29. May 2024

Albin Ahmeti Robert David Artem Revenko Jan Kees Schakel

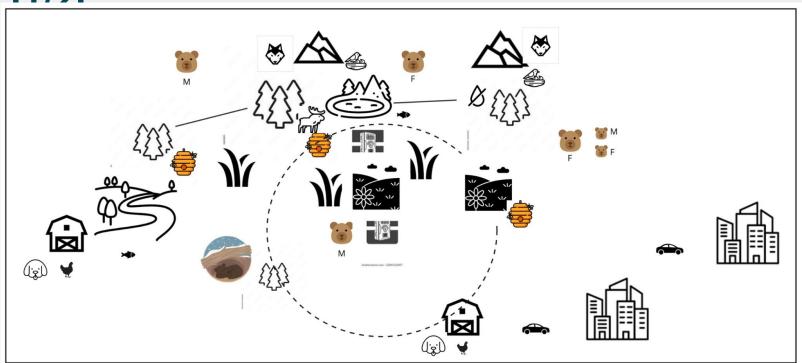


NATUREFIRST

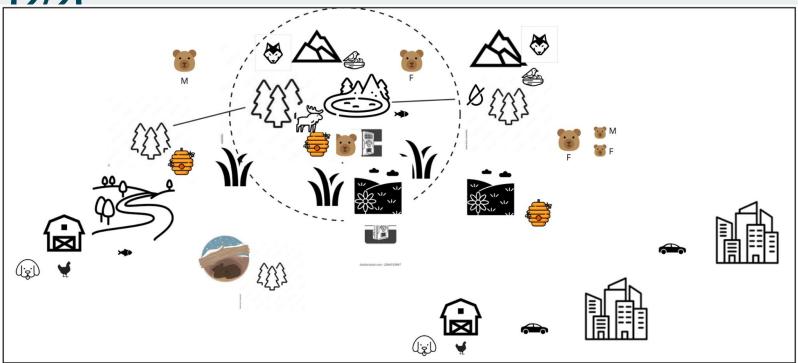
A Species Conservation Recommender System based on Knowledge Graph for Brown Bear Movement Prediction



Problem space: Brown Bear Movement Prediction (1/2)



Problem space: Brown Bear Movement Prediction (2/2)



Problem space: Summary

- A need to integrate, harmonize and reason over hetereogenous data originating from various sources:
 - Sensor data Digital twin: camera traps / traptagger
 - Brown bear habitat suitability index (HSI)
 - Which elevations does it prefer? Slopes? Habitats?
 - O Brown bear's **ecological model:** with which species and habitats does it interact? How does that change during time of the day and/or season?
 - Geographic/Spatial data on habitat structure **ecosystem basemaps**
 - Observations in Cluey points of interest, beehives etc..

Solution:

Describe and align the aforementioned data with common <u>vocabularies</u> and <u>taxonomies</u>! Use <u>knowledge graph</u> as a data model to represent, connect and reason over data sources!

What is a taxonomy?

https://sensingclues.org/taxonomy-graphviews

Corine Land Cover EU **Essential Biodiversity Variables EunisSpecies** Habitats EUNIS 2012 Habitats EUNIS 2017 Habitats EUNIS 2021 **IUCN Habitat Classification Scheme IUCN Red List Species** SCCSS Ontology SCCSS Ontology v3

Q Search for a concept **Tree View** Overview **Detail View** - Habitats EUNIS 2012 All habitats A-Marine habitats B-Coastal habitats C-Inland surface waters D-Mires, bogs and fens E-Grasslands and lands dominated by forbs, mosses or lichens F-Heathland, scrub and tundra G-Woodland, forest and other wooded land G1-Broadleaved deciduous woodland G1.1-Riparian and gallery woodland, with dominant Alnus, Betul. G1.2-Mixed riparian floodplain and gallery woodland G1.3-Mediterranean riparian woodland G1.4-Broadleaved swamp woodland not on acid peat G1.5-Broadleaved swamp woodland on acid peat G1.6-Fagus woodland (4) G1.7-Thermophilous deciduous woodland (4) G1.8-Acidophilous Quercus-dominated woodland G1.9-Non-riverine woodland with Betula, Populus tremula or Sor G1.A-Meso- and eutrophic Quercus, Carpinus, Fraxinus, Acer, T (4) G1.B-Non-riverine Alnus woodland (4) G1.C-Highly artificial broadleaved deciduous forestry plantations G1.D-Fruit and nut tree orchards G1.D1-Castanea sativa plantations G1.D2-Juglans groves G1.D3-Prunus amvodalus groves G1.D4-Fruit orchards G1.D5-Other high-stem orchards G2-Broadleaved evergreen woodland G3-Coniferous woodland G4-Mixed deciduous and coniferous woodland G5-Lines of trees, small anthropogenic woodlands, recently felled woo 1-Inland unvegetated or sparsely vegetated habitats -Regularly or recently cultivated agricultural, horticultural and domestic hab J-Constructed, industrial and other artificial habitats

