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1 A spatialised information system to support decisions
2 regarding grazing management in mountainous and
3 Mediterranean rangelands

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6 **Abstract**

7 Agro-sylvo-pastoral systems are common around the Mediterranean Basin,
8 where they provide a variety of goods and services to the local popula-
9 tions. Their sustainability relies on efficient grazing management, especially
10 in Mediterranean rangelands. The diversity of pastoral resources, combined
11 with the variety of grazing management techniques and farming objectives,
12 has slowed down the development of digital tools to assist grazing manage-
13 ment in these conditions. However, digital technologies could serve agro-
14 sylvo-pastoral farms by improving the efficiency of grazing management and
15 reducing the difficulty of the associated work. In this objective, and to take
16 into account the variety of situations, we suggest developing an informa-
17 tion system based on a variety of (contextualised) complementary data. For

18 southern France, the following data can be combined: Sentinel 2 images,
19 Registre Parcellaire Graphique (RPG), OSO land use and cover, RGE Alti
20 altimetry data, pastoral technical references, herd GPS location and feedback
21 from farmers. However, designing and implementing such an information
22 system requires overcoming methodological and technical limitations con-
23 cerning the integration of heterogeneous structured and unstructured data
24 and the definition of meaningful ways to combine them to produce relevant
25 insights for decision-making. In this article, we describe an approach to
26 produce a spatialised information system aimed at providing farmers with
27 relevant information to support decisions regarding grazing management in
28 mountainous and Mediterranean rangelands. The information system was
29 codesigned with stakeholders, including farmers, to best match their needs
30 and to facilitate its integration into farm management. The various stake-
31 holders were involved in choosing the types of data to be associated and,
32 defining the functions and the conceptual model of the information system.
33 We propose to structure the information system as a spatial data lake, de-
34 signed to integrate and associate the identified heterogeneous data, and to
35 produce decision-making insights for grazing management in mountainous
36 and Mediterranean rangelands.

37 *Keywords:* Agro-sylvo-pastoral system, Heterogeneous data, Spatial data
38 lake, Decision-making

39 1. Introduction and motivation

40 Agro-sylvo-pastoral systems are widely represented in Mediterranean ar-
41 eas of southern Europe (Nori, 2019). To feed their herds, these systems
42 rely on the diverse and variable natural forage resources of Mediterranean
43 rangelands, woodlands and mountain pastures. These diverse and variable
44 resources enable agro-sylvo-pastoral systems to play a fundamental role in
45 the socioeconomic development of rural populations (Bernués et al., 2014)
46 and the preservation of natural resources (Hadjigeorgiou et al., 2005).

47 The forage resources of rangelands are highly variable between seasons
48 and years in terms of quantity and quality due to the effect of climatic factors
49 (Dumont et al., 2015; Dono et al., 2016). In addition to this temporal vari-
50 ability, the wide range of altitudes, the diversity of geological substrates and
51 geomorphology favour the great diversity of pastoral resources. This vari-
52 ability forces farmers to continually adapt grazing management. Short-term
53 adaptations may include changes in the daily grazing circuit (for shepherd-
54 ing), in the timing and distribution of paddock grazing, temporary reduction
55 of animal performance or supplementation. Long-term adaptations may in-

56 clude mobility to new grazing areas, changes in the seasonal use of pastoral
57 resources, water development, fence development or shrub clearing. In ad-
58 dition, farmers face other constraints, such as the concurrent use of space
59 with other activities (e.g., hunting, tourism) and the presence of wildlife,
60 which can significantly impact the behaviour and production of animals due
61 to predation ([Vincent, 2010](#); [Meuret et al., 2018](#)).

62 Under these conditions, grazing management is at the heart of several
63 issues, especially economic viability ([di Virgilio et al., 2018](#)), adaptation to
64 climate change and variability ([Dono et al., 2016](#)), maintenance and sustain-
65 ability of natural environments ([Bailey et al., 2019](#)), adaptation to the Euro-
66 pean Common Agricultural Policy, and the fight against predation ([Meuret](#)
67 [et al., 2017](#); [Linnell and Cretois, 2018](#)). To graze while remaining compliant
68 with these challenges, a complete understanding of the grazed ecosystem and
69 the actors involved in its management is needed.

70 The grazing ecosystem can be modelled through the use of various sources
71 of information available from the public sector and at the farm level. High
72 or very high public satellite images such as Sentinel 2 and SPOT 6/7 images
73 associated with various reference data can be used to model the grazing
74 environment ([Shaqura and Lasseur, 2019](#); [Castro et al., 2020](#)); while in regard

75 to farm herds, GPS location can be used to understand the use of rangelands
76 by herds (Akasbi et al., 2012; Feldt and Schlecht, 2016; Handcock et al.,
77 2009). However, this information taken individually is often of low precision
78 for decision-making (Bahlo et al., 2019). Their combination can help to
79 produce new indicators (Capalbo et al., 2017), which can allow farmers to
80 adapt grazing management to the local context in the short and long term.

81 Initiatives have been carried out in different projects (e.g., E-Pasto¹ and
82 Clochète²) to integrate digital technology (GPS and accelerometers) into
83 grazing management in the mountains and Mediterranean areas of France.
84 Experiments on different farms have also been conducted for different appli-
85 cations: (i) to locate and track animal routes in free ranging (Buerkert and
86 Schlecht, 2009; Akasbi et al., 2012); (ii) to assess the spatiotemporal differ-
87 ences in grazing patterns (Feldt and Schlecht, 2016); (iii) to monitor animal
88 behaviour and environmental interactions (Handcock et al., 2009); and (iv)
89 to quantify the time spent by animals while grazing in different areas (Rutter
90 et al., 1997). The results of these experiments show that the analysis of these
91 kinds of data can produce relevant information for grazing management.

¹<https://www.epasto.fr/>

²<https://idele.fr/detail-article/projet-clochette-caracterisation-du-2Dcomportement-et-localisation-des-ovins-et-caprins-grace-a-des-2Dtechnologies-embarquees>

92 Currently, embedded GPS devices are commonly marketed for hunting
93 dogs and for cattle. Naturally, an increasing number of farmers are equipped
94 with at least one device to locate and track the movements of their herds.
95 Other sources of information can be used to provide more insight, such as
96 digital terrain models and meteorological and climatic data. Moreover, the
97 adoption of smartphones by farmers ([Michels et al., 2020](#)), is an opportunity
98 for the provision of additional information ([Pongnumkul et al., 2015](#); [Mendes](#)
99 [et al., 2020](#)), which can bring more precision regarding the grazing environ-
100 ment and herd behaviour (e.g., forage quantity and quality, microclimate,
101 animal physiology and feeding).

102 These public and farm data mentioned above are heterogeneous in terms
103 of their nature (spatial, nonspatial, structured, or unstructured), format and
104 resolution. Thus, the challenge remains to find ways to meaningfully com-
105 bine these heterogeneous data and resolve questions relating to data integra-
106 tion, analytics, ownership and quality ([Bahlo et al., 2019](#)). This challenge
107 cannot easily be managed by traditional Information Systems such as re-
108 lational databases and data warehouses designed specifically for structured
109 data. Data lakes currently being adopted, now represent a solution to han-
110 dle these kinds of data ([Ravat and Zhao, 2019](#); [Suriarachchi and Plale, 2016](#);

111 [Khine and Wang, 2018](#); [Quix and Hai, 2019](#)). We assume that the same ap-
112 proaches can also be applied in the context of agro-sylvo-pastoral livestock
113 management to integrate heterogeneous farming data and provide users with
114 relevant indicators for decision-making.

115 In this paper, we propose an approach to implement a spatial data lake
116 adapted for the integration and analysis of heterogeneous data to produce
117 new indicators for decision support in the context of agro-sylvo-pastoral farm-
118 ing. To do this, we codesigned the information system in the context of the
119 P@stor-All project involving 7 farms, 2 experimental sites, 2 research units
120 and 1 technical institute in French Mediterranean areas.

121 **2. Characteristics of agro-sylvo-pastoral systems in French Mediter-** 122 **anean areas**

123 *2.1. Rangelands and agro-sylvo-pastoral farming in French Mediterranean* 124 *areas*

125 French Mediterranean areas represented by the Occitania, PACA and
126 Corsica regions have large and dense rangeland areas. The estimations made
127 by ([Agreste, 2015](#)) in 2014 on the basis of analyses of land use and cover
128 show the importance of rangelands in these areas. In 2018, the spatial distri-

129 bution of rangelands resulting from the RGP³ showed their preponderance in
130 these three French Mediterranean regions (Nozieres et al., 2021). The avail-
131 ability and spatial distribution of these rangelands promote the existence of
132 agro-sylvo-pastoral farming, characterised by the persistence of traditional
133 management practices in these regions (Bernués et al., 2011).

