ji} \ge 0$  for j = 1, ..., k.

450 Each archetype represents an extreme observation of the dataset, and the remaining 451 observations are interpreted based on their proximity to these archetypes<sup>36,46</sup>.

## 452 Profiling humanist archetypes

453 To identify transversal profiles across the archetypes derived from 13 fields, we employed an 454 unsupervised clustering approach. First, the archetype values, expressed as percentiles, were normalized to ensure comparability across different attributes. This normalization adjusted the 455 data so that all attributes, regardless of their original scale, contributed equally to the clustering 456 457 process. We then applied a hierarchical clustering algorithm, visualized through a clustered heatmap generated using the pheatmap library in R<sup>47</sup>. The clustering was based on Euclidean 458 459 distance, which measures the dissimilarity between archetypes by calculating the geometric 460 distance between their attribute vectors. By grouping archetypes that exhibited similar patterns 461 across the attributes, this method uncovered latent structural relationships between 462 archetypes from different fields.

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To determine the optimal number of clusters, we tested various configurations, systematically evaluating the interpretability and coherence of the resulting groupings. Ultimately, a sixcluster solution was chosen as the most suitable. Based on the common patterns identified within each cluster, the profiles were labeled to clearly reflect their distinctive characteristics.

### 468 Keyword extraction

469 Publications were limited to those in Spanish and English language, that 85.79% of the 470 analyzed dataset (708,355 records). To ensure an accurate analysis, all publication titles were first translated into English using the ChatGPT API (GPT-4)<sup>41</sup>. Keywords were then extracted 471 472 from the document titles using the Rapid Keyword Extraction (RAKE) algorithm<sup>48</sup>. RAKE is an 473 unsupervised, domain-independent method that extracts keywords by analyzing the frequency 474 and co-occurrence of words within a text. The process begins with text segmentation, where 475 the input text is divided into candidate keywords by removing stop words and punctuation. 476 Each candidate keyword is then scored based on its frequency and degree of co-occurrence 477 with other words. The degree is defined as the sum of the frequencies of the words that co-478 occur with the candidate keyword.

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480 The scoring mechanism of RAKE can be expressed mathematically as follows: for a candidate 481 keyword k, the score S(k) is calculated as:

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$$S(k) = \sum_{w \in k} freq(w) \times deg(w)$$

484

Where freq(w) is the frequency of word w in the text, and deg(w) is the degree of word w, which is the total number of co-occurrences of w with other words in the candidate keywords. The algorithm's final output is a ranked list of keywords, with higher scoring keywords deemed more relevant.

489

## 490 Creation of thematic landscapes and topic detection

491 We then generated a document-keyword matrix from which we extracted a term co-mention 492 network was generated based on the publications of each author, applying a binary counting 493 method. This means that the co-occurrence of terms across all papers by the same author 494 was considered, but only in terms of whether the keyword was present or not, ignoring the 495 frequency. As a result, a co-occurrence network was obtained, calculating the weight between 496 keywords as the frequency of their appearance in distinct authors. However, we normalized 497 the weights to avoid problems when clustering due to the presence of terms with high 498 frequency. The normalized weight  $w_{norm}$  is calculated as follows:

499

500 
$$w_{norm} = \frac{2 \times w}{f_x + f_y}$$

where *w* is the original weight, and  $f_x$  and  $f_y$  are the frequencies of co-occurrence of individual terms. This normalization considers the total frequency of term across all authors versus their co-occurrence with each other, helping to balance the weights and reduce the impact of highly frequent terms in the clustering process.

506

The resulting network was filtered to include only terms that co-occur at least twice. Using the 507 Leiden community detection algorithm<sup>37</sup>, clusters were identified, resulting in a total of 4,829 508 clusters (0 = 0.825), representing thematic clusters that correspond to research topics. 509 510 However, since many clusters were composed of only a few terms, we further filtered to 511 include only clusters with more than four terms, reducing the total to 1,452 topics. Following 512 this, the co-occurrence network was aggregated by summing the normalized weights  $w_{norm}$ 513 within each topic, resulting in a network of 1,437 nodes, representing the thematic landscape 514 of the humanities. This network encompasses the keywords from 676,489 publications (81.5% 515 of total publications). We then use VOSviewer to visualize the network and apply the Leiden 516 community detection algorithm to further cluster topics into 8 major fields. From the general map, an overlay was created for each archetype within each discipline, showcasing the 517 518 research fronts where they publish the most.

