# HUMAN-LEVEL ARTIFICIAL INTELIGENCE & COGNITIVE SCIENCE

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## OUTLINE

**Computation and Intelligence** 

**Approaches Toward HLAI** 

The Current Situation

## THE COMPUTER: A UNIVERSAL MACHINE

"It can be shown that a single special machine of that type [a Turing machine] can be made to do the work of all. It could in fact be made to work as a model of any other machine. The special machine may be called the universal machine."

—Alan Turing

"The importance of the universal machine is clear. We do not need to have an infinity of different machines doing different jobs. A single one will suffice. The engineering problem of producing various machines for various jobs is replaced by the office work of 'programming' the universal machine to do these jobs."

—Alan Turing

"[Turing] decided the scope of the computable encompassed far more than could be captured by explicit instruction notes, and quite enough to include all that human brains did, however creative or original."

—Andrew Hodges, a Turing Biographer

# THE PHYSICAL SYMBOL SYSTEM HYPOTHESIS (PSSH)

"A physical symbol system [i.e., a computer] has the necessary and sufficient means for intelligent action." —Allen Newell and Herbert Simon

Relevance to Cognitive Science: Computational processes can explain (be a theory of) human intelligence.

Relevance to AI: Computational processes can implement human intelligence.

But, it's just a hypothesis!

# THE NAYSAYERS CLAIM (Among Other Things) "THE BRAIN IS NOT A COMPUTER!"

. . .

Computation: mainly serial 10<sup>9</sup> ops/sec 10<sup>9</sup> transistors digital/discrete (even binary!) disembodied silicon subject to crashes The Brain: highly parallel 10<sup>3</sup> ops/sec 10<sup>14</sup> neurons; 10<sup>17</sup> synapses analog/continuous embodied protein fault-tolerant

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### WHAT IS A COMPUTER? WHAT IS A BRAIN?

Human-Level AI ??? Plans, Goals, Inference, Logic Graphical Models, "Blackboards", Semantic Networks

**Neural Networks** 

A

CS

EE

Phys.

- Symbol Processing Data Structures (Lists, etc.) Programs
- Registers, Machine Ops

Logic Gates (AND's, OR's, )

0's and 1's

Transistor Currents, **Magnetizations** 

**Quantum Mechanics** 

Human Intelligence ??? Goals, Plans, Reactions? **Desires**, Beliefs, Intentions? Perceptual/Motor Apparatus Mentalese? ??? Models of Neo-Cortex Cell Assemblies/Modules? Neur. Neurons, Axons, Dendrites Sci. **Depolarizations Neurotransmitters Bio**. **Genomic Activity** Chem. **Chemical Reactions** 

Cog.

Sci.

## CAN COMPUTATIONAL SYSTEMS BE INTELLIGENT?

## HOW WOULD WE KNOW?

The Turing Test The "Employment" Test

#### SOME JOBS THAT HUMANS PERFORM\*

Meeting and Convention Planner Maid and Housekeeping Cleaner Receptionist Financial Examiner Computer Programmer Roofer's Helper Library Assistant Procurement and Sales Engineer Farm, Greenhouse, Nursery Worker Dishwasher Home Health Aide

Small Engine Repairer Paralegal Lodging Manager Proofreader Tour Guide and Escort Geographer Engine and Other Machine Assembler Security Guard Retail Salesperson Marriage and Family Counselor Hand Packer and Packager

### CAN THEY BE AUTOMATED?

\*From "America's Job Bank," a list of more than 1,500 jobs. Available at www.jobsearch.org/help/employer/SSONetJobCodeListbyCategory2.html8



























## HOW TO PROCEED?

# LET'S LOOK AT SOME THINGS AI HAS TRIED

#### THINGS AI HAS TRIED

•Try to program some activities thought to require intelligence

•Try to program some fundamental processes thought to be involved in intelligence

•Try to imitate the brain

•Try to simulate the performance of ever more complex biological organisms

Try to simulate biological evolution

•Try to "educate" simple (child-like) programs to make them more intelligent and capable

## 1. Programming Activities That Require Intelligence

Game playing Theorem proving Pattern recognition (images, speech, . . .) Natural language understanding Autonomous activity (robots that can perceive, plan and act) Expert judgment

. . .

