

Language & Technology

Lecture 2: Dialog Systems and the Turing Test

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Dialog Systems

- ▶ system for talking with user
- ▶ colloquial term: **chatbot**

Possible Uses

- ▶ 24h phone and online support
Optimum help chat?
- ▶ telemarketing
Samantha West for health insurance
- ▶ video games
Façade, event[0]



The First and Most Famous Chatbot: ELIZA

- ▶ developed by Joseph Weizenbaum (MIT) 1964–1966
- ▶ pretends to be psychotherapist
- ▶ fooled a surprising number of test subjects

ELIZA Effect

- ▶ The tendency of humans to assume computer behavior is analogous to human behavior.
- ▶ Reading human intentionality into mechanistic symbol manipulations.

Try it yourself:

<http://www.manifestation.com/neurotoys/eliza.php3>

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How Chatbots “Cheat”

- ▶ text only, no speech
- ▶ restricted topic of conversation
medical advise, weather forecast, . . .
- ▶ formulaic or specialized discourse
ordering train tickets, room reservation, . . .
- ▶ grammar with few distinct word forms, restricted word order
English VS German VS Hungarian

Why Chatbots Need to Cheat

- ▶ Dialog is arguably the **hardest problem in NLP**.
- ▶ **Requires:**
 - ▶ perfect command of English grammar
 - ▶ analysis of meaning
 - ▶ rich world knowledge
 - ▶ ability to keep track of discourse
 - save new information, recall established facts
 - ▶ correct turn taking
 - ▶ understanding non-literal speech
 - indirect speech acts, humor, . . .
 - ▶ sophisticated reasoning
 - developing and following arguments

Strategies for Detecting Chatbots

1 Be annoying

Ask the same thing over and over again.

Do you get contradicting replies?

2 Be a giant douche

Say something that is completely beyond the pale.

Do you get a scolding or shocked reply?

3 Be a polyglot

Randomly switch languages.

Do you get replies in a matching language, without any mention of the language change?

4 Be recent

Incorporate recent events that a human would be aware of.

Do you get a meaningful reply?

5 Be insane

Ignore all rules of language (word order, grammar, etc.).

Do you get a surprisingly normal reply?

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Let's Try Some of This...

Cleverbot: <http://www.cleverbot.com/>

cleverbot

20640 people
talking

How are you doing.


I am tired.

How are you doing.

I'm well, thank you.

How are you doing.

I'm a little depressed.  share!

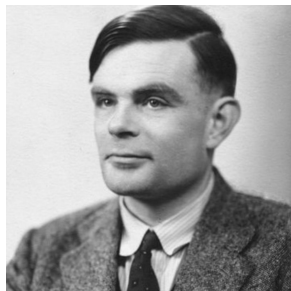
say to cleverbot... 

think al think fo thoughts

The Turing Test

Alan Turing (1912–1954)

- ▶ British mathematician/computer scientist
- ▶ cracked the *Enigma* in WW2
- ▶ father of computation (Turing machine)
- ▶ defined artificial intelligence (Turing test)
- ▶ extreme long-distance runner (40+ miles)

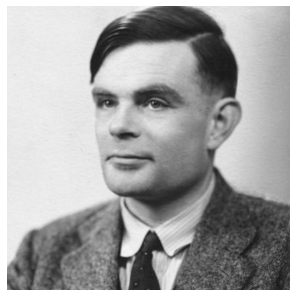


- ▶ Turing was interested in the possibility of artificial intelligence.
- ▶ What does it mean for a machine to be **intelligent**?
- ▶ **Turing's proposal**
A machine is intelligent if humans **cannot distinguish it from a human.**

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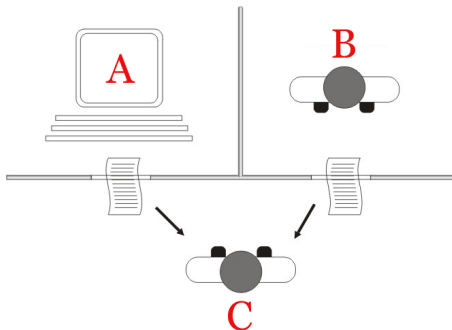


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Artificial Intelligence and the Turing Test

Turing Test

- ▶ human C joins remote/online chat
- ▶ must decide whether they are talking to human B or machine A
- ▶ machine A passes test if human C believes it is human

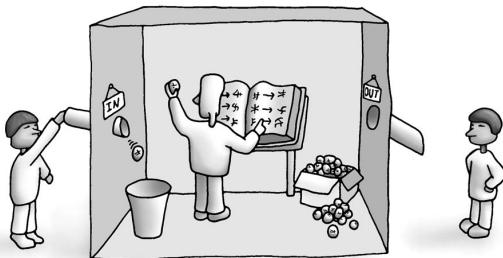


Criticism of the Turing Test

Some believe the Turing test is **too weak**.

