### Conversational Al Alquist:

Teaching Computers to Surpass Human Baseline in Post-Pandemic Pub Debates

Petr Marek

# **CALQUIST**



#### **Team Alquist**





SocialBot Grand Challenge 4 Champions





Annual **university competition** dedicated to accelerating the field of **conversational artificial intelligence** organized by **Amazon**.





The goal is to create a **socialbot** capable of **coherent and engaging conversation** about popular topics for **20 minutes**.





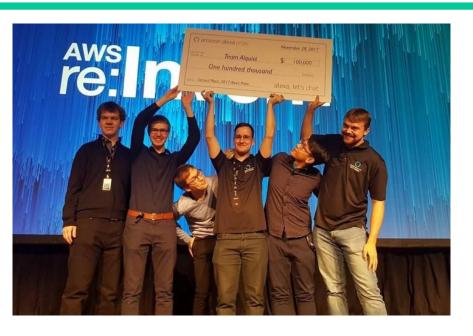
Anybody with Alexa device can say "Let's chat", have a conversation and rate it from one to five stars.







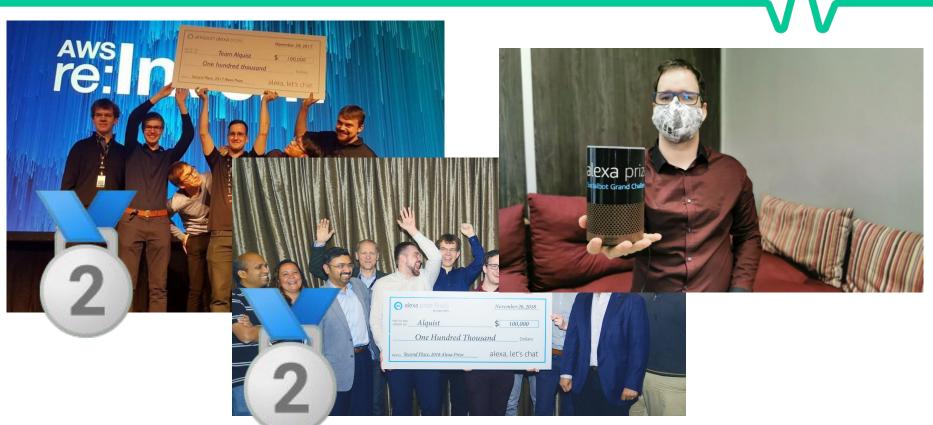
**Five best** teams progress into **finals**, where three **interactors** and three **judges** test the socialbot and decide the winner.

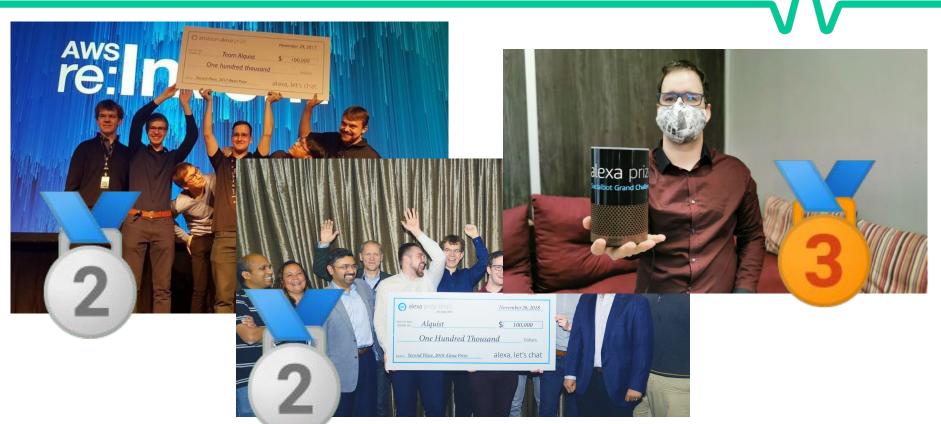












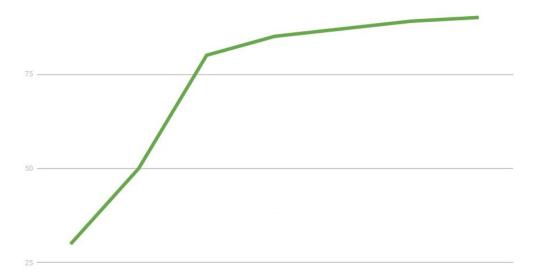
#### How to make a socialbot?