## 519 Thematic profile similarity

520 Finally, we represented each humanist profile as a vector, where each entry corresponds to 521 the total number of publications in a specific research topic. Pairwise distances between these 522 topic vectors were then computed using the Jaccard distance, which quantifies dissimilarity 523 by comparing shared and unique topics between profiles. The Jaccard distance  $d_j$  between 524 two sets *A* and *B* is defined as:

525

 $d_j(A,B) = 1 - \frac{|A \cap B|}{|A \cup B|}$ 

526

where  $|A \cap B|$  is the size of the intersection (i.e., the number of shared topics) and  $|A \cup B|$  is the size of the union (i.e., the total number of unique topics across both profiles). Subsequently, for each field, we applied a one-dimensional Multidimensional Scaling (MDS)<sup>49</sup> analysis to visualize how profiles align based on thematic similarity within each field. This analysis allowed us to assess whether the observed thematic patterns at the field level were consistent across the broader dataset.

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### 540 Authors contribution

- 541 NRG: Conceptualization; Funding acquisition; Investigation; Methodology; Project 542 administration; Writing – original draft; Writing – review & editing
- 543 WAM: Data curation; Formal analysis; Investigation; Methodology; Software; Resources; 544 Visualization; Writing – review & editing
- 545 EGS: Writing original draft; Writing review & editing
- 546 DTS: Supervision; Validation; Writing review & editing

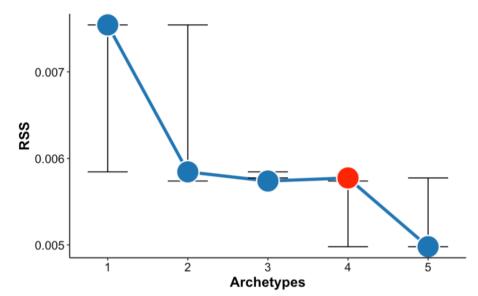
# 547 **References**

- Engels, T. C. E., Istenič Starčič, A., Kulczycki, E., Pölönen, J. & Sivertsen, G. Are book
   publications disappearing from scholarly communication in the social sciences and
   humanities? *Aslib Journal of Information Management* **70**, 592–607 (2018).
- Giménez-Toledo, E., Mañana-Rodríguez, J. & Sivertsen, G. Scholarly book publishing: Its
   information sources for evaluation in the social sciences and humanities. *Res Eval* 26,
   91–101 (2017).
- Zuccala, A. & Robinson-García, N. Reviewing, Indicating, and Counting Books for Modern Research Evaluation Systems. in *Springer Handbook of Science and Technology Indicators* (eds. Glänzel, W., Moed, H. F., Schmoch, U. & Thelwall, M.) 715–728 (Springer International Publishing, Cham, 2019). doi:10.1007/978-3-030-02511-3\_27.
- 4. Sivertsen, G. Patterns of internationalization and criteria for research assessment in the social sciences and humanities. *Scientometrics* **107**, 357–368 (2016).
- 5. Hammarfelt, B. Beyond Coverage: Toward a Bibliometrics for the Humanities. in *Research Assessment in the Humanities* (eds. Ochsner, M., Hug, S. E. & Daniel, H.-D.)
  115–131 (Springer International Publishing, 2016). doi:10.1007/978-3-319-29016-4\_10.
- 563 6. Kulczycki, E. *et al.* Multilingual publishing in the social sciences and humanities: A seven564 country European study. *Journal of the Association for Information Science and*565 *Technology* **71**, 1371–1385 (2020).
- 566 7. Wang, J. Citation time window choice for research impact evaluation. *Scientometrics* 94, 851–872 (2013).
- 568 8. Ochsner, M., Hug, S. E. & Daniel, H.-D. Four types of research in the humanities: Setting
  569 the stage for research quality criteria in the humanities. *Research Evaluation* 22, 79–92
  570 (2013).
- 9. Nederhof, A. J. Bibliometric monitoring of research performance in the Social Sciences
  and the Humanities: A Review. *Scientometrics* 66, 81–100 (2006).
- 573 10. Reale, E. *et al.* A review of literature on evaluating the scientific, social and political
  574 impact of social sciences and humanities research. *Research Evaluation* 27, 298–308
  575 (2018).
- 576 11. Robinson-Garcia, N., Costas, R., Nane, G. F. & van Leeuwen, T. N. Valuation regimes in
  577 academia: Researchers' attitudes towards their diversity of activities and academic
  578 performance. *Research Evaluation* **32**, 496–514 (2023).
- 579 12. Toledo, E. G. Why Books are Important in the Scholarly Communication System in
  580 Social Sciences and Humanities. 2, 6 (2020).
- 13. Hammarfelt, B. Recognition and reward in the academy: Valuing publication oeuvres in
  biomedicine, economics and history. *Aslib Journal of Information Management* 69, 607–
  623 (2017).

