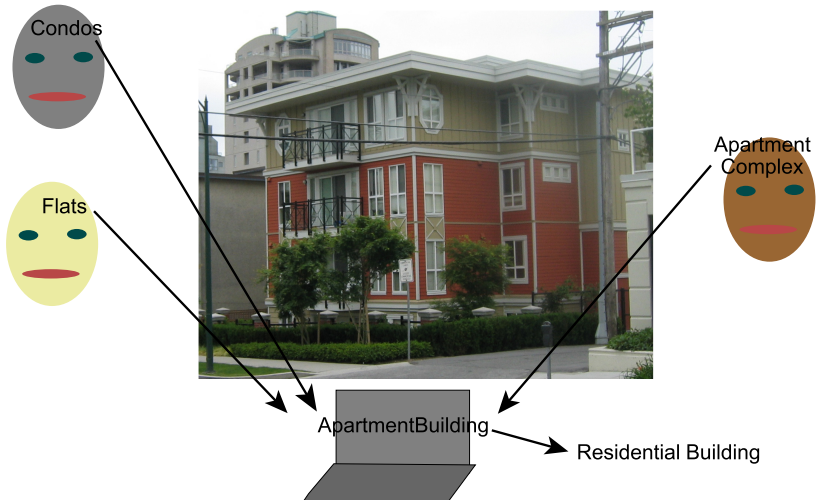


Building large knowledge repositories:

- Knowledge often comes from multiple sources.
- Fields have their own terminology and division of the world.
- Systems evolve over time and it is difficult to anticipate all future distinctions that should be made.
- Designers must agree on what individuals, classes and relationships to represent. The world is not divided into individuals.
- It is often difficult to remember what notation means:
  - ▶ Given a symbol used in the computer, what does it mean?
  - ▶ Given a concept in someone's mind, what symbol to use?
    - ▶ Has the concept already been defined?
    - ▶ If already defined, what symbol has been used for it?
    - ▶ If not already defined, what can it be defined in terms of?

- A **conceptualization** is a map from the problem domain into the representation. A conceptualization specifies:
  - ▶ What sorts of individuals are being modeled
  - ▶ The vocabulary for specifying individuals, relations and properties
  - ▶ The meaning or intention of the vocabulary
- If more than one person is building a knowledge base, they must be able to share the conceptualization.  
→ challenge: inter-operability of separately designed knowledge bases.
- An **ontology** is a specification of a conceptualization. An ontology specifies the meanings of the symbols in an information system.

# Mapping from a conceptualization to a symbol



- Ontologies are published on the web in machine readable form.
- Builders of knowledge bases or web sites adhere to and refer to a published ontology:
  - ▶ A symbol defined by an ontology means the same thing across web sites that obey the ontology.
  - ▶ If someone wants to refer to something not defined, they publish an ontology defining the terminology. Others adopt the terminology by referring to the new ontology. In this way, ontologies evolve.
  - ▶ Separately developed ontologies can have mappings between them published.

# Challenges of building ontologies

- They can be huge: finding the appropriate terminology for a concept may be difficult.
- How one divides the world can depend on the application. Different ontologies describe the world in different ways.
- People can fundamentally disagree about an appropriate structure.
- Different knowledge bases can use different ontologies.
- To allow KBs based on different ontologies to inter-operate, there must be mapping between ontologies.
- It has to be in user's interests to use an ontology.
- The computer doesn't understand the meaning of the symbols. The formalism can constrain the meaning, but can't define it.

- **RDF** the Resource Description Framework is a language of triples, including the property `rdf:type` and containers (bags, lists, etc)
- **RDF-S** RDF Schema is RDF plus the class: `rdfs:Class`, and properties: `rdfs:domain`, `rdfs:range`, `rdfs:subClassOf`, `rdfs:subPropertyOf`, ...
- Lots of alternative syntaxes: XML, Turtle, N-Triples, Json ...
- **OWL** the Web Ontology Language, defines some primitive properties that can be used to define terminology. (Uses multiple alternative syntaxes).