## It's not in the Al algorithms!

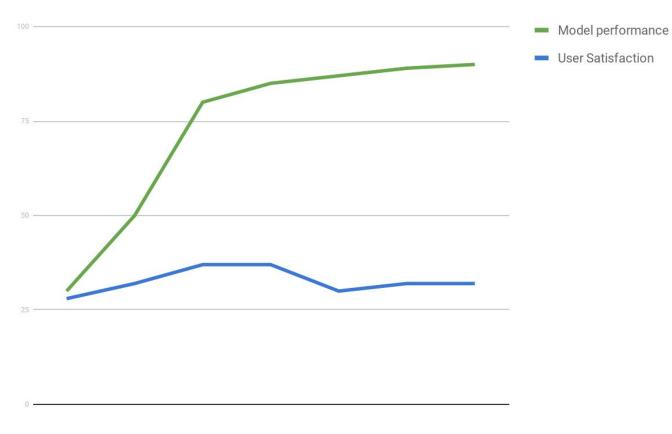




Model performance



0 -----













#### How to make a good socialbot?



Ability to say something



Coherence

Ability to plan dialogue

Ability to recognize unexpected

Ability to answer factual questions

Ability to react



Engaginess

Ability to make the conversation engaging

Ability to learn about user

#### How to make a good socialbot?



#### Ability to say something



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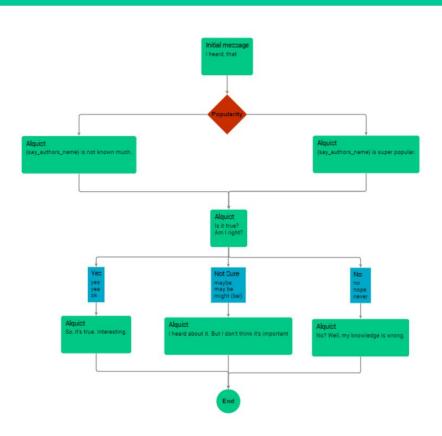
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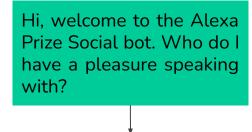
#### How to teach it what to say?

#### **Dialogue Graphs**



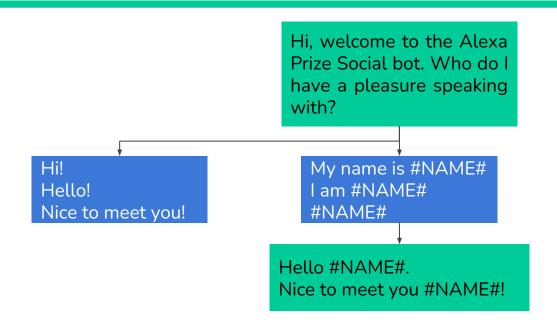


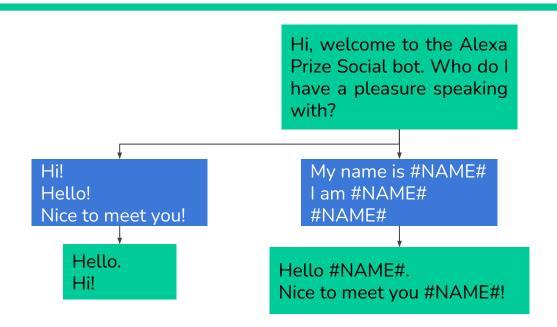
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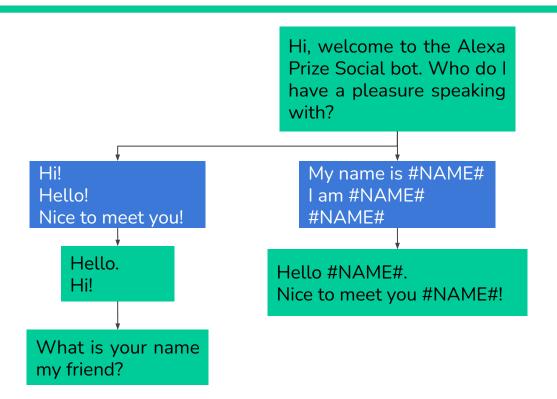