- 584 14. Becher. Academic Tribes and Territories: Intellectual Enquiry and the Cultures of
   585 Discipline. (Open University Press, Buckingham, 2001).
- 586 15. Kuhn, T. S. *The Structure of Scientific Revolutions*. (University of Chicago Press, 1996).
- 16. Sokal, A. D. A physicist experiments with cultural studies. *Lingua franca* **6**, 62–64 (1996).
- 588 17. Linmans, A. J. M. Why with bibliometrics the Humanities does not need to be the
  589 weakest link. *Scientometrics* 83, 337–354 (2010).
- 590 18. Verleysen, F. T. & Weeren, A. Clustering by publication patterns of senior authors in the
  591 social sciences and humanities. *Journal of Informetrics* **10**, 254–272 (2016).
- 592 19. Hicks, D. The difficulty of achieving full coverage of international social science literature
  593 and the bibliometric consequences. *Scientometrics* 44, 193–215 (1999).
- 594 20. Sivertsen, G. & Larsen, B. Comprehensive bibliographic coverage of the social sciences
  595 and humanities in a citation index: an empirical analysis of the potential. *Scientometrics*596 91, 567–575 (2012).
- 597 21. Glänzel, W., Thijs, B. & Chi, P.-S. The challenges to expand bibliometric studies from
  598 periodical literature to monographic literature with a new data source: the book citation
  599 index. *Scientometrics* 109, 2165–2179 (2016).
- 22. Archambault, É., Vignola-Gagne, É., Côté, G., Larivière, V. & Gingrasb, Y.
- 601 Benchmarking scientific output in the social sciences and humanities: The limits of 602 existing databases. *Scientometrics* **68**, 329–342 (2006).
- 403 23. Hug, S. E., Ochsner, M. & Daniel, H.-D. Criteria for assessing research quality in the
  404 humanities: a Delphi study among scholars of English literature, German literature and art
  405 history. *Research Evaluation* 22, 369–383 (2013).
- 4. Torres-Salinas, D. & Moed, H. F. Library Catalog Analysis as a tool in studies of social
  sciences and humanities: An exploratory study of published book titles in Economics. *Journal of Informetrics* 3, 9–26 (2009).
- 609 25. Hammarfelt, B. Using altmetrics for assessing research impact in the humanities.
  610 *Scientometrics* **101**, 1419–1430 (2014).
- 611 26. Hammarfelt, B. & de Rijcke, S. Accountability in context: effects of research evaluation
  612 systems on publication practices, disciplinary norms, and individual working routines in
  613 the faculty of Arts at Uppsala University. *Res. Evaluat.* 24, 63–77 (2015).
- 614 27. van Leeuwen, T. Bibliometric research evaluations, Web of Science and the Social
  615 Sciences and Humanities: a problematic relationship? *Bibliometrie Praxis und*616 *Forschung* 2, (2013).
- 617 28. López Piñeiro, C. & Hicks, D. Reception of Spanish sociology by domestic and foreign
  618 audiences differs and has consequences for evaluation. *Research Evaluation* 24, 78–89
  619 (2015).
- 620 29. Ossenblok, T. L. B., Engels, T. C. E. & Sivertsen, G. The representation of the social
  621 sciences and humanities in the Web of Science—a comparison of publication patterns
  622 and incentive structures in Flanders and Norway (2005–9). *Research Evaluation* 21, 280–
  623 290 (2012).
- 30. Kulczycki, E. *et al.* Publication patterns in the social sciences and humanities: evidence
  from eight European countries. *Scientometrics* 1–24 (2018) doi:10.1007/s11192-0182711-0.
- 627 31. Kulczycki, E. & Korytkowski, P. Researchers publishing monographs are more
  628 productive and more local-oriented. *Scientometrics* **125**, 1371–1387 (2020).
- 629 32. Chavarro, D., Tang, P. & Rafols, I. Interdisciplinarity and research on local issues:
- evidence from a developing country. *Research Evaluation* **23**, 195–209 (2014).