Searle's Chinese Room

- ▶ Suppose a person who doesn't speak Chinese is locked into a room full of Chinese phrase books.
- ▶ To the outsider, the person seems proficient in Chinese.
- ▶ appearing intelligent \neq being intelligent



A Different View

I believe the Turing test is **too strong**.

- ▶ intelligence \neq human intelligence
- ▶ AIs have very different memory and computation abilities.
- ▶ We should not expect them to think like humans.
- ▶ Also, humans can fail/differ in various aspects of intelligence.
Autism, Williams syndrome, . . .

The Pragmatic Viewpoint

- ▶ In the end, all of this only matters for establishing AI rights.
- ▶ An AI that is autonomous enough to demand rights is sufficiently intelligent to deserve them.

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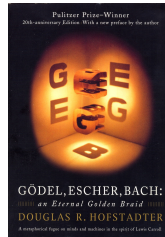
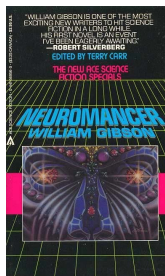
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(Artificial) Intelligence in the Media



A Real-World Turing Test: Loebner Prize

- ▶ Loebner Prize: \$3,000 for chatbot that fools human judges
- ▶ meant as a real-world Turing test
- ▶ Loebner Prize has been won several times
- ▶ **But:** all of the chatbots are just **tweaked versions of Eliza**
- ▶ How is this possible?

Analyzing ELIZA

- ▶ ELIZA uses pattern matching.
- ▶ Specific constructions provide specific responses.

Example

```
1  if 'you' in user_input:
2      print('We were discussing you, not me.')
3  if 'feel' in user_input:
4      print('Tell me more about such feelings.')
```

- ▶ Responses can reuse user input with **regular expressions** (more on that in a later lecture)

- ▶ ELIZA is a simplistic solution for a very complex problem.
- ▶ With enough tweaking, chatbots work incredibly well for restricted domains.
- ▶ Almost all chatbots nowadays thus follow the ELIZA model.
- ▶ This is a shame, as dialogue systems were meant to be the vanguard of artificial intelligence.

Experiment: A Mini Turing Test

- ▶ We can't play with Loebner Prize chatbots.
Most of them are not available online.
- ▶ But we can do a mini-experiment with similar technology:
poetry generators

Haiku

- ▶ A very short form of Japanese poetry;
- ▶ three phrases of 5, 7, and 5 syllables;
- ▶ an example by Basho.

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初しぐれ猿も小蓑をほしげ也

はつしぐれさるもこみのをほしげなり

*the first cold shower
even the monkey seems to want
a little coat of straw*

Liked This?

For more of this, go to *bot or not* at botpoet.com

- ▶ Writing convincing poems is **easier** because
 - ▶ there is no interactivity
 - ▶ poems can be gibberish
- ▶ But it is also **harder** because
 - ▶ there is meter and rhyme,
 - ▶ you need greater stylistic diversity,
 - ▶ you cannot reuse user input.
- ▶ Given these results, do you think anybody has won the Loebner prize?

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Recent Loebner Prize Winner: Eugene Goostman

- ▶ pretends to be 13 year old boy from Ukraine
- ▶ explains:
 - ▶ broken English
 - ▶ no knowledge of American culture
 - ▶ uncooperative conversation (stubborn child)
 - ▶ random topic changes

The Trick

- ▶ Loebner prize winners fail standards of human intelligence.
- ▶ Instead, they use social engineering to lower expectations.

The Loebner Prize Misses the Point

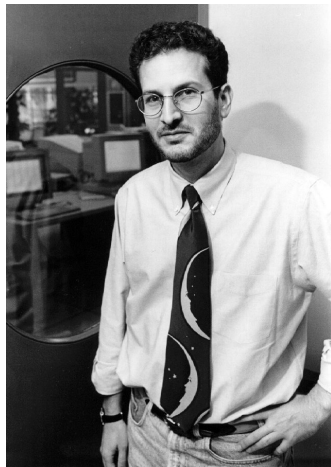
- ▶ The Turing test is meant as a means for testing whether a very sophisticated machine is truly intelligent.
- ▶ The chatbots competing for the Loebner prize are obviously not intelligent since they are just Eliza on steroids.
- ▶ Passing the Turing test is pointless if
 - ▶ we already know that the machines aren't intelligent,
 - ▶ passing depends on lowering the evaluation standards.
- ▶ Scientifically, the **Loebner prize is completely worthless.**

Stuart Shieber's Pogo Stick Analogy

- ▶ Suppose you have a competition for building the first human-powered flying machine.
- ▶ The ambitious flying machines do not get off the ground, while a pogo stick manages to stay in the air for a few seconds.
- ▶ So from then on people keep improving pogo sticks.
- ▶ But obviously even the best pogo stick will never allow you to fly.