## Game-Playing



### **Speech Recognition**



## **Autonomous Activity**



## **Autonomous Activity**



#### **Expert Judgment**



Part of a Large Bayesian Network Used for the Diagnosis of Hepatobiliary Diseases

# WOULD SOME COMBINATION OF ALL OF THESE SKILLS ADD UP TO HLAI?

2. Programming Processes Thought to be Involved in Intelligence

Logical reasoning

Probabilistic reasoning

Search

Image processing

Knowledge representation

Learning

Syntactic analysis

Planning

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### Logical Reasoning



# Resolution Theorem Proving Propositional Satisfiability (SAT)

#### **Probabilistic Reasoning**



#### **Bayesian Belief Networks**

#### Search



## A\*, Hill-Climbing Recursive Back-Tracking



#### Image Processing



E.g., Edge Extraction

### **Representing Knowledge**



Semantic Networks, Cyc, WordNet

## Learning



E.g., Reinforcement Learning

# WOULD SOME COMBINATION OF PROCESSES LIKE THESE PRODUCE HLAI?

#### 3. Trying to Imitate the Brain



Neural Networks

Models of the Neo-Cortex

#### **Neural Networks**

#### Input: Text Versions of English Words

#### Output: Sound

#### Training: Change Weights to Make Sound More Correct

When, in disgrace with fortune and men's eyes, I all alone beweep my outcast state And trouble deaf heaven with my bootless cries And look upon myself and curse my fate, Wishing me like to one more rich in hope, Featured like him, like him with friends possess'd, Desiring this man's art and that man's scope



Sejnowski, T. J. and Rosenberg, C. R., Parallel networks that learn to pronounce English text, Complex Systems 1, 145–168 (1987).

#### Models of Neo-Cortex



#### Large Graphical Models

Jeff Hawkins, Tom Dean, David Mumford, Geoff Hinton, ...

#### 4. Simulating Simple Biological Organisms



#### Rod Brooks's Creepy-Crawly Things

#### 5. Simulating Biological Evolution



#### Target-Seeking Demo

http://www.cs.northwestern.edu/~fjs750/netlogo/ final/gpdemo.html

#### **Truck-Backing Demo**

http://www.handshake.de/user/blickle/Truck/ index.html

Genetic Algorithms, Genetic Programming

#### 6. "Educating" Educable Programs

Turing's "Child Programme"

Cassimatis's "Cognitive Substrate"

Lenat's "CYC Bootstrapping"

# WHICH OF THESE APPROACHES WILL BE SUCCESSFUL?

# WE'LL HAVE TO WAIT AND SEE!

# IN THE MEANTIME:

THESE EFFORTS HAVE PRODUCED A GROWING ARMAMENTARIUM OF TECHNICAL TOOLS

## Here is a Partial List:

**Bayesian Belief Networks** Hidden Markov Models Kalman Filtering POMDP's A\* Global Search Hill-Climbing Local Search GA/GP Resolution Theorem Prvg. SAT Encodings/Solvers Semantic Networks **Reinforcement Learning** 

Neural Networks Backpropagation **Support Vector Machines Blackboard Architectures** Monte Carlo Methods Statistical Grammars **Expectation Maximization** Inductive Logic Programming **Teleo-Reactive Programs** Particle Filtering Model-Based Vision

#### Will They Help Us Achieve HLAI? Are More Tools Needed? 35

## THE CURRENT SITUATION

The Tools Are Being Used to Solve Problems in Several Fields:

Biology Genomics Chemistry Medicine Aeronautics Geology Data Mining Business

But Little Work is Being Done Toward HLAI. Why?

. . .

### PETER HART'S QUESTION (Al's Progress)