- 33. Rafols, I., Ciarli, T. & Chavarro, D. Under-reporting research relevant to local needs in
  the South: Database biases in rice research. in *The Transformation of Research in the South Policies and outcomes* (eds. Arvanitis, R. & O'Brien, D.) (Éditions des archives
  contemporaines, 2019).
- 635 34. Mateo, F. Producción científica en español en humanidades y ciencias sociales. Algunas
  636 propuestas desde Dialnet. *Profesional de la información* 24, 509–516 (2015).
- 637 35. Arroyo-Machado, W. & Robinson-Garcia, N. Towards a Science of Humanities: How Big
  638 Data can Solve the Limitations of Scientometrics. in *Towards a Science of Humanities:*639 How Big Data can Solve the Limitations of Scientometrics 75–92 (De Gruyter, 2023).
  640 doi:10.1515/9783110753523-006.
- 641 36. Eugster, M. J. A. & Leisch, F. From Spider-Man to Hero & Mdash; Archetypal Analysis in
  642 R. *Journal of Statistical Software* **30**, 1–23 (2009).
- 643 37. Traag, V. A., Waltman, L. & van Eck, N. J. From Louvain to Leiden: guaranteeing well644 connected communities. *Scientific Reports* 9, 5233 (2019).
- 645 38. Hicks, D. The Four Literatures of Social Science. in *Handbook of Quantitative Science*646 *and Technology Research* 473–496 (Springer, 2005).
- 647 39. CoARA. The Agreement. *Coalition for Advancing Research Assessment*648 https://coara.eu/agreement/the-agreement-full-text/ (2022).
- 649 40. Cutler, A. & Breiman, L. Archetypal Analysis. *Technometrics* **36**, 338–347 (1994).
- 650 41. OpenAl. ChatGPT. (2023).
- 42. Frandsen, T. F. & Nicolaisen, J. Intradisciplinary differences in database coverage and
  the consequences for bibliometric research. *Journal of the American Society for Information Science and Technology* 59, 1570–1581 (2008).
- 43. Hicks, D., Wouters, P., Waltman, L., de Rijcke, S. & Rafols, I. The Leiden Manifesto for research metrics. *Nature* **520**, 429–431 (2015).
- 44. R Core Team. R: A Language and Environment for Statistical Computing. R Foundationfor Statistical Computing (2021).
- 45. Van Eck, N. J. & Waltman, L. Software survey: VOSviewer, a computer program for
  bibliometric mapping. *Scientometrics* 84, 523–538 (2010).
- 46. Eugster, M. J. A. & Leisch, F. Weighted and robust archetypal analysis. *Computational Statistics & Data Analysis* 55, 1215–1225 (2011).
- 662 47. Kolde, R. pheatmap: Pretty Heatmaps. (2019).
- 48. Rose, S., Engel, D., Cramer, N. & Cowley, W. Automatic Keyword Extraction from
  Individual Documents. in *Text Mining* 1–20 (John Wiley & Sons, Ltd, 2010).
  doi:10.1002/9780470689646.ch1.
- 49. Davison, M. L. & Sireci, S. G. 12 Multidimensional Scaling. in *Handbook of Applied Multivariate Statistics and Mathematical Modeling* (eds. Tinsley, H. E. A. & Brown, S. D.)
- 668 323–352 (Academic Press, San Diego, 2000). doi:10.1016/B978-012691360-6/50013-6.
- 669 323-332 (Academic Fress, San Diego, 2000). doi: 10.1016/09/6-012691300-6/5
- 670

