

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31

Please cite this article as:

Radaelli G., Lettieri E., Frattini F., Luzzini D., Boaretto A. (2017).

Users' search mechanisms and risks of inappropriateness in healthcare innovations: The role of literacy and trust in professional contexts

Technological Forecasting and Social Change,

Vol. 120, pp. 240-251.

(DOI: <https://doi.org/10.1016/j.techfore.2016.12.015>)

32

33

**Users' search mechanisms and risks of inappropriateness in
healthcare innovations: The role of literacy and trust in
professional contexts**

34

35

36

37

Giovanni Radaelli *

38

Warwick Business School

39

University of Warwick

40

CV4 7AL, Coventry, UK

41

E-mail: giovanni.radaelli@wbs.ac.uk

42

Emanuele Lettieri

43

Department of Management, Economics and Industrial Engineering

44

Politecnico di Milano

45

Via Raffaele Lambruschini 4B

46

20156 Milan, Italy

47

E-mail: emanuele.lettieri@polimi.it

48

Federico Frattini

49

Department of Management, Economics and Industrial Engineering

50

Politecnico di Milano

51

Via Raffaele Lambruschini 4B

52

20156 Milan, Italy

53

E-mail: federico.frattini@polimi.it

54

Davide Luzzini

55

Audencia Business School

56

8 Route de la Joneliere

57

44312 Nantes

58

E-mail: dluzzini@audencia.com

59

Andrea Boaretto

60

Personalive S.r.l.

61

Via Durando 38/a

62

20158 Milan, Italy

63

E-mail: andrea@personalive.it

64

65

* Corresponding author

66

67

Corresponding author:

68

Giovanni Radaelli

69

Warwick Business School

70

University of Warwick

71

CV4 7AL, Coventry UK

72

E-mail: giovanni.radaelli@wbs.ac.uk

73

Phone: +44 (0)24 765 73717

74

Fax: +44 (0)24 7652 3747

75 **Users' search mechanisms and risks of inappropriateness in healthcare**
76 **innovations: The role of literacy and trust in professional contexts**

77 **Brief Running Title:** User knowledge search in professional context

78 **Abstract**

79 In the context of professional service organizations, user engagement with knowledge search
80 might generate significant risks of inappropriateness to innovation processes. Previous
81 research suggests that professionals would then keep users at arms' length, controlling the
82 design and implementation of innovations internally. This study overcomes this view
83 investigating how professional service organizations can enable users' knowledge search
84 while controlling for the risks of inappropriateness. Combining a qualitative research on 5
85 innovation processes in healthcare organizations with quantitative research on 110 service
86 users, our findings highlight that professional providers, such as senior clinicians, shaped
87 their tactics according to the 'threats' of laggards, i.e. users searching knowledge outside of
88 professional logics of appropriateness; more than to the opportunities of lead-user
89 communities. Professional providers sought to "activate" users' engagement with knowledge
90 search by investing on their literacy, i.e. showing the basics of the logic of appropriateness
91 informing their decision; and on trust relationships, i.e. becoming transparent on the criteria
92 of knowledge selection during the innovation processes.

93 **Keywords:** Users; Knowledge Search; Literacy; Trust; Professionals; Healthcare

94 **1. Introduction**

95 Innovation research emphasizes the importance of searching knowledge beyond
96 organizational boundaries to differentiate the sources of new ideas and information (Li et al.,
97 2013; Raisch et al., 2009; Rosenkopf and Nerkar, 2001). Most studies have usually
98 investigated mechanisms used by one firm to search the knowledge produced by other firms,
99 e.g. alliances, acquisitions, employee mobility, open source platforms, pyramiding, and
100 service intermediaries (Savino et al., 2015). More recently, firms have been also
101 recommended to search the knowledge produced by user communities. Some users
102 proactively search and produce knowledge about new technical and scientific advancements
103 to evaluate their service providers and market opportunities (Greer and Lei, 2012; Bogers et
104 al., 2010). So, firms can gain important competitive advantages by identifying relevant users
105 and incorporating their knowledge in the innovation processes. Mechanisms abound, such as
106 the use of IT platforms, user enrolment and focus groups (Hienerth et al., 2014; Parmentier
107 and Mangematin, 2014; Yoshida et al., 2014; Nahuis et al., 2012).

108 Noticeably, most research in this field has focused on large private firms pursuing
109 shareholder value in high-tech industries (Savino et al., 2015; Greer and Lei, 2012). These
110 studies tend to overlook the risks of user engagement, as they assume that firms can rely at
111 least on lead-users, and keep others at arms' length. The generalizability of this assumption is
112 however questionable in organizations with smaller size, different goals and embedded in
113 low-tech sectors (Savino et al., 2015; Lane et al., 2006). These organizations face relevant
114 risks when their users search new knowledge; and very little is known about what they should
115 do to prevent unintended consequences.

116 This study addresses this gap, investigating the experience of healthcare organizations
117 attempting to elicit knowledge search from their patients while facing threats to the
118 appropriateness of care. Healthcare organizations represent an exemplar of professionalized

119 service organizations, which possess two important features (von Nordenflycht, 2010;
120 Abbott, 1986). First, their services are based on the work of professionals (e.g. doctors,
121 nurses), who abide by logics and ethical codes of service appropriateness, i.e. generate
122 maximum value for users, rather than for shareholders or others. Second, professional work is
123 informed by expert knowledge, acquired over long years of certified professional
124 development and training, and virtually inaccessible to managers, employees, and users
125 (Radaelli et al., 2014). These features generate competing demands on patients' knowledge
126 search. The logics of appropriateness imply that users *must* be engaged with knowledge
127 search to increase the appropriateness of innovations. Users, however, cannot possess the
128 skills and abilities necessary to search and absorb knowledge appropriately; and thus struggle
129 to navigate misinformation and fraud (Kraft et al., 2015; SteelFisher et al., 2015; Deer, 2011).
130 In several occasions, patients have pushed professional organizations to spend money on
131 inappropriate innovations, or refused to attend appropriate new services. Healthcare providers
132 must do something to orient patients' knowledge search toward principles of appropriateness,
133 without locking patients into their own ideas. How they can do so remains unknown. So, we
134 ask: *how can professionals elicit patients' knowledge search during innovation processes*
135 *while reducing the risks of inappropriateness?*

136 To address this question, we developed a mixed-method study of multiple service
137 innovations. The manuscript is organized as follows. First, we review the literature to identify
138 key concepts and theoretical gaps. Second, we describe the qualitative research used to
139 induce an interpretive model of users' engagement with knowledge search. The findings
140 informed the taxonomy of knowledge search behaviors, i.e. some patients stay passive or
141 reactive in the search of new knowledge, with others search knowledge to challenge
142 professionals' decision-making, and only a few acted as lead-users. Building from this, we
143 describe the role of patient activation, use of traditional/virtual sources of information, health

144 literacy and trust in eliciting patients' knowledge search. Later, we describe the quantitative
145 research that tested this induced model on a sample of 110 patients with chronic obstructive
146 pulmonary disease (COPD). Finally, we discuss the results and contributions to literature.

147 **2. Theoretical Background**

148 **2.1. Knowledge search and logics of appropriateness**

149 Service innovations in healthcare are required to follow principles of appropriateness, i.e.
150 "care is effective based on valid evidence; efficient [in terms of] cost-effectiveness; and
151 consistent with the ethical principles and preferences of the relevant individual" (WHO,
152 2000; p. 2). Healthcare innovation processes derive their legitimacy from (i) the rigor of their
153 scientific approach, and (ii) the response of patients. Unscientific and untested services
154 should not be provided to patients as they might introduce risks to the safety of patients;
155 while services that are not attended by patients should be changed because they are not
156 meeting the expected appropriateness. One implication is that processes of healthcare
157 innovation should be structured into a formal stage of knowledge search, in which scientific
158 and experiential knowledge is identified; and a stage of recombination, in which the complex
159 knowledge is translated into new services. Professionals are expected to: (i) search relevant
160 scientific evidence on the effectiveness and costs of new interventions; (ii) search
161 experiential/contextual knowledge from their own practice, and from peers; (iii) discuss and
162 recombine this knowledge in multi-professional teams; (iv) develop structured pathways that
163 describe the new service, to allow replication and assessment; and (v) test the new service on
164 a selected group of patients to ascertain the consequences (Walshe and Rundall, 2001; West
165 and Wallace, 1991). Clinicians *must* prove the appropriateness of their decision-making by
166 producing evidence of effectiveness. They usually apply an 'evidence pyramid', and collect
167 evidence from meta-analyses and systematic reviews to legitimize change; and produce

168 evidence from Randomized Clinical Trials (RCTs) or cohort studies to demonstrate
169 improvements (Murad et al., 2016).

170 Overall, through education and practice, these expectations consolidate into *logics of*
171 *appropriateness*, i.e. institutionalized rules, roles and norms that demand clinicians to have
172 high standards regarding what knowledge should inform their innovations, where they should
173 search it, and how they should apply it. So, for instance, clinicians use scientific journals and
174 peer reviews, and avoid generic sources of information, such as newspapers, websites and
175 forums (Gabbay and Le May, 2004), because these are regarded as weak evidence and unfit
176 for the standards of appropriateness.

177 By contrast, newspapers, websites and forums represent the privileged sources of information
178 for patients, who typically lack the ability to navigate more complex knowledge (McMullan,
179 2006). The knowledge embedded in these media is often inaccurate, blown out of proportions
180 or intentionally mischievous. Lured into the prospects of “easy” and/or “immediate” cure,
181 patient groups have often pushed providers to invest money on very inappropriate
182 innovations (Bodemer et al., 2012; Claassen et al., 2012). Clinicians need to orient patients’
183 knowledge within acceptable logics of appropriateness, while allowing for some creativity.
184 Previous research does not specifically explain how they can do so. Rather, three neighboring
185 research streams described possible approaches. To prepare the theoretical background of our
186 empirical research, we review these research streams, i.e.: (i) knowledge search beyond
187 organizational boundaries; (ii) user-based innovation; and (iii) sociology of professions.

