### **Imagine**

An assistant who suggested to

**Kepler** that an ellipse best fitted Brahe's observations of Mars

**Ramanujan** that the numbers like 12 were like  $2^{a_1} \times 3^{a_2}$  where  $a_1 \geq a_2$ 

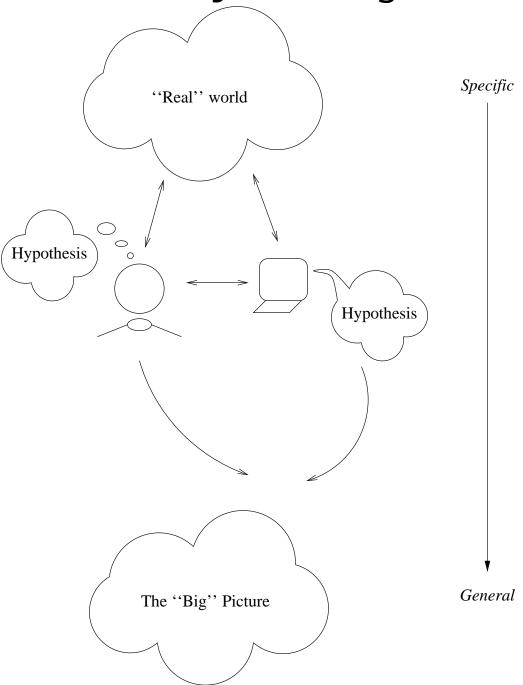
Rachmaninoff that he had a tendency to anticipate notes in some conditions

 How much more would such a Sorcerer and Apprentice team have achieved . . .

## Machines as "intelligent assistants"

- Science
  - Forming and refining new theories
- Engineering
  - Data analysis
  - Training professionals
- Arts
  - Artist/author-specific patterns
  - Suggesting playing method
- "Assistance" should be understandable

### 2-Way Learning



### ILP: Areas of Application

**Science.** Protein shape prediction, drug structure activity prediction, . . .

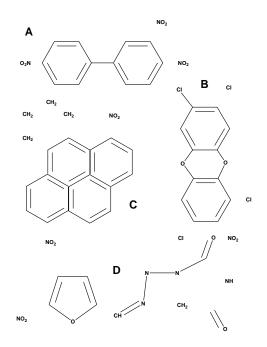
Engineering. Finite element mesh design, satellite fault diagnosis, circuit design, automobile traffic-flow analysis, intelligent software agents for the Internet, reconstruction of simulator models, numerical prediction, . . .

Language. Part-of-speech disambiguation from large real-world corpora, learning grammars, . . . .

**Music.** Analysis of Rachmaninoff's pianoforte performances, . . .

# Scientific Application: Mutagenesis

**Task.** Find rules describing highly mutagenic compounds using molecular structure of chemicals



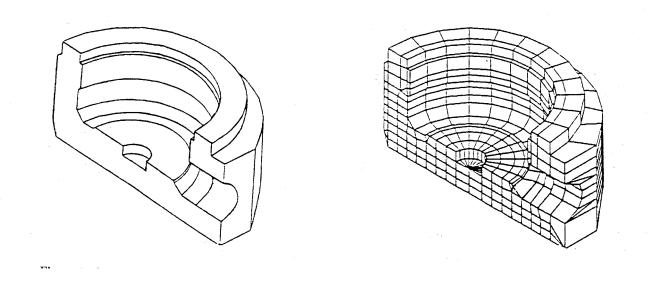
 ILP found new structural alert for poorlyunderstood subset

### • Example rule:

A chemical is mutagenic if: it contains a double bond conjugated to a 5-membered aromatic ring via a carbon atom

# Engineering Application: Mesh-Design

**Task.** Find correct mesh resolution (partitions) for component parts of a physical object using factors such as the type of edges, boundary conditions and loadings, shape of the structure etc.



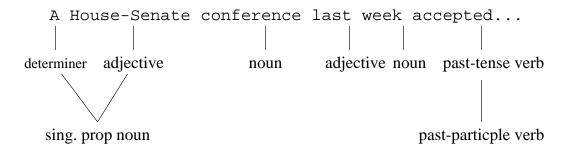
 ILP derived rules being incorporated into a commercial program for mesh-design

#### • Example rule:

The resolution of an edge A is 2 elements if:
 it is an ''important short'' edge, and
 it is adjacent to an element B, and
 B is completely fixed, and
 B contains no load.

### Language Application: Tagging

**Task.** Find rules to eliminate incorrect partof-speech tags in corpus-based data (1,000,000's of sentences)



- ILP rules comparable to best statistical taggers on word-by-word basis
- ILP rules much better on a sentence-bysentence basis

### • Example rule:

A word cannot be a past participle if:
 it is sandwiched between a determiner (right) and
 a noun-phrase (left)

### Music Application: Interpreting Rachmaninoff

**Task.** Find interpretive rules that may have been used by Rachmaninoff using Ampico recordings of his piano performances (ca. 1920, records notes, duration, tempo, dynamics of key pressure, pedalling in a digital form)



• ILP rules conform to musical expectations and find some unusual patterns

#### • Example rules:

A note marked ''staccato'' is interpreted by:
a severe shortening of the note followed by
lengthening the gap before the next note

A note is played slightly earlier than indicated if: it appears at the beginning of a bar