() (i Submit Feedback http://eunis.eea.europa.eu/rdf/habitats schema.rdf#name Fruit and nut tree orchards description Stands of trees cultivated for fruit or flower production, providing permanent tree cover once mature. Extensively cultivated and old orchards are habitats supporting rich flora and fauna. code 362 http://www.w3.org/2000/01/rdfschema#label Fruit and nut tree orchards priority false originallyPublishedCode 362 habitatCode G1.D Children G1.D1-Castanea sativa plantations G1.D2-Juglans groves

· G1.D3-Prunus amygdalus

G1.D4-Fruit orchards

groves

Habitats EUNIS 2012

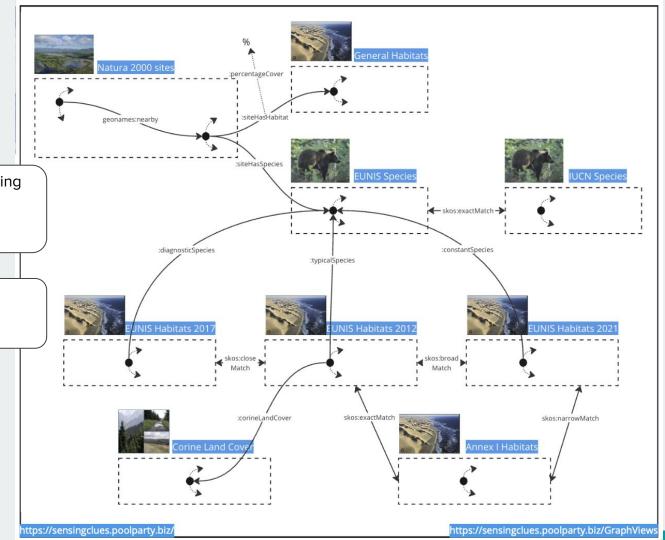
Interlinking sources of truth. Making them accessible to the public.

And machine-readable for researchers and developers.

What is a knowledge graph?

Provide more contextual knowledge using relations: *geonames:nearby*Crossovers to link one dataset with another: skos:exactMatch

Added value: Ask more complex competency questions!



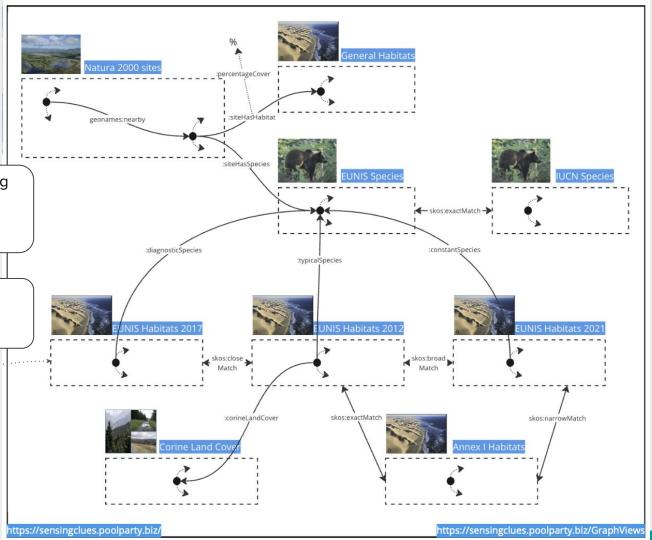
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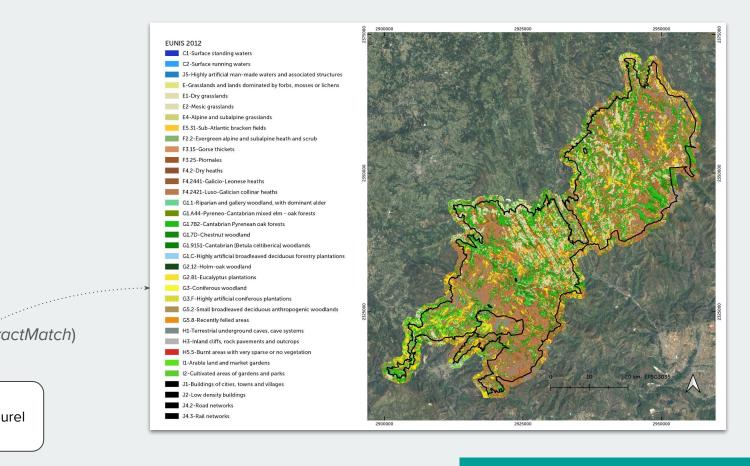
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"is equal to" (skos:exactMatch)