188 **2.2. Knowledge search beyond organizational boundaries**

189 Several past studies have looked at mechanisms for knowledge search beyond organizational
190 boundaries as necessary to access non-redundant ideas (Savino et al., 2015). To reduce
191 problems of cognitive lock-in, firms should differentiate the knowledge sources, e.g. other
192 firms in their supply chain, direct and indirect competitors, consultancy firms, and research

193 institutions (Kohler et al. 2012; Chen et al. 2011; Grimpe and Sofka 2009; Laursen and Salter
194 2004). Firms can implement several mechanisms to search and absorb new knowledge, e.g.
195 alliances, firm acquisition, employee mobility, open source platforms, pyramiding, service
196 intermediaries and collective research centers (Savino et al., 2015).

197 These studies suggest that *weak ties* (i.e. infrequent and distant relationships between
198 knowledge sources and recipients) are salient to identify non-redundant knowledge, while
199 *strong ties* (i.e. more frequent and structured relationships) should be used to transfer and
200 recombine such knowledge (Granovetter, 1983; Burt, 1992; Hansen, 1999, 2002). Weak ties
201 prevent risks of cognitive lock-in, since the firm remains at arms' length from others. More
202 structured relationships are however necessary to transfer the complex knowledge, which
203 includes tacit insights, interpretations and heuristics, entrenched in individual experiences and
204 context-specific routines (Becerra et al., 2008; Easterby-Smith et al., 2008; Polanyi, 1966).

205 Complex knowledge is thus *sticky*, and recipients need to spend time and efforts to absorb
206 new information (Szulanski, 1996; von Hippel, 1994). This suggests that firms should get
207 close to organizations struggling with knowledge search, and help them through training and
208 socialization tactics (Van Wijk et al., 2008; Inkpen and Tsang, 2005; Hansen, 1999).

209 Alternatively, the firm can select privileged 'partners', and keep others at arms' length. The
210 selection is based on benevolence-based trust and competence-based trust, i.e. trusting that
211 the knowledge source wants to do good to the firm, and has the skills to search relevant
212 knowledge (Phelps et al., 2012; Renzl, 2008; Levin and Cross, 2004).

213 **2.3.Collaborative innovation with users**

214 Studies on collaborative innovation with users acknowledge that firms can also relate to
215 users. Some users are especially proactive, and engage with knowledge search to increase
216 their customer experience and/or support firms' innovation processes (Greer and Lei, 2012;
217 Von Hippel, 2009; Luthje and Herstatt, 2004). These users demonstrate a capacity to develop

218 expert and technical knowledge, and share their findings with firms (Hienerth et al., 2014;
219 Von Hippel, 2009). In particular, previous research remarked the importance of lead-users,
220 i.e. users “who face the same needs of the general marketplace but face them months or years
221 earlier than the bulk of the market and expect to benefit significantly from a solution to those
222 needs” (Von Hippel, 1986; p. 796). More generally, several studies showed how users
223 perform knowledge search through multiple sources, from generic websites and IT platforms
224 to specialist forums and higher education programmes (Greer and Lei, 2012). This behavior
225 can inform multiple outcomes, from micro-adjustments to established products to the design
226 of new services and products (Greer and Lei, 2012; Luthje and Herstatt, 2004). In turn, firms
227 can access low-cost knowledge, build brand awareness, create customer commitment, and
228 create more competitive offerings (Frow et al., 2015). To do so, they might use focus groups,
229 customer surveys and IT platforms to collect new ideas; review the content user forums and
230 communities while remaining at arms’ length; employ expert users; and develop structured
231 co-production programmes (Frow et al., 2015). LEGO[®], for instance, developed a web-based
232 ecosystem (www.ldraw.org) in which users can generate virtual models and scenes, as well as
233 configure new building blocks (Hienerth et al., 2014). Differently, several firms and
234 government branches have enrolled end users in their organization to develop products
235 (Wagner, 2002). Risks of inappropriateness are usually overlooked. It is usually assumed that
236 (i) firms can identify and select relevant key users (e.g. lead-users) to engage in the
237 innovation process, or keep others at arm’s length; (ii) key users develop competencies and
238 expectations that are consistent with firm’s; and (iii) employees, experts and managers do not
239 antagonize the engagement of lead-users, because it does not threaten their jurisdictions and
240 decision-making (Greer and Lei, 2015; Enkel et al., 2005; Parmentier and Mangematin, 2014;
241 Hienerth et al., 2014). So, the key problem for firms is to find relevant lead-users and cost-
242 effective ways to embed them in the innovation process.

243 **2.4. Sociology of professions**

244 The generalizability of these considerations to healthcare organizations is dubious for two
245 reasons: (i) healthcare organizations follow principles of appropriateness and altruistic
246 service, which demands to include *all* users in the process, and not just lead-users; and (ii)
247 patients might openly challenge the decision-making of clinicians, who react by reinforcing
248 their status as sole ‘arbiters of risk’ and appropriateness, i.e. the only possessing the
249 knowledge and accountability to make decisions (Currie et al., 2012; Llewellyn, 2001).
250 Professionals experience a paradoxical tension in their relationship with patients. The logics
251 of appropriateness suggest that professionals should put users at the center of their decision-
252 making (Coule and Patmore, 2013; Suddaby, 2008). Users’ lack of expert knowledge,
253 however, generates a great risk for service appropriateness. Non-professional actors are
254 unlikely to identify appropriate information, and might pressure professional workers to
255 pursue inappropriate innovations (Abbott, 1986; Dinovitzer et al., 2015). Professionals face a
256 conundrum: if they follow users’ lead, they might undermine the appropriateness of
257 innovation processes. But if they do not, they might undermine the relationship with users.
258 To mediate the two risks, Koh et al. (2013) recommended structured and long-term
259 collaborations with patients, such as “focus groups, interviews, surveys and the most active
260 form of engagement which is serving on a study board or advisory council and attending
261 regular meetings with researchers (as in active participatory research studies and community
262 based participatory research)” (Domecq et al., 2014; p. 5). Evidence on the effectiveness of
263 these initiatives is however limited and contradictory (; Domecq et al., 2014; Berger et al.,
264 2013). The very possibility for clinicians to implement structured collaborations is dubious,
265 because of “the lengthy process that involved training, transportation, attendance, etc.;;
266 [logistics] such as extra time needed to complete research, time constraints of patients and
267 researchers, and incremental funding needed for patient engagement; overarching worry

268 [that] patient engagement may become tokenistic (a false appearance of inclusiveness),
269 resulting in a devaluated patients' input; [and] scope creep" (Domecq et al., 2014; p. 6).
270 Furthermore, patients rarely exploit these occasions, as they either concede full jurisdiction to
271 clinicians or act in isolation from their clinicians. If and how professionals might elicit users'
272 knowledge search within a framework of appropriateness thus remains unknown.

273 We thus ask: *how do professional workers (clinicians) enable to elicit the engagement of*
274 *users (patients) in knowledge search within logics of appropriateness?*

275 **3. Inductive research methodology**

276 To address this question, we implemented an exploratory sequential mixed method study.
277 This approach combines an initial qualitative method aimed at inducing from professionals an
278 explanatory model on patients' knowledge search; and a subsequent quantitative method to
279 test the model with patients (Cresswell, 2013). Mixed methods are increasingly used in
280 innovation research, building on the premise that triangulating qualitative and quantitative
281 data reduces the weaknesses of each type of data (Osei-Frimpong et al., 2016; Teddlie and
282 Tashakkori, 2009). Our design, in particular, aimed at triangulating insights from
283 professionals (who controlled the design and implementation of initiatives to elicit patients'
284 knowledge search); with empirical authentication from patients (who are the recipients of
285 these initiatives, and implement knowledge searches).

286 The inductive stage was informed by a multiple case study. Case studies are relevant
287 methodologies to generate theory on organizational dynamics, i.e. to address the 'how' and
288 'why' questions (Yin, 2013). Multiple case studies are especially relevant to find patterns
289 across different settings, and increase the generalizability of findings (Eisenhardt, 1989). We
290 relied on two research projects. The first project involved professional workers in secondary
291 care, separately involved in four service innovations. Innovation 1 involved a new
292 multidisciplinary service, managed by psychologists and acute specialists, for the treatment

293 of the psychological distress caused by physical pain. Innovation 2 involved a new pathway,
294 managed by psychologists, nurses and social workers, to improve the management of patients
295 with medium-to-low severity of conditions. Innovation 3 involved a radical redesign of the
296 pathways for teenager patients with mental health problems. Finally, Innovation 4 involved
297 the implementation of a new digital system for the mobilization of patient-related data across
298 acute specialisms. Data collection was a combination of 97 interviews; 57 non-participant
299 observation (internal meetings with clinicians' teams developing the new service,
300 promotional events and training events). The interviews were organized around three main
301 topics: relevant sources and mechanisms for knowledge search; role of patients in the
302 innovation process; mechanisms and conditions of patient engagement.

303 The second project involved a new digital-based service for asthma management, developed
304 by a group of general practitioners, respiratory consultants, and allergy specialists. The
305 research investigated patients' involvement by asking how patients provided information
306 about the transformation of practice and the adoption of digital technologies; and how
307 patients adopted innovative behaviors to support service change. Clinicians with a high
308 digital and innovative profile were identified with a four-stage process. First, a focus group
309 with six pharmaceutical representatives developed two profiles of highly innovative
310 behaviors, one related to the use of digital technologies and one related to the information
311 practices. Second, the profiles were shared with selected medics, who were asked to generate
312 names of colleagues, who belonged to each profile. Third, one fieldworker double-checked
313 the contacts (e.g. publications, social media presence, personal website). Finally, the
314 identified clinicians were contacted by phone or skype to arrange an interview. The selected
315 15 clinicians (6 allergists and 9 lung specialists) were then interviewed, following a semi-
316 structured interview schedule. Two focus groups with 12 clinicians (six per focus group)
317 were then organized to collect further insights on the relationship with patients.

318 Overall, the five cases were part of a theoretical sampling, as they varied in terms of patient
 319 engagement and clinicians' tactics. Table 1 summarizes the research data.