134 Agro-sylvo-pastoral farming systems in French Mediterranean areas vary
135 depending on two principal factors: the type of production and the land
136 resources and management. The farms mainly breed sheep, with goats ad-
137 ditionally and, to a lesser extent, cattle and horses. The major production
138 is sheep meat and goat and sheep milk (Bataille et al., 2016). Wool, cheese
139 and cattle meat are produced to a lesser extent. Equine production is in-
140 tended for slaughter or leisure. Regarding land resources and management,
141 the importance of rangeland resources in feeding herds, herd mobility and
142 grazing management are the factors of variability. Rangeland resources used
143 by herds vary considerably depending on each type of farm. Farming can
144 also be sedentary, characterised by the movement of animals close to the
145 farm, or mobile. In the latter case, it implies a seasonal shift to a greater
146 or lesser distance (Nozieres et al., 2021). Grazing management also varies,

³<https://geoservices.ign.fr/rpg>

147 from rotational or continuous grazing in fenced paddocks to shepherding and
148 free grazing. Different combinations of these various factors thus create a
149 diversity of agro-sylvo-pastoral systems and land use. This diversity of agro-
150 sylvo-pastoral farming systems is also found more widely in southern Europe
151 ([de Rancourt et al., 2006](#)).

152 The diversity of agro-sylvo-pastoral systems raises a number of issues,
153 particularly for farmers and research and extension services. The function-
154 ing of agro-sylvo-pastoral systems is different from conventional systems, and
155 their recognition remains difficult. In addition, the difficulty of accurately
156 characterising the areas used by the herds can make it difficult for farmers to
157 access certain subsidies, including the European CAP. However, it is difficult
158 to study and produce knowledge on this varied form of livestock farming.
159 There are many particular cases of grazing that require studies on a large
160 number of farms to produce generic results. Furthermore, this diversity cre-
161 ates a need to collect a great deal of information in the field to consolidate the
162 tools that make it possible to document and diagnose the use of rangelands
163 by herds.

164 2.2. *A favourable context for the emergence of an information system to*
165 *manage rangeland utilisation*

166 Several initiatives have been carried out to improve pastoral practices in
167 French Mediterranean areas, ranging from technical aspects to the testing of
168 technological tools to improve rangeland use.

169 In France, various services are involved in the technical support of farms,
170 including the development of references and tools to assist grazing man-
171 agement: the chambres d’agriculture ⁴, technical institutes, associations of
172 actors interested in grazing and pastoralism, and pastoral services. Since the
173 pastoral law of 1972 (Charbonier, 1972), various pastoral support structures
174 have over the years produced technical references adapted to rangelands in
175 the form of manuals and more recently in digital format. These references
176 provided by the different services can be mobilised and fed into an informa-
177 tion system (IS) to improve pastoral use.

178 The increasing availability of free satellite data with better spatial, spec-
179 tral and temporal resolution, such as Sentinel 2 data (10 m in the visible
180 and near infrared and 20 m and 60 m spatial resolution; 13 spectral bands
181 and a 5-day revisit period), and associated processing algorithms, favours the

⁴<https://chambres-agriculture.fr/>

182 characterisation of land use at large territorial scales ([Inglada et al., 2017](#)).
183 Other types of spatial reference data can be associated with it, such as the
184 Registre Parcellaire Graphique (RPG), the Forestry Database (BD-Forêt⁵)
185 and the Altimetric Database(BD-Alti⁶) produced by the the National Insti-
186 tute of Geographic and Forestry Information (IGN) to better characterise
187 rangelands. Current work ([Inglada et al., 2017](#)) was able to capitalise on the
188 complementarity of these data to map the land use and cover of all French
189 metropolitan and overseas territories with better accuracy (Kappa of 0.88 for
190 2019). Taken individually, these data produce less accurate information for
191 improved decision-making for farmers. However, combining them in the best
192 possible way increases the level of precision of the new information produced
193 to facilitate grazing management ([Bahlo et al., 2019](#)).

194 Over the last decade, there has been a growing interest among pastoral
195 farmers for digital tools, especially for geolocation. Some farmers use hiking
196 tools (hiking GPS or smartphone GPS) for their own use. Others actively
197 participate in seminars and discussions on digital tools for breeding and graz-
198 ing. In general, their interest stems from a desire to lighten the drudgery of

⁵<https://geoservices.ign.fr/bdforet>

⁶<https://geoservices.ign.fr/bdalti>

199 their work of guarding, monitoring and documenting the activities of the
200 herd. However, they are concerned about data ownership issues and do not
201 want the digital transition to lead to increasing demands for justification of
202 the spatial distribution of grazing herds. In addition, farmers are seeking ex-
203 changes with their peers ([Berrier and Girard, 2021](#)), hence the development
204 of networks for sharing experiences. There are also experimental pastoral
205 farms, which are increasingly equipped with digital tools to study grazing.
206 They constitute a potential source of information to analyse more precisely
207 the use of spaces by herds.

208 Through these opportunities, diverse and heterogeneous available data
209 from a variety of sources could be gathered and combined to improve the
210 understanding of the grazed ecosystem in pastoral conditions, both locally
211 (for farmers) and generally (for research).

212 **3. What are the functionalities for an IS in regard to rangeland** 213 **utilisation?**

214 The characteristics of the agro-sylvo-pastoral system described earlier
215 suggest that specific and continuous information is needed for farmers to
216 best adapt to the many constraints that they have to face for grazing man-

217 agement. The documentation of a variety of pastoral systems would also
218 enable research to draw more general knowledge regarding rangeland utili-
219 sation in Mediterranean environments, depending on the environmental and
220 management conditions.

221 *3.1. Associating farmers to the design of the IS and the identification of its* 222 *functionalities*

223 To best respond to the different needs concerning grazing management,
224 the P@stor-All project involving 7 farmers and 2 experimental farms (Table
225 1), researchers and a technical institute was established. The aim was to bring
226 together the stakeholders in a process of codesigning the IS by alternating
227 moments of individual exchange with moments of collective discussion. The
228 quota of farmers participating in this process was limited to a small number
229 of highly motivated individuals, whose different farms represent the diversity
230 according to the characteristics described in Section 2.

231 The codesign process to define the functionalities of the IS included 3 steps
232 (Figure 1): (i) individual semidirective interviews with farmers to determine
233 their needs in the form of questions, (ii) collective discussions on farmer
234 needs together with the stakeholders, and (iii) final validation by farmers
235 and selection of relevant questions to address by the IS.

Table 1: Characteristics of the farming systems surveyed involved in the P@stor-All project. Le Merle and La Fage are experimental farms of the project.

Farms	Production	Nb. mothers	Grazed area	Complementation
1	Meat sheep and goat	300	Rangelands + vineyard	Any
2	Dairy goat	40	Rangelands	Crau hay
3	Meat sheep	140	Rangelands + vineyard	Any
4	Meat sheep	280	Rangelands + grassland	Any
5	Dairy sheep	550	Rangelands + culture	Hay + grain
6	Meat sheep and goat	123	Rangelands + grassland	Hay + barley
7	Dairy goat	-	Rangelands + grassland	Any
Le Merle	Meat sheep	1670	Rangelands + grassland	Any
La Fage	Meat sheep	300	Rangelands	Forage + concentrate

First, individual farmer questions were collected exhaustively (51 questions, step 1), and then the relevant questions, **those related to the use of rangelands by herds of herbivores**, were selected by all project stakeholders (38 questions, step 2) during an exchange session. At this stage, the exchanges also made it possible to group the questions into 3 themes according to the type of use to which they relate: (i) benchmarks for adjusting pasture management, ii) methods to achieve a given objective and iii) better understanding the ecology of the agro-sylvo-pastoral ecosystem. Finally, **a ranking was made in order to assign a priority score to each question. Three scores were defined: i) priority question, ii) interesting question, and iii) not frequent question. The questions retained were those with the highest number of votes (8 to 9 by stakeholders) as "priority question". 9 questions have been retained (see table 2) to constitute the list of farmers' needs. The table A.1 in Appendix A shows the list of 38 questions with their priority ratings.**

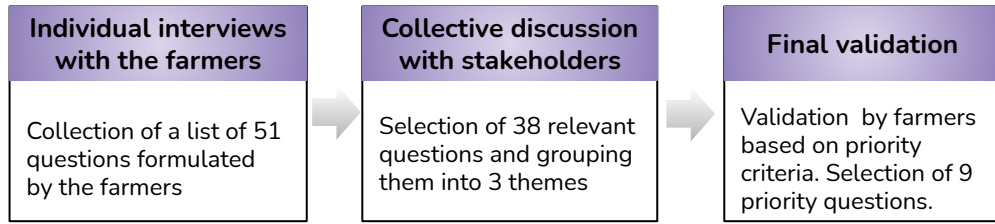


Figure 1: The three stages of defining the priority needs of farmers.

250 3.2. What are the functionalities of the P@stor-All IS?

251 The three stages of defining the needs of the farmers allowed the selection
 252 of the nine priority questions that constitute the functionalities of the IS.
 253 Table 2 presents the list of these questions grouped into themes. The majority
 254 of the functionalities of the IS concerns questions related to benchmarks for
 255 adjusting pasture management (5 questions), followed by those related to
 256 methods to achieve a given objective (3 questions), then by a functionality
 257 related to the understanding of the ecology of the agro-sylvo-pastoral system,
 258 which includes 1 question.

