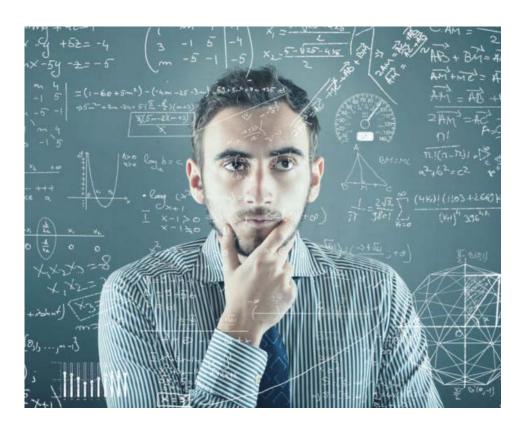
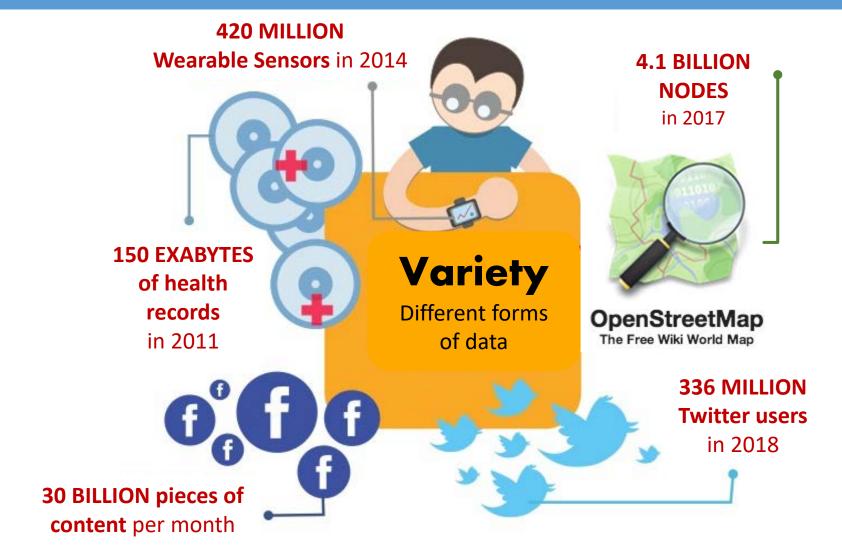
# Question-answering with linked spatial data: the role of spatial core concepts



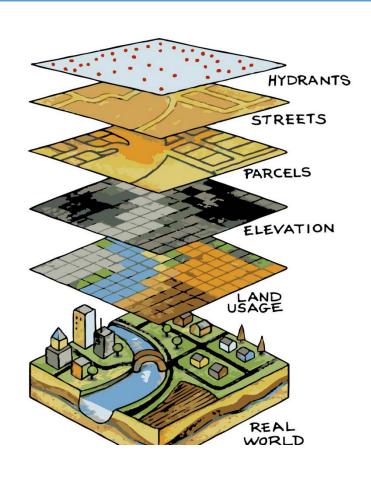


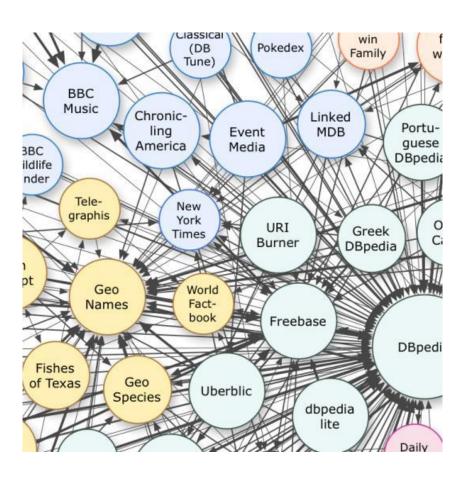
Simon Scheider, Dep. Human Geography and Planning, SDI.Next: Linked Spatial Data in Europe, 12-3-2019

