## Al: Machine Learning

#### Watson

- Ren Watson BRAD
- Question Answering "pipeline"
  - Question analysis
    - Type of answer (person, place, ...)
    - Type of question
    - Is the question really two or more seperate questions
  - Search
    - Find data relevant to the question
  - Answer selection
    - Rank proposed answers

#### Watson

Gathers evidence for each answer

Scores each piece of evidence

 Produces a model based on sample questions and their answers (machine learning)

#### Watson

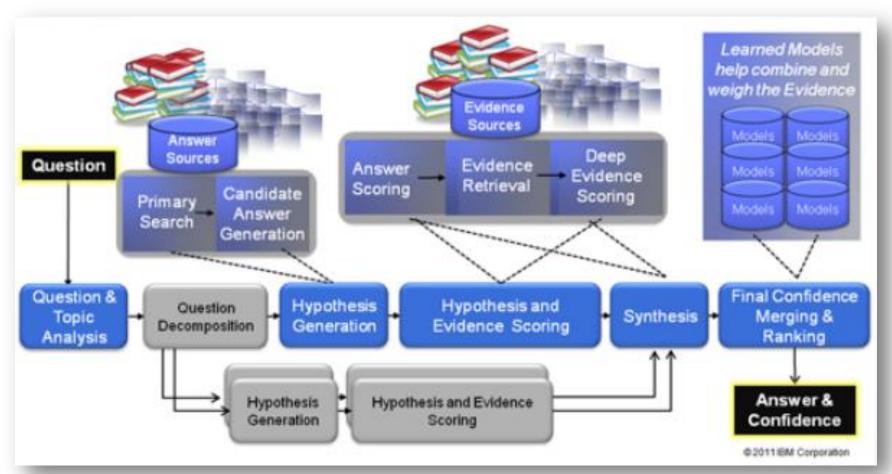


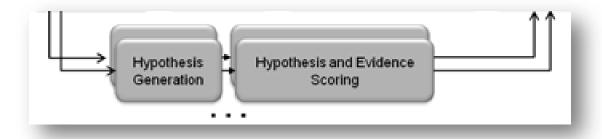
image source:

http://researcher.watson.ibm.com/researcher/view\_group\_subpage.php?id=2159

#### Concurrency in Watson

 Early single processor version: 2 hours to answer a question.

Naturally decomposes into parallel processes



# Excluded question types (by agreement with game producers)

- Audio visual questions
  - Picture This (Contestants are shown a picture of a B---52 bomber)
- Special instruction questions
  - Decode and postal codes
  - We're going to give you a word comprising two postal abbreviations; you have to identify the states.

## Watson is Multiple

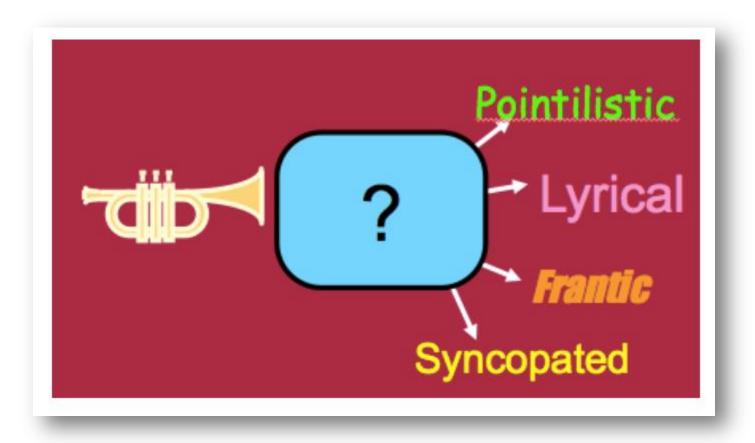
- Different kinds of data sources
  - Wikipedia, encyclopedia, ...
  - Structured data (databases, ontologies, taxonomies)
- Various algortihms
  - search evaluation
  - Learning combining and filtering results
- Goal is not to play, but develop an architecture for Q/A in serious domains such as medical diagnosis.

## Machine learning

- Statistics / probability
- Decision trees
- Neural networks
- Learning to classify (Classifiers)
  - Features
  - Training data
  - Mathematical formulas
- Many others

## Classification Example

https://www.youtube.com/watch?v=LLBBvHYBbW0



## Robot Learning to Walk

This video shows a robot "learning" a model of its own "body".



https://www.youtube.com/watch?v=iNL5-0 T1D0

#### **Artificial Neural Network**

Biologically inspired but not nearly as complex as real neurons

Input

- Highly parallel (concurrent)
- Can learn classifiers from features (someone has to choos features)
- Uses weights, numerical multipliers that adjust relative importance

### How to teach computers to see



Min. 3:50 8:40 10:15 14:00

http://www.ted.com/talks/fei fei li how we re teach ing computers to understand pictures?language=en