259 The IS is able to incorporate a range of information that can be used
 260 to provide farmers with new information to meet their needs formulated as
 261 a question in Table 2. However, the possibility of answering the questions
 262 depends on both the availability of adequate data and the appropriate pro-
 263 cessing methods to produce new information.

Table 2: Farmers’ needs expressed in the form of questions, considered as a basis for the IS functionalities.

Questions
Function 1: benchmarks for adjusting pasture management What is the grazing area used at the moment? What route does my herd take each day? How much time does my herd spend on grazing? What is the area covered by the herd? How do my animals occupy the space? (weekly, monthly, seasonally, or yearly)
Function 2: methods to achieve a given objective How can encroached areas be enhanced? How can pastoral resources be developed to meet the needs of my herd? How can animals be stimulated to move into unexplored areas?
Function 3: better understanding the ecology of the agro-sylvo-pastoral ecosystem How does the behaviour of the animals change according to the season?

264 4. Representing the grazed ecosystem: main factors determining 265 the spatial utilisation of rangelands

266 To address the needs of farmers through the analysis of heterogeneous
267 pastoral data, it is first necessary to have a model of the grazing ecosystem
268 and to understand the use of space by animals. This will then contribute to
269 the structuring and definition of the cross-analyses of the information system.

270 The combination of the different factors of the grazing ecosystem deter-
271 mines the grazing behaviour of the herds. This behaviour refers to a set
272 of spatiotemporal activities that animals perform or develop to ensure their
273 feeding during grazing (Dumont et al., 2001; Ginane et al., 2008; Zampaligré
274 and Schlecht, 2018); and includes the time devoted to searching for, select-
275 ing, prehending and consuming forage, usually on a daily basis (Allen et al.,

276 2011). Thus, movement, space occupation, food choices and feed intake of
277 animals may vary according to the effects of these factors. Knowledge of
278 these factors will allow a better understanding of the use of space by grazing
279 animals and thus allow us to model the entire agro-sylvo-pastoral ecosystem.

280 4.1. Codesigning the grazing ecosystem with farmers

281 The codesign of the grazed ecosystem was carried out through a process
282 of identifying key factors of the feeding behaviour of the herds. Three stages
283 were carried out for this purpose (Figure 2): i) first, an analysis of the sci-
284 entific literature made it possible to globally identify the factors of grazing
285 behaviour, ii) then a validation followed by a complementation of these fac-
286 tors was carried out through individual surveys of farmers, and iii) a final
287 analysis made it possible to compile the list of factors specifically influencing
288 the behaviour of herds while grazing.

289 The literature used corresponds to different conditions from the context of
290 our study (different environments, sometimes different types of animals, and
291 under experimental conditions) because of the limited availability of scien-
292 tific studies in the mountainous and Mediterranean areas of southern Europe
293 on the topic of grazing behaviour. We integrated the vision of the farmers
294 involved in the project to move closer to the context of our study (both ge-

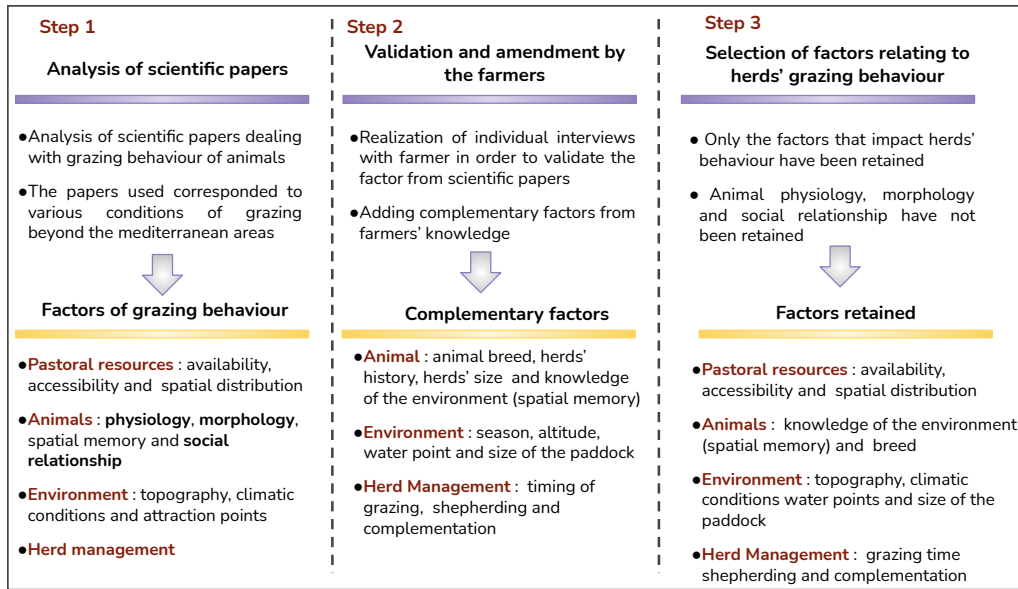


Figure 2: Different steps conducted to identify the key factors influencing the grazing behaviour of herds on pasture. Factors in bold were not retained at the end of the process.

ographic and in terms of uses). These processes have allowed us to validate, complete and establish a list of factors that enhances the scientific knowledge addressed while resituating it in a context (in terms of vocabulary and representation) that is customary for farmers in the European Mediterranean environment.

4.2. The agro-sylvo-pastoral ecosystem model used in the P@astor-All information system

The analysis of the scientific literature enabled the identification of various factors grouped into 4 categories: those concerning pastoral resources, those

304 concerning the animals of the herd, those concerning the grazing environment
305 and the grazing management method (Figure 2). The interviews with farmers
306 showed that certain factors identified in the literature were not sufficiently
307 consistent with their vision of the system and the parameters used to manage
308 it. Their integration in the codesign process enabled the scientific factors to
309 be validated and completed in the context of livestock farming in European
310 Mediterranean areas.

311 Most factors in the literature retained for the conceptual model of the
312 agro-sylvo-pastoral ecosystem were selected based on the number of times
313 they were validated by farmers. The factors resulting from this process are
314 shown in Table A.2 in the Appendix. The factors validated by all farm-
315 ers were pastoral resource abundance, quality and diversity, presence of the
316 farmer and heat. These factors correspond to pastoral resource availability,
317 management practices and weather conditions in scientific knowledge. Some
318 factors concerning herds (herd size, knowledge of the environment, animal
319 breed, and animal species) were mainly derived from the point of view of the
320 farmers. Although the farmers did not validate the impact of accessibility, we
321 also maintained this factor because shrub encroachment is a characteristic of
322 rangelands in mountainous and Mediterranean environments, and its impact

323 on the feeding and spatial behaviour of herds is well known.

324 The unification of validated scientific factors and complementary factors
325 coming from the farmers made it possible to constitute the final list of key
326 factors of the feeding and spatial behaviour of the herds on pasture in an
327 adapted context in mountainous and Mediterranean rangeland conditions.
328 These factors were then used to model the agro-sylvo-pastoral ecosystem
329 and to represent their different links without addressing their interactions.

330 We present in Figure 3 the conceptual model of the agro-sylvo-pastoral
331 ecosystem under Mediterranean rangeland conditions. The scale of our study
332 concerns the herd. Thus, only the factors that act directly on the grazing and
333 spatial behaviour of herds were taken into account. Those that had effects
334 on the individual (animal) were not retained. This was the case for animal
335 morphology, physiology and social relationships.

336 The factors presented in the unified model can be modelled thanks to
337 available data from various sources. The factors concerning pastoral resources
338 and the environment can be represented using various available spatial data
339 (satellite and GIS data) (Shaqura and Lasseur, 2019; Castro et al., 2020).
340 Herd location data can also be used to represent animal factors (Buerkert and
341 Schlecht, 2009; Handcock et al., 2009; Akasbi et al., 2012). Last, information