320

Table 1: Data Sources

	Interviews	Observations	Archival Data
Innovation 1	14 Senior clinicians 5 Junior clinicians 1 Project manager	26 internal meetings 7 promotion events 2 training events	9 service specifications 3 internal reports 30 meeting minutes
Innovation 2	25 Senior clinicians 5 Junior clinicians	6 internal meetings 7 training meetings	4 service specifications 7 meeting minutes
Innovation 3	6 Senior clinicians 15 managers	2 internal meetings 3 conferences/workshops	1 service specification 4 internal reports
Innovation 4	20 Senior clinicians 6 project managers	4 internal meetings	2 service specifications
Innovation 5	15 Senior clinicians	2 focus groups	
Total	79 Senior clinicians 10 Junior clinicians 22 Managers	38 internal meetings 10 promotion events 9 training events 2 focus groups	16 service specifications 7 internal reports 37 meeting minutes

321 To analyze the data, we followed indications from Gioia et al. (2013) on inductive research.
 322 Strategically, two different fieldworkers collected data on the two projects, and developed the
 323 early data analysis. The data was analyzed separately by the other researchers, who were
 324 detached from the context of application, and thus could provide alternative perspectives. The
 325 analyses were compared first within each project, and then across projects, until a final
 326 agreement was reached. Operationally, the extracts from transcribed interviews and
 327 observations were assigned first-order codes by the fieldworkers, reflecting concepts
 328 expressed in the language of the informants. These first-order concepts were gradually
 329 aggregated into second-order constructs if they reflected common themes. These second-
 330 order concepts were in turn aggregated into third-order dimensions, which represent the final
 331 theoretical model. To determine themes and dimensions, we travelled iteratively between
 332 data, emergent theory, and previous literature.

333 **4. Findings: model development**

334 All cases moved from an intention to introduce service innovation, as professionals had
 335 intercepted discontent and concerns from users, as well as found opportunities for

336 improvements. These efforts involved an initial attempt to identify scientific evidence
337 demonstrating causal links between certain interventions and outcome improvements. The
338 scientific evidence was not sufficient to design innovation since it: (i) was often high-level,
339 specialist and a-contextual (hence, clinicians needed local knowledge to contextualize this
340 information); (ii) did not cover all the key decisions required in a service (hence clinicians
341 needed experiential knowledge, improvisation and intuition to ‘fill the gaps’); and (iii) did not
342 capture the most recent experiments in other professional organizations (hence clinicians
343 needed to insights and word-of-mouth from their social network). The clinicians used internal
344 knowledge from formal service assessments (e.g. audits), extreme experiences (e.g. the death
345 of a patient, near misses), and individual beliefs/opinions (‘feeling the gut’). Clinicians also
346 searched (i) ideas executive boards, medical directors, commissioners, funding bodies and
347 quality assurance groups; (ii) experiences in other contexts through informal chats, word-of-
348 mouth, workshops, seminars and professional events.

349 Patients’ knowledge search contributed in different ways across the five innovation sites. In
350 Case 3, patients participated *throughout* the innovation process. Professionals opened
351 processes of consultations, to which patients contributed by sharing their knowledge through
352 social media, workshops and meetings. Patients helped designing a new access center for
353 teenage patients by providing their opinions and aspirations as patients, and their experiences
354 and information with other providers. In Cases 1 and 2, patients contributed more indirectly.
355 Clinicians collected information patient inputs during clinical consultations, and used them
356 during professional-only teamwork. In Cases 4 and 5, clinicians were reluctant to use patient
357 inputs, and patients remained at arms’ length. Our comparative case approach analyzed these
358 differences (Table 2).

359

Table 2: Cases overview

360

361

362

Cases	Patient knowledge in innovation process	Patient-provider relationship	Investments in health literacy	Investments in relational trust
1: Multidisciplinary service for pain management	Moderate inclusion of patients' knowledge. Inputs discussed by clinicians in multi-professional teamwork	Moderate improvement	High: websites, face-to-face consultations to build basic knowledge and awareness of logics of appropriateness	Low: innovation processes 'hidden' to patient groups
2: Psychological service for mid-low severity patients	Moderate inclusion of patients' knowledge. Inputs discussed by clinicians in early stages of innovation	Moderate improvement	Low: brief consultations dedicated to clinical decision-making; information leaflets about basic knowledge; no communication of logics of appropriateness	Moderate: inclusion of patient discussions/surveys during design of new pathways; rationale of new service explained to selected group of patients; request of knowledge search to help the process
3: Transition path for young mental health patients	High inclusion of patients' knowledge in new services and decisions.	High improvement	High: websites, face-to-face consultations, conferences and seminars to build basic knowledge and awareness of logics of appropriateness	High: development of process of patient engagement; high participation because of clear rationale for change; requests of knowledge search; methods to include patient inputs
4: Digitalized tool for knowledge management across acute specialisms	Low inclusion of patients' knowledge in decision-making	No generalized improvement	Low: brief consultations dedicated to clinical decision-making; information leaflets about basic knowledge; no communication of logics of appropriateness	Low: innovation processes 'hidden' to patient groups
5: Digitalized tool for knowledge management for asthma patients	Low inclusion of patients' knowledge in decision-making	No generalized improvement	Low: brief consultations dedicated to clinical decision-making; information leaflets about basic knowledge; no communication of logics of appropriateness	Low: innovation processes 'hidden' to patient groups

363 4.1. Patients' approaches to knowledge search

364 Across all sites, clinicians acknowledged the impossibility to control or know how patients
365 search new knowledge. Clinicians tried to use face-to-face consultations to know more about
366 patients' methods and sources of knowledge search, but could only scratch its surface.
367 Patients searched knowledge through traditional and virtual channels. Traditional channels
368 include newspapers, television programmes and discussions with fellow patients. Virtual
369 channels include IT-based platforms such as websites, patient forums, and other Apps.
370 Patients' use of these sources is typically unstructured, since few patients plan knowledge
371 search strategies. Patient approaches can be classified into four categories.
372 First, several patients were *passive knowledge recipients*, disengaging from any attempt of
373 knowledge search and accepting every clinicians' decision-making. They did so to reduce (i)
374 their exposure to new information that they could not process, and thus the possibility to
375 overestimate their symptoms and increase their anxiety; (ii) interpersonal risks with their
376 clinicians, fearing that this might contest their authority or become a way for professionals to
377 share responsibility and blame.

378 *Post-interview excerpt – Innovations 3*

379 *Senior Consultant (SC) 6: Internet is great, but you can find anything in it. Google your*
380 *symptoms in it and you'll find all sorts of assessments. They are not wrong, but an array of*
381 *possibilities we gradually eliminate through appropriate tests Well, several patients call me*
382 *scared as s**t, because they thought they were going to die soon... I need to clarify these*
383 *things face-to-face, explaining why that self-diagnosis is wrong. Some might not believe me,*
384 *actually, but most do and actually decide they had enough of Google searches.*

385 Second, other patients were *reactive knowledge collectors*, only searching information about
386 their condition and prescriptions. For instance, patients who receive prescriptions for a certain
387 medication might use Internet to acquire more knowledge about its side effects. Patients
388 intentionally remained at arm's length from clinicians with regard to knowledge search,
389 which could have implications on service innovation.

390 *Field-note excerpt – Innovations 1-3*

391 *Patient representative (PR): Several patients want to engage with research and innovations,*
392 *because their voice can be heard. We should not underestimate the burden of knowledge for*

393 *patients. Knowing how symptoms emerge, limitations in diagnosis and therapy, inevitable*
394 *outcomes can generate all sorts of emotions – anxiety, anger, weariness...*

395
396 Third, other patients were proactive *lead-users*, searching new information about other
397 available services, diagnoses and therapies from multiple sources. Consistently with the
398 definition of lead-users from von Hippel (1986), these patients: (i) experienced the most
399 significant problems of the established services, e.g., they had experienced chronic pain
400 without an appropriate solution (Innovation 1) or a difficult transition from different service
401 mental health providers (Innovation 3) – thus they expected to benefit significantly from
402 innovations; and (ii) were positioned advantageously to search knowledge, e.g. they had
403 travelled across the Country to meet different service providers, had friends and relatives
404 working in healthcare, or were embedded in patient groups. These patients were particularly
405 interested in and well-equipped to improve the current services, and independently tried to
406 collect new information of available alternatives elsewhere, e.g. through forums and informal
407 conversations with peers, or through more elaborated searches. In Case 1, for instance, some
408 patients had travelled across the Country to meet different service providers in order to
409 improve their pain management. Talking with other patients with similar experiences, they
410 had developed an up-to-date knowledge on available alternatives, before these had been
411 published in scientific journals. These patients used the Internet to search more information
412 and communicate them to their current providers to, at least, discuss new service options.

413 ***Interview excerpt – Innovation 2***

414 *SC2: Medical consultants are extremely busy, and our [time off clinics] has been reduced*
415 *drastically. [In the few hours per week] we are expected to do audits, research, attend*
416 *conferences and seminars, supervise students and juniors, participate in managerial*
417 *meetings, write publications and applications etcetera. It's an impossible task. Capacity is a*
418 *big issue. We need to look at job plans and decide if you want consultants to just be clinicians*
419 *and look after patients. We should focus on the most complex patients. Then you give them*
420 *capacity to be clinical leaders in the team, and innovators.*

421 These behaviors improved the relationship with clinicians, who welcomed these inputs from
422 patients. Clinicians shared patient insights with peers during the multidisciplinary team
423 meetings, or directly engaged patients in the innovation process. Across all sites, clinicians

424 directly quoted patients' knowledge searches to legitimize changes in the services. Clinicians
425 could then look at the literature "with new eyes"; liaise with external providers with similar
426 experiences; develop better communications with these patients in the consultations.

427 ***Fieldnote excerpt – Innovation 1***

428 ***SCI:*** *Some patients are glorious goldmines of information, especially when they move from*
429 *other regions. They carry insights on what others do. You would think that we know who does*
430 *what everywhere and any time in the NHS, but there is no such knowledge system. So, what is*
431 *not reported in conferences, seminars or journals is fundamentally unavailable to us... Those*
432 *patients perhaps don't even realize how precious it was for us to know about the other*
433 *experiences, because we could pick up the phone, call the colleagues and say: "We are trying*
434 *to develop this new service, and this patient told us about you – can we have a chat?"*

435 Fourth, other patients were proactive *laggards*, i.e. they were latest to accept the established
436 services and very vocal in expressing their skepticism and challenging clinicians. We derive
437 the term "laggard" from Rogers (2003) and from observations in the contexts of Innovation 1,
438 2 and 3. Professionals did not use this term, but represented the following concept: some
439 patients had bad experiences with the service providers or held specific misconceptions about
440 traditional care. Hence, they were the hardest group of people to reach out. Unlike passive
441 and reactive patients, these actors actively engaged with knowledge search, perusing
442 "contrarian" views on what service innovations should do. In doing so, they challenged the
443 status and decisions of their clinicians, and searched knowledge to identify alternative
444 medications or services. Mental health workers were especially exposed to this risk. Patients
445 perceived the stigma of mental health diagnosis, and search knowledge that could legitimize
446 their decision not to attend psychological sessions.