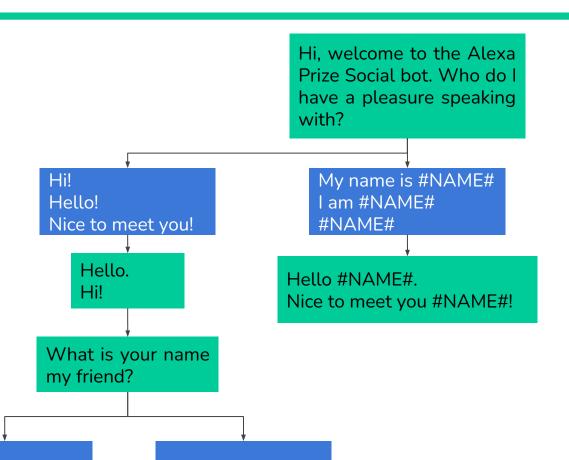
My name is #NAME#
I am #NAME#
#NAME#

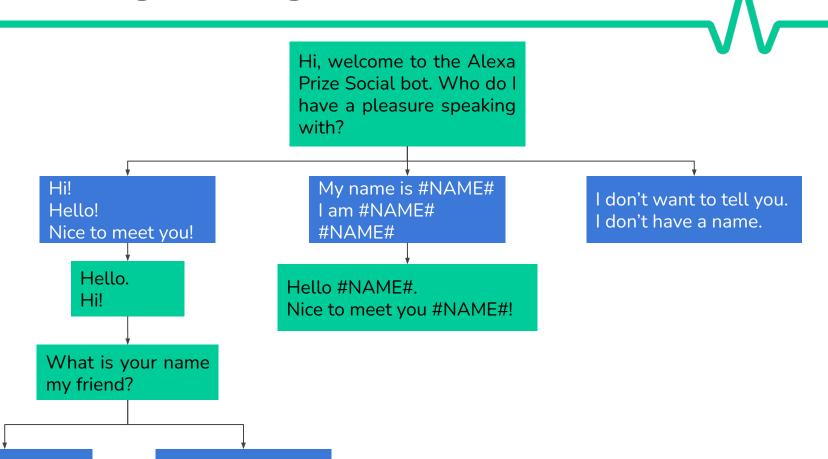


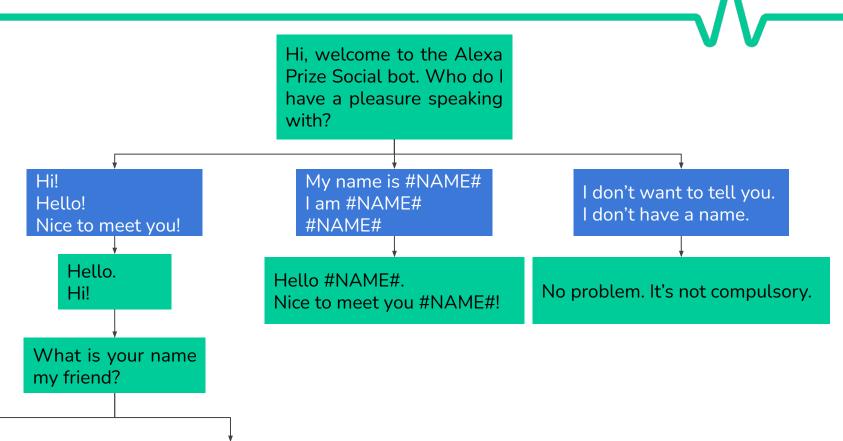


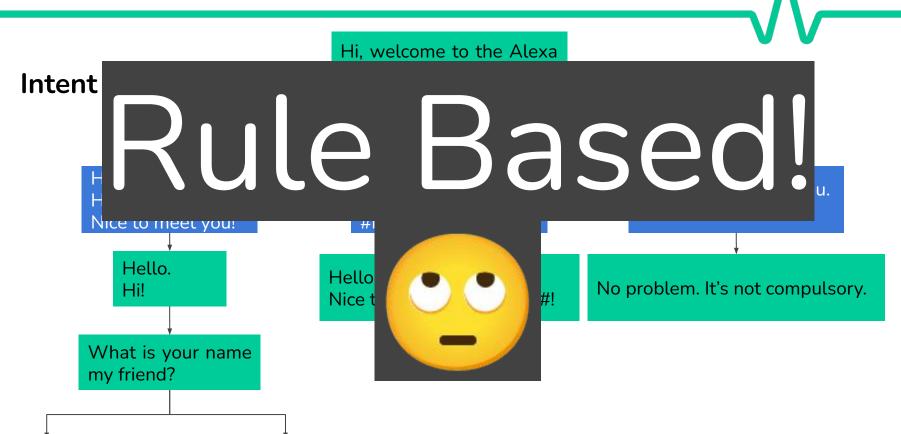




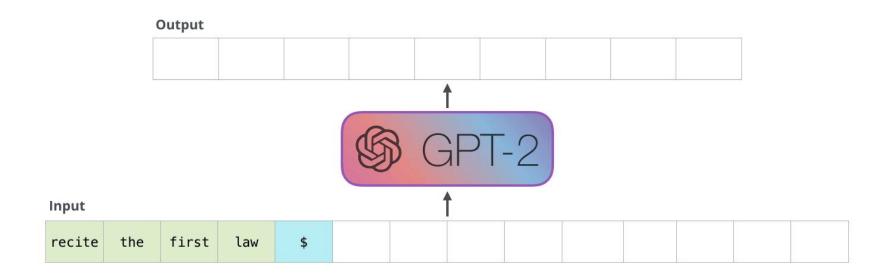




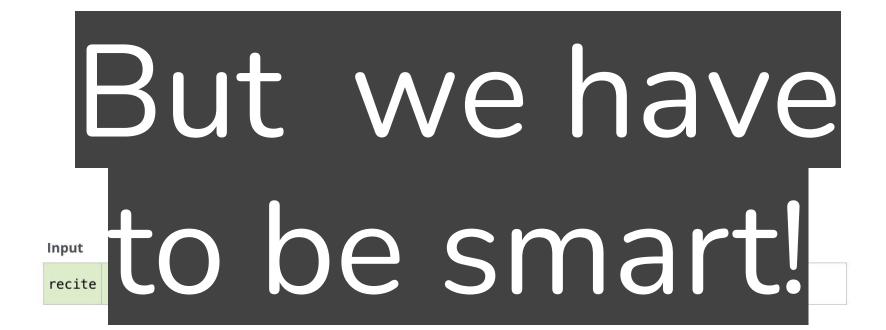




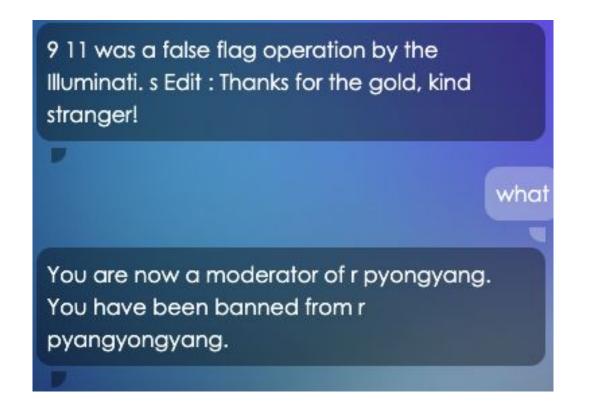
# We use Neural Response Generators!



## We use Neural Response Generators!



## **Neural Response Generators**



#### Areas of Our Research in NRG



#### Control

The models learn what they see in the data.

We would like to have power to influence the style of the generated responses.

#### Knowledge

The responses are bland and inconsistent.

We experiment with infusing knowledge into the dialogue.

#### **Effectivity**

The large transformer-based models have long inference time, are computationally infeasible and training is data hungry.

We try to lower the requirements by quantization, distillation and fine tuning.