## Variety of big geodata: A blessing and a curse



## GIS and linked spatial data

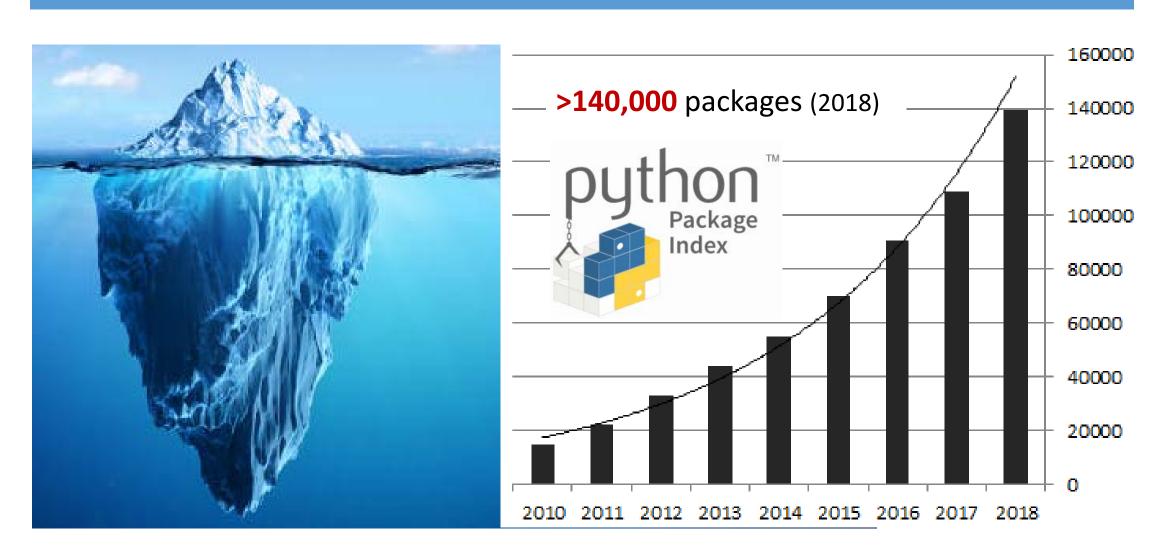




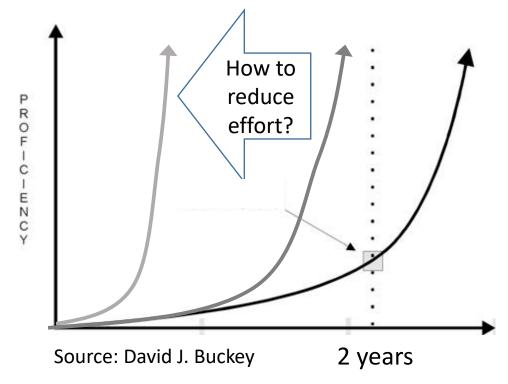
# Variety of GIS tools: > 8000 tools in main software programs



## Variety of (GIS) tools: Exponential growth of packages



## Learning a GIS tool simply takes too much time



Learning ...

• a new toolset : ~ 2 months

to become proficient in GIS:

~ 2 years



# Ask a spatial question - and find the right tools and data in an instant

Data scientists always start (and end) with an analytic question

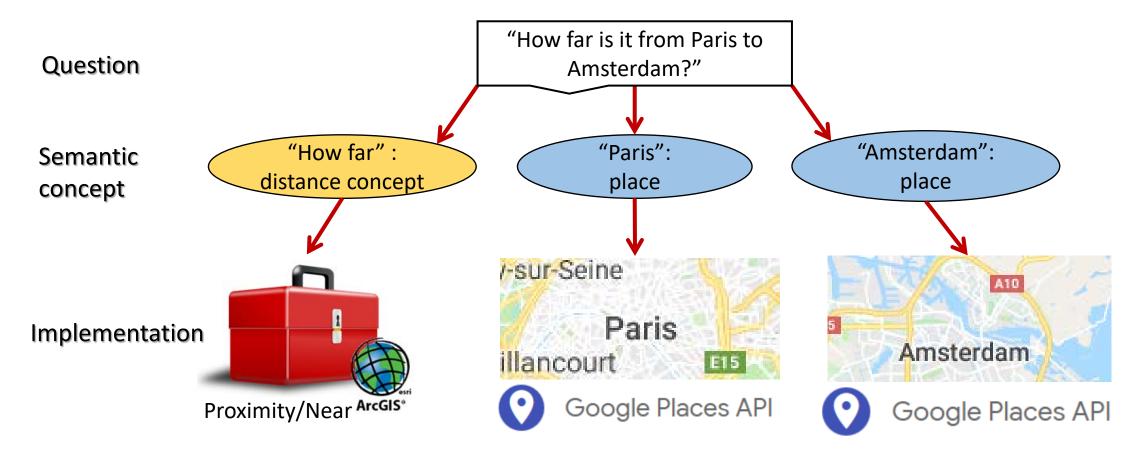
- ... to capture what they actually want to know
- ... to share and discuss their results
- ... independently from a tool or data set (Vahedi et al 2016)