447 This behavior deteriorated the relationship with clinicians, e.g. showing mistrust over their
448 intentions and capabilities. Patients could refuse to attend the clinics, or to adhere to clinical
449 decisions. Innovation 1 clinicians, for instance, reported how some patients refused to attend
450 meetings with the psychologists despite complaining of anxiety and sleep deprivation, and
451 stopped attending consultations with their acute specialist, who proposed the new service.

452 ***Interview excerpt – Innovation 1***

453 ***SCI:*** *In general, there is a lot of stigma with psychological services [as if] attending our*
454 *clinics means they are crazy. These patients also have physical pain, so they wonder why they*

455 *should attend psychological services. They think [acute specialists] are not taking their pain*
456 *seriously and dump them to us. We try to explain we are investigating if there is any*
457 *psychological distress, and perhaps doing that improves their pain management. But often,*
458 *they do not attend, and go elsewhere.*

459 This behavior also deteriorated the innovation process. Clinicians accommodated some
460 request from patients, which generated concerns over the maximum appropriateness.

461 ***Fieldnote excerpt – Innovation 3***

462 ***SC10:*** *It is quite evident that [changes] were made to accommodate what patients thought*
463 *was best for them. I'm a bit conflicted about that, because we probably could be managing*
464 *[this pathway] in a more innovative way. However, the evidence is not so clear to rule out*
465 *[patients' expectations]. So I can see the problem of balancing the two... This proposal is*
466 *very appropriate, but is it the most appropriate we could have delivered?*

467 Alternatively, clinicians excluded patients from the innovation processes to avoid making
468 compromises on the quality of the service.

469 ***Interview excerpt – Innovation 1***

470 ***Health researcher:*** *A colleague received dreadful press and death threats because he dared*
471 *to consider a psychological component to [organic symptoms]. Radical patient groups have*
472 *views that may be contrary to how we should develop services... Scientists shouldn't be*
473 *harassed for trying to understand the root causes for these challenging problems. A lot of*
474 *people believe some very strange ideas around the origins of these types of conditions. You*
475 *just have to look on the Internet to see some wacky views. People are entitled to have these*
476 *views, but please don't lambaste the people doing some proper scientific work.*

477 Based on this evidence, we propose:

478 *P1. Knowledge searches made by lead-users (perceived by professionals to be consistent with*
479 *their logics of appropriateness) improve the relationship with professional providers, and*
480 *support superior processes of innovation.*

481 *Lemma: Knowledge searches made by laggards (perceived by professionals to be*
482 *inconsistent with their logics of appropriateness) degrade the relationship with professional*
483 *providers, and support inferior processes of innovation.*

484 *Lemma 2: Knowledge searches made by passive/reactive users do not alter significantly the*
485 *relationship with professional providers or the processes of innovation*

486 **4.2.Key features of lead-users**

487 Professional tactics aimed at (i) motivating reactive and passive patients to engage more with
488 knowledge search and (ii) reducing the risk that laggards gained momentum and supported
489 inappropriate innovations. Overall, they hoped to “transform” these patients into lead-users.
490 Three features characterized the lead-users. First, they were motivated to directly participate
491 in the decisions about their care. Curiosity to know more about ‘what is out there’, and the

492 desire to take responsibility for decision-making overcame the anxieties of knowledge search
493 and decision-making. Second, they processed information and develop proper conversations
494 with service providers without feeling subordinated to (or overwhelmed by) professional
495 status. Third, they were aware of their personal limitations and the need to connect with more
496 knowledgeable actors to make decisions.

497 *Conference excerpt – Innovation 3*

498 *Patient: A few years ago, I decided to write about my life with [this disease], after a long*
499 *history of misdiagnoses. [This innovation] meant a lot to me because of the signs that were*
500 *missed in my life. I became part of [a steering group], and collaborated with [service*
501 *provider]. I wanted to fight the stigma surrounding our condition [because] it leads to people*
502 *not wanting to be open [and delaying cures]. We needed to approach it with experts,*
503 *improving our lines of communication*
504

505 This evidence aligns with the concept of *patient activation* in the literature. Activated patients
506 “believe they have important roles to play in managing their conditions, possess the
507 knowledge needed to manage their health; take action, using their skills and behavioral
508 repertoire to maintain their well-being; and stay the course under stress” (Hibbard et al.,
509 2007; p. 1458). Activation is a combination of patients’ resilience (i.e., remain proactive
510 despite stress and adversities); and awareness of their role in the process of care (i.e.
511 motivated to take responsibilities without interfering with the professional workforce).
512 Activated patients (Fumagalli et al., 2015) engage in several behaviors – e.g. training,
513 providing feedbacks, searching new knowledge – to overcome “the passivity of sick role
514 behavior and [assume] responsibility for their care” (Aujoulat et al., 2008; p. 1229). Patient
515 activation is likely to emerge from patients who have persistent conditions, which need
516 continued observance, generate stigma or impair social life. Consistently with this, we thus
517 propose:

518 *P2: Patients with higher degrees of activation are more likely to perform appropriate forms*
519 *of knowledge search oriented to service change or innovation.*

520 Knowledge searches might be inhibited by a lack of access to traditional and virtual channels.
521 Despite the broad diffusion of Internet, for instance, several patients did not have rapid access
522 to it, or did not know how to meaningfully use these media. Patients’ insecurity about their

523 search skills generated additional anxiety that relevant information is missed, and that
524 subsequent conversations with a clinician would reveal their limitations.

525 ***Field-note – Innovation 4***

526 ***SC7:*** *I promote the use of a new technology to almost all my patients. However, I need to be*
527 *careful about their skills, and how they react. I cannot push it on patients, or this creates*
528 *problems in our relationship. Some patients are reluctant, because they do not feel confident*
529 *about their IT skills, do not care about new technologies, or just want to keep things as they*
530 *are. [Changes] become an additional burden and responsibility for them, who already are in*
531 *a fragile condition...*

532 Conversely, patients were more likely to explore new knowledge when they were confident
533 in the use of traditional and virtual channels. Stronger access to traditional and virtual sources
534 and stronger perception of control over these meant that patients also had (i) has greater
535 confidence in the achievement of meaningful outcomes and (ii) has fewer concerns about
536 unintended consequences. Patients might however become over-confident, and lower the
537 level of attention in the selection and interpretation of new knowledge.

538 ***Meeting excerpt – Innovation 1 [Discussing another innovation]***

539 ***SC8:*** *They should have chosen a better name for the programme. That's one of my pet peeves:*
540 *the notion that 'patients take the lead' [anonymized name] feels excluding of healthcare*
541 *professionals that work in the wonderful multidisciplinary team around that patient.*

542 ***SC3:*** *Well, most patients don't take [such names] too seriously...*

543 ***SC8:*** *Agreed, but they accept the ethos. They ask: if 'patients take the lead', why am I not?*
544 *The truth is that we must take the final decision, because we are accountable for it. This shift*
545 *[in decision-making] cannot happen.*

546 ***SC1:*** *It creates different expectations, I agree.*

547 ***SC8:*** *Patient-centered care is a better term. It conveys the idea that [innovations] should put*
548 *patients at the center of our decision-making, not at the top...*

549 Notwithstanding the actual capacity to find new knowledge, however, our findings suggest
550 linear and positive effects of self-efficacy on task persistence. Hence, we propose:

551 *P3: Patients with greater access and ability to use of traditional and virtual channels are*
552 *more likely to engage with knowledge search.*

553 **4.3. Professional tactics to elicit appropriate search mechanisms**

554 Across the cases, professionals invested on initiatives that sought to (i) elicit a more proactive
555 and “innovative” response from the majority of patients, who either disengaged from any
556 knowledge search, or concentrated only on the routine service delivery; (ii) reduce the chance
557 that patients acted as laggards, who used knowledge searches to divert innovation processes
558 towards inappropriate directs. Professionals were especially concerned for the threats of

559 laggards, who remain “hidden” from their view and eventually acquire a “bigger voice” than
560 others. In Innovation 1, for instance, a minority group of patients was so vocal that it
561 threatened researcher and clinicians attempting to couple physiotherapy with psychotherapy.

562 ***Interview excerpt – Innovation 1***

563 *SC1: We decided to change name of the new service to prevent problems with “certain”*
564 *patients, who don’t accept the idea of psychological interventions. The former name and*
565 *description of the service, we thought, had too much of a “psychological flavor”, and were*
566 *likely to disengage a significant amount of patients. So, we introduced more neutral terms,*
567 *such as “distress” and “complex care” instead of “psychological complications”.*

568 Noticeably, then, professional tactics were primarily designed to prevent problems from
569 laggards, and subsequently to grasp opportunities from lead-users. Two tactics were
570 especially salient to manage patients’ knowledge searches within acceptable logics of
571 appropriateness. First, professional providers worked to limit the ‘stickiness’ of scientific
572 knowledge for patients. These initiatives involved communication events and the sharing of
573 educational material to increase patients’ basic knowledge and awareness of the logics of
574 appropriateness. Across all innovation sites, clinicians used face-to-face consultations to
575 provide patients with a first education on their condition, to collect information about
576 patients’ knowledge search, and to explain their decision-making. These conversations were
577 not directly meant for innovation purposes, but created the background for patients’
578 knowledge search as (i) clinicians collected information about patients’ knowledge, to
579 understand if and how they search knowledge; and (ii) patients prevented misunderstanding,
580 disrupted false beliefs, and received clarifications on what knowledge was regarded as
581 appropriate by the clinicians. In Case 1, some acute specialists built these conversations
582 around a website, which included lay descriptions of medical conditions, diagnoses and
583 therapies; debunking of false ‘myths’; frequently asked questions; and links to portals where
584 patients search knowledge in ‘safe’ environment, e.g. Cochrane Database.

585 ***Interview excerpt – Innovation 1***

586 *SC7: Our patients very often ask: what are the causes of my pain? Am I imagining it? What*
587 *about the treatments? What should I expect? A colleague had the brilliant idea of developing*
588 *a website to address these questions. I use it during consultations with the patients. Then they*

589 *can google it at home and read it through... It is full of hyperlinks, and who knows where this*
590 *leads them [chuckles]...*

591 In Case 3, conversations about the “appropriateness” of the services moved outside of face-
592 to-face consultations. Public meetings, workshops and community events represented the key
593 social environments in which clinicians communicated their intentions to improve the
594 services, and elicited patients’ inputs. Clinicians shaped patients’ understanding of
595 appropriateness by communicating their methodology and appropriate sources of knowledge.