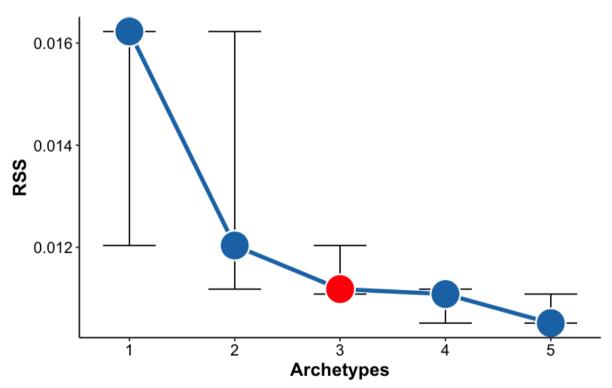
### Appendix











678 Fig. A2 Screeplot of the residual sum of squares (RSS) of History. The red dot represents the value chosen for the analysis.

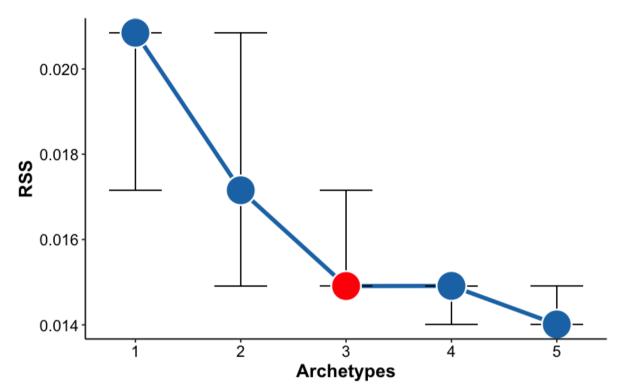




Fig. A3 Screeplot of the residual sum of squares (RSS) of Philosophy. The red dot represents the 682 value chosen for the analysis.



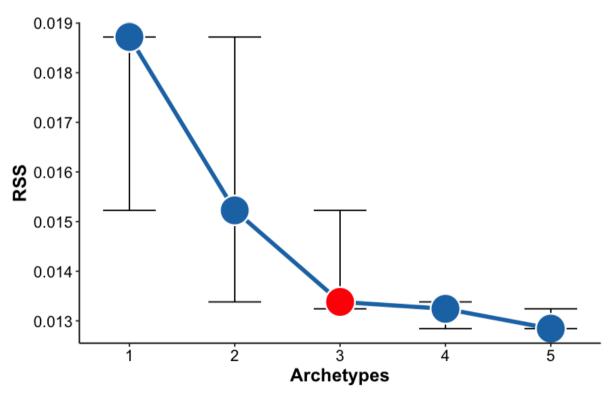
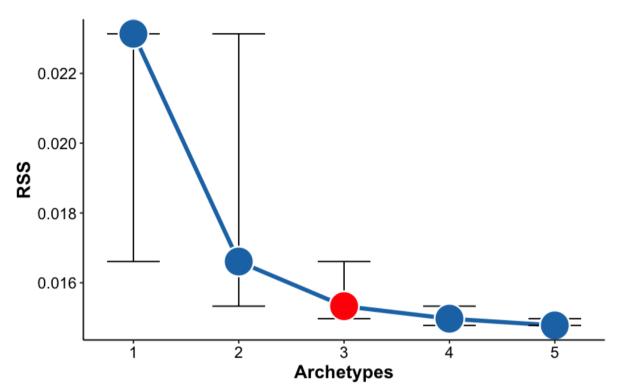


Fig. A4 Screeplot of the residual sum of squares (RSS) of Philology. The red dot represents the value 685 686 chosen for the analysis.