Habitat X in Ancares Courel



Ancares Courel mapping using EUNIS 2012

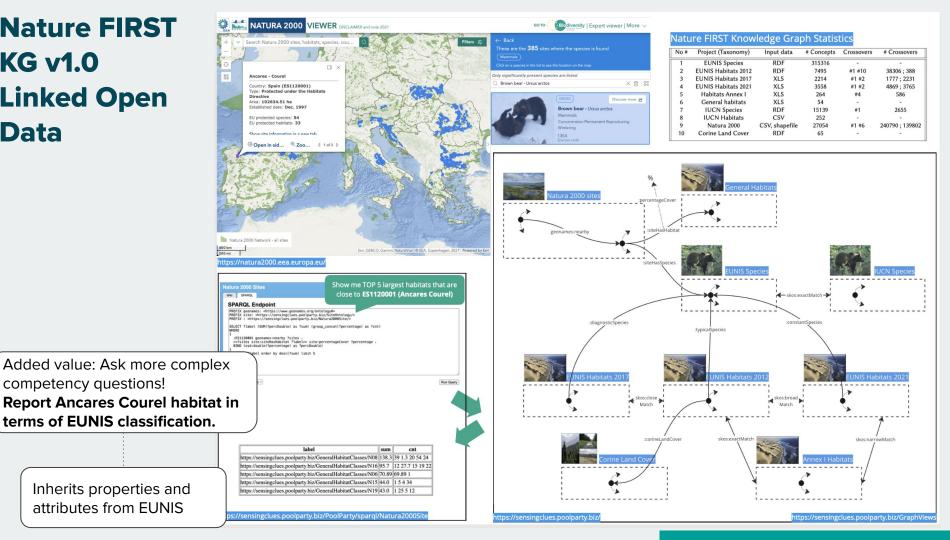


"is equal to" (skos:exactMatch)

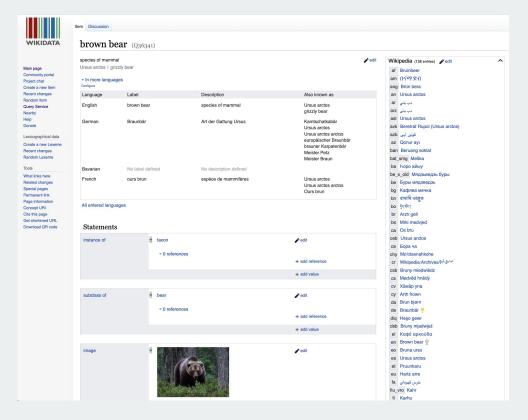
Habitat X in Ancares Courel

Nature FIRST **KG v1.0 Linked Open Data**

competency questions!