596 ***Interview excerpt – Innovation 3***

597 ***SC9:*** *We have forums to receive updates from patients. Some read a lot of stuff from different*
598 *sources, and talk to each other. Then, they ask: “what don’t you do that?” Some idea is*
599 *brilliant, most are not. These conversations happened only during consultations, where we*
600 *have little time to explain what we can do with that information. In these forums, we can*
601 *communicate our approach and methods, so it is clear what we can and cannot do, what is*
602 *relevant and is not. We put them in the condition to help us.*

603 Elsewhere, interactions with patients did not address the problem of knowledge stickiness. In
604 Cases 2, 4 and 5, workload pressures inhibited conversations and events with patients.
605 Clinicians opted for the provision of leaflets, providing summary information about patient
606 conditions, the rationale and nature interventions and useful links to collect more information.
607 These initiatives suggest that professionals invested in the provision of basic *health literacy*
608 to their patients. Health literacy represents “the degree to which individuals have the capacity
609 to obtain, process, and understand basic health information and services needed to make
610 appropriate health decisions” (Nielsen-Bohlman et al., 2004; p. 32). Higher degrees of health
611 literacy are expected to increase the ability to “gain access to age and context specific
612 information from a variety of different sources; discriminate between sources of information;
613 understand and personalize health information that has been obtained; appropriately apply
614 relevant health information for personal benefit” (Nutbeam, 2008; p. 2076). Hence, patients
615 with greater health literacy should be more active and effective in searching new knowledge
616 outside of the direct relationship with clinicians; and capable to engage with conversations
617 with clinicians about such knowledge. We thus propose:

618 *P4: Patients with greater health literacy display higher degrees of patient activation.*

619 *Lemma: Professional providers can increase users' literacy by carving time in their*
620 *operational interfaces (e.g. face-to-face consultations) to explain their decision-making;*
621 *implementing new interfaces (e.g. websites, leaflets) to publish their knowledge; and*
622 *introducing short windows of contact (e.g. workshops, seminars) to discuss appropriate*
623 *innovations.*

624 Second, professionals worked to build a sense of reciprocity with the service stakeholders.
625 The relationships between clinicians and patients are characterized by status differentials, as
626 the former possess medical and experiential knowledge that is inaccessible to the latter. So,
627 most patients usually leave the jurisdiction of knowledge search entirely to professionals; or
628 are disillusioned about clinicians' behaviors and act antagonistically. Attempts to engage
629 patients without a revision of this relationship failed to gain traction.

630 ***Interview excerpt – Innovation 3***

631 ***SC9:*** *The engagement of patients took a lot of time. Initially, we approached this issue*
632 *naively, thinking that we just had to stick our heads out. We experimented with some patient*
633 *forums, but the response was limited... We needed to be clearer about our intentions and what*
634 *we asked from our patients. It was a hit-and-miss approach, while we realized we needed to*
635 *develop a consultation process [and be clear about] how we collect information, what were*
636 *the [inclusion criteria] and how we could use this.*

637 In Case 3, clinicians addressed this problem directly, and worked to increase patients' trust in
638 their 'benevolence'. This included: being outspoken about the need and rationale for change,
639 clarifying what kind of knowledge was useful and how the provided knowledge would be
640 processed; publicly acknowledging patients' knowledge and feedbacks; generating occasions
641 in which providers reported back to patients. By doing so, clinicians locked their innovation
642 processes into acknowledging, while not necessarily incorporating, patient inputs.

643 ***Fieldwork excerpt – Innovation 3***

644 ***SC3:*** *We rejected some proposal, but we did not ignore them. We explained every decision by*
645 *providing our rationale for including certain inputs and not others. Patients were stimulated*
646 *to participate because one way or the other, they would receive something from the process.*
647 *Either inputs were embedded in the innovation, or they learn why that information was not*
648 *appropriate. They trusted we were not trying to screw with them or losing their time.*

649 Reassured patients organized to search and share knowledge. This materialized into a formal
650 consultation process with patients, which included a website of the initiatives, public events
651 where the initiative was presented; web forums, social media handles and other public forums
652 with which patients could collect information about the initiative and share knowledge.

653 *Conference excerpt – Innovation 3*

654 *Researcher: We have a great deal to celebrate. There have been a lot of important changes*
655 *over the last few years. Our patients and providers have risen to the challenge developing a*
656 *radical transformation of services... The event today has patients at the heart of it. Patients*
657 *and patient representatives that I see today in the audience have been central to organizing*
658 *this event and developing the format for today. You have entered the 'loop' a long time ago:*
659 *let me emphasize that you have helped us raising our ambitions.*

660 Cases 2 performed similar actions “more timidly”. Public consultations with patients were
661 limited to the earlier stages of “knowledge scoping”; after which, clinicians and managers
662 controlled the innovation process, and stopped eliciting patient inputs. Similarly, the other
663 cases hid the existence of an innovation process from patients. In Case 1, clinicians used
664 inputs from patients during the face-to-face consultations, but did not clearly state the
665 existence of the innovation process to avoid the risk of losing its ownership. Clinicians did
666 not request patients’ knowledge search, so the innovation processes benefitted from the few
667 patients who spontaneously engaged with this behavior. Following this, we propose:

668 *P5: Patients with higher trust in the benevolence and competence of their providers display*
669 *higher degrees of patient activation.*

670 *Lemma: Professional providers can increase users’ trust in their benevolence and*
671 *competences by exposing key steps of the innovation processes to the user community;*
672 *explaining the rationale, requirements and boundaries of patients’ knowledge searchers,*
673 *clarifying the logics and practices used to select the relevant knowledge.*

674 **5. Quantitative research methodology**

675 For a further validation of the induced model, we tested empirically its propositions on
676 service users. Quantitative data for this study were collected through a face-to-face survey.
677 Patients represented our unit of analysis, and all data came from primary sources. The survey
678 focused on patients with chronic obstructive pulmonary disease (COPD). Information about
679 COPD patients is strictly confidential, and not directly available to the public. Hence, for
680 practical and ethical considerations, we involved 8 senior clinicians, who shared our interest
681 in the factors influencing patients’ knowledge search behaviors to (i) identify a list of
682 patients, who were cognitively and psychologically adequate to provide reliable data; and (ii)
683 discuss their participation to the research. 115 patients agreed to participate, and clinicians

684 put these in contact with us. At this point, the fieldworkers clarified to patients that the survey
 685 exclusively had academic purposes; that all data would be handled with full confidentiality;
 686 and that there were no correct answers. 110 patients agreed to participate, and as many
 687 complete questionnaires were collected through face-to-face interviews. Sociodemographic
 688 control variables (age, gender, education and severity of the disease) were collected from
 689 respondents, and double-checked with clinical records (Table 2).

690 Table 2: Sociodemographic characteristics of the enrolled patients

Characteristic	Type	N	%
Gender	<i>Female</i>	37	34%
	<i>Male</i>	73	66%
Age	<i>41-50</i>	2	2%
	<i>51-60</i>	8	7%
	<i>61-70</i>	28	25%
	<i>71-80</i>	50	46%
	<i>81-90</i>	22	20%
Education	<i>Primary School</i>	32	29%
	<i>Secondary School</i>	34	31%
	<i>College</i>	29	26%
	<i>Bachelor/Master Degree</i>	13	12%
	<i>Other</i>	2	2%
Severity of the disease <i>Measured with mMRC scale</i>	<i>Level 0 (low severity)</i>	8	7%
	<i>Level 1</i>	41	37%
	<i>Level 2</i>	19	17%
	<i>Level 3</i>	20	18%
	<i>Level 4 (high severity)</i>	22	20%

691 Interviews were run by two authors and lasted on average 45 minutes. They took place in a
 692 dedicated room to guarantee privacy and comfort to patients. Clinicians ignored who the
 693 actual participants were, and did not take part to any interview to avoid any influence on
 694 patients. Clinicians did not have access to any individual questionnaire.

695 5.1.Measures

696 The questionnaire administered through face-to-face interviews included scales adapted from
 697 previous research. The measurement items were pre-tested by 8 senior clinicians and 10
 698 patients (not included as respondents), who were asked to indicate whether these items were
 699 suitable and clearly phrased. Specifically, *Patient Activation* was measured with four items
 700 derived from Hibbard et al. (2005); *Use of (Traditional and Virtual) Sources of Information*

701 were measured with three items for traditional sources and other three items for digital ones,
702 both derived from Holtgräfe and Zentes (2012); *Health Literacy* was measured with three
703 items derived from the Health Literacy scale by Chew et al. (2004) and Omachi et al. (2013);
704 *Trust in Providers* was measured with five items derived from Anderson and Dedrick (1990).
705 The scales for patients' *Knowledge Search* and *Improvement of Patient-Provider*
706 *Relationship* were crafted by the authors for this specific study and measures with two items.
707 Three considerations assured us that the two scales are suitable to test our propositions: (i)
708 their contextual validity was validated by both providers and patients; (ii) collected data
709 showed considerable variation in the answers, leading us to think that the items captured
710 different opinions; (iii) the analysis also provided more than satisfying measurement
711 properties. All manifest variables used to measure the latent variables are shown in Table 3
712 along with relevant indicators of convergent and discriminant validity.

713 Given that we relied on a single respondent design, we controlled for common method
714 bias in two ways: through the design of the study and through statistical control (Podsakoff et
715 al., 2003). Regarding the survey, we carefully pre-tested the items to ensure that ambiguous,
716 vague or unfamiliar terms were not included; reassured respondents of confidentiality;
717 emphasized that there were no 'correct' answers; and encouraged respondents to provide
718 objective answers. The research project was labelled as a broad overview of the patients'
719 knowledge search initiatives: no explicit reference to the intention to test antecedents or
720 consequences was evident. Thus, the respondents' attention was not drawn to the
721 relationships being targeted in this study. Questions including items and constructs related to
722 each other in the general model were also separated in the questionnaire in order to prevent
723 respondents from developing their own theories about possible cause–effect relationships.
724 Finally, we used different scales and formats for the independent and criterion measures. As a
725 second mean to ensure against common method bias, we examined the unrotated factor

726 solution for the constructs included in our model checking that neither a single nor a general
727 factor was likely to account for the majority of the covariance among the measures.