689 Fig. A5 Screeplot of the residual sum of squares (RSS) of Arts. The red dot represents the value chosen for the analysis.



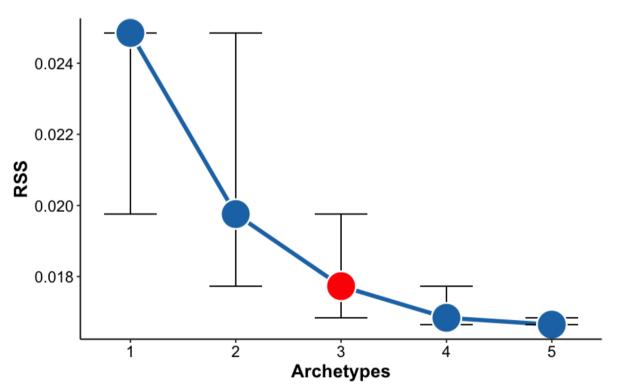


Fig. A6 Screeplot of the residual sum of squares (RSS) of Archaeology. The red dot represents the value chosen for the analysis.

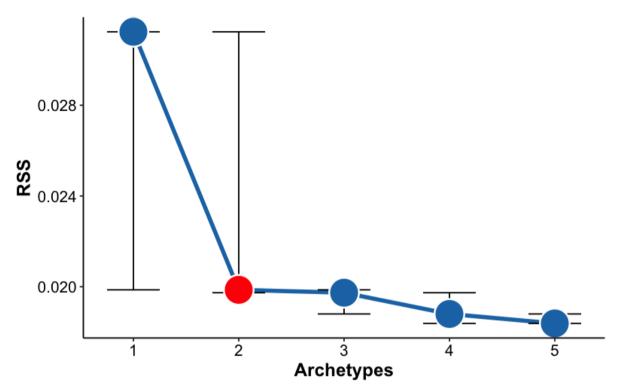
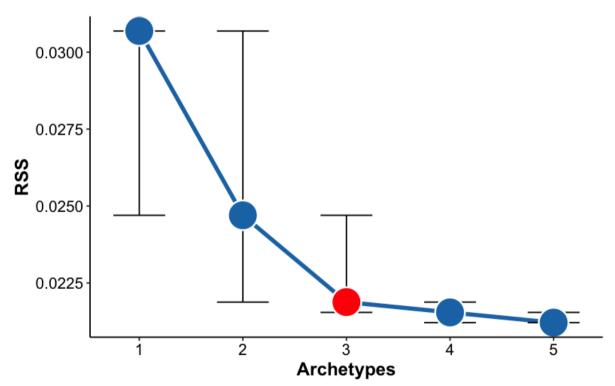


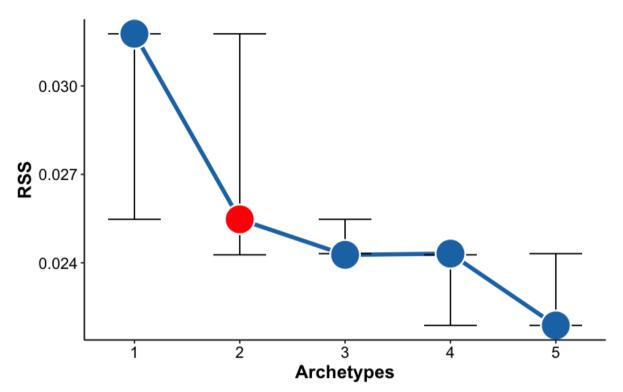


Fig. A7 Screeplot of the residual sum of squares (RSS) of Language & Linguistics. The red dot 699 represents the value chosen for the analysis.





