

CSC 481: The Semantic Web

**Based on Chapter 1 of “Semantic Web for the Working Ontologist
- Modeling in RDF, RDFS and OWL” by Allenmag and Handler**

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Recap of course so far

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- **Reasoning** can be used to produce new representations of knowledge
 - Can be thought of as manipulation of symbols in a language

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- **Inference Rules** such as resolution let us design algorithms to produce new symbols that represent sentences entailed by a KB
 - Horn Clauses are a subset of FOL with efficient inference algorithms

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- *Ontological commitment*: world consists of facts about objects and their relationships
- Applications (e.g. Prolog) often operate under the *closed world assumption and unique name assumption*
 - Facts we cannot prove are considered false
 - Differently named entities are assumed to be different objects

Should you represent everything with FOL?

- No difference between *types*, *roles* and *attributes* of objects
 - ▶ All represented by predicates: $\text{person}(\text{Bob})$, $\text{baker}(\text{Bob})$, $\text{hungry}(\text{Bob})$
- Terminological facts can be handled by implication but don't have a dedicated representation
 - ▶ A statement like $\text{dog}(x) \rightarrow \text{animal}(x)$ has no “special status”
- Best suited for applications with a single source of truth
 - ▶ Hard to reason about conflicting statements e.g. the IAU does not consider Pluto a planet, astrologists do.
- Also hard to reason about probabilities, degrees of belief, temporal beliefs, etc.

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- **Situation calculus** (ch. 14)
 - Focus on beliefs about a changing world

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- As we'll see, many of these lend themselves naturally to **graph** representations (knowledge graphs).

What's next?



Semantic Web

Goals

Semantic Web Goals

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I have a dream for the Web [in which computers] become capable of analyzing all the data on the Web – the content, links, and transactions between people and computers. A "Semantic Web", which makes this possible, has yet to emerge, but when it does, the day-to-day mechanisms of trade, bureaucracy and our daily lives will be handled by machines talking to machines. The "[intelligent agents](#)" people have touted for ages will finally materialize.^[9]