728 **5.2.Results**

729 Hypotheses were tested using structural equation modelling (SEM) with the maximum
730 likelihood (ML) estimation method. Most SEM applications described in the literature are
731 analyzed with this methodology. The hypothesized model was tested statistically in a
732 simultaneous analysis of the entire system of variables to determine the extent to which it was
733 consistent with the data. Where goodness-of-fit is adequate, the model can be seen as a
734 plausible explanation of postulated interactions between constructs. The research model is
735 analyzed and interpreted sequentially: first the assessment of the reliability and validity of the
736 measurement model and secondly the assessment of the structural model. The R software
737 (<https://cran.r-project.org>) was used to estimate both the measurement model and the
738 structural model. The ML algorithm was used to obtain the paths, the loadings, the weights,
739 and the quality criteria.

740 **5.2.1. Measurement model**

741 The measurement model consists of seven multi-item constructs with a total of 22 indicators.
742 We used several tests to determine the convergent and discriminant validity of the reflective
743 constructs. We controlled through an exploratory factor analysis that all item loadings
744 between an indicator and its posited underlying latent variable were greater than 0.5 with no
745 relevant cross-loadings. Next, all the measurement scales of the reflective constructs have
746 been tested through confirmatory factor analysis (CFA). We verified the measures by
747 assessing reliability and unidimensionality of each of the seven constructs, i.e. item-to-total
748 correlations within each construct were examined. The measures also meet discriminant and
749 convergent validity requirements: both composite reliability (CR) and average variance
750 extracted (AVE) were above the recommended threshold of 0.7 and 0.5, respectively (Fornell

751 and Larcker, 1981). Only the Patient Activation AVE is slightly below the threshold, but
 752 none of the constructs violates the Fornell-Larcker criterion. In particular we checked that the
 753 squared correlation between each pair of latent constructs does not exceed their AVE
 754 estimates (see Table 4). Finally, we evaluated the overall model fit in two ways (Hu and
 755 Bentler, 1998): with the chi-square goodness-of-fit statistic (which should be <2) and with
 756 other absolute and relative fit indices, namely we considered the comparative fit index (CFI)
 757 and Gamma hat or root mean square error of approximation (RMSEA). Overall the CFA
 758 reveals a sufficient model fit attested through such fit indices for the measurement model:
 759 $\chi^2=239.577$; $\chi^2/d.f.=1.30$; $RMSEA=0.052$; $CFI=0.972$.

760 Table 3: Measurement properties of reflective constructs from CFA (* = reversed)

Constructs	Items (corresponding to the survey questions)	Loading	CR	AVE
Health Literacy	I understand any information about my health	0.756	0.805	0.580
	I need other persons' help to understand information about my health*	0.803		
	I am confident in filling in all documents about my health and disease that the provider requires	0.735		
Trust in Provider	I do not think that my provider is taking care of me as a person	0.610	0.806	0.548
	My provider is taking into account my needs and put them in first place	0.713		
	I trust my provider so much that I try implement her recommendations	0.749		
	I trust my provider's judgement about my health	0.751		
	I think that my provider is doing everything she can to take care of me	0.879		
Patient Activation	I am confident I can take actions that will help prevent or minimize some symptoms or problems associated with my health condition	0.554	0.712	0.387
	I know what each of my prescribed medications do	0.685		
	I am confident I can tell my health care provider concerns I have even when she does not ask	0.662		
	I can handle symptoms of my health condition on my own at home	0.592		
Use of Traditional Sources of Information	I can search information about health through the TV programs and newspapers	0.964	0.977	0.934
	I find difficult to search information about your health through the TV programs, newspapers, others sources but Internet	0.974		
	I can search information about your health through the TV programs, newspapers, others sources but Internet	0.961		
Use of Digital Sources of Information	I am able to search information about health on Internet	0.956	0.981	0.944
	I find difficult to search information about my health on Internet	0.994		
	I am used to search information about my health on Internet	0.965		
Knowledge Search	I often search new information about my health/disease	0.842	0.852	0.742
	I use different sources of information to search new insights on the management of my disease	0.886		
Improvement in Relationship with Provider	My understanding of providers' intentions has decreased in recent time*	0.808	0.904	0.826
	My appreciation for providers' recommendations has increased in recent time	1.016 ^a		

761 *Fit indexes: chi-square=239.577; p-value=0.004; chi/d.f.=1.30; CFI=0.972; RMSEA=.052*
 762 ^a - On the legitimacy of coefficients above 1, please cf. Deegan (1978) and Joreskog (1999)

763

764

Table 4: Correlation matrix

Variables	1	2	3	4	5	6	7
1. Health Literacy	0.762						
2. Trust in Provider	-0.072	0.741					
3. Patient Activation	0.515	0.298	0.622				
4. Use of Traditional Info	0.388	-0.085	0.357	0.966			
5. Use of Digital Info	0.411	-0.192	0.362	0.250	0.972		
6. Knowledge Search	0.394	-0.072	0.545	0.514	0.452	0.861	
7. Improvement of Patient-Provider Relationship	0.464	-0.118	0.370	0.659	0.583	0.622	0.909

765 *The square root of the average variance extracted (AVE) is shown in bold on the diagonal. Correlations are in*
766 *the lower triangle of the matrix.*

767

5.2.2. Structural model

768

769

770

771

772

773

774

775

776

777

778

779

780

781

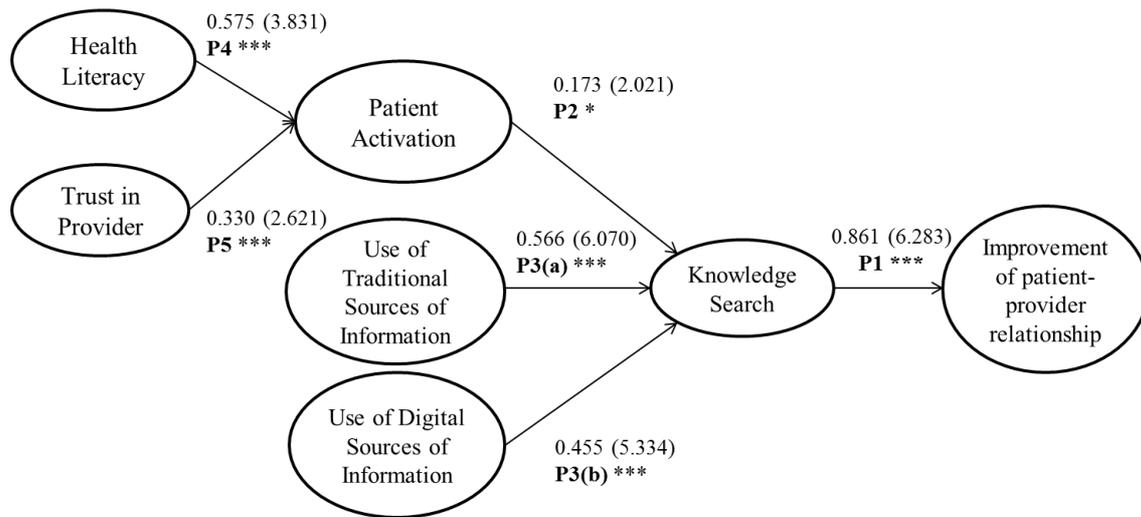
782

783

784

The postulated path model produced a sufficient fit to the data ($\chi^2 = 299.466$; $\chi^2/\text{d.f.} = 1.55$; RMSEA = .071; CFI = .947). Figure 1 shows the results of the propositions testing, which support all the hypothesized relationships. Specifically, Proposition 1 (P1) is confirmed, as the link between knowledge search and the improvement of patient-provider relationship was positive and significant ($\beta = 0.861$, $t = 6.283$). Noticeably, the 8 senior consultants could not report laggards among the 115 patients. Senior consultants noted the relationship with ‘lag-user’ patients had so deteriorated that the latter could not be contacted (hence providing additional qualitative support to our lemma to P1). The sample thus included patients who remained within acceptable (for clinicians) boundaries of appropriateness. P2 was also confirmed. The link between patient activation and knowledge search was positive and significant ($\beta = 0.173$, $t = 2.021$). Likewise, P3 was confirmed. The link between the use of traditional and digital sources and knowledge search were positive and significant (respectively, $\beta = 0.566$, $t = 6.070$; $\beta = 0.455$, $t = 5.334$). Finally, P4 and P5 were confirmed. Health literacy and trust in provider had positive and significant links with patient activation (respectively, $\beta = 0.575$, $t = 3.831$; $\beta = 0.330$, $t = 2.621$).

Figure 1: SEM Results



786

787 ****p-value<0.001; **p-value<0.01; *p-value<0.05; the value of the test statistic is in brackets*788 *Fit indexes: chi-square=299.466; p-value=0.000; chi/d.f.=1.55; CFI=0.947; RMSEA=.071*789 **6. Discussion**

790 Healthcare providers are exemplars of professional service organizations whose logics of
 791 appropriateness demand the prioritization of clients' interests, while the complex knowledge
 792 prevents full user engagement (Von Nordenflycht, 2010). So, while some patients might help
 793 providers accessing otherwise remote knowledge; others might implement incongruous
 794 search mechanisms and demand inappropriate innovations.

795 Previous research in professional contexts did not address this conundrum, showing
 796 contradictory examples of user engagement, or successful cases of professionals protecting
 797 their status as sole 'arbiters of risk and appropriateness' (Currie et al., 2012). Research in
 798 private settings, instead, shows firms 'cherry-picking' knowledge from user communities,
 799 and only engaging lead-users in innovation processes (Greer and Lei, 2012). Our findings
 800 divert from both perspectives showing that professionals concentrate on the engagement of
 801 'laggards', i.e. patients who are proactive like lead-users, but enact inappropriate search
 802 mechanisms. Laggards are a threat to established jurisdictions and logics of appropriateness,
 803 and cannot be kept at arms' length because they actually hid themselves from professionals'

804 view; and nevertheless influence the design and implementation of service innovations with
805 inappropriate ideas and expectations.