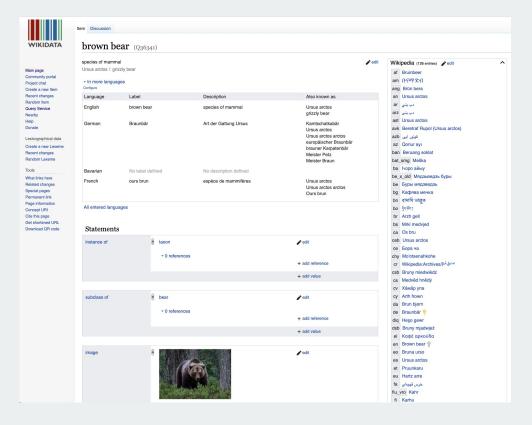
Linked Open Data - Wikidata





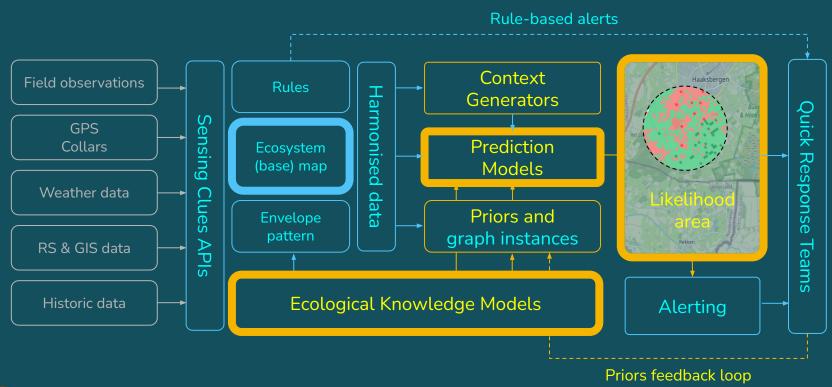
IUCN conservation status		Least Concern		y edit
		→ 1 reference		
				+ add value
start time	8	500000 years BCE • 0 references		≯ edit
		→ U references		+ add reference
				+ add value
award received	GBD	Animal of the Year point in time	2005	∕ edit
		▶ 1 reference		
	8	Q109758751 >		≯ edit
		point in time	2009	
		→ 0 references		+ add reference
				+ add value
taxon range map image	QBO	Ursus arctos range map.svg 1,000 × 500; 715 KB		p edit
		media legend	Световно разпространение на "U. arctos" (Bulgarian)	
		→ 0 references		
				+ add reference
	000	Bulgaria Distribution Ursus arcto	NE SMI	≯ edit
		2,483 × 1,642; 899 KB		

Linked Open Data - Wikidata



Crossovers to "Catalogue of Life" and other species repositories.

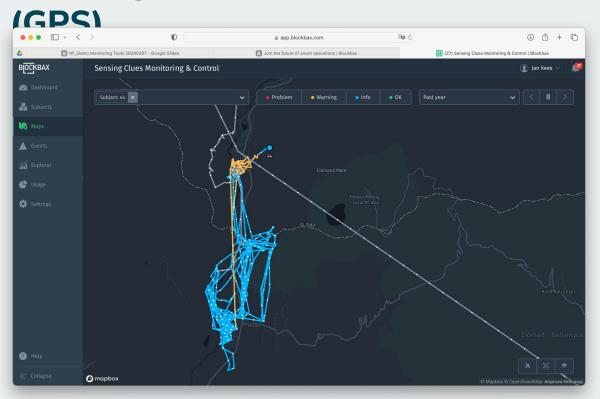
BNCF Thesaurus ID	8	20737		edit
		subject named as	Orsi bruni	
		alternative name	Orsi europei	
			Ursus arctos	
		▼ 0 references		
		* 0 references		+ add reference
				+ add value
BOLD Systems taxon ID	8	12510		
		→ 1 reference		
		r i lalalatica		
				+ add value
Catalogue of Life ID	90	7F2KB		
		▶ 1 reference		
				+ add value
CITES Species+ ID	QBC	9829		edit
		▶ 1 reference		
				+ add value
CONABIO ID	080	184392MAMIFB501112		∂ edit
		▼ 0 references		+ add reference
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				+ add value
Czech NDOP taxon ID	8	34378		edit edit
		→ 1 reference		
		Filelelelice		
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Den Store Danske ID	9	brun_bjørn		edit
		→ 0 references		
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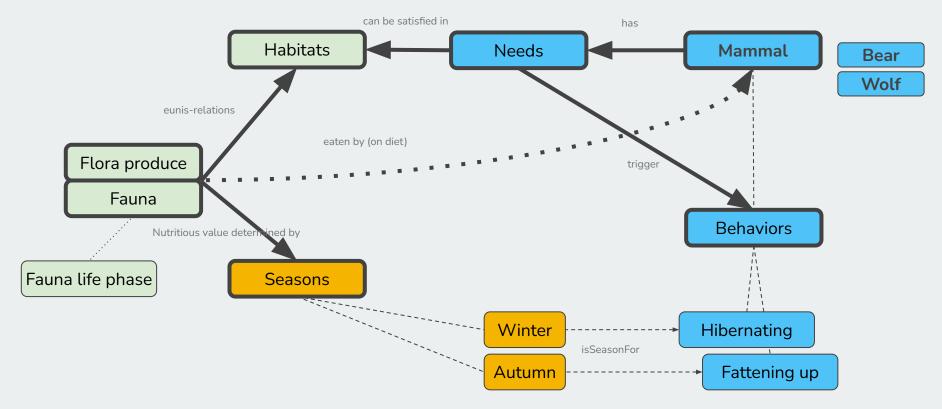