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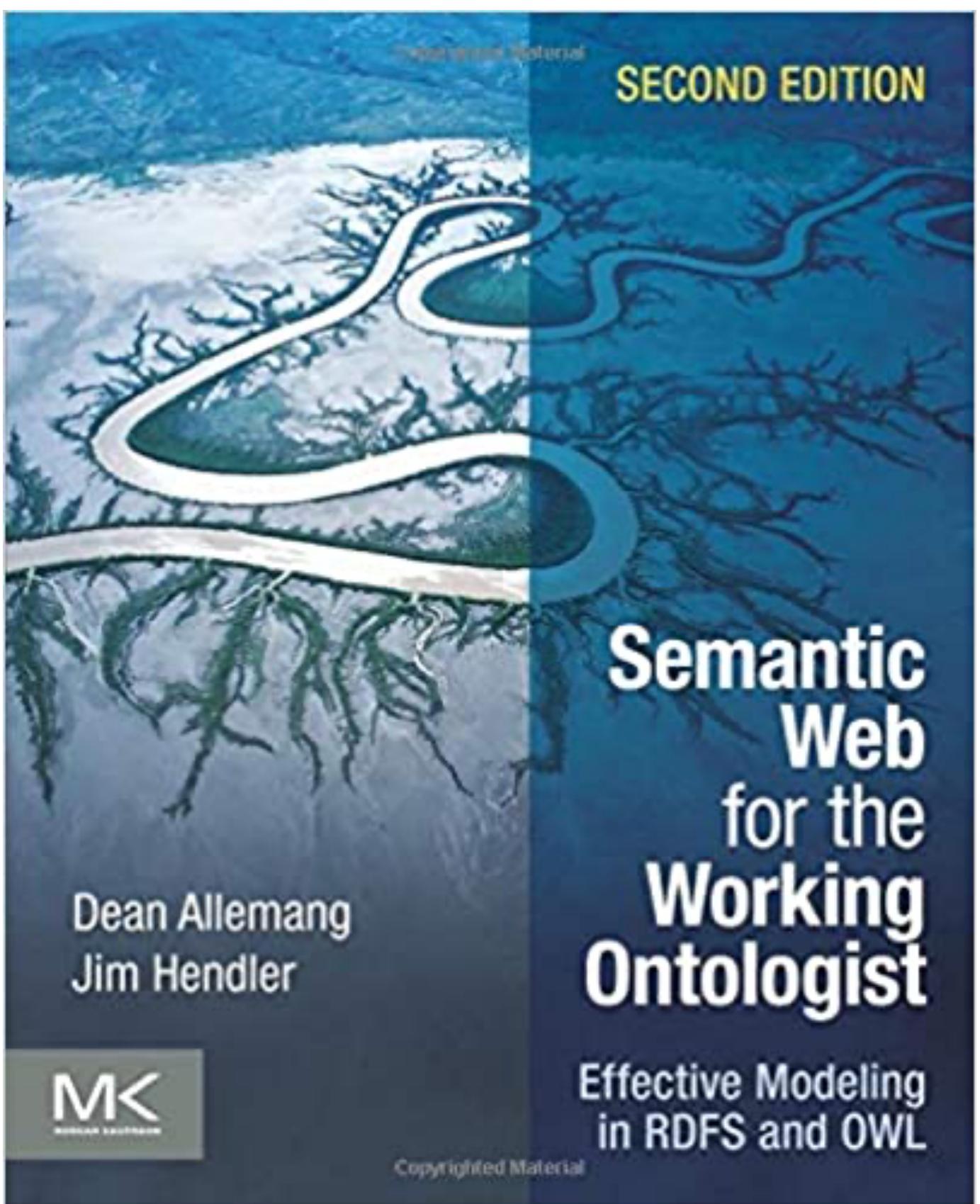
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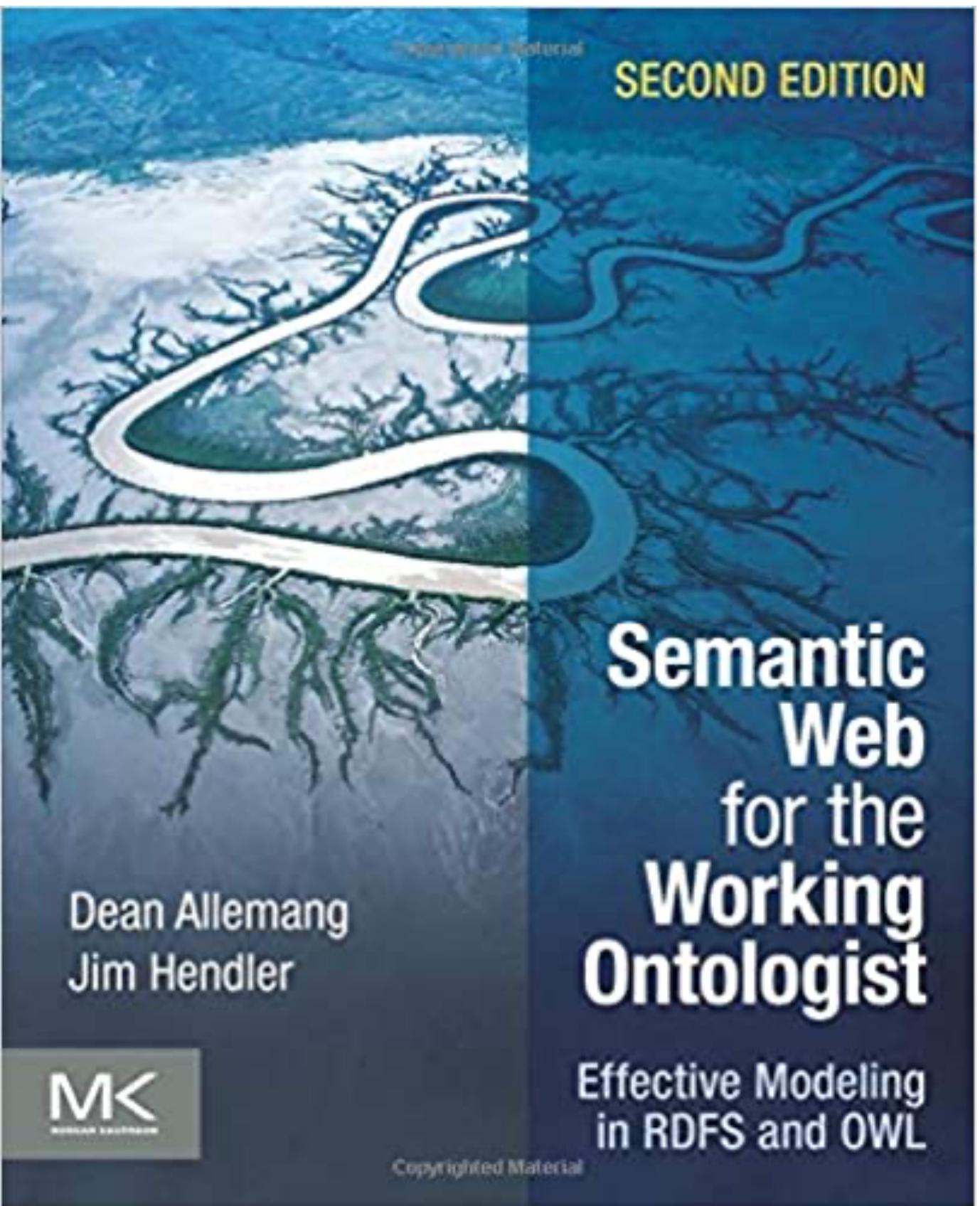
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- Main theme: data on the web was (or is) optimized for human readability
 - We need to make it more machine-readable