702 Fig. A8 Screeplot of the residual sum of squares (RSS) of Literature. The red dot represents 703 the value chosen for the analysis.



706

Fig. A9 Screeplot of the residual sum of squares (RSS) of Music. The red dot represents the value chosen for the analysis.



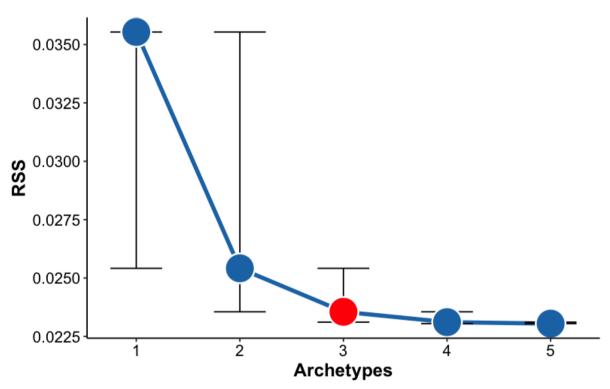
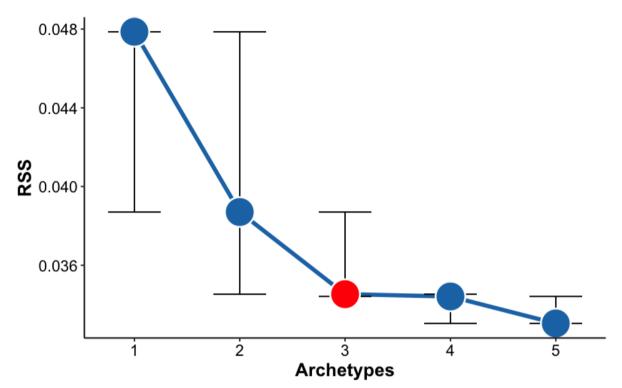
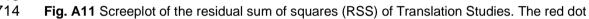


Fig. A10 Screeplot of the residual sum of squares (RSS) of Anthropology. The red dot represents the value chosen for the analysis.

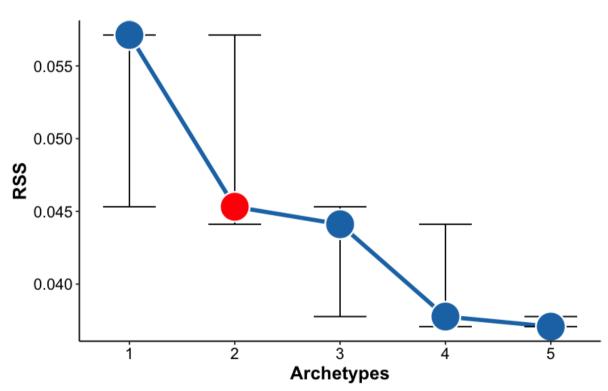






715 represents the value chosen for the analysis.







**Fig. A12** Screeplot of the residual sum of squares (RSS) of Geography. The red dot represents the value chosen for the analysis.

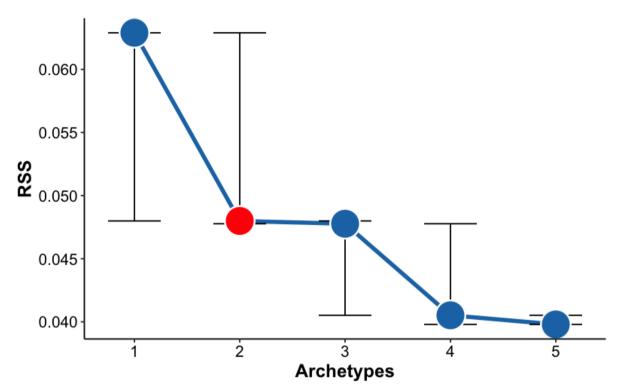


Fig. A13 Screeplot of the residual sum of squares (RSS) of Paleontology. The red dot represents thevalue chosen for the analysis.