Learning brown bear behaviors from collared data



Ecological Knowledge Model (EKM)



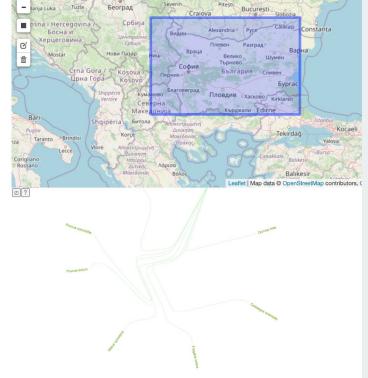
EKM completed with GLoBI GloBI



Turnu

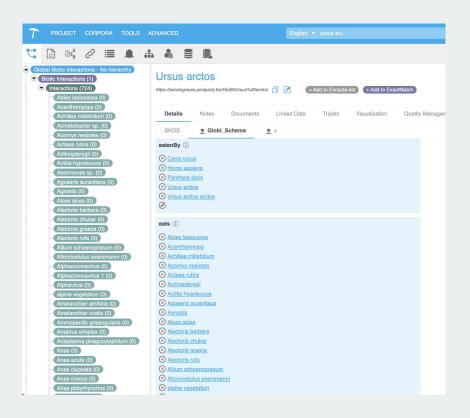
Ploiești Buzău

download csv data sample		access full dataset	
taxon	ecologically related to	taxon	
(1 distinct)	(7 distinct interactions)	(7 distinct)	
Ursus arctos	eats	Fragaria vesca	
Ursus arctos	eats	Malus sylvestris	
Ursus arctos	eats	Cornus mas	
Ursus arctos	eats	Prunus cocomilia	
Ursus arctos	eats	Prunus avium	



EKM completed with GLoBI GloBI





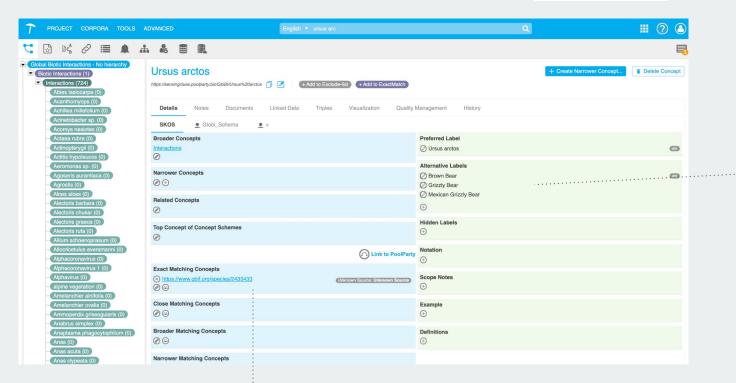
Stats:

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"535"^^<http://www.w3.org/2001/XMLSchema#integer> "76"^^http://www.w3.org/2001/XMLSchema#integer "71"^^<http://www.w3.org/2001/XMLSchema#integer> "39"^^http://www.w3.org/2001/XMLSchema#integer> "21"^^http://www.w3.org/2001/XMLSchema#integer> "10"^^http://www.w3.org/2001/XMLSchema#integer "5"^^<http://www.w3.org/2001/XMLSchema#integer> "3"^^ "3"^^<http://www.w3.org/2001/XMLSchema#integer> "2"^^ "2"^^http://www.w3.org/2001/XMLSchema#integer "1"^^http://www.w3.org/2001/XMLSchema#integer "1"^^http://www.w3.org/2001/XMLSchema#integer> "1"^^ "1"^^<http://www.w3.org/2001/XMLSchema#integer> "1"^^http://www.w3.org/2001/XMLSchema#integer> "1"^^



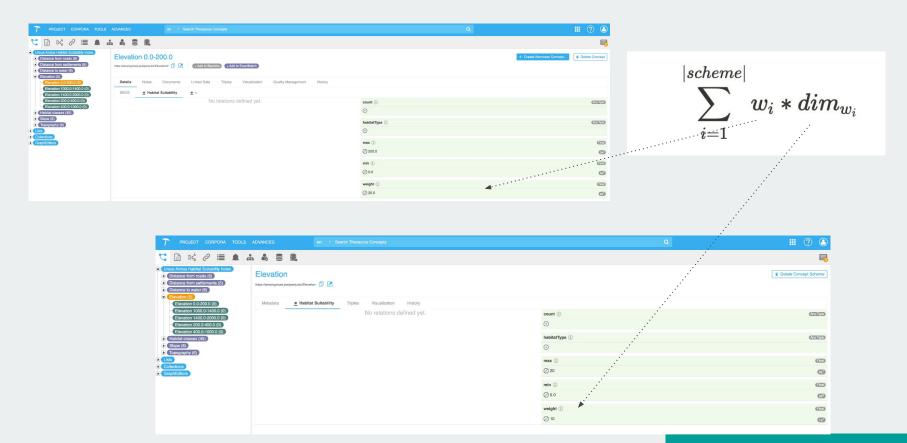




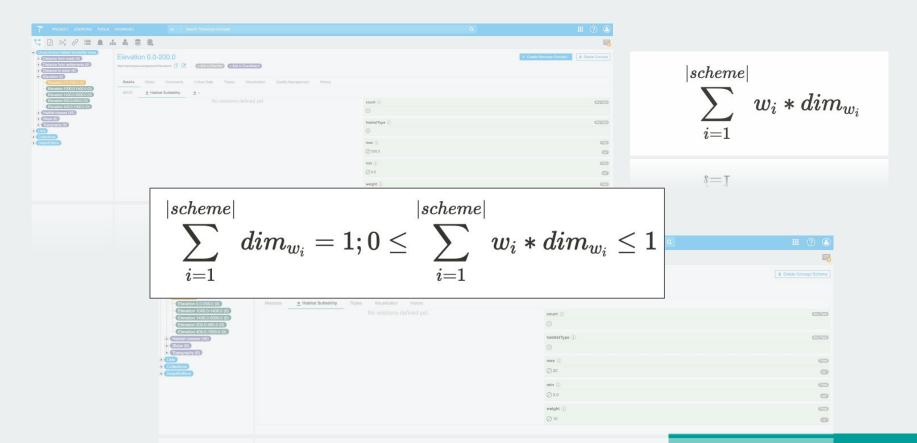
Synonyms fetched from Wikidata

Crossovers

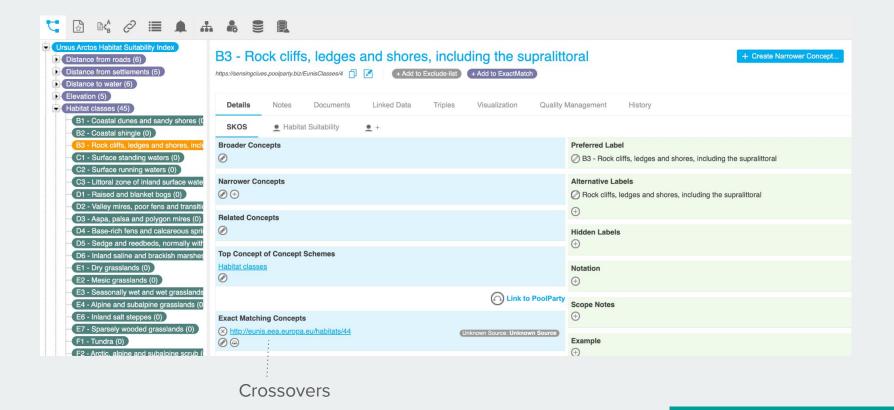
Brown Bear Habitat Suitability Index (Koen et al.)