# Main Components of an Ontology

- **Individuals** the things / objects in the world (not usually specified as part of the ontology)
- **Classes** sets of individuals
- **Properties** between individuals and their values

# Individuals

- Individuals are things in the world that can be named.  
(Concrete, abstract, concepts, reified).
- Unique names assumption (UNA): different names refer to different individuals.
- OWL does *not* adopt the unique names assumption.
- The UNA is not an assumption you can universally make:  
“Lewis Carroll”, “Charles Lutwidge Dodgson”, “the author of Alice’s Adventures in Wonderland” etc.
- Without the determining equality, we can’t count!  
Joe’s mother was in the room. Sam’s cousin was there.  
Chris’s football coach was there. How many people were in the room?
- Using OWL:  
 $(i_1, \text{'owl:SameIndividual'}, i_2)$   
 $(i_1, \text{'owl:DifferentIndividuals'}, i_3)$



- A class is a set of individuals. E.g., house, building, officeBuilding
- One class can be a subclass of another
  - `rdfs:SubClassOf(house, building)`
  - `rdfs:SubClassOf(officeBuilding, building)`
- The most general class is owl:Thing.
- Classes can be declared to be the same or to be disjoint:
  - `owl:EquivalentClasses(house, singleFamilyDwelling)`
  - `owl:DisjointClasses(house, officeBuilding)`
- Different classes are not necessarily disjoint.  
E.g., a building can be both a commercial building and a residential building.

# Example Concepts in an Ontology

The following are some of the concepts in an ontology for documents.

<http://www.cs.umd.edu/projects/plus/DAML/onts/docmnt1.0.daml>

homepage	correspondence	publication
letter	periodical	article
book	email	magazine
journal	document	communication
workshopPaper	journalPaper	discussion
newspaper	PersonalHomepage	speech

- A property is between an individual and a value.
- A property has a domain and a range.

`rdfs:domain(livesIn, person)`

`rdfs:range(livesIn, placeOfResidence)`

- An *ObjectProperty* is a property whose range is an individual.
- A *DatatypeProperty* is one whose range isn't an individual, e.g., is a number or string.
- There can also be property hierarchies:

`rdfs:subPropertyOf(livesIn, enclosure)`

`rdfs:subPropertyOf(principalResidence, livesIn)`

# Clicker Question

Suppose we are given the following triple as true:

```
years_eligibility 'rdfs:domain' student.  
sam years_eligibility 3).
```

Which of the following can we infer

- A Sam is a student
- B Sam could a student (but maybe isn't)
- C All students have value 3 for years\_eligibility
- D We can infer nothing about whether Sam is a student

# Clicker Question

Suppose we are given the following triples as true:

`years_eligibility 'rdfs:domain' student.`

`years_eligibility 'rdfs:domain' athlete.`

`sam years_eligibility 3.`

Which of the following is true

- A Sam is both a student and an athlete.
- B Sam could be either student or an athlete.
- C We can infer nothing about whether Sam is an athlete or a student
- D There are no student athletes.
- E The facts are inconsistent, and couldn't possibly all be true

# Properties (Cont.)

- One property can be inverse of another  
owl:InverseObjectProperties(*livesIn*, *hasResident*)
- Properties can be declared to be transitive, symmetric, functional, or inverse-functional.  
(Which of these are only applicable to object properties?)
- We can also state the minimum and maximal cardinality of a property.

owl:minCardinality(*principalResidence*, 1)

owl:maxCardinality(*principalResidence*, 1)

# Property and Class Restrictions

- We can define complex descriptions of classes in terms of restrictions of other classes and properties.  
E.g., A homeowner is a person who owns a house.