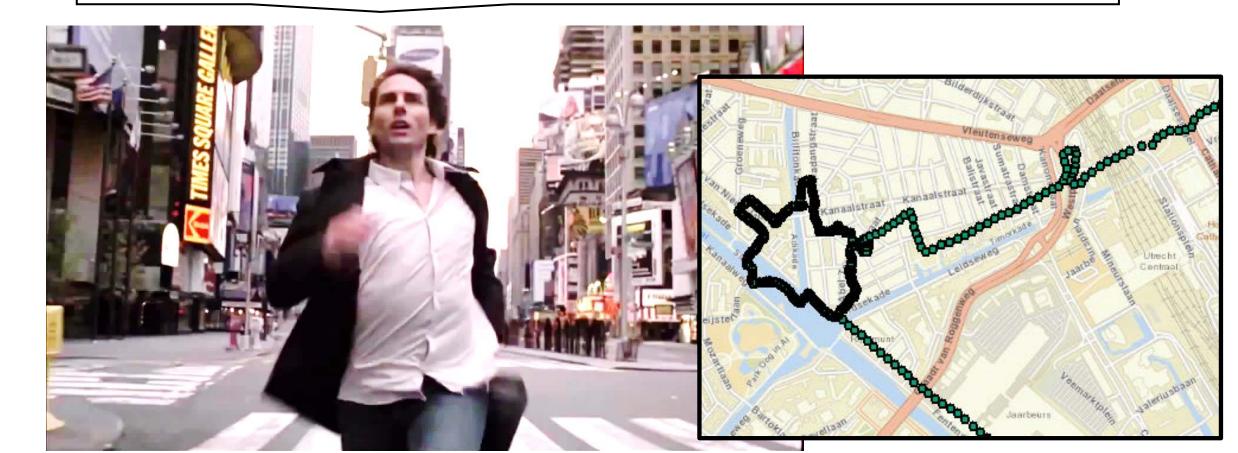
## Building a question-based GIS

GIS currently do not understand questions! The challenge lies in semantically translating questions into tools and data (Gao 2013):



## Example: Translation of a question into GIS

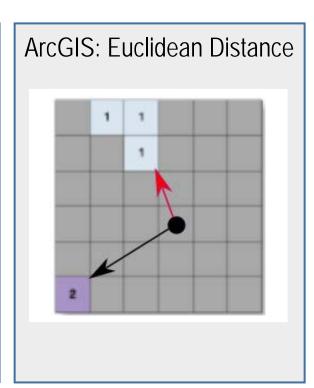
"How much is Tom exposed to green space while running through the city?"

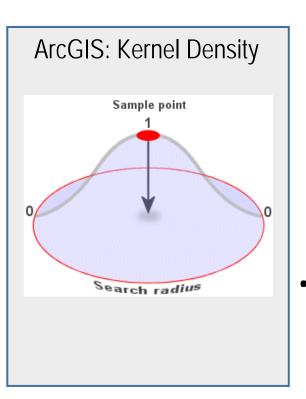


### Data and tools that might be of relevance ...









Which ones of these resources answer the question?