Semantic Web Textbook

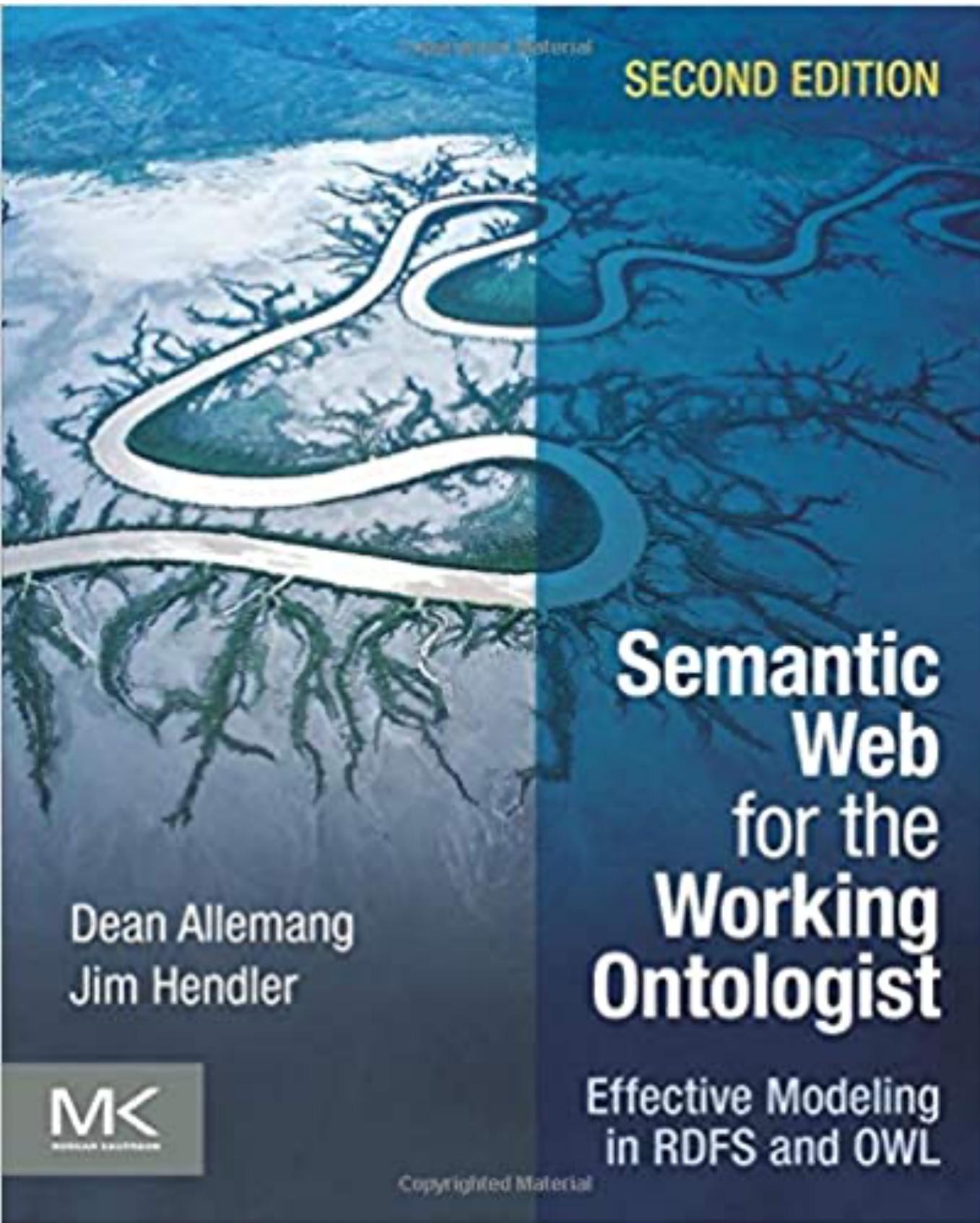


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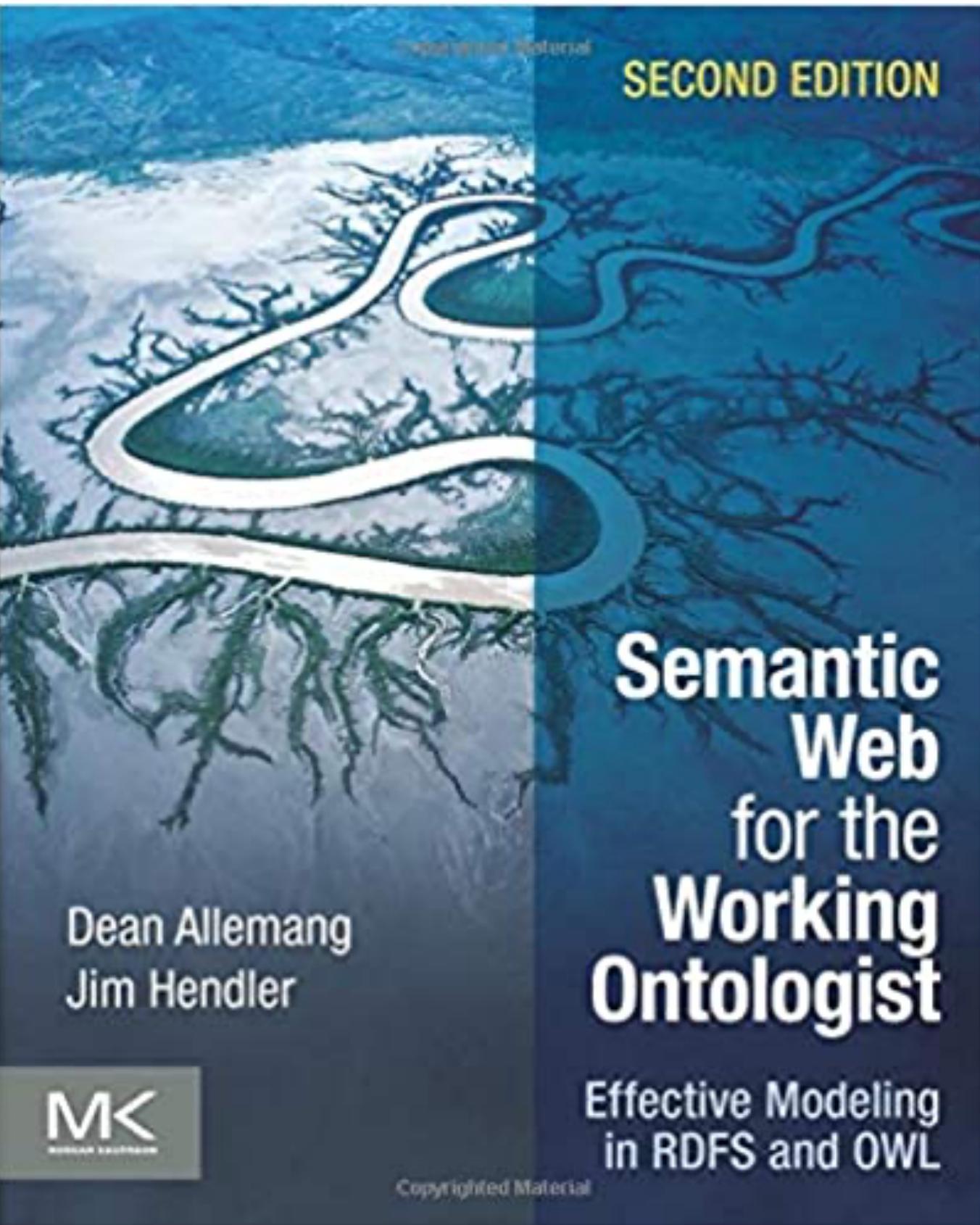
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