# How to make a good socialbot?



Ability to plan dialogue

Ability to recognize unexpected

Ability to answer factual questions

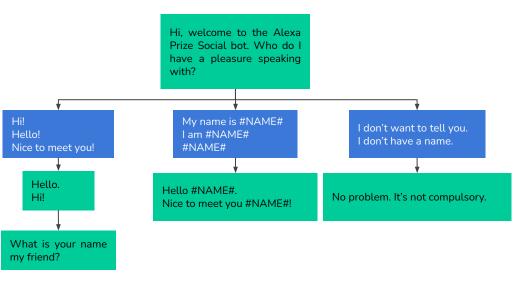
Ability to react

Ability to make the conversation engaging

Ability to learn about user

# How to respond to unexpected inputs?

# How to respond to unexpected inputs?





Let's chat about art now!



What is the population of Brazil?



I will visit my sister tomorrow. I would like to tell you about that now.

# How to respond to unexpected inputs?

Step 1: Recognize

Step 2: Respond

# Step 1: Recognize





I will visit my sister tomorrow. I would like to tell you about that now. UNIVERSAL SENTENCE ENCODER

→ [0.4 1.2 ...]

Cosine Similarity

Is < Threshold?

**Expected** 

In-domain

Hi! Hello! Nice to meet you!

My name is #NAME# I am #NAME# #NAME#

I don't want to tell you. I don't have a name. UNIVERSAL SENTENCE ENCODER [0.3 0.1 ...]

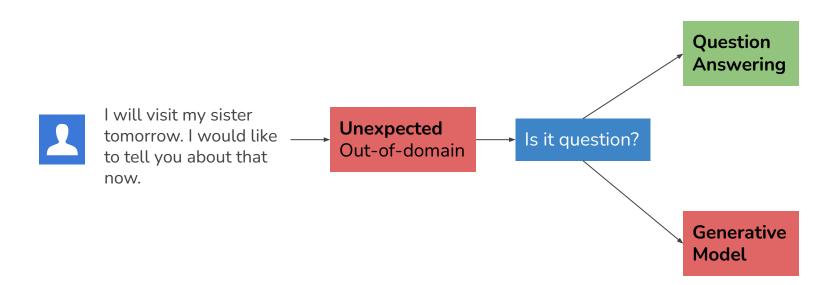
[0.1 2.4 ...]

...

**Unexpected**Out-of-domain

# Step 2: Respond





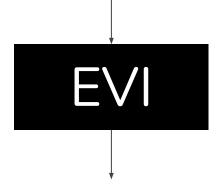
# **Question Answering**





What is the population of Brazil?





The population of Brazil is 211 millions.



Alexa. Let's chat.



Alexa. Let's chat.



Hi, welcome to the Alexa Prize Social bot. Who do I have a pleasure speaking with?





Alexa. Let's chat.



Hi, welcome to the Alexa Prize Social bot. Who do I have a pleasure speaking with?



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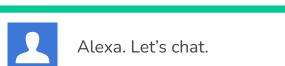
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DialoGPT is a large-scale pretrained dialogue response generation model for multiturn conversations. The human evaluation results indicate that the response generated from DialoGPT is comparable to human response quality under a single-turn conversation Turing test. The model is trained on 147M multi-turn dialogue from Reddit discussion thread.





Hi, welcome to the Alexa Prize Social bot. Who do I have a pleasure speaking with?



I will visit my sister tomorrow. I would like to tell you about that now.



- 1: Yes, let's go.
- 2: Sure!
- 3: No, thank you. I don't care.
- 4: How old is your sister?
- 5: Sure! I am dying of curiosity!