### State-of-the-art: KB QA

Knowledge based Question-Answering (KB QA):

Match questions with facts stored in a fact DB (Diefenbach et al 2017)

- 1. Build a semantic representation of the question as query
- 2. Run this query on a facts DB:
  - Geospatial DB
  - Ontologies (DBPedia, WordNet, Yago)
  - Scientific databases

Many steps are based on *machine learning* (QA learning)

Question analysis Phrase mapping

Disambiguation

Query construction

Distributed knowledge

### State-of-the-art: KB QA

For example, IBM Watson's winning reply in Jeopardy!:

WILLIAM WILKINSON'S
"AN ACCOUNT OF THE PRINCIPALITIES OF
WALLACHIA AND MOLDOVIA"
INSPIRED THIS AUTHOR'S
MOST FAMOUS NOVEL



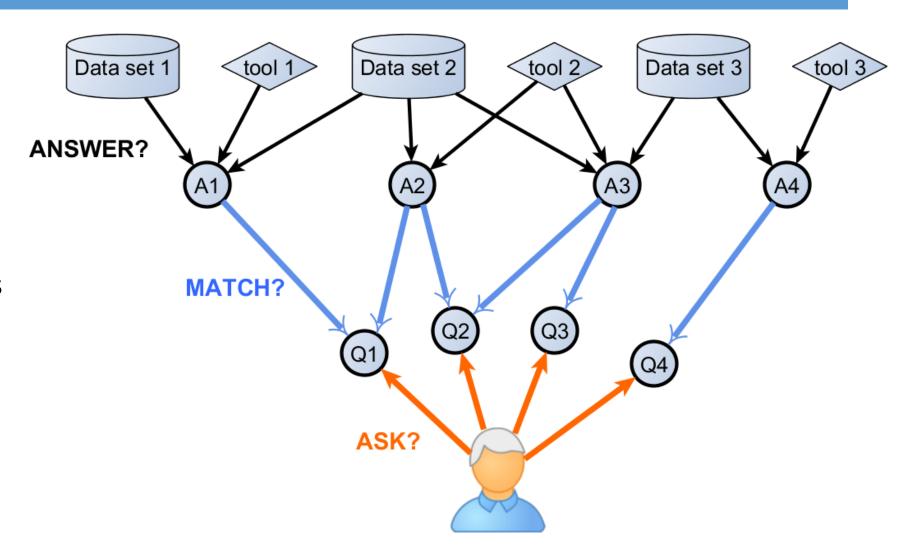
Or Apple's Siri:



# The challenge I: Creativity in asking/answering questions

... makes it a non-trivial learning task ...

- Problem for QA learning: training samples lacking
- Problem for QA learning: many possible answers



## The challenge II: Unknown answers

Example: "Who is the director of Forrest Gump?" (Bao et al 2014)

Answer derived by matching *question patterns* to facts in DBpedia:

Yet,

 The most interesting GIS questions are analytical, they have unknown answers!

• So: we cannot *learn* QA!

Q: who is the director of Forrest Gump  $\mathcal{QP}_{pattern}$ : who is the director of [Slot]

 $\mathcal{QP}_{predicate}$  : Film.Film.Director

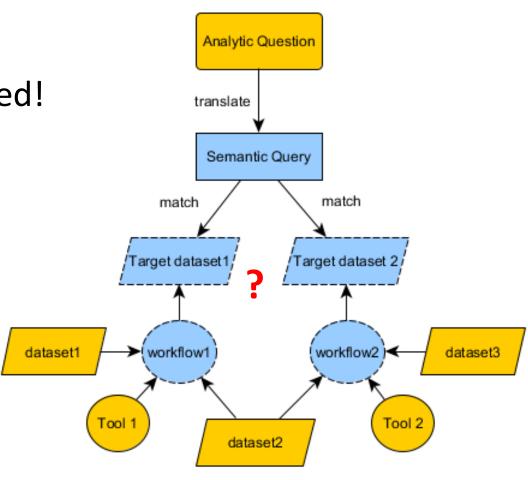
q : <Forrest Gump, Film.Film.Director, ?>

t : <Forrest Gump, Film.Film.Director, Robert Zemeckis>

# The challenge III: Analytic QA: *potential* of tools and data

#### *Analytic* QA:

- Matching questions to data which may not exist (yet), but may be generated!
- Finding a way to describe the analytic potential of
  - geodata
  - GIS tools
- ... across datatypes (raster, vector)
- ... across software implementations



### QuAnGIS

1. ASK: Which spatial questions can be **asked**?

2. ANSWER: Which spatial questions can be answered by

a) GIS tools?

b) Web data sources?