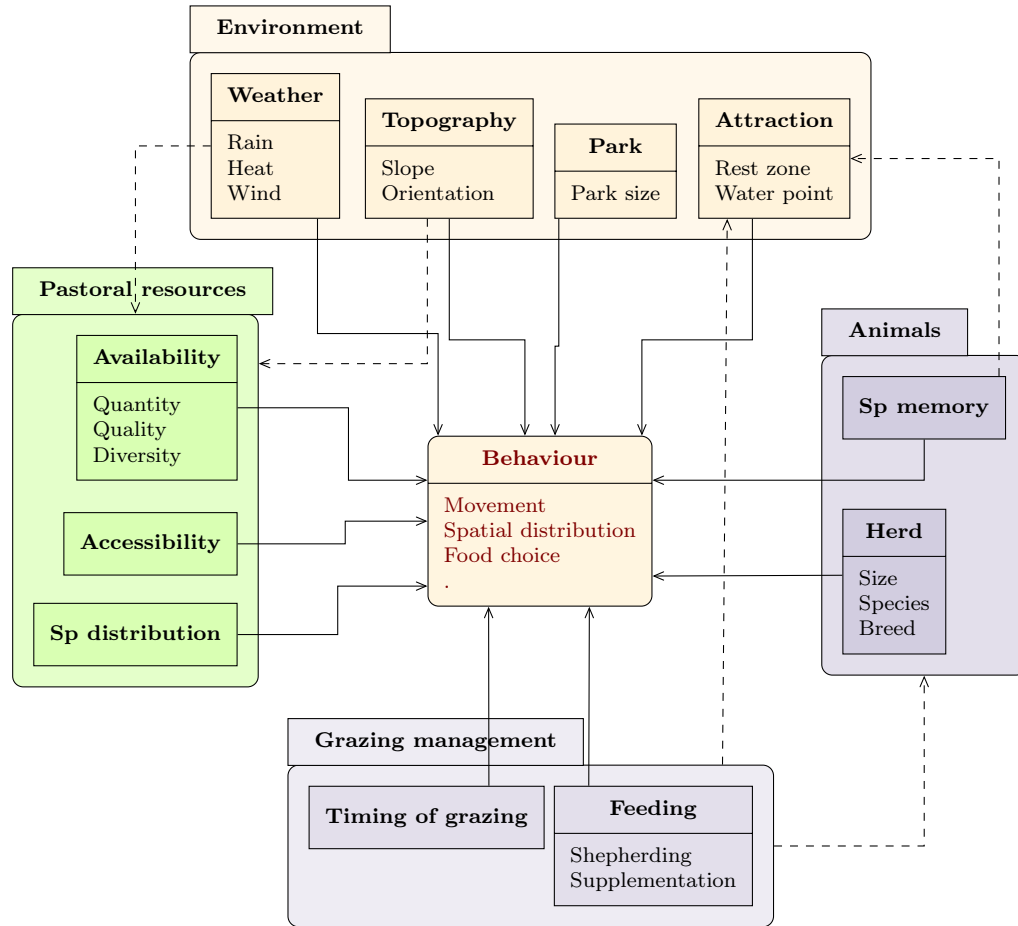


Figure 3: The conceptual model of the feeding and spatial behaviour of domestic herbivores on Mediterranean rangelands. the solid line represents the influence of the factor on herd behaviour and the dashed line represents the link between the factors.

342 provided by farmers at the level of agro-sylvo-pastoral farms allows us to
343 understand the factors related to grazing management. The combination of
344 this information allows us to achieve more insight to better understand the
345 use of rangelands by herds to facilitate grazing management.

346 In the following section, we identify these data and present their relevance
347 to provide insight for agro-sylvo-pastoral systems.

348 **5. Selecting data to document the model of the grazed ecosystem**

349 Various sources of data can be used to characterise the factors of feeding
350 and spatial behaviour of the herds. To achieve the objectives of this study, we
351 rely on the availability of acceptable accurate data individually or in combi-
352 nation with other data. The unavailability of data or the lack of accuracy of
353 some of the available data can be overcome by the complementary informa-
354 tion coming from the feedback of the farmers. However, with the evolution
355 of increasingly accurate sensors and open data, the possibility of obtaining
356 more accurate data reduces the implications to the farmers for the provision
357 of complementary information.

358 The various data identified can be categorised into two types according
359 to their sources: (i) external data, which are data from sources other than

the farm site, and (ii) farm data that can be collected at the level of each agro-sylvo-pastoral farm.

5.1. External source data

The external data concern the Sentinel 2 satellite data, Registre Parcellaire Graphique (RPG), OSO land use and cover, IGN altimetry data, and technical references on grazing. They are mostly provided by public sources. Except for the technical references, all external data are provided under Etalab 2.0 Open Licence⁷. This licence grants a nonexclusive and free right to reuse information for commercial purposes or not for an unlimited period. The characteristics of the external data are presented in the following table 3. For interested readers, further information about these data are provided in the appendix B.

5.2. On farm data

On-farm data mainly concern herd location data using GPS and feedback from farmers. They are an important part of the data source of this study because they characterise the scale of analysis of our work, which is considered as the management unit, corresponding to the area grazed by the herds

⁷<https://www.etalab.gouv.fr/licence-ouverte-open-licence>

Table 3: Summary of characteristics of the external data that can be used to model rangelands utilization by herds

External data	Characteristics
Sentinel 2	<p>Description : Satellite image in TIFF format</p> <p>Source : Theia</p> <p>Availability : 5 days for Level 1C and 2A, 1 month for Level 3A</p> <p>Spectral domain : 13 bands of 10m, 20 m and 60 m of spatial resolution</p> <p>Wide swath : 290 km</p> <p>Contribution : Land use and cover</p>
RPG	<p>Description : database of agricultural parcels declared by farmers, provided in SHP or GeoPackage format</p> <p>Source : French Service and Payment Agency</p> <p>Availability : yearly</p> <p>Contribution : Identification of partoral classes for mapping rangelands</p>
OSO land use and cover	<p>Description : Land use and cover with 23 classes and a minimum mapping unit of 20 m</p> <p>Source : CNES</p> <p>Availability : yearly</p> <p>Contribution : description and mapping of rangeland</p>
MNT RGE ALTI	<p>Description : Relief model in the form of a regular rectangular grid</p> <p>Source : IGN</p> <p>Spatial resolution : 1 m to 5 m in X and Y</p> <p>Availability : on update</p> <p>Contribution : Modelling of the terrain relief</p>
Technical references	<p>Description : documents describing technical practices in pastoral farming</p> <p>Source : technical institutes</p> <p>Availability : at each release</p> <p>Contribution : grazing management</p>

377 during a given period.

378 5.2.1. Herd GPS location

379 GPS data from herds are collected in different ways by different actors.
380 Some farmers, experimental farms, and researchers have started using GPS
381 to analyse the behaviour of their herds. These data are in different forms
382 depending on the variety of GPS equipment used and can be accessed in
383 different ways. They can be used to analyse the movement of herds and their
384 use of rangeland resources. Several studies have shown the potential of GPS
385 data to model the grazing behaviour of herds. The grazing pattern ([Buerkert
386 and Schlecht, 2009](#); [Akasbi et al., 2012](#); [Feldt and Schlecht, 2016](#); [McGavin
387 et al., 2018](#)), herds behaviours and interaction with grazing areas ([Putfarken
388 et al., 2008](#); [Handcock et al., 2009](#)) and grazing time ([Rutter et al., 1997](#)),
389 are types of applications that can be realised from herd GPS location data.
390 Different analytical methods can be applied to this information to produce
391 new valuable information to model the use of pastoral areas by herds in
392 combination with other sources of information.

393 5.2.2. *Feedback from farmers*

394 The level of precision provided by the data mentioned above may have
395 limitations in describing agro-sylvo-pastoral systems in more detail. For in-
396 stance, the 10 m spatial resolution of the Sentinel data does not allow us
397 to identify the grazing resources available at the farm level. To provide
398 more details on agro-sylvo-pastoral systems, feedback from farmers can be
399 of great interest. In addition to the details of the information, the feedback
400 from farmers also provides information that the other available data can-
401 not provide regarding the grazing management and behaviour of the animals
402 observed in the field.

403 The acquisition of farmer data can be achieved via collaborative smart-
404 phone applications to collect information on pastoral resources, soil, climate,
405 animal intake, or any other information concerning grazing management.
406 There exist several applications for making these acquisitions in an adapted
407 way, allowing their analysis in an IS.

408 5.3. *Connecting data and the modelling of the grazed ecosystem*

409 The available data presented can allow us to identify basic analyses that
410 can be carried out to characterise each factor of grazing behaviour. In Table
411 4, we present the different factors of the grazing behaviour of the herds and

the available data identified that can be used to characterise them. The characterisation of the factors can be possible through a combination of different types of information of the data. The retained components of herd behaviour can also be modelled through a different combination at a second analytical level. This can allow us to produce additional information regarding the interactions between animals, pastoral resources, the environment and grazing management.

Not all data allow characterisation of the factors of animal grazing behaviour (see empty boxes in the table). However, other cross-references between the different types of information are likely to be identified a posteriori to improve the characterisation of certain factors. Farmers can also contribute much more precise information to complement other data and improve the characterisation of factors.

5.4. Issues related to the variability and heterogeneity of the identified data

The data presented are very varied in terms of their sources and their nature. First, the data presented come from a variety of public and farm sources. Depending on the source, the data may differ in terms of their nature or the level of accuracy they possess. Herd GPS location data may come from different sources and present variability in terms of the level of accuracy

Table 4: The factors of feeding and spatial behaviour of herds, their components and the available data allowing to characterise them.