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```
So what the pope is saying is, "Be excellent to each other."
  permalink report give gold reply
   ♣ [-] qambalore 25 points 53 minutes ago

→ "God gave rock and roll to you, gave rock and roll to you, put it in the soul of everyone."

      permalink parent report give gold reply
   ♠ [-] frankdozier 9 points 1 hour ago
   Still no "Party on dude's!" but it makes me happy, nonetheless.
      permalink parent report give gold reply
   ♠ [-] hackerbots 2 points 38 minutes ago

→ I hear the Vatican also has a few broken 3d printers and is therefore a hackerspace.

      permalink parent report give gold reply
  load more comments (2 replies)
♠ [-] FunDIE_Fungi 1027 points 4 hours ago
 Pope Francis is really a breath of fresh air for the Catholic church. He seems like a great man.
  permalink report give gold reply
   ♠ [-] aeyntie 366 points 1 hour ago
   This new Pope is pretty dope
      permalink parent report give gold reply
       ♠ [-] Emay75 235 points 51 minutes ago
       * The dopest pope thats ever poped
          permalink parent report give gold reply
           ♠ [-] LearnedToLoveTheBomb 19 points 35 minutes ago
           Hands down
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           ♠ [-] Psy-Kosh 9 points 32 minutes ago
           Born from an egg on a mountain top, the dopest pope that's ever poped?
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          load more comments (6 replies)
        ♠ [-] Gauldenwahn 18 points 54 minutes ago
       dope pope is dope
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          load more comments (3 replies)
      load more comments (5 replies)
    ▲ [-] Lilatu 95 points 4 hours ago
    Well, so far it is all "marketing", he hasn't actually changed the doctrine on any issue ... so
      let's wait and see.
      permalink parent report give gold reply
```

♠ [-] PhilbroSwaggins 197 points 1 hour ago