806 The focus on laggards explains the emphasis on literacy and trust – both understood as *the*
807 way to reduce the threats of inappropriateness, rather than a way to increase the opportunities
808 from their creativity. More specifically, health literacy initiatives designed the cognitive
809 framework for patients' knowledge search. Professionals provided patients with the basic
810 knowledge on their logics of appropriateness – so that patients could self-regulate their
811 knowledge search. These findings resonate with the concept of *shared mental models*
812 (Mathieu et al., 2000), i.e. the collective understanding of knowledge within a group of
813 innovators. We import this concept from the teamwork literature. Different team members
814 hold different interpretations of relevant outcomes, tasks, technologies and inputs for a given
815 goal (Cannon-Bowers et al., 1993). Organizations are invited to 'unpack' the nature of these
816 differences, realizing that the *variety* of perspectives and inputs improves decision-making
817 and generates more creativity; while, the *separation* of values, beliefs and attitudes generates
818 conflicts (Harrison and Klein, 2007). Shared mental models exactly generate consensus on
819 the basic values and beliefs, without homologating the individual perspectives (Mathieu et
820 al., 2008). We extend these considerations to the relationship between professionals and
821 users. *Variety* is enabled by patients having perspectives on service innovation and access to
822 specific sources of information, both unavailable to professionals. The threats of "separation"
823 are however salient, once patients ignore professional logics and practices of appropriateness.
824 The investments in health literacy are thus attempts to reduce the separation of values and
825 beliefs through shared mental models on the basic logics of appropriateness; while preserving
826 the variety of perspectives by remaining at arms' length on the specifics of knowledge search.
827 By learning the language of their providers and understanding their decision-making process,

828 patients partook in new cognitive frameworks of values, beliefs and methodological tools,
829 and their knowledge search became meaningful.

830 Investments in competence/benevolence trust provided instead the affective framework for
831 user engagement. Users need reassurances from professionals about how their inputs are
832 processed otherwise they would disengage from knowledge search or become disillusioned.

833 Our findings resonate with the concept of *organizational fairness* regulating the relationship
834 between firms and employees (Colquitt et al., 2001; Fulmer and Gelfand, 2012). The social
835 exchange theory argues that employees are more likely to engage with organizational
836 citizenship behaviors if they expect to be reciprocated from their employer. Greater
837 perceptions of organizational fairness increase expectations of reciprocity, which in turn
838 increase employees' proactivity. Our findings extend these considerations to the relationship
839 between professionals and users. The most effective healthcare providers managed patients'
840 expectations, by increasing their trust in the fairness of the innovation process. Professionals
841 made the process and criteria used to collect process patient inputs transparent. This
842 transparency was the reciprocation expected by patients, who displayed greater participation
843 and less disillusionment than in other context. This is a significant departure from more
844 'traditional' research on knowledge search and user-based innovation, which suggested that
845 firms select capable and trustworthy partners, and then use weak ties to scan the knowledge
846 generated by other actors (e.g., Greer and Lei, 2012; Levin and Cross, 2004). On the contrary,
847 our findings suggest that trust-based and literacy mechanisms work in the other direction, i.e.
848 professionals had to legitimize their decision-making to users, so that the latter would decide
849 to adjust their search mechanisms to professional logics of appropriateness.

850 **7. Conclusions**

851 Our study investigated how professional organizations oriented the search mechanisms of
852 their users to access remote knowledge while preventing risks of inappropriateness. Our

853 findings highlighted the coexistence of lead-users, who proactively search new knowledge to
854 reinforce innovations processes; and “laggards”, who proactively search new knowledge to
855 challenge professional decision-making. Beyond the identification and engagement of lead-
856 users, professional organizations worked to remedy the engagement of laggards through
857 mechanisms of literacy and trust. By doing so, professional organizations created cognitive
858 and affective frameworks within which patients could self-regulate their search mechanisms.
859 To conclude, this study has a number of limitations which call for further theoretical and
860 empirical research. First, the paper focuses on a particular professional sector, i.e. healthcare,
861 where the risks of inappropriateness resulting from the involvement of users in the innovation
862 process are particularly severe. Furthermore, the relationship between patients and service
863 providers is special, as the former is especially vulnerable and often likely to accept
864 uncritically the decisions of their latter. It would be interesting to study whether and under
865 what conditions the findings of this study hold true in other professional service contexts
866 (such as law firms, universities or research institutions), where the risks of inappropriateness
867 might not be so severe, where the status of professionals and service providers is earned
868 through different mechanisms and where the overall regulatory context is highly
869 idiosyncratic. While we believe that the healthcare industry is a particularly paradigmatic
870 context, we expect that other professional service providers might adopt specific strategies to
871 involve users in knowledge search processes without detriment to the appropriateness of the
872 offered service. Unveiling these strategies represents a very promising venue for future
873 research. Second, the quantitative approach we employed has an exploratory nature and it
874 does not allow generalizing statistically the findings within and outside the healthcare
875 industry. Our aim was to make generalizations to the existing body of knowledge regarding
876 the involvement of users in knowledge search processes in professional organizations. We

877 hope that these findings will inform future empirical studies that will test our findings and
878 question their generalizability.
879 Despite these limitations, we believe that our study has offered a number of insights that will
880 extend our understanding of knowledge search processes and hopefully inform the practice of
881 service providers in professional organizations.

882 **8. References**

- 883 Abbott, A.D. 1988. *The System of Professions: An Essay on the Division of Expert Labor*. Chicago: University
884 Of Chicago Press.
- 885 Anderson, L.A., Dedrick, R.F. 1990. Development of the trust in physician scale: a measure to assess
886 interpersonal trust in patient-physician relationship. *Psychol Rep* 67, 1091-1100.
- 887 Aujoulat, I., Marcolongo, R., Bonadiman, L., Deccache, A. 2008. Reconsidering patient empowerment in
888 chronic illness: a critique of models of self-efficacy and bodily control. *Social Sciences & Medicine* 66,
889 1228–1239.
- 890 Becerra, M., Lunnan, R., Huemer, L. 2008. Trustworthiness, risk, and the transfer of tacit and explicit
891 knowledge between alliance partners. *Journal of Management Studies* 45(4) 691-713.
- 892 Bodemer, N., Müller, S.M., Okan, Y., Garcia-Retamero, R., Neumeier-Gromen, A. 2012. Do the media provide
893 transparent health information? A cross-cultural comparison of public information about the HPV vaccine.
894 *Vaccine*, 30(25), 3747-3756.
- 895 Bogers, M., Afuah, A., Bastian, B. 2010. Users as innovators: a review, critique, and future research directions.
896 *Journal of Management* 36, 857–875.
- 897 Burt, R. 1992. *Structural Holes*. Harvard University Press, Cambridge, MA.
- 898 Cannon-Bowers, J.A., Salas, E., Converse, S. 1993. Shared mental models in expert team decision making. In
899 Castellan, N.J. (Ed.) *Individual and group decision making*. Lawrence Erlbaum Associates, 221-246.
- 900 Chen, J., Chen, Y., Vanhaverbeke, W. 2011. The influence of scope, depth, and orientation of external
901 technology sources on the innovative performance of Chinese firms. *Technovation* 31, 362–373.
- 902 Chew, L.D., Bradley, K.A., Boyko, E.J. 2004. Brief questions to identify patients with inadequate health
903 literacy. *Family Medicine* 36(8), 588,594.
- 904 Claassen, L., Smid, T., Woudenberg, F., Timmermans, D.R. (2012). Media coverage on electromagnetic fields
905 and health: Content analysis of Dutch newspaper articles and websites: Health risks in the media. *Health,*
906 *Risk & Society*, 14(7-8), 681-696.
- 907 Colquitt, J.A., Conlon, D.E., Wesson, M.J., Porter, C.O., Ng, K.Y. 2001. Justice at the millennium: a meta-
908 analytic review of 25 years of organizational justice research. *Journal of Applied Psychology*, 86, 425-445.
- 909 Coule, T., Patmore B. 2013. Institutional Logics, Institutional Work, and Public Service Innovation in Non-
910 Profit Organizations. *Public Administration* 91(4), 980-997.
- 911 Creswell, J.W. 2013. *Research design: Qualitative, quantitative, and mixed methods approaches*. Sage
912 publications.
- 913 Currie, G., Lockett, A., Finn, R., Martin, G., Waring, J. 2012. Institutional work to maintain professional power:
914 recreating the model of medical professionalism. *Organization Studies* 33(7), 937-962.
- 915 Deegan, J. 1978. On the occurrence of standardized regression coefficients greater than one. *Educational and*
916 *Psychological Measurement*, 38(4), 873-888.
- 917 Deer, B. 2011. How the case against the MMR vaccine was fixed. *BMJ* 342, 5347.
- 918 Dinovitzer, R., Gunz, H., Gunz, S. 2015. Professional ethics: Origins, applications and developments. In L.
919 Empson, D. Muzio, J. Broschak, B. Hinings B (Eds.), *The handbook of professional services firms*. Oxford:
920 Oxford University Press, 113–134.
- 921 Domecq, J.P., Prutsky, G., Elraiayah, T., Wang, Z., Nabhan, M., Shippee, N., et al. 2014. Patient engagement in
922 research: a systematic review. *BMC health services research* 14
- 923 Easterby-Smith, M., Lyles, M.A., Tsang, E.W. 2008. Inter-organizational knowledge transfer: Current themes
924 and future prospects. *Journal of Management Studies* 45(4), 677-690.
- 925 Eisenhardt, K.M. 1989. Building theories from case study research. *Academy of Management Review*, 14(4),
926 532-550.
- 927 Enkel, E., Kausch, C., Gassmann, O. 2005. Managing the risk of customer integration. *European Management*
928 *Journal*, 23(2) 203-213.

929 Fornell, C., Larcker, D.F. 1981. Structural equation models with unobservable variables and measurement error:
930 Algebra and statistics. *Journal of marketing research*, 38(4) 382-388.

931 Frow, P., Nenonen, S., Payne, A., Storbacka, K. 2015. Managing Co-creation Design: A Strategic Approach to
932 Innovation. *British Journal of Management* 26(3), 463-483.

933 Fulmer, C.A., Gelfand, M.J. 2012. At what level (and in whom) we trust. Trust across multiple organizational
934 levels. *Journal of Management* 38(4), 1167-1230.

935 Fumagalli, L.P., Radaelli, G., Lettieri, E., Bertele', P., Masella, C. 2015. Patient empowerment and its
936 neighbours: Clarifying the boundaries and their mutual relationships. *Health Policy* 119(3), 384-394.

937 Gabbay, J., le May, A. 2004. Evidence based guidelines or collectively constructed "mindlines?" Ethnographic
938 study of knowledge management in primary care. *BMJ* 329(7473), 1013.

