- A primitive atom is an atom that is defined using facts.
- A derived atom is an atom that is defined using rules.
- Typically, the designer writes axioms for the derived atoms and then expects a user to specify which primitive atoms are true.

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- What if the world changes to make a no longer true?
   What happens to b?

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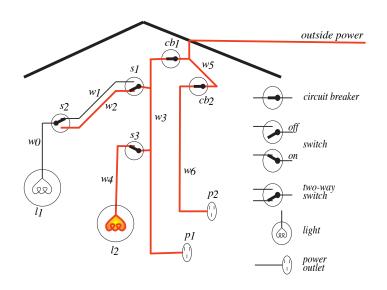
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- If the model is manipulated to make an atom true or false, the clauses for that atom are replaced by the atomic fact or are removed.

3/6

### **Electrical Environment**





# Combining Evidential & Causal Reasoning

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is logically equivalent to

$$up\_s_1 \leftrightarrow (lit\_l_1 \leftrightarrow up\_s_2).$$

This formula is symmetric between the three propositions; it is true if and only if an even number of the propositions are false.



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  - Putting  $s_1$  down does not make  $s_2$  go down to preserve  $lit_-l_1$ .
  - Putting  $s_1$  down makes  $lit_l_1$  false, and  $up_s_2$  remains true.



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$$up_{-}s_{1}$$

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## Structural causal model as logic program

• Structural causal model:

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• As a logic program using negation as failure:

$$\begin{split} & \mathit{lit\_I_1} \leftarrow \mathit{up\_s_1} \land \mathit{up\_s_2}. \\ & \mathit{lit\_I_1} \leftarrow \sim \mathit{up\_s_1} \land \sim \mathit{up\_s_2}. \\ & \mathit{up\_s_1}. \end{split}$$

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An evidential model

$$up\_s_1 \leftarrow lit\_l_1 \land up\_s_2.$$
  
 $up\_s_1 \leftarrow \sim lit\_l_1 \land \sim up\_s_2$ 

can be used to answer questions about whether  $s_1$  is up based on the position of  $s_2$  and whether  $l_1$  is lit.

It does not accurately predict the effect of interventions.