3. MATCH: How to **match** geoanalytic resources and questions?

Question Based Analysis



#### https://questionbasedanalysis.com/

@2019 -2024: Funded by the European Research Council (ERC) under the European Union's Horizon 2020 research and innovation programme (grant agreement No 803498).

## Spatial core concepts (Kuhn 2012)

Objects of study in Geographic Information Science? (... like "cell" in biology or "value" in economics)

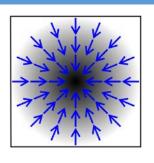
#### Constraints for...

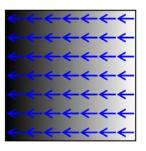
- 1. Typing geodatasets and tools
- Posing spatial questions
- Finding answers with GIS workflows



## Spatial core concepts ctd.

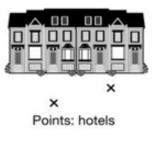
Field





- continuous phenomenon
- Space -> Quality (value field)
- boundaries are irrelevant

Object







- discrete phenomenon with qualities
- Object -> Space (projected in space, not time)
- boundaries are relevant
- Object -> Quality (are not self-similar)

Event

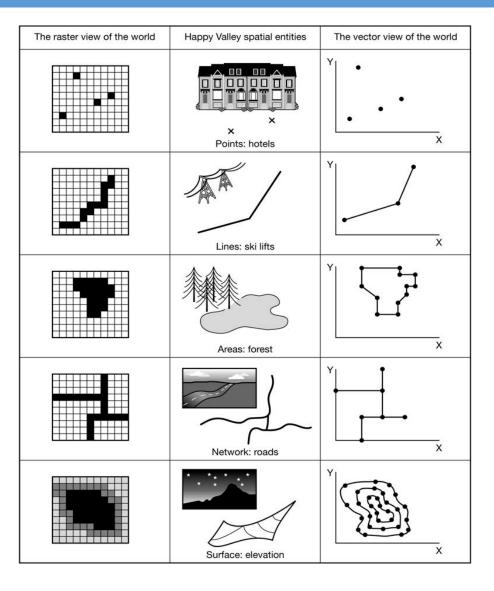




- like objects, but...
- Event -> Time, Space (projected in time and space)

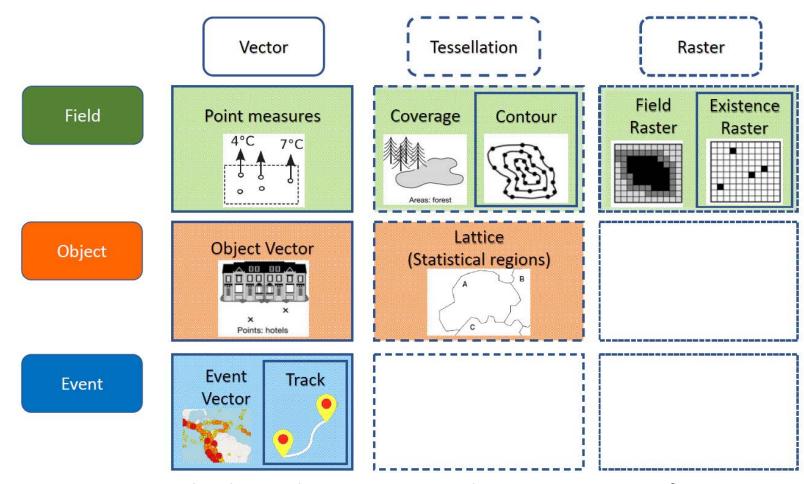
(Galton 2004, Scheider et al 2019)

