## Comments on MacLellan, Harpstead, Alevan, and Koedinger

- Multiple attribute and relation types (nominal, numeric, component, relational)
  - Can components include components as well as base attributes?
- The incremental (iterative) algorithm (again)
- Predicting missing attributes (again)
- The matching problem (next slides)
- Flattening

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Figure 2. A tower in RumbleBlocks, its representation as an instance in TRESTLE using the four attribute-

Relational (e.g., first-order) representations, such as:

IF R(?c1, ?r1)  $\Lambda$  R(?c2, ?r1)  $\Lambda$  R(?c3, ?r2)  $\Lambda$  R(?c4, ?r2)  $\Lambda$  R(?c5, ?r2)  $\Lambda \neq$ (?c1, ?c2)  $\Lambda \neq$ (?c3, ?c4)  $\Lambda \neq$ (?c3, ?c5)  $\Lambda \neq$ (?c4, ?c5)

#### **THEN** FullHouse(?c1, ?c2, ?c3, ?c4, ?c5)



The matching problem (on sets of feature vectors)

## Back to Trestle

- Is Trestle limited to a one-to-one matching of components?
- How would Trestle handle towers of different heights (i.e., a different number of composite blocks)?
  - Are one or more components (e.g., blocks, cards) left unmatched?
  - Are one or more components double (multiply) matched (i.e., a many to one matching)
- How does Trestle's matching strategy compare to human matching strategies?

#### Fit to human behavior

- Compared Trestle end-results to human end-results
  - No comparisons on HOW these end-results results were obtained
    - e.g., no comparison of Trestle matching with human matching
  - Supervised: Just end-result accuracies
  - Supervised: No response time predictions
  - Unsupervised: only (two  $\rightarrow$ ) one human clustering for comparison
    - A lab colleague at that
- In addition to comparing human and Trestle behavior without functional knowledge,
  - Could functional knowledge be encoded into Trestle too?
  - Trestle would have to be extended to use background knowledge

- Categorization during problem solving (p. 131)
- Can ordering effects be exploited "how best to order practice problems" (p. 132)
- Supervised and unsupervised together (p. 132 ...)
- Aside: CFE converts parse trees to feature vectors (p. 134). Why not cluster parse trees directly?
  - Fisher and Yoo: "Categorization, Concept Learning, and Problem Solving: A Unifying View"

# Difficulties in understanding

- I (Doug) doesn't understand how CART was used (pp. 140-141)
  - and why it went unmentioned in discussion of the supervised learning results
  - Why was CART needed at all since CFE can do prediction (p. 134)?
- CFE insufficiently described