**√** 

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DialoRPT









DialoRPT UpDown



DialoRPT UpDown

DialoRPT Width



 $\sqrt{}$ 

DialoRPT UpDown

DialoRPT Width

DialoRPT Depth

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#### DialoRPT UpDown

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Generative Model: Sure! I am dying of curiosity!





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She told me she will marry soon.



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Generative Model: Are you married?



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General Are you married?

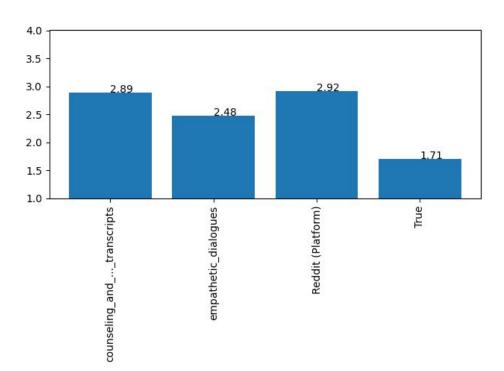
# Does fine tuning on a more aligned dataset bring better responses?

 $\sqrt{\phantom{a}}$ 

Switchboard, EmpatheticDialogues, Counseling and Psychotherapy Transcripts

Comparative Analysis (the lower the position, the better)

Conclusion: Indeed it does.
EmpatheticDialogues dataset is the best.



# How to make a good socialbot?



Ability to plan dialogue

- ✓ Ability to recognize unexpected
  - ✓ Ability to answer factual questions
  - Ability to react

Ability to make the conversation engaging

Ability to learn about user

# How to make dialogue engaging?

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n/todayilearned · Posted by u/bijoy89 3 years ago

TIL Jet Li turned down a role in The Matrix Reloaded because Hollywood producers wanted to record and copy all of his martial arts moves into a digital library, with all rights going to them.



slashfilm.com/jet-li...

34.5k upvotes 994 comments 0 awards



TIL that Keanu Reeves trained for four months in karate for The Matrix. Later, he learned over 200 martial arts moves for Matrix Reloaded. He also learned Judo and Jujitso for John Wick.



blackbeltmag.com/entert...

63.9k upvotes 1.8k comments 0 awards



I was wondering, if you were supposed to watch only one movie for the rest of your life, which one would it be?



Well, probably Matrix.