Factors	External/Public data				On farm data	
	Sentinel 2	RPG	OSO	MNT RGE	Herd location	Feedback
Pastoral resources						
Availability	X	X	X			X
Accessibility	X	X	X	X		X
Space distribution	X	X	X			
Environment						
Meteorology						X
Topography				X		
Paddock						X
Attraction point						X
Animal/Herds						
Sp. memory					X	
Herd characteristics						X
Grazing management						
Timing of grazing					X	X
Feeding						X
Components of feeding behaviour						
Movement				X	X	
Space occupation	X	X	X	X	X	
Food choice	X	X	X	X	X	X

431 and frequency of acquisition. The same is true for all other types of data.
 432 Second, according to their nature, we categorise two types of data: spatial
 433 and nonspatial. Within these two types of data, the structure (structured and
 434 unstructured), format (ASCII Grid, PDF, SHP, TIFF, TXT, or HTML) and
 435 resolution can be variable. We distinguish from this list: (i) the structured
 436 data that mainly concern herd location (GPX or CSV formats), RPG (SHP
 437 formats), OSO land use and cover (SHP format) and feedback from farmers
 438 (form formats), and (ii) the unstructured data corresponding to satellite data
 439 (TIFF format) and technical references (PDF format). Other considerations
 440 can be made for the weight of these data, which also varies according to their

441 format. The Sentinel 2 images, RPG, OSO land cover and MNT RGE ALTI
442 are heavy by nature. They need sufficient storage to ensure their integration
443 for analysis. These data may also have different levels of accuracy. This is the
444 case for the Sentinel 2 data and MNT RGE ALTI, which have 10 m (visible
445 and near-infrared) and 5 m spatial resolutions, respectively. Spatial vector
446 data (OSO and RPG) and on-farm data can also vary in terms of accuracy.

447 This great variability of the identified data in terms of their sources,
448 format, structure, weight and resolutions constitutes a challenge for the im-
449 plementation of the information system intended to integrate them. The
450 information system intended to integrate these types of data must take into
451 account all these heterogeneous constraints. In addition to this challenge
452 in regard to the heterogeneity of the data, the IS must be able to manage
453 the increasing volume of data and propose adequate processing methods for
454 extracting and crossing information from these data. Another important
455 consideration for the information system is the fact that it needs to meet the
456 principles of findability, accessibility, interoperability, and reusability (FAIR)
457 of the data project.

458 6. The P@stor-All information system

459 6.1. Objectives and uses of the information system

460 The main goal of the IS is to provide both farmers (private and experi-
461 mental farms) and researchers with a framework that allows them to gather
462 their data and at the same time guarantees their access as well as the re-
463 sults of their combined analyses. Thus, this IS targets two categories of
464 use: agro-sylvo-pastoral farming and research. On the one hand, farmers
465 and experimental farms, which are the direct beneficiaries of this informa-
466 tion system, contribute by providing the necessary data they collect on their
467 respective farms. These are mainly herd location data and feedback. When
468 stored and analysed together with external data, the resulting information
469 contributes to the management of grazing at the level of individual farms. On
470 the other hand, access to the data by researchers enables them to carry out
471 different types of analysis on a wider scale (territorial or regional) than the
472 agro-sylvo-pastoral farms, outside the IS or internally, depending on the pro-
473 cessing possibilities offered. These cross-sectional analyses associated with
474 different pastoral situations contribute to the development of scientific knowl-
475 edge on rangeland and grazing management.

476 6.2. Conceptual data model

477 Different criteria were taken into account for the design of the conceptual
478 data model of the IS: the functionalities of the IS defined with the stakehold-
479 ers, availability of data and associated methods that can be used to produce
480 new information, and consideration of the technical constraints of the IS.
481 The functionalities of the IS are described in Table 2, and the data available
482 for modelling the grazed ecosystem are presented in Section 5. As for the
483 technical constraints:

- 484 • The IS must support the integration and combination of the heteroge-
485 neous identified data.
- 486 • Data standardisation must be guaranteed for better collaborative man-
487 agement of stakeholders.
- 488 • The information system must be scalable to manage the increase in
489 data volume and the application of new functionalities.

490 The figure 4 presents the conceptual data model we propose. The dif-
491 ferent components of the agro-sylvo-pastoral system are described by the
492 different associations between the classes corresponding to the data, as pre-
493 sented in Table 4. Information about the different factors can be obtained

494 as a result of analysis applied to the interacting data in the IS. Different
495 levels of analysis can be realised to produce new insight for decision-making.
496 Other information resulting from the analysis between the herds and grazing
497 area can be historicised to follow its dynamics in space and time. This new
498 information will then contribute to other types of analysis involving the in-
499 teraction between herd behaviour, pastoral resources, the environment and
500 management practices.

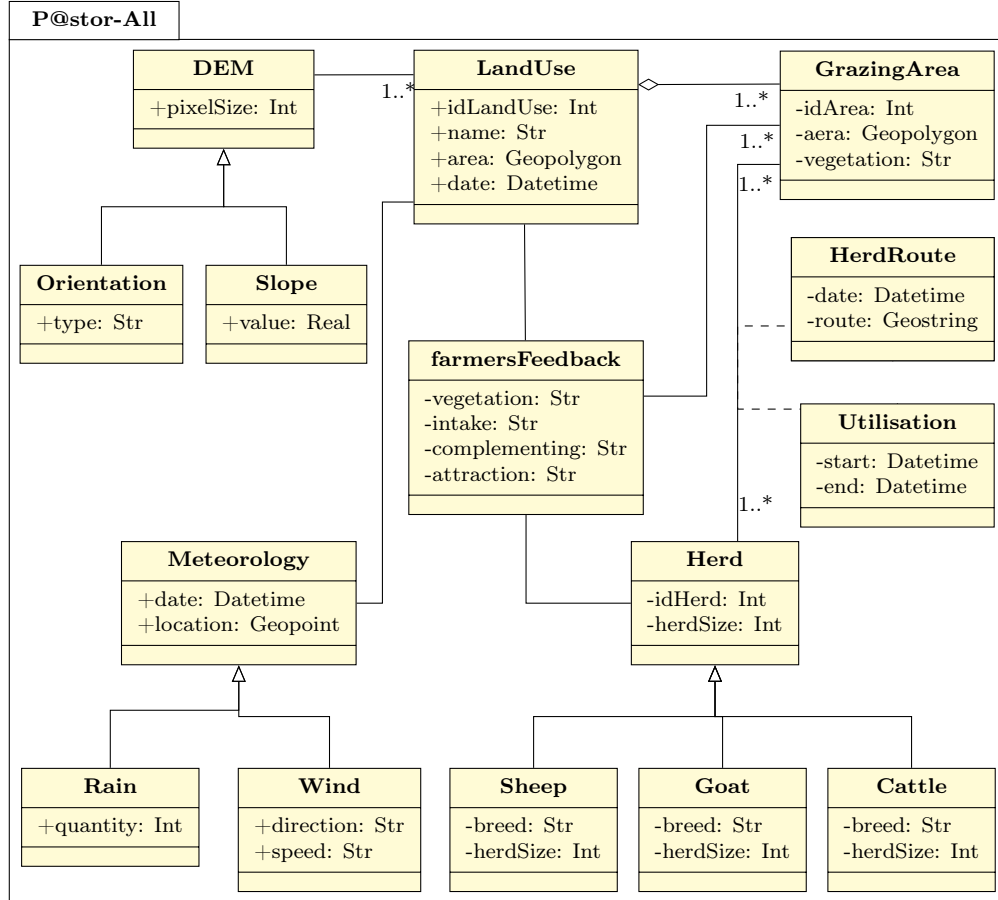


Figure 4: Conceptual data model of the spatial Information System for agro-sylvo-pastoral system in Mountain and Mediterranean European regions. This model describes the different relationships between the data allowing to model the use of rangelands by herds. A given environment characterised by one or more land uses (LandUse) contains one or more grazing areas (GrazingArea), visited by one or more groups of animals (Herd). These first two entities are characterised by the influence of two spatial phenomena that impact their use by herds: the relief (DEM) and the weather (Meteorology). The use in time and space of grazing areas (GrazingArea) by herds (Herd) allows the production of new spatio-temporal information: grazing trajectories (HerdRoute) and the use of the pastoral resources of a grazing area (Utilisation), which can help to understand how animals vary the use of rangelands. Finally, feedback from farmers (FarmersFeedback) will be provided on both the environment and areas used, as well as on animal management.

501 6.3. Information system infrastructure

502 The IS infrastructure must allow for the integration of the heterogeneous
503 identified data. These types of data cannot be easily managed in a data
504 warehouse ideally designed to manage structured data. We opted for the
505 data lake to enable the integration of heterogeneous data. Data lakes allow
506 the ingesting, storing and processing of heterogeneous raw data from various
507 sources; provide access to different users for various analyses; and govern
508 data to ensure data quality, data security and data life-cycles ([Ravat and](#)
509 [Zhao, 2019](#)). These advantages presented by the data lake allow both the
510 management of the identified pastoral data and offer several possibilities of
511 analysis and a better accessibility of the information by the different users.