939 Gioia, D.A., Corley, K.G., Hamilton, A.L. 2013. Seeking qualitative rigor in inductive research notes on the
940 Gioia methodology. *Organizational Research Methods* 16(1), 15-31.

941 Granovetter, M. 1983. The strength of weak ties: A network theory revisited. *Sociological Theory* 1, 201-233.

942 Greer, C.R., Lei, D. 2012. Collaborative innovation with customers: a review of the literature and suggestions
943 for future research, *International Journal of Management Reviews* 14, 63-84.

944 Grimpe, C., Sofka, W. 2009. Search patterns and absorptive capacity: low- and high-technology sectors in
945 European countries. *Research Policy* 38, 495-506.

946 Hansen, M.T. 1999. The search-transfer problem: The role of weak ties in sharing knowledge across
947 organization subunits. *Administrative Science Quarterly* 44(1), 82-111.

948 Hansen, M.T. 2002. Knowledge networks: Explaining effective knowledge sharing in multiunit companies.
949 *Organization Science* 13(3), 232-248.

950 Harrison, D.A., Klein, K.J. 2007. What's the difference? Diversity constructs as separation, variety, or disparity
951 in organizations. *Academy of Management Review*, 32(4), 1199-1228.

952 Hibbard, J.H., Mahoney, E., Stockard, J., Tusler, M., 2005. Development and testing of a short form of the
953 patient activation measure. *Health Services Research* 40(6p1), 1918-1930.

954 Hibbard, J.H., Mahoney, E.R., Stock, R., Tusler, M. 2007. Do increase in patient activation result in improved
955 self-management behaviors. *Health Services Research* 42, 1443-63.

956 Hienerth, C., Lettl, C., Keinz, P. 2014. Synergies among producer firms, lead users, and user communities: The
957 case of the LEGO producer-user ecosystem, *Journal of Product Innovation Management* 31(4), 846-866.

958 Holtgräfe, C., Zentes, J. 2012. Multifaceted determinants of online non-prescription drug information seeking
959 and the impact on consumers' use of purchase channels. *Health Informatics Journal* 18(2), 95-110.

960 Hu, L.T., Bentler, P.M. 1998. Fit indices in covariance structure modeling: Sensitivity to underparameterized
961 model misspecification. *Psychological Methods*, 3(4), 424-453.

962 Inkpen, A.C., Tsang, E.W. 2005. Social capital, networks, and knowledge transfer. *Academy of Management*
963 *Review* 30(1), 146-165.

964 Joreskog, K.J. 1999. How large can a standardized coefficient be? Available at:
965 <http://www.ssicentral.com/lisrel/techdocs/HowLargeCanaStandardizedCoefficientbe.pdf>

966 Koh, H.K., Brach, C., Harris, L.M., Parchman, M.L. 2013. A proposed 'health literate care model' would
967 constitute a systems approach to improving patients' engagement in care. *Health Affairs* 32, 357-367.

968 Kohler, C., Sofka, W., Grimpe, C. 2012. Selective search, sectoral patterns, and the impact on product
969 innovation performance. *Research Policy* 41, 1344-1356.

970 Kraft, P.W., Lodge, M., Taber, C.S. 2015. Why People "Don't Trust the Evidence" Motivated Reasoning and
971 Scientific Beliefs. *The Annals of the American Academy of Political and Social Science* 658(1), 121-133.

972 Lane, P.J., Koka, B.R., Pathak, S. 2002. The reification of absorptive capacity: a critical review and rejuvenation
973 of the construct, *Academy of Management Review* 31(4), 833-863.

974 Laursen, K., Salter, A. 2004. Searching high and low: what types of firms use universities as a source of
975 innovation? *Research Policy* 33, 1201-1215.

976 Levin, D.Z., Cross, R. 2004. The strength of weak ties you can trust: The mediating role of trust in effective
977 knowledge transfer. *Management Science* 50(11), 1477-1490.

978 Li, Q., Maggitti, P.G., Smith, K.G., Tesluk, P.E., Katila, R. 2013. Top management attention to innovation: the
979 role of search selection and intensity in new product innovations, *Academy of Management Journals* 56(3),
980 893-916.

981 Llewellyn, S. 2001. Two-way windows: clinicians as medical managers. *Organization Studies* 22(4), 593-623.

982 Lüthje, C., Herstatt, C. 2004. The Lead User method: an outline of empirical findings and issues for future
983 research. *R&D Management* 34(5), 553-568.

984 Mathieu, J.E., Heffner, T.S., Goodwin, G.F., Salas, E., Cannon-Bowers, J.A. 2000. The influence of shared
985 mental models on team process and performance. *Journal of Applied Psychology*, 85(2), 273-283.

986 McMullan, M. 2006. Patients using the Internet to obtain health information: how this affects the patient-health
987 professional relationship. *Patient Education and Counseling*, 63(1), 24-28.

988 Murad, M.H., Asi, N., Alsawas, M., Alahdab, F. 2016. New evidence pyramid. *Evidence Based Medicine*,
989 21(4), 125-127.

990 Nahuis, R., Moors, E.H., Smits, R.E. 2012. User producer interaction in context. *Technological Forecasting and*
991 *Social Change* 79(6), 1121-1134.

992 Nielsen-Bohlman, L., Panzer, A.M., Kindig, D.A. 2004. *Health literacy: a prescription to end confusion*.
993 National Academies Press.

994 Nutbeam, D. 2008. The evolving concept of health literacy. *Social Science & Medicine* 67(12), 2072-2078.

995 Omachi, T.A., Sarkar, U., Yelin, E.H., Blanc, P.D., Katz, P.P. 2013. Lower health literacy is associated with
996 poorer health status and outcomes in chronic obstructive pulmonary disease. *Journal of General Internal*
997 *Medicine* 28(1), 74-81.

998 Osei-Frimpong, K., Wilson, A., Lemke, F. 2016. Patient co-creation activities in healthcare service delivery at
999 the micro level: The influence of online access to healthcare information. *Technological Forecasting and*
1000 *Social Change*. DOI: 10.1016/j.techfore.2016.04.009

1001 Parmentier, G., Mangematin, V. 2014. Orchestrating innovation with user communities in the creative
1002 industries. *Technological Forecasting and Social Change* 83, 40-53.

1003 Phelps, C., Heidl, R., Wadhwa, A. 2012. Knowledge, networks, and knowledge networks a review and research
1004 agenda. *Journal of Management* 38(4), 1115-1166.

1005 Podsakoff, P.M., MacKenzie, S.B., Lee, J.Y., Podsakoff, N.P. 2003. Common method biases in behavioral
1006 research: A critical review of the literature and recommended remedies. *Journal of Applied Psychology*
1007 88(5), 879-903.

1008 Polanyi, M. 1966. *Personal knowledge. Towards a post-critical philosophy*. London, Routledge.

1009 Radaelli, G., Lettieri, E., Mura, M., Spiller, N. 2014. Knowledge sharing and innovative work behaviour in
1010 healthcare: A micro-level investigation of direct and indirect effects.

1011 Raisch, S., Birkinshaw, J., Probst, G., Tushman, M.L. 2009. Organizational ambidexterity: balancing
1012 exploitation and exploration for sustained performance. *Organization Science*, 20(4), 685-695.

1013 Renzl, B. 2008. Trust in management and knowledge sharing: The mediating effects of fear and knowledge
1014 documentation. *Omega* 36(2), 206-220.

1015 Rosenkopf, L., Nerkar, A. 2001. Beyond local search: boundary-spanning, exploration, and impact in the optical
1016 disc industry. *Strategic Management Journal*, 22, 287-306.

1017 Savino, T., Messeni Petruzzelli, A., Albino, V. (2015) Search and Recombination Process to Innovate: A
1018 Review of the Empirical Evidence and a Research Agenda, *International Journal of Management Reviews*,
1019 DOI: 10.1111/ijmr.12081

1020 SteelFisher, G.K., Blendon, R.J., Lasala-Blanco, N. 2015. Ebola in the United States — Public Reactions and
1021 Implications, *New England Journal of Medicine* 373, 789-791.

1022 Szulanski, G. 1996. Exploring internal stickiness: Impediments to the transfer of best practice within the firm.
1023 *Strategic Management Journal* 17(S2), 27-43.

1024 Teddlie, C., Tashakkori, A. 2009. *Foundations of mixed methods research: Integrating quantitative and*
1025 *qualitative approaches in the social and behavioral sciences*. Sage Publications.

1026 Van Wijk, R., Jansen, J.J., Lyles, M.A. 2008. Inter-and intra-organizational knowledge transfer: a meta-analytic
1027 review and assessment of its antecedents and consequences. *Journal of Management Studies* 45, 830-853.

1028 von Hippel, E. 1986. Lead users: a source of novel product concepts. *Management Science* 32, 791-805.

1029 von Hippel, E. 1994. "Sticky information" and the locus of problem solving: implications for innovation.
1030 *Management Science* 40(4), 429-439.

1031 von Hippel, E. 2009. Democratizing innovation: the evolving phenomenon of user innovation. *International*
1032 *Journal of Innovation Science* 1(1), 29-40.

1033 von Nordenflycht, A. 2010. What is a professional service firm? Toward a theory and taxonomy of knowledge-
1034 intensive firms, *Academy of Management Reviews* 35(1), 155-174.

1035 Wagner, C. 2002. End users as expert system developers. *Human computer interaction development and*
1036 *management*, in T. Barrier (Eds.) *Human Computer Interaction Development and Management*, 31-53.

1037 Walshe, K., Rundall, T.G. 2001. Evidence-based management: from theory to practice in health care. *Milbank*
1038 *Quarterly*, 79(3), 429-457.

1039 West, M.A., Wallace, M. 1991. Innovation in health care teams. *European Journal of Social Psychology*, 21(4),
1040 303-315.

1041 World Health Organization (WHO). 2000. Appropriateness in Health Care Services. Available at:
1042 www.euro.who.int/_data/assets/pdf_file/0011/119936/E70446.pdf

1043 Yin, R.K. (2013). *Case study research: Design and methods*. Sage publications.

1044 Yoshida, D., Miyazawa, J.I., Takahashi, S. 2014. Role of community in user innovation generation and
1045 diffusion. Focusing on non-brand communities in the mountain climbing market. *Technological Forecasting*
1046 *and Social Change* 88, 1-15.