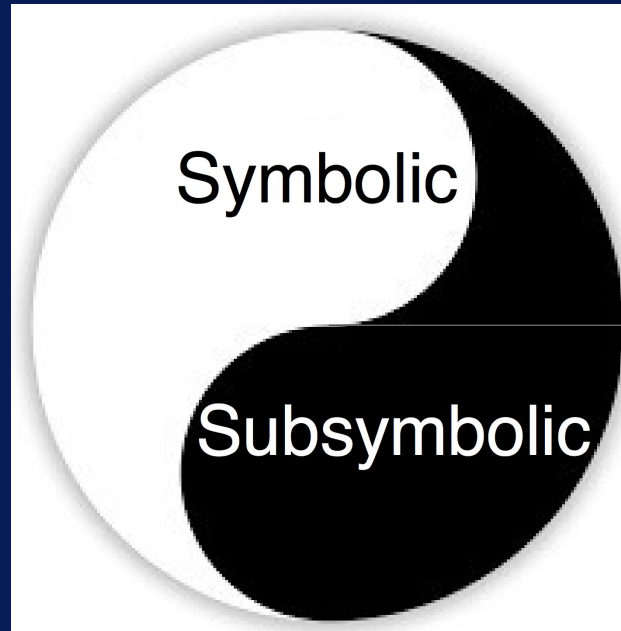


Symbolic vs. Subsymbolic AI



Henry Lieberman

MIT CSAIL & MIT Media Lab

Symbolic vs. Subsymbolic

Explicit symbolic
programming

Inference, search
algorithms

AI programming
languages

Rules, Ontologies,
Plans, Goals...

Bayesian learning

Deep learning

Connectionism

Neural Nets / Backprop

LDA, SVM, HMM, PMF,
alphabet soup...

Symbolic vs. Subsymbolic

Introspection more useful
for coding

Easier to debug

Easier to explain

Easier to control

Not so Big Data

More useful for explaining
people's thought

Better for abstract
problems

More robust against noise

Better performance

Less knowledge upfront

Easier to scale up

Big Data

More useful for connecting to
neuroscience

Better for perceptual
problems

What's the goal of AI?

To have computers do things, that, if people did them, we would consider intelligent
(subject to “Disappearing AI”)

To explain how human intelligence works, and reproduce it in computers

What is the appropriate level for describing intelligence?

We're just bags of chemicals.... Can we explain intelligence in terms of chemistry?

We're just a bunch of connected neurons.... Can we explain intelligence in terms of wiring?

We're just information processors... Can we explain intelligence in terms of information?

We're just {math, bio, genetic, social, ...}

Symbolic vs Subsymbolic

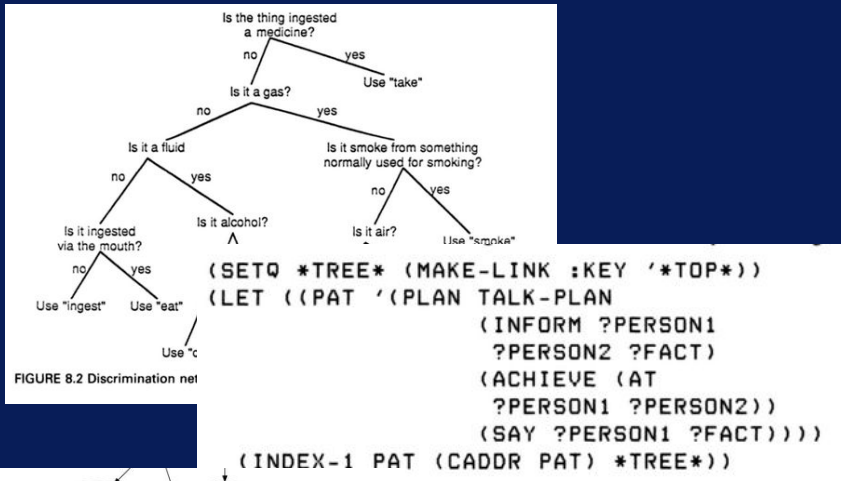
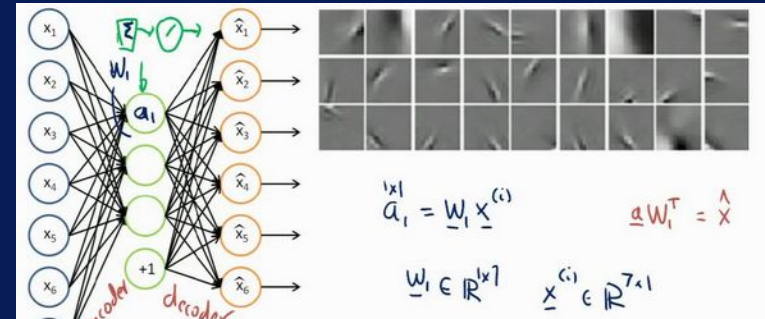
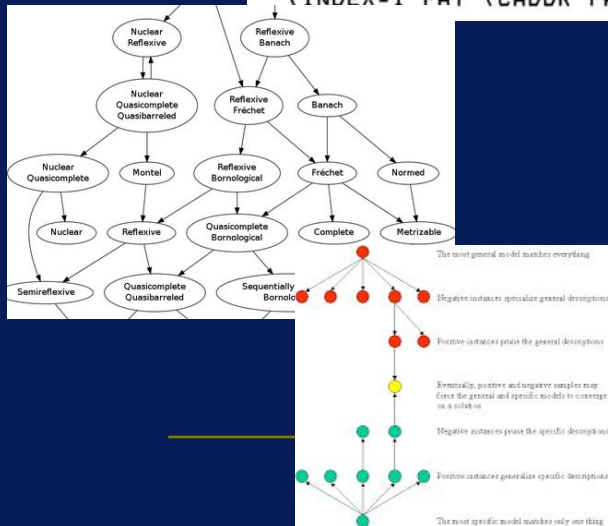