512 The data lake implementation we opted for is Apache Hadoop solution
513 based based on two essential components: HDFS (Hadoop Distributed File
514 System) and MapReduce. HDFS ([Honnutagi, 2014](#)) ensures the distributed
515 and parallelised storage of data when they are ingested in the data lake. The
516 structure of the HDFS offers several advantages, including (i) the easy inges-
517 tion and retrieval of data from their metadata and (ii) the parallelisation of
518 storage and processing, which brings more performance for data security and
519 significantly improves the processing cost. Apart from the storage system,

520 the Hadoop HDFS is flexible in regard to connecting with other process-
521 ing engines. This allows the creation of an ecosystem that provides a full
522 range of tools for data storage, analysis and exploration for grazing manage-
523 ment. These various technical advantages offered by Hadoop HDFS-based
524 data lakes better meet the constraints imposed by the IS in the present study.

525 **7. Architecture and data management in the P@stor-All informa-** 526 **tion system**

527 In a data lake, access to the data is essential to ensure better management.
528 This is accomplished through queries at the metadata level. Apache Hadoop
529 does not have all the functionality needed to capture metadata for the wide
530 variety of data that exists. Faced with the variety of data we identified for
531 agro-sylvo-pastoral farming purposes, it is necessary to define suitable means
532 to extract metadata in an objective manner. To overcome this constraint re-
533 lated to metadata extraction, various studies have proposed complementary
534 solutions ([Hai et al., 2016](#); [Quix and Hai, 2019](#); [Sawadogo et al., 2019](#)). How-
535 ever, these studies did not propose an implementation capable of handling
536 the variety of heterogeneous data (especially spatial) we identified. The im-
537 plementation made by [Kafando et al. \(2020\)](#), fulfils these functionalities.

538 The metadata management system implemented in the data lake is based on
539 GeoNetwork⁸ which uses the ISO 19115 conceptual model implementation
540 for spatial data. Geonetwork allows storage of the metadata, together with
541 the HDFS path of the data lake, and facilitates data retrieval. This imple-
542 mentation is suitable for the integration of agro-sylvo-pastoral farming data
543 in the spatial data lake.

544 *7.1. The P@stor-All information system architecture*

545 The data lake architecture we propose for pastoralism data integration
546 and analysis has 5 main components: data collection, data preprocessing,
547 data ingestion and storage, data processing and analysis, and visualisation.
548 Figure 5 presents the overall architecture of the spatial data lake for the
549 integration of heterogeneous pastoralism data and the cross-analysis of infor-
550 mation for the production of new insight for decision-making.

551 The different processes in these components are further presented in the
552 following points.

⁸<https://geonetwork-opensource.org/>

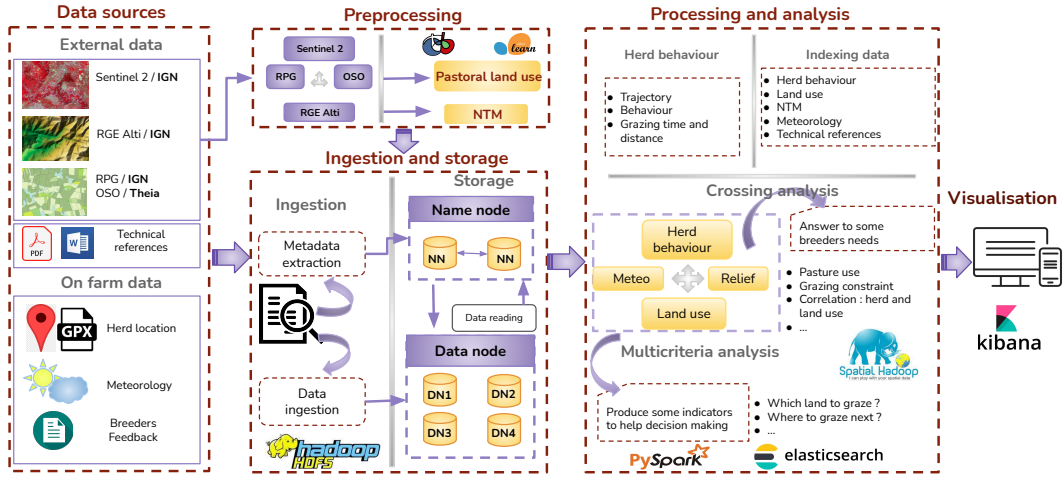


Figure 5: General architecture of the data lake for the integration of heterogeneous data from pastoralism in Mediterranean areas

7.1.1. Data source

We identified several data sources in Section 5. The frequency of acquiring external data is different depending on the dynamics of the type of information to be drawn. Considering that the relief is not affected by the change, the MNT RGE ALTI is acquired only once without any need for updating. Otherwise, to describe the land use that is susceptible to change, the data should be collected regularly. This means that Sentinel 2 data should be available at least monthly to cover large areas, and RPG and OSO land use and cover should be updated annually. Technical references can be acquired only once, with the possibility of being completed in case of new availability. On-farm data are acquired continuously and transmitted

564 at well-defined periods for their integration into the IS. Herd GPS location
565 data are acquired at different time intervals depending on whether they are
566 from a private farm or an experimental area. Indeed, given their interest
567 in research, experimental farms may be able to plan more frequent location
568 point acquisitions than private farms. This difference in acquiring frequency
569 is thus able to provide some precision in the description of herd behaviour.
570 For feedback from farmers, a wide variety of information can also be collected
571 from applications.

572 *7.1.2. Data preprocessing*

573 The goal of the processing carried out in this component concerns the
574 production of land use and cover of pastoral interest from Sentinel 2 data,
575 the RPG and the OSO land use and cover. These preprocessing steps are not
576 a part of the various analyses within the data lake. The data are processed
577 externally, and then the land use and cover produced are injected into the
578 data lake thereafter.

579 The principle of this preprocessing is to improve the low accuracy of the
580 pastoral interest classes present in the OSO land use and cover. From the
581 Sentinel 2 data, the objects corresponding to the pastoral classes in the OSO
582 land use and cover are reclassified using the RPG as a reference informa-

583 tion source for training and validation of the classification machine learning
584 model. We thus manage to produce improved OSO land use and cover, offer-
585 ing better precision for the classes of pastoral interest, which are permanent
586 meadows, lawns, moorlands and grazed forests.

587 Preprocessing also concerns the DTMs in producing different relief vari-
588 ables, namely, slope and aspect. It is also possible to consider, if necessary,
589 preprocessing for other types of data to facilitate their integration into the
590 data lake. However, the aim remains to use the raw data produced by their
591 sources.

592 Following training and validation of the classification algorithm, the pro-
593 cessing chain is used for the annual update of land use and cover.

594 *7.1.3. Data ingestion and storage*

595 In this phase, we define two levels of operations: ingestion and storage of
596 the data. The process is based on the data lake implementation by [Kafando
597 et al. \(2020\)](#). First, the data undergo the ingestion process, where their
598 preliminary analysis is performed to differentiate them (e.g., compared with
599 their format) and extract their metadata. The metadata make it possible to
600 identify and locate the data to which they refer from the GeoNetwork search
601 engine. In the storage process, the metadata are stored in the Namenode, and

602 the data are stored in a distributed manner in Datanodes thanks to HDFS.
603 As input data into the data lake, we list the improved land use and cover
604 from preprocessing, meteorological data, technical references, herd location
605 data and farmer feedback.

606 7.1.4. *Data processing and analysing*

607 This component allows the IS to perform different kinds of queries and
608 analysis to produce decision-making support indicators. Once the data are
609 stored, the retrieval becomes easier through the links defined between data
610 and metadata due to GeoNetwork. Thus, the data can be used according
611 to different needs. Various analysis will be possible within this information
612 system.

613 In the following table 2 we describe some of the analyses that can be
614 carried out in relation to the needs of farmers. To meet these needs, sev-
615 eral analysis techniques can be applied. For the first category of questions,
616 "benchmarks for adjusting grazing behaviour", the following functionalities
617 can be included: spatial queries (allowing to locate the places visited by the
618 herds as well as some areas of interest), trajectory analysis (allowing to know
619 the routes travelled and the distances made by the herds), point pattern
620 analysis (allowing to know the distribution of the location points in a grazed

environment), point clustering (allowing to discover the different phases of the herds' activities), detection of the patterns of moving objects (that can help to discover the differences or similarities in the exploration of the space by the herds). The second category of needs, "methods to achieve a certain goal", will mainly require text mining methods. They will help to discover new knowledge from farmers' experiences and technical references related to grazing. Finally, the third category of needs will require medium- and long-term analyses to assess variations in the use of rangelands by herds at different periods of the year. The combinations of the different information produced for the first category of needs will be carried out to produce new knowledge.

Beyond the needs of farmers, researchers are led to conduct various studies on a wider scale. Where the IS provides analytical results for farmer decision-making, research finds information to base new hypotheses and to verify them using other types of analysis. This new research knowledge can then be fed into the IS.

In addition to these analyses corresponding to the needs expressed in table 2, multicriteria analyses could be carried out with the aim of providing new indicators to facilitate decision-making for grazing. They provide a

640 set of solutions or choices that farmers are led to select according to their
641 grazing objectives. These solutions or choices can concern the identification
642 of nearby pastoral areas, the avoidance of recently grazed pastoral areas,
643 and the identification of optimal grazing routes (taking into account the
644 topography of the environment).