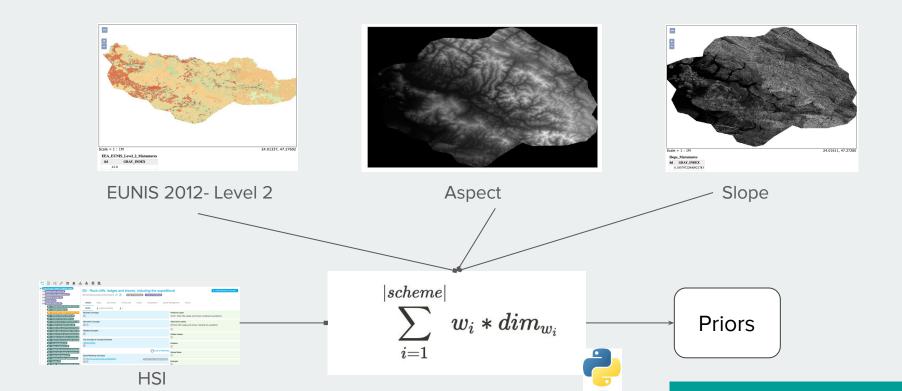
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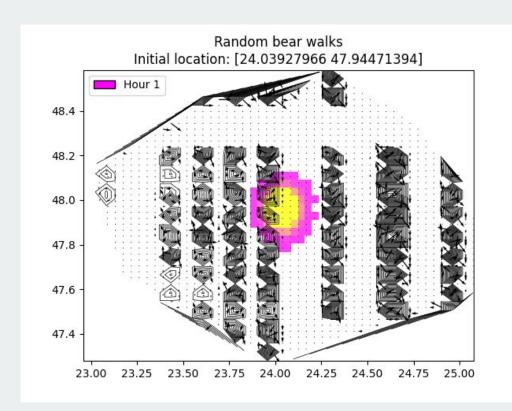
HSI alignment with EUNIS 2012 via crossovers



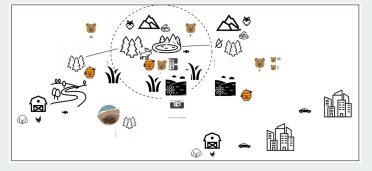
Geoserver ecobasemaps for Maramoures



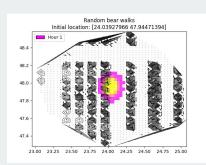
Agent based simulation - Preliminary results

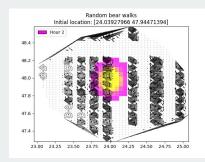


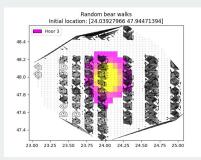


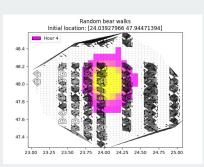


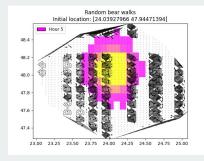
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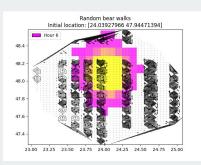


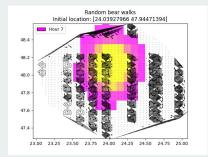


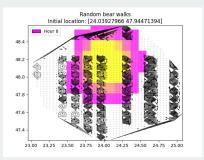












Future work

- Integration of ecosystem basemaps
 - Distance to town
 - Distance to river
 - L3 EUNIS 2012
 - 0.
- Applying path-based queries (e.g. for computing short-path distance) and integration with Ecological Knowledge Model
- Application of Machine Learning algorithms to learn habits from brown bear logs



























Questions & Answers