## 1) Typing geodatasets using core concepts



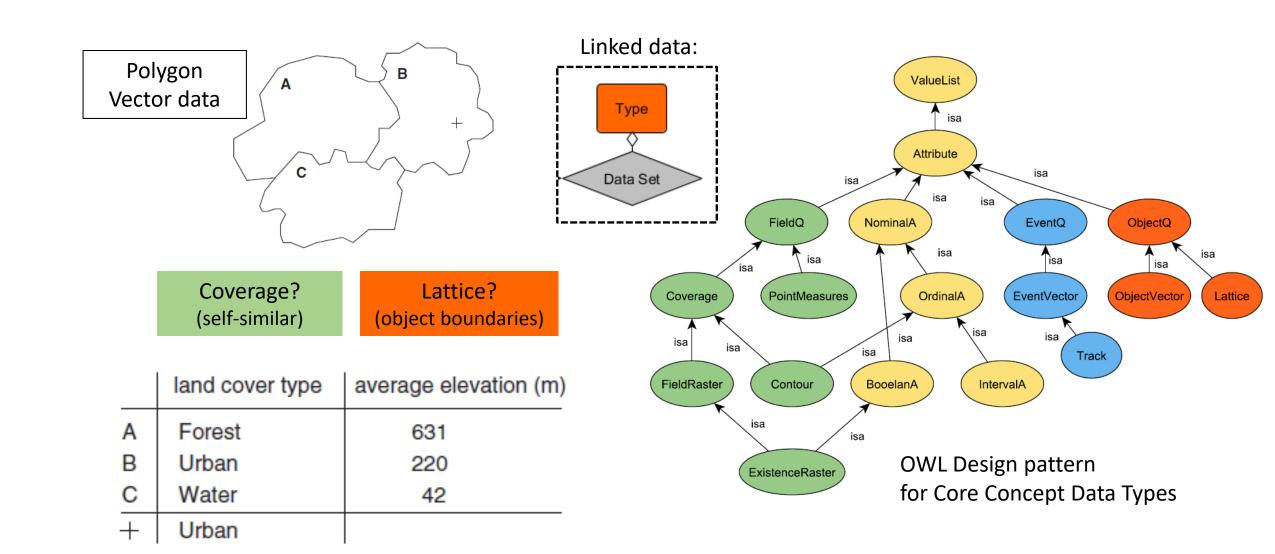
Spatial data types ≠ Core Concepts!

## 1) Typing geodatasets using core concepts

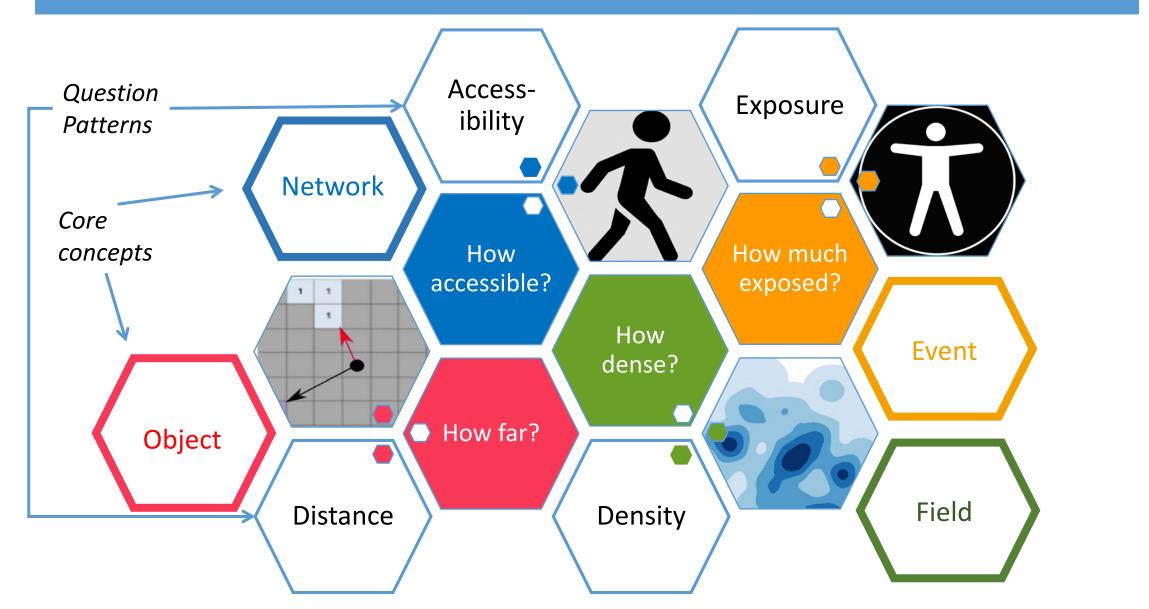


Scheider et al 2019: Semantic data type signatures for representing spatial core concepts in GIS operations on spatial layers

## 1) Typing geodatasets using core concepts



## 2) Posing spatial questions using core concepts



## 2) Posing spatial questions using core concepts

Question patterns correspond to core concept data types:

"Which trees exist in New York?"