645 7.1.5. *Data visualisation*

646 The information produced within the data lake is accessible to users via
647 different visualisation interfaces depending on different access levels. Three
648 levels of access are established: one dedicated to agro-sylvo-pastoral farms,
649 one to researchers, and one to all types of users. The interface specific for
650 agro-sylvo-pastoral farms allows each farmer or experimental site to access
651 the data describing his or her farm. All information related to Table 2 in
652 the data lake is used to characterise each individual farm. No farmer has
653 access to data specific to a farm other than his or her own. The interface for
654 researchers gives them access to information and tools that enable them to
655 carry out large-scale analyses of livestock systems. They are able to combine
656 the different types of information from the IS to produce new knowledge
657 about pastoralism. Finally, the interface, which is dedicated to all users,
658 concerns farmers, researchers and other users interested in the application.

Table 5: An overview of some of the analyses within the IS that can help to address farmers' needs

Farmers' needs	Kinds of analysis to integrate in the IS
Function 1: benchmarks for adjusting pasture management	
What is the grazing area used at the moment (1)?	Data : land use and cover and daily GPS location data of animals
What route does my herd take each day (2)?	<u>Analysis :</u> - Spatial queries allowing to identify in which land use and cover animals are located (1) - Transformation of GPS data in trajectories with trajectory data mining functions (2) - Application of spatial intersection functions between trajectories and land use to produce a summary of the areas explored each day (2)
How much time does my herd spend for grazing (3)?	Data : daily GPS location data of animals, meteo, land use, DEM
What is the area covered by the herd (4)?	<u>Analysis :</u>
How do my animals occupy the space (5)?	- Point pattern analysis: Spielman (2017) - Identification of approximate bounding area of grazing (4) - Analysis of the distribution of location points in the surveyed area : clustering or dispersion ? (5) - Trajectory clustering of Moving object (animal locations) analysis allowing to find out how differences in the use of rangelands (5): Chen et al. (2014) - Discovery of moving pattern : animals who move together for a certain timestamp (5): Zheng (2015) <u>Cross analysis :</u> - Correlation between point pattern and slope, land use and cover and, meteo parameters to discover the effect of factors on the use of rangelands (5)
Function 2: methods to achieve a given objective	
How can encroached areas be enhanced (6)?	Data : technical references and feedbacks from farmers
How can pastoral resources be developed to meet the needs of my herd (7)?	<u>Analysis :</u>
How can animals be stimulated to move into unexplored areas (8)?	Keyword search of indexed data (6, 7 and 8) - Application of text mining techniques to extract knowledge on pastoral management (6, 7, and 8)
Function 3: better understand the ecology of the agro-sylvo-pastoral ecosystem	
How does the behaviour of animals change according to the season (9)?	Data : GPS location data, land use and cover, DEM and meteo <u>Analysis :</u> - Application of the analytical methods described above to data collected over long periods of time in order to analyse daily and seasonal variations in animal behaviour and the factors that determine them (9)

659 It will provide access to all types of information except those collected at the
660 individual farm level (GPS data or herd data). People who want to start
661 agro-sylvo-pastoral farming can be able to find the necessary information
662 on how to conduct it from this interface. It can also be used as a didactic
663 reference to support the teaching of grazing practices.

664 8. Discussion

665 8.1. *Relevance to addressing agro-sylvo-pastoral farming system issues*

666 The integration of massive data in an information system for agro-sylvo-
667 pastoral management is not currently as effective as in most agricultural
668 applications. Data from different sources (public and farm levels) are often
669 only partially used to contribute to livestock management. To take maxi-
670 mum advantage of the wide variety of data, their combination is necessary
671 ([Capalbo et al., 2017](#); [Bahlo et al., 2019](#)). However, the wide variety of agro-
672 sylvo-pastoral systems in terms of environments, management modes and
673 data make it difficult to implement a decision support tool. In this study,
674 we proposed a spatial data lake for the integration of heterogeneous data to
675 produce indicators and useful knowledge for short- and long-term decision-
676 making in agro-sylvo-pastoral farming.

677 The originality of this study lies in considering the pastoral context of the
678 southern Mediterranean regions to define IS functionalities; identifying and
679 contextualising the key factors for modelling the agro-sylvo-pastoral ecosys-
680 tem; designing an adapted and operational IS for the integration, cross anal-
681 ysis of data, and retrieval of information for decision support; and setting up
682 a collaborative framework for farmers and between farmers and researchers.

683 Thanks to the cataloguing system offered by GeoNetWork, the IS data
684 we present benefit from a standardisation that facilitates their access by
685 different users. The latter can use it to find useful information according to
686 their specific needs. They will find answers to the questions mentioned above
687 in Table 2, and much more to discover new indicators to optimise the use of
688 pastures. Indeed, the added value of combining data lies in the methods used
689 to produce new information (Bahlo et al., 2019). According to (Teucher et al.,
690 2014), the information system must have functionalities that provide precise
691 information on the location of phenomena and recommendations on the best
692 agricultural practices. The different levels of processing that we propose will
693 allow users to become aware of the state of the farms and to provide them
694 with proposals and references according to the needs and situation of each
695 farmer.

696 In the medium and long term, the increase in example cases in the IS will
697 open a way for new applications to enrich the knowledge regarding pastoral
698 management. Apart from analyses based on short periods of time, research
699 will find uses at this stage by widening its temporal scale of study. Thus,
700 various applications can be considered, for example, the influence of graz-
701 ing on the spatial distribution of vegetation, influence of climatic factors on
702 the dynamics of vegetation, and medium- and long-term changes in animal
703 behaviour. The spatial IS can also be applied at the territorial level. In
704 ([Capalbo et al., 2017](#)), the authors showed that ISs can also be beneficial
705 for management at levels above the farm level. This could allow us to anal-
706 yse the state and dynamics of vegetation and to plan interventions at the
707 territorial level.

708 *8.2. Functional considerations*

709 The proposed spatial data lake meets most of the constraints mentioned,
710 including data heterogeneity and standardisation, correspondence with user
711 needs, and scaling. Beyond these constraints, the IS presents other advan-
712 tages facilitating the management of metadata, as presented in ([Sawadogo](#)
713 [et al., 2019](#)) and summarised by ([Kafando et al., 2020](#)): semantic enrichment,
714 data indexing, link generation and conservation, data polymorphism, data

715 versioning and user tracking. These functionalities present in the IS based on
716 ISO 19115 conceptual model implementation favour interoperability, security
717 and confidentiality of pastoral data.

718 However, the practical applications of data integration in spatial ISs raise
719 some practical considerations, especially in relation to the integration of spa-
720 tial land cover and satellite imagery data. The processes of ingesting and
721 storing data in the HDFS are carried out by replicating the sequences of
722 blocks corresponding to each file in the Datanodes available for this purpose
723 ([Honnutagi, 2014](#)). The size of each block is 128 mb by default but can be
724 configured by the operator. For 500 mb data, for instance, 4 blocks includ-
725 ing 3 of 128 mb and 1 of 116 mb, can be replicated as many times in the
726 Datanodes. This process allows better management of less heavy data, such
727 as technical references, GPS data, meteorological data and farmer feedback.
728 However, ingesting and storing massive spatial data such as land cover and
729 raster data requires a specific approach that takes into account the topology
730 of factors. Hadoop does not handle better the topology of large vector data
731 when ingesting and storing. Application of appropriate techniques are nec-
732 essary. In [Yao et al. \(2017\)](#), the authors proposed an implementation based
733 on a spatial partitioning matrix allowing a coherent replication of spatially

734 close factors. Such an approach can be experimented with for the integration
735 of land use data.

736 The data lake is dynamic, depending on the data cycle and its feeding
737 over time. The increase in data volume raises the problem of scaling of the
738 IS. In the production phase, it is important to evaluate the storage aspect of
739 heterogeneous pastoral data by considering their dynamics. In essence, data
740 lakes are designed to better manage the problem of increasing the volume of
741 data ([Fang, 2015](#); [Khine and Wang, 2018](#)).

742 *8.3. Applicability in other European Mediterranean areas*

743 Several aspects favoured the realisation of this study in French mountain-
744 ous and Mediterranean areas. The presence of services and farmers involved
745 in pastoralism, the recent work carried out within a framework of different
746 projects that tested different technological tools to improve pastoral condi-
747 tions, and the availability of various public data that can contribute to the
748 modelling of the agro-sylvo-pastoral ecosystem.

749 As long as the conditions concerning data availability and farmer interest
750 are met in other areas, there are sufficient similarities between EU agro-sylvo-
751 pastoral farms and common issues ([de Rancourt et al., 2006](#)) to extend this
752 method. Outside of the EU, the questions and needs of farmers might be

753 slightly different since the CAP is a strong structuring factor in the EU.