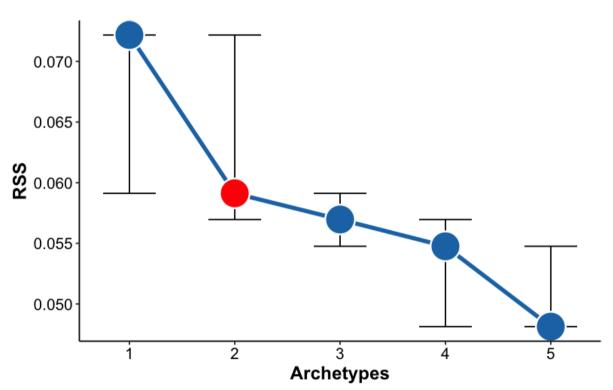
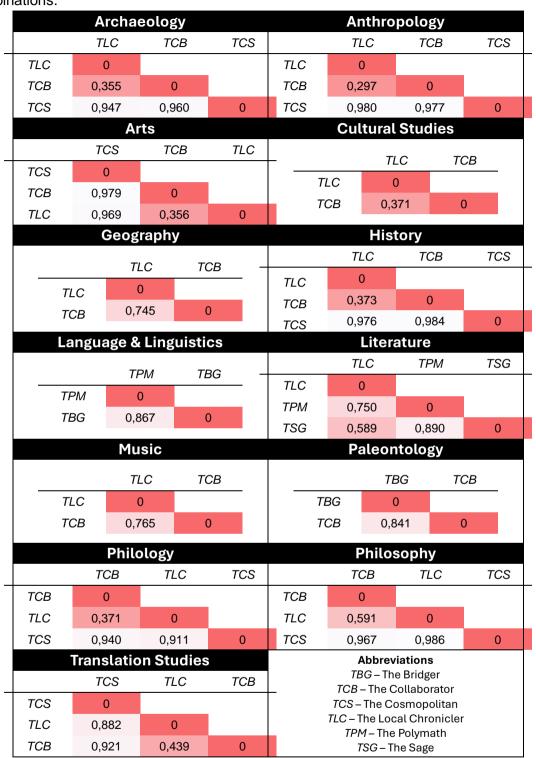


Fig. A14 Archetypes for the rest of fields not included and generational distribution. Colors are linked
 to archetypes. Red represents the Digital Chronicler; green the Traditionalist and blue the global
 scholar

**Table A1** Jaccard distances matrices between thematic profiles of archetype-discipline

733 combinations.



### **Table A2** Equivalence between disciplines and research fields.

Equivalence between disciplines and research fields.	
Discipline	Field
Social Anthropology	Anthropology
Archaeology	Archaeology
Architectural Graphic Expression	Arts
Graphic Expression in Engineering	Arts
Art History	Arts
Painting	Arts
Arab and Islamic Studies	Cultural Studies
East Asian Studies	Cultural Studies
Hebrew and Aramaic Studies	Cultural Studies
German Philology	Philology
Catalan Philology	Philology
Slavic Philology	Philology
French Philology	Philology
Galician and Portuguese Philology	Philology
Greek Philology	Philology
English Philology	Philology
Italian Philology	Philology
Latin Philology	Philology
Romance Philology	Philology
Basque Philology	Philology
Philosophy	Philosophy
Moral Philosophy	Philosophy
Logic and Philosophy of Science	Philosophy
Human Geography	Geography
Historiographical Sciences and Techniques	History
Ancient History	History
Contemporary History	History
American History	History
History of Science	History
History of Thought and Movements	History
Medieval History	History
Modern History	History
Prehistory	History
Spanish Language	Language & Linguistics
General Linguistics	Language & Linguistics
Indo-European Linguistics	Language & Linguistics
Spanish Literature	Literature
Music	Music
Paleontology	Paleontology
Translation and Interpretation	Translation Studies