FIGURE 8.2 Discrimination net



$$\hat{x}_i = W_i x^{(i)}$$

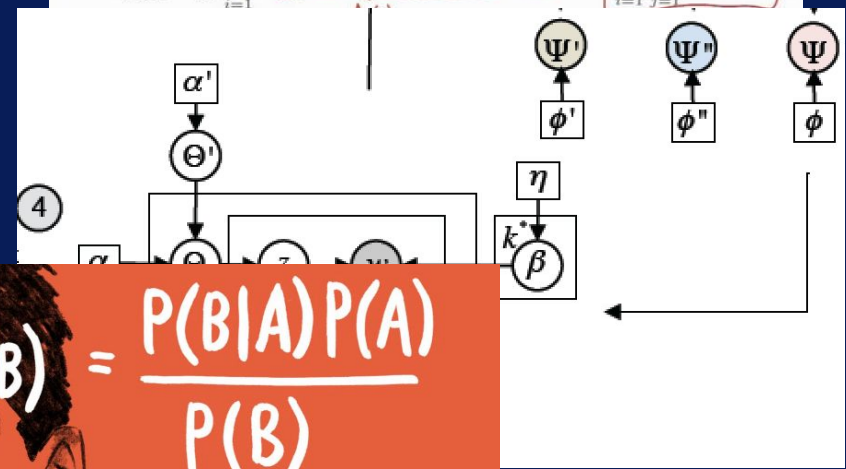
$$W_i^T = \hat{x}$$

$$W_i \in \mathbb{R}^{k \times 1}$$

$$x^{(i)} \in \mathbb{R}^{7 \times 1}$$

$$\text{minimize}_W \frac{\lambda}{m} \sum_{i=1}^m \|W^T [W x^{(i)}] - x^{(i)}\|_2^2 + \sum_{i=1}^m \sum_{j=1}^k g(W_j x^{(i)})$$

$$\text{minimize}_{W,b,c} \frac{\lambda}{m} \sum_{i=1}^m \|\sigma(W^T \sigma(W x^{(i)} + b) + c) - x^{(i)}\|_2^2 + \sum_{i=1}^m \sum_{j=1}^k g(W_j x^{(i)})$$



$$P(A|B) = \frac{P(B|A)P(A)}{P(B)}$$

Newell & Simon: The Physical Symbol System Hypothesis

Physical symbol system

From Wikipedia, the free encyclopedia

See also: [Philosophy of artificial intelligence](#) and [Data system](#)

A **physical symbol system** (also called a [formal system](#)) takes physical patterns (symbols), combining them into structures (expressions) and manipulating them (using processes) to produce new expressions.

The **physical symbol system hypothesis (PSSH)** is a position in the [philosophy of artificial intelligence](#) formulated by [Allen Newell](#) and [Herbert A. Simon](#). They wrote:

"A physical symbol system has the [necessary and sufficient means](#) for general intelligent action."^[1]

— [Allen Newell](#) and [Herbert A. Simon](#)