754 If the IS is to be extended to other geographic areas, new specific databases
755 would need to be built, since certain types of similar data (MNT RGE, OSO
756 land use and cover, RPG and technical references) are specific to each coun-
757 try. Data of the same nature as the one used in this work can also be obtained
758 or generated in these different countries. In the case of the existence of these
759 types of data, the different approaches developed in this article may be ap-
760 plicable.

761 **9. Conclusion and perspectives**

762 In this study, we describe the codesign process of a spatial information sys-
763 tem for grazing management in agro-sylvo-pastoral systems in French moun-
764 tainous and Mediterranean regions. To address the operational concerns of
765 grazing, we define with the stakeholders the main functionalities of the IS.
766 We then mapped out the grazed ecosystem model that allowed us to iden-
767 tify the heterogeneous pastoralism data. The information system is a data
768 lake based on the HDFS, offering functionalities for the integration of het-
769 erogeneous data and the analysis and visualisation of information to support
770 decision-making in pastoral farming.

771 In the context of variability and heterogeneity of agro-sylvo-pastoral sys-
772 tems, this information system will provide information adapted to each farm
773 thanks to the data that they provide. This will provide farmers with an
774 effective tool to help them make decisions regarding the actions to be taken.
775 This information system will also provide a source of information for research
776 to carry out studies on larger scales and to document knowledge about these
777 variable and heterogeneous systems. Furthermore, this IS could lead to an
778 exchange network between pastoralists, with the aim of improving knowl-
779 edge and practices. The design approach presented in this study can also be
780 applied to other mountainous and Mediterranean regions in Europe to build
781 an IS adapted to the context of each region.

782 The codesign process are not only limited to the applications defined in
783 this study. Throughout the project, regular interactions between stakehold-
784 ers made it possible to improve the established applications and to propose
785 others to be integrated into the IS. These applications notably concern the
786 cross-referencing and visualisation of information. They offer users relevant
787 information adapted to their needs.

788 The next study will focus on the implementation of the spatial data lake
789 presented here to provide concrete results in the practical situation of live-

790 stock farming in French Mediterranean areas.

791 Appendices

792 Appendix A : tables

Table A.1: Breeders' needs expressed in the form of questions, considered as a basis for the IS functionalities

N°	Questions
Benchmarks for adjusting pasture management	
1	Do my animals have enough forage to eat ? *
2	What is the instantaneous stocking rate on my rangeland? (no. of animals/ha) *
3	What is the seasonal or annual stocking rate on my rangeland? (no. of animals/ha * days) *
4	What type of pastoral resource is available in my paddock? **
5	What is the average daily distance travelled by the herd? **
6	What is the grazing area used at the moment? ***
7	What route does my herd take each day? ***
8	How much time does my herd spend for grazing? ***
9	What is the area covered by the herd? ***
10	How do my animals occupy the space? (weekly, monthly, seasonally, yearly) ***
Methods to achieve a given objective	
11	How to identify the vegetation? *
12	How to prevent fires on my rangelands? *
13	Where to place fences or enclosures? *
14	How to bring water on the rangelands? *
15	How can animals refusals be reduced? *
16	How to adapt the grazing circuit to the topography of the rangelands? *
17	How can several grazing methods be managed (guarding, free ranging, park)? *
18	How can animals be forced to consume woody plants? *
19	Would it be useful to split up a paddock? *
20	How can animals be forced to eat unpalatable species? *
21	How can digital tools be integrated to save time and accuracy? *
22	How can encroached areas be reopened? **
23	What information should be passed on to a breeder who takes over the herd? **
24	How to quantify the available pastoral resource? **
25	How to control encroached areas? **
26	How to adapt the grazing circuit to the weather of the day? **
27	How to change the attractiveness of an area for a herd? **
28	How can encroached areas be enhanced? ***
29	How to develop the pastoral resource to meet the needs of my herd? ***
30	How can animals be stimulated to move into unexplored areas? ***
Better understand the ecology of the pastoral ecosystem	
31	What are the differences between species in the use of rangeland? *
32	What are the differences between breeds of the same species in terms of rangeland utilisation? *
33	How does animal behaviour change according to the breeder? *
34	I'm setting up: How can I breed my herd in the open air and valorise the rangelands? *
35	What is the impact of climate change on rangelands? **
36	What is the influence of the type of pastoral resource on dairy production? **
37	How does the animal behaviour change depending on the grazing management? **
38	How does the behaviour of animals change according to the season? ***

Table A.2: Factors from the literature review validated by the breeders and those from the breeders' feedback only, shown in *italics*.

Factors	Number of votes out of 8
Pastoral resources	
Availability	8
Accessibility	3
Spatial distribution	7
Animals / herds	
Physiology	7
Morphology	1
Relationship between animals	7
Spatial memory : <i>Knowledge of the environment</i>	2
<i>Herd size</i>	2
Managment practices	
Guarding	8
Complementing	5
<i>Grazing moment</i>	7
Environment	
Topography : slope	5
Meteo : Ran	5
Meteo : Wind	4
Meteo : Warm	8
Attractions: water point	6
Attractions: resting area	7
<i>Park size</i>	3

793 **Appendix B : description of external data that can be integrated**
794 **into the information system for grazing management**

795 *Appendix B.1: Sentinel 2 satellite data from Theia*

796 Sentinel 2 data⁹ comprise 13 spectral bands at 10, 20 and 60 m spatial
797 resolutions depending on the spectral band. A wide swath width of 290 km
798 makes it possible to capture at once a large portion of the Earth's surface
799 with a revisit period of 10 days (by 1 satellite) or 5 complementary days
800 (for the two satellites, Sentinel 2A and Sentinel 2B). Its spatial resolution
801 and its spectral richness are an asset for obtaining better discrimination of
802 the different pastoral vegetation classes (see, [Castro et al., 2020](#)), which can
803 bring, in association with other information (e.g., spectral indices of very high
804 spatial resolution data), more detail for analyses at the level of agro-sylvo-
805 pastoral exploitation (e.g., ligneous vegetation density). These data can be
806 analysed together with other references, such as the RPG, which can provide
807 better information for training and validation in the supervised classification
808 process.

⁹<https://www.theia-land.fr/>

809 *Appendix B.2: Registre Parcellaire Graphique (RPG)*

810 RPG is a geographic information system managed by the French Ser-
811 vice and Payment Agency (ASP), allowing the identification of agricultural
812 parcels declared by farmers. It provides detailed information on land use
813 and land structures. Several rangelands (lawns, open moorlands, and closed
814 moorlands) and grazed forests are represented. In addition to identifying
815 pastoral classes, the RPG can be useful in the land use classification process
816 in combination with satellite data, as shown in [Shaqura and Lasseur \(2019\)](#).
817 It is an important source of accurate and large-scale training data.

818 *Appendix B.3: OSO land use and cover*

819 The OSO land use and cover is processed and provided by the National
820 Center for Spatial Studies (CNES) in collaboration with specialised research
821 laboratories¹⁰. These data have a spatial resolution of 10 m in raster mode
822 and a minimum mapping unit of 20 m in vector mode with 23 classes. The
823 23 classes are divided into 5 groups: artificial areas, annual crops, perennial
824 crops, forests, natural vegetation and other nonvegetated natural areas.

825 The iota2 processing chain¹¹ that made it possible to obtain land use

¹⁰<https://www.theia-land.fr/la-carte-doccupation-des-sols-millesime-2019%2Dfrance-entiere/>

¹¹<https://www.theia-land.fr/product/iota-2/>

826 data from Sentinel 2 data (Inglada et al., 2017) allowed us to obtain better
827 outlines of objects. However, the accuracy of the rangeland classes (perma-
828 nent grassland, lawn and moorlands) in OSO land use and cover is low. To
829 improve this accuracy, the processing of OSO vector data can be performed
830 for an oriented object classification process. To do this, the OSO data can be
831 combined with the Sentinel 2 data and the RPG is utilised as reference data.
832 The annual production of OSO data is a good opportunity for an annual
833 update of land use for agro-sylvo-pastoral applications.

834 *Appendix B.4: IGN altimetry data: the MNT RGE ALTI*

835 The MNT RGE ALTI altimetry data compose a relief model in the form
836 of a regular rectangular grid, also called the “altitude matrix”, where the
837 altitude of each of the nodes of this grid corresponds to the nominal terrain
838 altitude at the point defined by the grid node. The spatial resolution of the
839 grids ranges from 1 m to 5 m in X and Y. The information drawn from these
840 data allows the relief of the rangelands to be modelled with better accuracy.
841 Interaction with other information, such as land use and cover, can allow
842 us to characterise the shape of the land within an agro-sylvo-pastoral farm.
843 These data might be collected only once for the areas to be studied, given
844 that the topography of these environments can be considered constant.

845 *Appendix B.5: Technical references*

846 These are documents describing technical practices in the field of pastoral-
847 ism. They are mainly collected from different agro-sylvo-pastoral farming
848 institutions and associations. They can be integrated into the information
849 system to serve as a reference source of information for various users, mainly
850 farmers and shepherds, on agro-sylvo-pastoral practices.

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