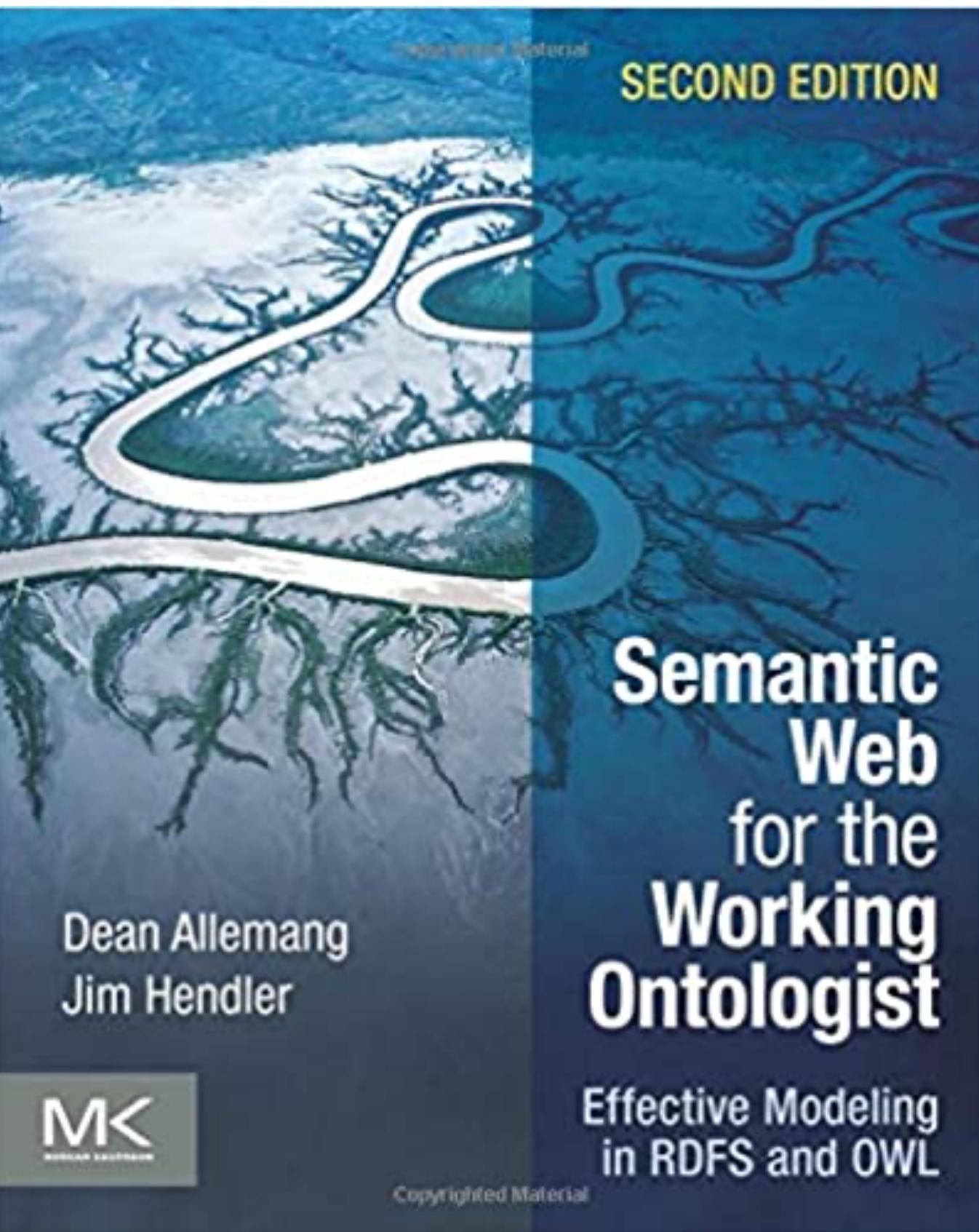
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- Information that has been typically presented in a human-readable way now needs to be machine-readable as well.