QuestionPattern: "Which [ObjectVector]s exist in [Place]?"

Semantic Query:

## 2) Posing spatial questions using core concepts

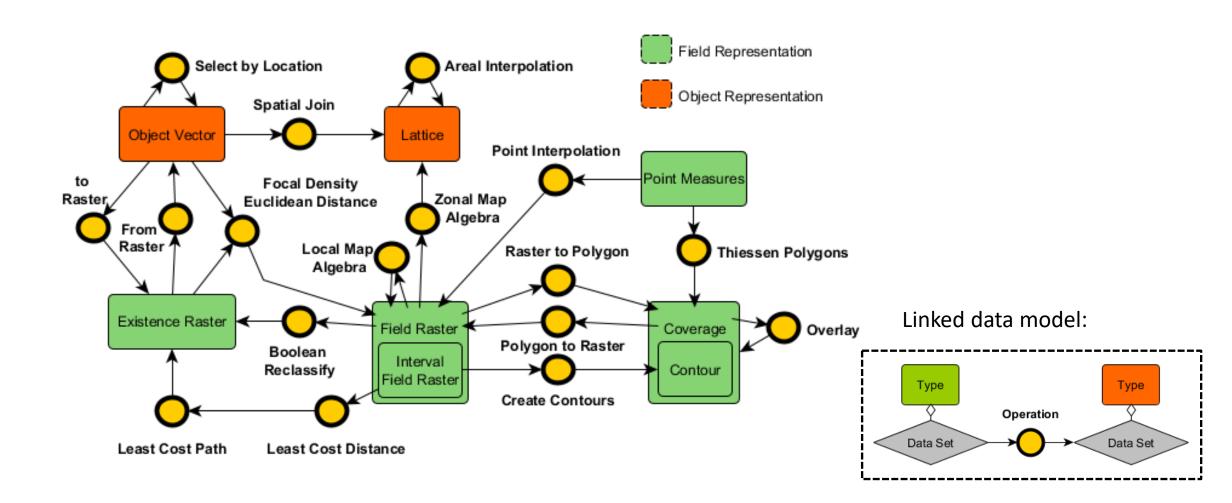
Question patterns correspond to core concept data types:

"How dense/far is green around/from Tom?"

QuestionPattern: "How [FieldRaster] is [DataSet] around [ObjectVector]?"

## 3) Finding answers using core concepts

Using Core Concept Data Types as operation signatures (ArcGIS):



## 3) Finding answers using core concepts



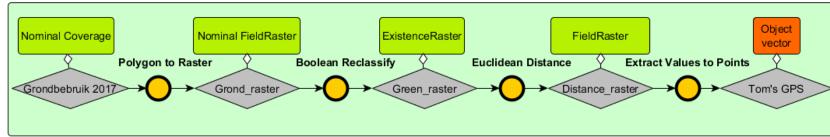
"How dense is green around Tom?"



**Automated Workflow Composition (Lamprecht 2013)** 



"How far is green from Tom?"



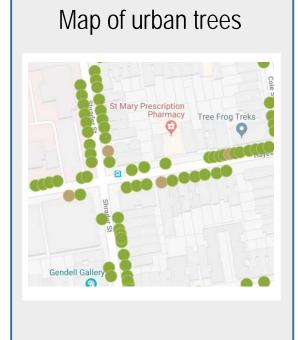


## 3) Finding answers using core concepts

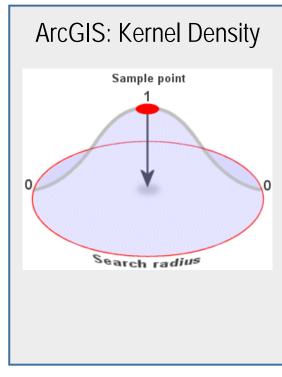


#### 

#### **ANSWER** Possible answer resources:



"Given this layer of trees,



how densely located are trees around Tom?"

