

- Is there a flexible way to represent relations?
- How can knowledge bases be made to interoperate semantically?

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$prop(Individual, Property, Value)$ is the only relation needed:
called **individual-property-value representation**
or **triple representation**

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- $prop(a, type, parcel)$, where *type* is a special property
- $prop(a, parcel, true)$, where *parcel* is a Boolean property

- To represent *scheduled(cs422, 2, 1030, cc208)*. “section 2 of course *cs422* is scheduled at 10:30 in room *cc208*.”

- To represent *scheduled(cs422, 2, 1030, cc208)*. “section 2 of course *cs422* is scheduled at 10:30 in room *cc208*.”
- Let *b123* name the booking:
 - prop(b123, course, cs422)*.
 - prop(b123, section, 2)*.
 - prop(b123, time, 1030)*.
 - prop(b123, room, cc208)*.
- We have **reified** the booking.
- Reify means: to make into an individual.
- What if we want to add the year?

Semantic Networks / Knowledge Graphs

When you only have one relation, *prop*, it can be omitted without loss of information.

Logic:

$prop(Individual, Property, Value)$

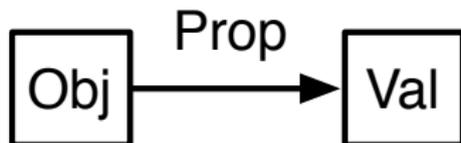
triple:

$\langle Individual, Property, Value \rangle$

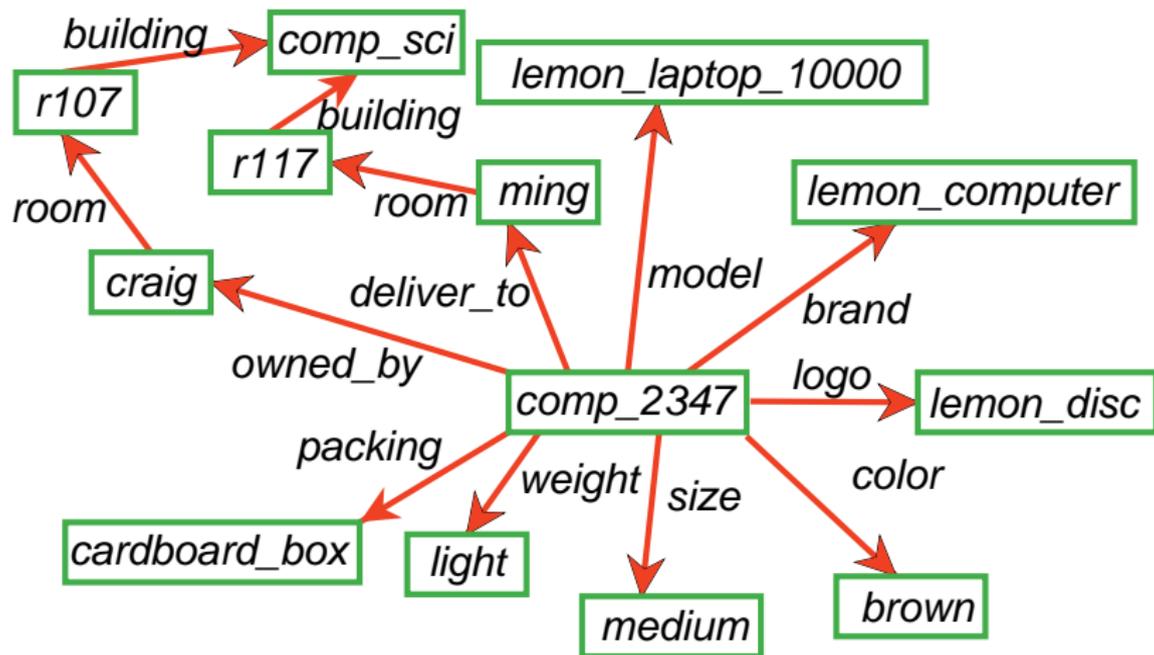
simple sentence:

Individual Property Value.

graphically:



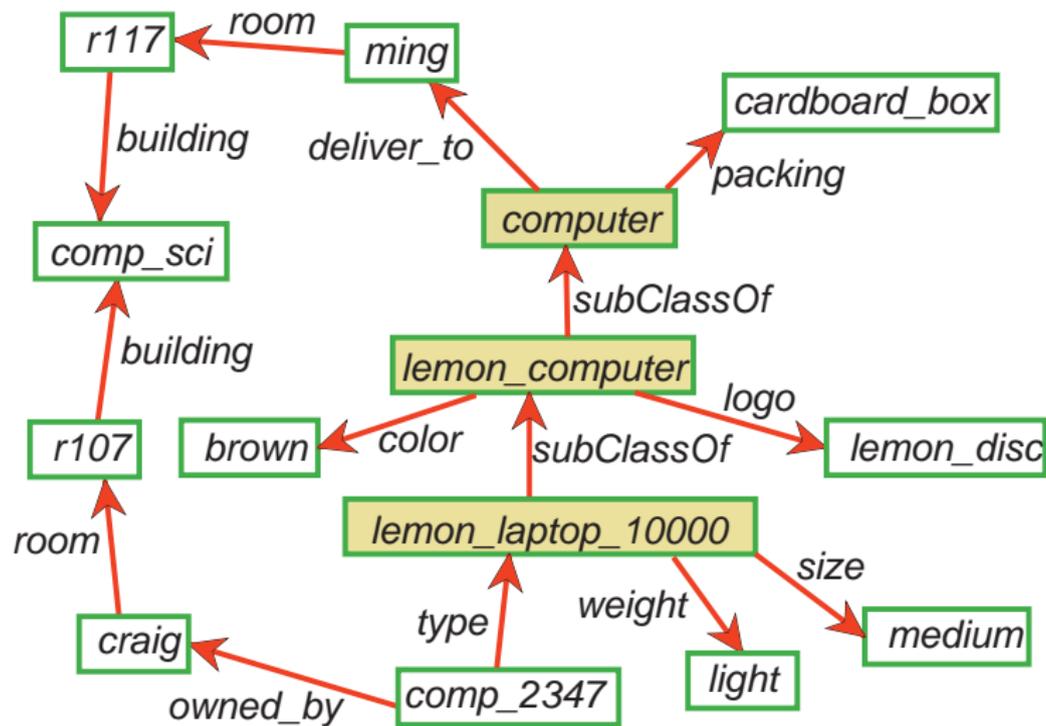
An Example Semantic Network / Knowledge Graph



Equivalent Logic Program

```
prop(comp_2347, owned_by, craig).  
prop(comp_2347, deliver_to, ming).  
prop(comp_2347, model, lemon_laptop_10000).  
prop(comp_2347, brand, lemon_computer).  
prop(comp_2347, logo, lemon_disc).  
prop(comp_2347, color, brown).  
prop(craig, room, r107).  
prop(r107, building, comp_sci).  
  
⋮
```

A Structured Semantic Network / Knowledge Graph



An arc $c \xrightarrow{p} v$ from a class c with a property p to value v means every individual in the class has value v on property p :

$$\begin{aligned} \text{prop}(\text{Obj}, p, v) \leftarrow \\ \text{prop}(\text{Obj}, \text{type}, c). \end{aligned}$$

Example:

$$\begin{aligned} \text{prop}(X, \text{weight}, \text{light}) \leftarrow \\ \text{prop}(X, \text{type}, \text{lemon_laptop_10000}). \\ \text{prop}(X, \text{packing}, \text{cardboard_box}) \leftarrow \\ \text{prop}(X, \text{type}, \text{computer}). \end{aligned}$$

You can do inheritance through the subclass relationship:

$$\begin{aligned} \text{prop}(X, \text{type}, T) \leftarrow \\ \text{prop}(S, \text{subClassOf}, T) \wedge \\ \text{prop}(X, \text{type}, S). \end{aligned}$$

Multiple Inheritance

- An individual is usually a member of more than one class. For example, the same person may be a wine expert, a teacher, a football coach,
- The individual can inherit the properties of all of the classes it is a member of: **multiple inheritance**.
- With default values, what is an individual inherits conflicting defaults from the different classes? **multiple inheritance problem**.

Choosing Primitive and Derived Properties

- Associate an property value with the most general class with that property value.
- Don't associate contingent properties of a class with the class. For example, if all of current computers just happen to be brown.