$$homeOwner \subseteq person \cap \{x : \exists h \in house \text{ such that } x \text{ owns } h\}$$

owl:subClassOf(homeOwner, person)

owl:subClassOf(*homeOwner*,  
owl:ObjectSomeValuesFrom(*owns*, *house*))

# OWL Class Constructors

owl:Thing  $\equiv$  all individuals

owl:Nothing  $\equiv$  no individuals

owl:ObjectIntersectionOf( $C_1, \dots, C_k$ )  $\equiv C_1 \cap \dots \cap C_k$

owl:ObjectUnionOf( $C_1, \dots, C_k$ )  $\equiv C_1 \cup \dots \cup C_k$

owl:ObjectComplementOf( $C$ )  $\equiv \text{Thing} \setminus C$

owl:ObjectOneOf( $I_1, \dots, I_k$ )  $\equiv \{I_1, \dots, I_k\}$

owl:ObjectHasValue( $P, I$ )  $\equiv \{x : x P I\}$

owl:ObjectAllValuesFrom( $P, C$ )  $\equiv \{x : x P y \rightarrow y \in C\}$

owl:ObjectSomeValuesFrom( $P, C$ )  $\equiv$   
 $\{x : \exists y \in C \text{ such that } x P y\}$

owl:ObjectMinCardinality( $n, P, C$ )  $\equiv$   
 $\{x : \#\{y | x P y \text{ and } y \in C\} \geq n\}$

owl:ObjectMaxCardinality( $n, P, C$ )  $\equiv$   
 $\{x : \#\{y | x P y \text{ and } y \in C\} \leq n\}$



# OWL Predicates

$\text{rdf:type}(I, C) \equiv I \in C$

$\text{rdfs:subClassOf}(C_1, C_2) \equiv C_1 \subseteq C_2$

$\text{owl:EquivalentClasses}(C_1, C_2) \equiv C_1 \equiv C_2$

$\text{owl:DisjointClasses}(C_1, C_2) \equiv C_1 \cap C_2 = \{\}$

$\text{rdfs:domain}(P, C) \equiv \text{if } xPy \text{ then } x \in C$

$\text{rdfs:range}(P, C) \equiv \text{if } xPy \text{ then } y \in C$

$\text{rdfs:subPropertyOf}(P_1, P_2) \equiv xP_1y \text{ implies } xP_2y$

$\text{owl:EquivalentObjectProperties}(P_1, P_2) \equiv xP_1y \text{ if and only if } xP_2y$

$\text{owl:DisjointObjectProperties}(P_1, P_2) \equiv xP_1y \text{ implies not } xP_2y$

$\text{owl:InverseObjectProperties}(P_1, P_2) \equiv xP_1y \text{ if and only if } yP_2x$

$\text{owl:SameIndividual}(I_1, \dots, I_n) \equiv \forall j \forall k I_j = I_k$

$\text{owl:DifferentIndividuals}(I_1, \dots, I_n) \equiv \forall j \forall k j \neq k \text{ implies } I_j \neq I_k$

$\text{owl:FunctionalObjectProperty}(P) \equiv \text{if } xPy_1 \text{ and } xPy_2 \text{ then } y_1 = y_2$

$\text{owl:InverseFunctionalObjectProperty}(P) \equiv$

$\text{if } x_1Py \text{ and } x_2Py \text{ then } x_1 = x_2$

$\text{owl:TransitiveObjectProperty}(P) \equiv \text{if } xPy \text{ and } yPz \text{ then } xPz$

$\text{owl:SymmetricObjectProperty} \equiv \text{if } xPy \text{ then } yPx$

- One ontology typically imports and builds on other ontologies.
- OWL provides facilities for version control.
- Tools for mapping one ontology to another allow inter-operation of different knowledge bases.
- The semantic web promises to allow two pieces of information to be combined if
  - ▶ they both adhere to an ontology
  - ▶ these are the same ontology or there is a mapping between them.