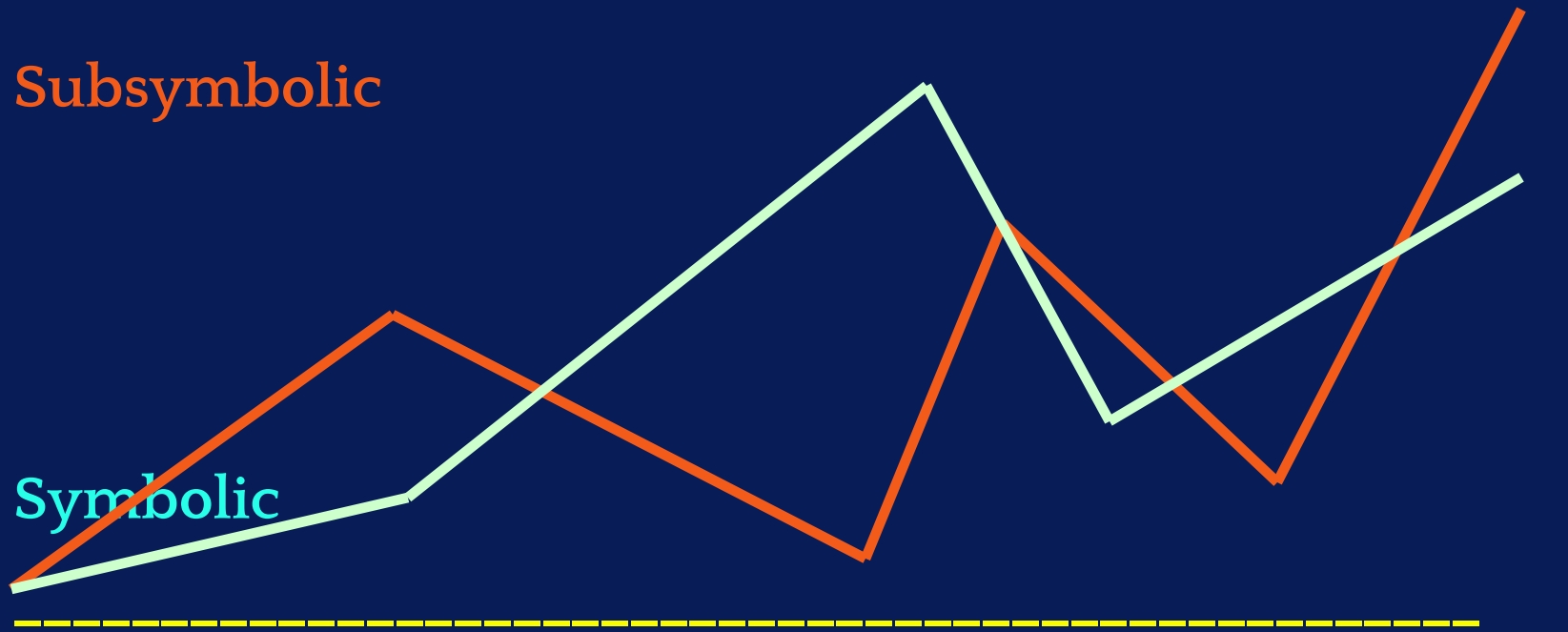
This claim implies both that human thinking is a kind of symbol manipulation (because a symbol system is necessary for intelligence) and that machines can be intelligent (because a symbol system is [sufficient](#) for intelligence).^[2]

Timeline

Subsymbolic

Symbolic

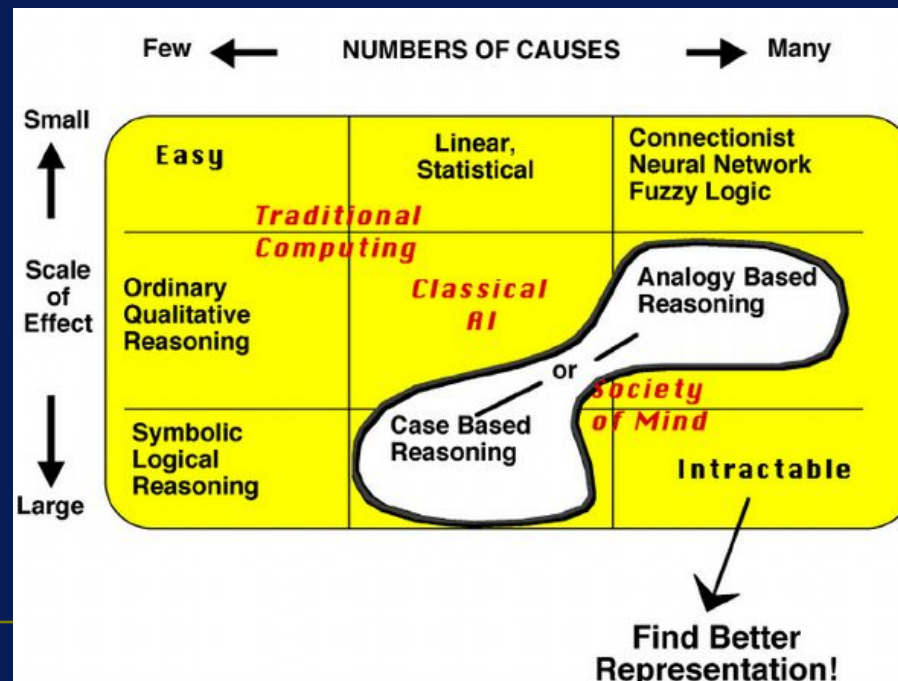
1940 1950 1960 1970 1980 1990 2000 2010



Reconciling approaches

Top down vs. bottom up

Bits of the other approach are seeping into both sides



Peace!

-