### Project outcomes



## future opportunities

Theory of spatial questions used in spatial sciences



Core concepts of spatial information theory

Technology that makes spatial questions machine-readable



Natural ("Alexa") interfaces for data science

Web tool repository for registering/ requesting tools and data



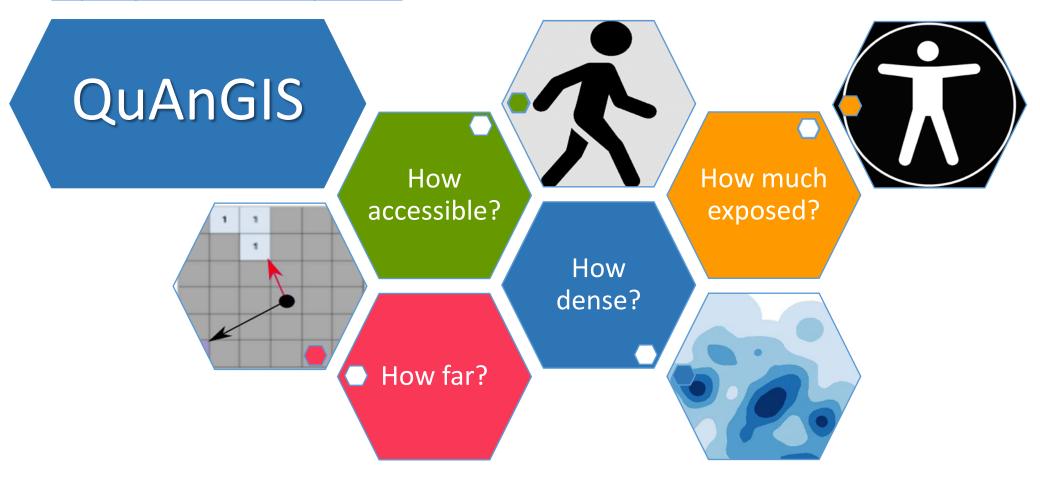
Integrated Web repositories (tools + data)

Standard geoanalytic tools (ArcGIS, QGIS, R) *packaged* with standard Web data sources (OSM, Kadaster and CBS)



Boost GIS technology through data sciences

#### https://questionbasedanalysis.com/



### References

- Werner Kuhn 2012: Core concepts of spatial information for transdisciplinary research. International Journal of Geographical Information Science, 26(12):2267–2276.
- Behzad Vahedi, Werner Kuhn, and Andrea Ballatore 2016. Question-based spatial computing. A case study. In Geospatial Data in a Changing World, pages 37–50. Springer,
- Ballatore, A., Scheider, S. and Lemmens, R., 2018: Patterns of consumption and connectedness in GIS web sources. In *The Annual International Conference on Geographic Information Science* (pp. 129-148). Springer
- Song Gao and Michael Goodchild 2013: Asking spatial questions to identify GIS functionality. In 2013 Fourth International Conference on Computing for Geospatial Research and Application
- Anna-Lena Lamprecht 2013: User-Level Workflow Design: A Bioinformatics Perspective, volume 405 8311. Springer
- Antony Galton 2004: Fields and objects in space, time, and space-time. Spatial cognition and computation, 4(1):39–68
- Dennis Diefenbach, Vanessa Lopez, Kamal Singh, and Pierre Maret 2010. Core techniques of question answering systems over knowledge bases: a survey. Knowledge and Information systems, 55(3):529–569
- Junwei Bao, Nan Duan, Ming Zhou, and Tiejun Zhao 2014: Knowledge-based question answering as machine translation. In Proceedings of the 52nd Annual Meeting of the Association for Computational Linguistics
- <u>Simon Scheider et al 2019: Semantic data type signatures for representing spatial core concepts in GIS operations</u> on spatial layers