# On The Thresholds of **Knowledge** (Lenat & Feigenbaum, 1987)

#### What is this?



- Apt in many ways:
  - So much in the paper, so fast
  - Understanding needs much knowledge
  - We share this knowledge

# The Point

"We all know about electricity, but few of us have flown kites in thunderstorms."



3

# The Knowledge Principle

- Knowledge is Power
- A system exhibits intelligent understanding and action at a high level of competence primarily because of the specific knowledge it can bring to bear.

л

# Questions they Raise (and Answer)

- What is intelligence?
- Intelligence is in the eye of the (uninformed) beholder

5

- What is the well-formedness threshold?
- The mininal knowedge needed to formulate a problem

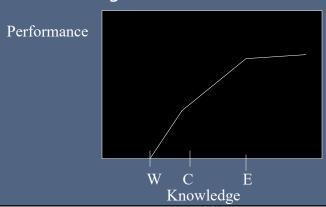
- What is the competence threshold?
- The minimal knowledge required to solve most problems the reasoner will encounter

7

# How Does the Value of Added Knowledge Change?

# How Does the Value of Added Knowledge Change?

 Difficult tasks succumb nonlinearly to knowledge.



9

#### Some Tenets

- The Explicit Knowledge Principle: Much of the knowledge in an intelligent system needs to be represented explicitly (Why?)
- The Knowledge is all there is hypothesis: No new control structures are needed
  - "When searching a space of size 1, it is not crucial in what order you expand the nodes"
- The Breadth Hypothesis: Intelligent performance often requires falling back on general knowledge or analogizing to specific knowledge from far-flung domains

# Some Tenets (Continued)

- Knowledge facilitates learning: If you don't know much, you won't learn quickly
- The Empirical Inquiry Hypothesis: AI should embody hypotheses in programs, gather data by running them, and to revise based on surprising behaviors
- The Difficult Problems Hypothesis: There are too many ways to solve simple problems. Raising required system level and breadth of competence makes it easier to test and raise its intelligence

11

#### **Problems**

- 1. Possible "in principle" limitations
- 2. How do we get the knowledge?
- 3. How do we adequately represent it?
- 4. How will it be used? (Synergy between representation and process)

- 5. How can someone interact "naturally" with KB systems?
- 6. How can you combine several enterers knowledge?
- 7. How can builder and user not get lost?
- 8. How big a fraction of the million pieces of consensus reality do you need to represent?

14

### Breadth is Within Our Grasp

- A KB of under a million frames will provide a significant performance increase
- · A sufficient research agenda is
- Slowly hand-code a broad knowledge base
- When enough knowledge is present, system will assimilate from reading, data bases, etc.
- System will then be able to go beyond frontiers of human knowledge by carrying out its own R&D projects

### The Hoped-For Result: Man-Machine Synergy

- In the "second era" of knowledge systems,
  - the system will be a colleague
  - intelligence will emerge from the interaction

16

#### Breakout groups: Applying "AI as Empirical Inquiry" to **Unpack Section 8**

- We'll split into breakout groups for 15 minutes
- Discuss the following and then write one answer per group to hand in (be sure to include all participant names):

  - Select one of the problems in Section 8 of the paper
    Propose a concrete task context in which to study/assess the claim
  - 3. Sketch the behavior of a system, or another computational strategy, to address it
  - 4. How could performance be evaluated?

Submit one writeup per group. Designate one participant to submit on canvas.