Reference

<http://www.eecs.harvard.edu/~shieber/Biblio/Papers/loebner-rev-html/loebner-rev-html.html>



Leaving Pogo Sticks Behind

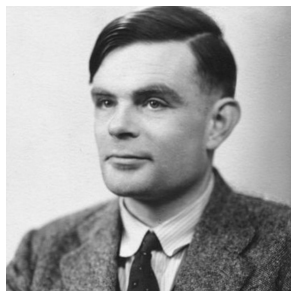
- ▶ A machine that can pass the Turing test needs **genuine understanding of language and the world.**
- ▶ We are still many years away from that (probably hundreds).
- ▶ But we can do better than current technology:
 - ▶ better computational machinery
 - ▶ more linguistic know-how

Appendix

More on Alan Turing

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Tragic Death

- ▶ Turing was gay, a criminal offense in 50s UK.
- ▶ Turing was sentenced to undergo hormone treatment, which rendered him impotent and caused severe depression.
- ▶ Two years later he died of cyanide poisoning (probably suicide).

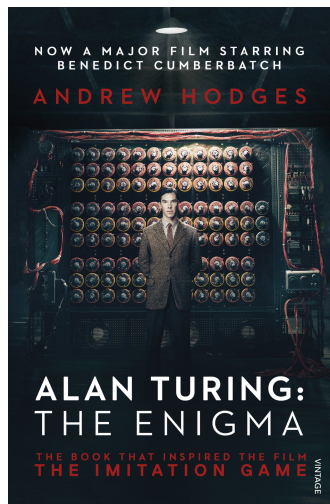
Enigma

- ▶ Nazi encryption device.
- ▶ Based on automatic key substitution
- ▶ Substitution table changed after every key press.
- ▶ **Crucial weakness**
Substitutions depend on plugboard configuration
⇒
messages with same configuration use same substitutions



Book/Movie Recommendation

- ▶ long time out of print
- ▶ recent reprint thanks to movie *The Imitation Game*
- ▶ get it while it lasts



Turing as the Founding Father of Computer Science

On Computable Numbers, with an Application to the Entscheidungs Problem (1936)

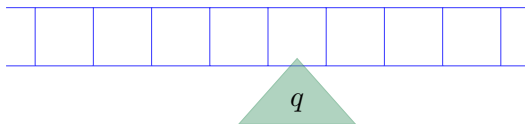
What is a Turing Machine?

- ▶ General purpose computing machine
- ▶ **Memory:**
infinite tape that can be filled with symbols
- ▶ **Program:**
finite set of instructions for filling tape with symbols

- ▶ Turing machine is abstract, does not specify hardware
tape could be a line of water buckets. . .
- ▶ Function or process is computable if and only if
computable by Turing machine
- ▶ Turing machines are **universal models of computation**.
- ▶ Modern-day computers = Turing machines with finite tape

Full Specification of Turing Machine

Infinite Tape with Read/Write Head and State Register



Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
		delete symbol <i>or</i> write new symbol <i>or</i> do nothing	left <i>or</i> right <i>or</i> stay	

Example of Turing Machine

Instruction Table

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A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 0 1 0 0 1 0 0 0 0 0

C

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 1 1 0 0 1 0 0 0 0 0

C

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	\leftarrow	B
B	0	none	\leftarrow	C
B	1	none	\leftarrow	B
C	0	print(1)	\Rightarrow	D
C	1	none	\leftarrow	C
D	0	none	\Rightarrow	E
D	1	none	\Rightarrow	D
E	0	print(1)	\leftarrow	A
E	1	none	\Rightarrow	E

0 1 1 0 0 1 0 0 0 0 0

D

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 1 1 0 0 1 0 0 0 0 0

D

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 1 1 0 0 1 0 0 0 0 0

E

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 1 1 0 1 1 0 0 0 0 0

E

Example of Turing Machine

Instruction Table

<i>state</i>	<i>tape symbol</i>	<i>write action</i>	<i>move action</i>	<i>new state</i>
A	0	none	none	done
A	1	print(0)	←	B
B	0	none	←	C
B	1	none	←	B
C	0	print(1)	⇒	D
C	1	none	←	C
D	0	none	⇒	E
D	1	none	⇒	D
E	0	print(1)	←	A
E	1	none	⇒	E

0 1 1 0 1 1 0 0 0 0 0

A

Another Book Recommendation

- ▶ friendly intro to Turing machines
- ▶ development of computers after Turing's initial paper
- ▶ in particular origins at Manhattan project in Los Alamos