## Example: Apartment Building

An apartment building is a residential building with more than two units and they are rented.

```
Declaration(ObjectProperty(:numberOfunits))
FunctionalObjectProperty(:numberOfunits)
ObjectPropertyDomain(:numberOfunits :ResidentialBuilding)
ObjectPropertyRange(:numberOfunits
                    ObjectOneOf(:two :one :moreThanTwo))
```

```
Declaration(Class(:ApartmentBuilding))
EquivalentClasses(:ApartmentBuilding
    ObjectIntersectionOf(
        :ResidentialBuilding
        ObjectHasValue(:numberOfunits :moreThanTwo)
        ObjectHasValue(:ownership :rental)))
```

# Example: hotel ontology

Define the following:

- Room
- BathRoom
- StandardRoom - what is rented as a room in a hotel
- Suite
- RoomOnly
- Hotel
- HasForRent
- AllSuitesHotel
- NoSuitesHotel
- HasSuitesHotel

## A top-level ontology

- provides a definition of *everything* at a very abstract level.
- provides a useful categorization on which to base other ontologies.
- facilitates the integration of domain ontologies.

At the top is **entity**. OWL calls the top of the hierarchy **thing**. Essentially, everything is an entity.

# Concrete or abstract

- Physical objects and events are **concrete**.  
E.g., A person, a lecture, the sending of an email.
- Mathematic objects and times are **abstract**.  
E.g., 17, set of all mammals on Earth, an email, a course

# Continuants vs Occurrents

- A **continuant** exists in an instance of time and maintains its identity through time.  
Examples: person, a finger, a country, a smile, the smell of a flower, an email, Newtonian mechanics
- An **occurrent** has temporal parts.  
Examples: a life, a holiday, smiling, the opening of a flower, sending an email, earthquake
- Continuants participate in occurrents.
- a person, a life, a finger, infancy: what is part of what?

Alternative: a four-dimensional or **perdurant** view where objects exist in the space-time.

- A person is a trajectory through space and time
- At any time, a person is a snapshot of the four-dimensional trajectory.

# Dependent or independent

- An **independent continuant** is something that can exist by itself or is part of another entity.  
For example, a person, a face, a pen, a flower, a country, and the atmosphere are independent continuants.
- A **dependent continuant** only exists by virtue of another entity and is not a part of that entity.  
For example, a smile, the ability to laugh, the inside of your mouth, the ownership relation between a person and a phone
- An occurrent dependent on an entity is a **process** or an **event**.
- A **process** happens over time, has temporal parts, and depends on a continuant.  
For example: a holiday, writing an email, and a robot cleaning the lab are all processes.
- An **event** is something that happens at an instant, and is often a process boundary.  
For example, the end of a lecture, the first goal in the 2022 FIFA World Cup final.



- The **provenance** of data or **data lineage** specifies where the data came from and how it was manipulated
- Provenance is typically recorded as **metadata** – data about the data – including:
  - ▶ Who collected each piece of data? What are their credentials?
  - ▶ Who transcribed the information?
  - ▶ What was the protocol used to collect the data? Was the data chosen at random or chosen because it was interesting or some other reason?
  - ▶ What were the controls? What was manipulated, when?
  - ▶ What sensors were used? What is their reliability and operating range?
  - ▶ What processing has been done to the data?

FAIR principles for data:

- *Findable* – the (meta)data uses unique persistent identifiers, such as IRIs.
- *Accessible* – the data is available using free and open protocols, and the metadata is accessible even when the data is not.
- *Interoperable* – the vocabulary is defined using formal knowledge representation languages (ontologies).
- *Reusable* – the data uses rich metadata, including provenance, and an appropriate open license, so that the community can use the data.

- <https://schema.org>
- SNOMED CT for medicine:  
<https://www.snomed.org/five-step-briefing> or  
<https://browser.ihtsdotools.org/>
- <http://obofoundry.org>
- <https://www.springernature.com/gp/open-research/open-data>