Semantic Web

Motivating examples

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Example 1

Semantic Web

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- A hotel chain (Mongotel) has a list of branches in its website.

Semantic Web

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Semantic Web

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- One of these branches is near a certain park
- The park also lists nearby hotels in its website
- But the Mongotel branch is not listed on the park's website!

Semantic Web

Motivating examples

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Example 2

Semantic Web

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- A trip-planning site lists all hotels in a city and their addresses

Semantic Web

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- A trip-planning site lists all hotels in a city and their addresses
- A geolocation website finds the shortest path from any two addresses

Semantic Web

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- A trip-planning site lists all hotels in a city and their addresses
- A geolocation website finds the shortest path from any two addresses
- But a user who wants the closest hotel to a point of interest has to copy-paste a lot of addresses to find which is closest to the target!

Semantic Web

Motivating examples

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Example 3

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Semantic Web

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- The IAU changed Pluto's standing in 2006 from “planet” to “dwarf planet”
- On the webpage of Pluto, the “category” field says “dwarf planet”
- But Pluto still appears on the main page as a planet !

Semantic Web

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Example 4 (not in book)

Semantic Web

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- I can also easily find a list of cities that have hosted the Olympics
- But there's no easy way for me to find a city that has hosted both!

Group exercise

Discuss in groups

- What makes each of these examples “dumb”?
- How would you go about solving them?
 - You can start simple, by assuming for example all the data is maintained by a single actor, then consider more complicated scenarios
- What are potential complications?

The four examples:

1. Hotel lists itself as close to park, but park doesn't list them
2. Copy-pasting required to use data from one application (hotel search) into another (geolocation)
3. Pluto categorized as a dwarf planet in its page, but as regular planet in the “planets of the solar system” page
4. How to find cities that have hosted both a FIFA finals and an Olympics?

Results of discussion

- Some queries may be too specific to be specifically supported
- Data may be represented differently
- How to know that two different sources are talking about the same thing?
- Conflicting information: who to trust?
 - Sometimes we might want to aggregate, sometimes we might want to trust a single source
- Any website may either define a concept or refer to another source of truth for that concept
- Security concerns, one point of failure

Applications vs infrastructure

- The Web is “dumb” in the sense that data are inconsistent, out of synch, disconnected.
- Given the right data, it’s not too hard to write a “smart” application to solve any of these problems.
- The hard part is how to get the data in the first place!
- *“What can the Web infrastructure provide to improve the consistency and availability of Web data?”*
- *“Infrastructure is something that one would rather buy than build”*
- Adoption of Semantic Web standards and advancements in Natural Language Processing (NLP) already help build applications with the desired properties
 - But it’s important to understand how!

Semantic data

Local database approach

An initial solution to some of these examples (1,3,4) would be to back data in a database

- Pages are the result of queries to the DB rather than display static content
- If data changes, page is automatically updated (preserves consistency)
- However, doesn't work well if different entities control different parts of the data (example 1)

Semantic data

Another approach would be to write a program to keep data from various sources updated

- Requires custom code for each linkage of data
- Data linked at the level of pages
- Changes in one source may affect applications used by other sources
- Still requires some coordination

Network Effect

But who will be tasked with converting all this data to RDF?

- Little incentive at the beginning (why do it if no one is consuming the info?)
- The more applications convert, the higher the incentive
- Same network effect that drove the original Web

Non-Unique naming

- Different sources may disagree on the properties of a real world object
- Or they may call the same object by different names
 - “Pluto as viewed by the IAU” is a different notion than “Pluto as viewed by astrologists”
 - Pluto is also known by different names (e.g. plu134340)

Fundamental concepts

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Core technologies

- **RDF - Resource Description Framework.** Models data as triplets (subject, predicate, object)
- **RDFS - RDF Schema language.** Enhances RDF with notions of classes, subclasses and properties.
- **OWL - Web Ontology Language.** adds more vocabulary for describing properties and classes (e.g. disjointness, cardinality, symmetry of properties...)
 - Related to Description Logics (ch. 9 of the Brachman & Levesque book)