Keanu Reeves trained for four months in karate for The Matrix. Later...



OK..

# How to make dialogue engaging?



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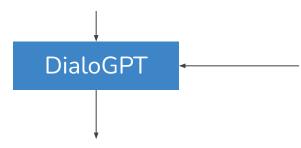


Keanu Reeves trained for four months in karate for The Matrix. Later...

Do you like Keanu Reeves?



Keanu Reeves trained for four months in karate for The Matrix. Later...



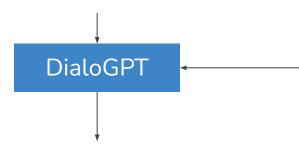
human-human conversation dataset

**Topical-Chat** - knowledge-grounded

Do you like Keanu Reeves?

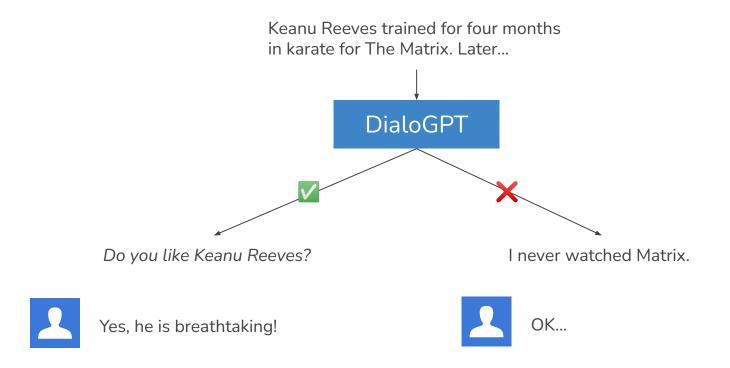


Keanu Reeves trained for four months in karate for The Matrix. Later...



I never watched Matrix.

**Topical-Chat** - knowledge-grounded human-human conversation dataset





#### Input:

A: How are you?

B: I am fine, thank you!

A: What do you plan to do on weekend?

STATEMENT

#### Target:

I'm going to visit my sister.

#### Input:

A: How are you?

B: I am fine, thank you!

A: What do you plan to do on weekend?

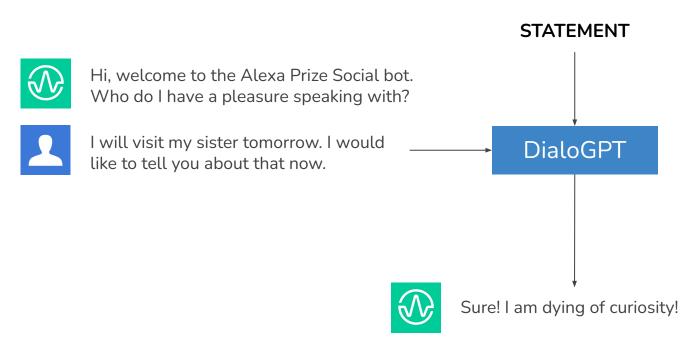
B: I'm going to visit my sister.

OPEN QUESTION

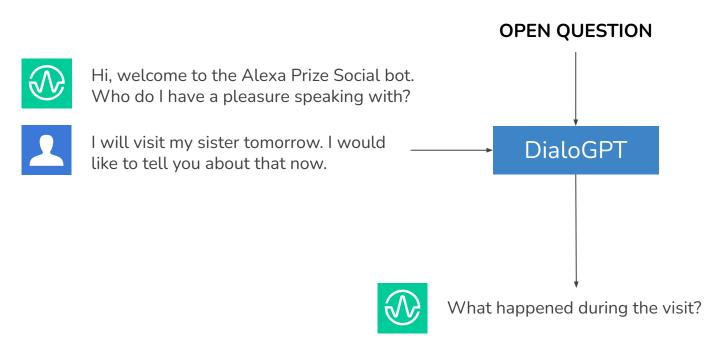
#### Target:

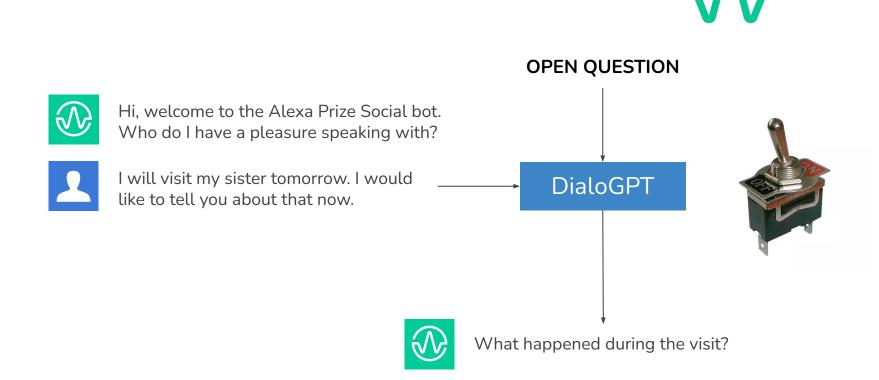
How is she doing recently?

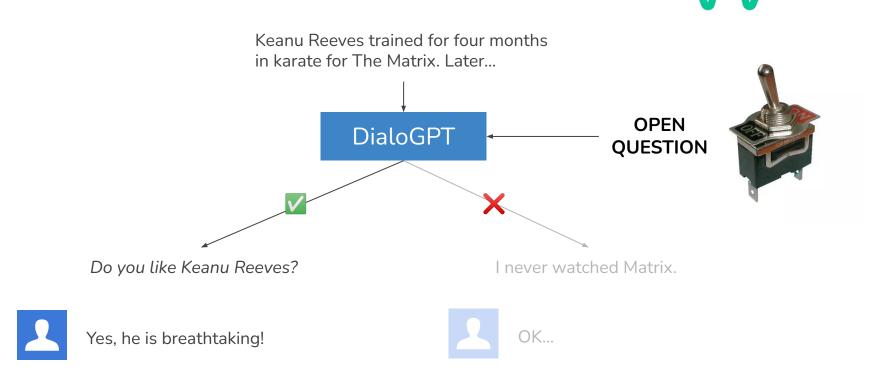










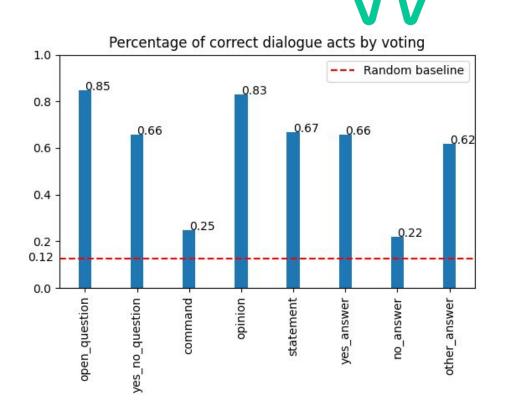


### Can we influence the response by dialogue acts?

Open question, yes-no question, statement, opinion, command, yes answer, no answer, other answer

- <|statement|> Hello.
- <|open\_question|> How are you?

Conclusion: We can, in 66% of cases on average.



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Ability to plan dialogue

- ✓ Ability to recognize unexpected
  - ✓ Ability to answer factual questions
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Ability to make the conversation engaging

Ability to learn about user

When will some kind of digital persona invite us to talk over a non-digital beer?

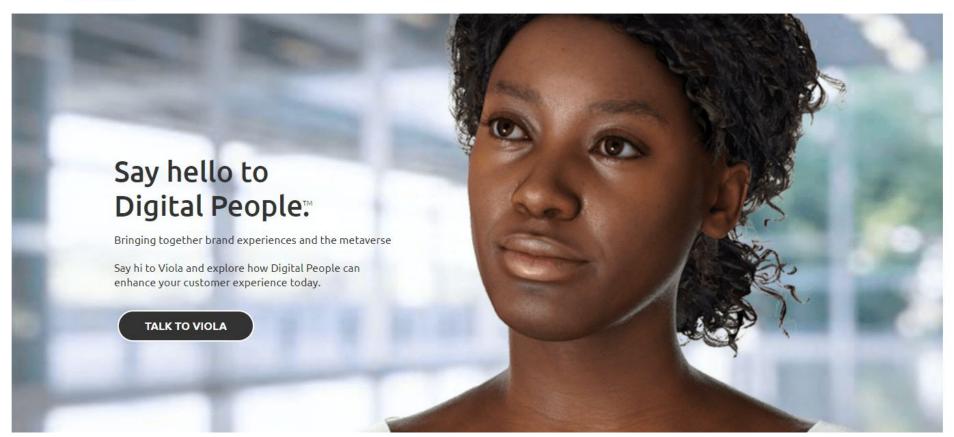


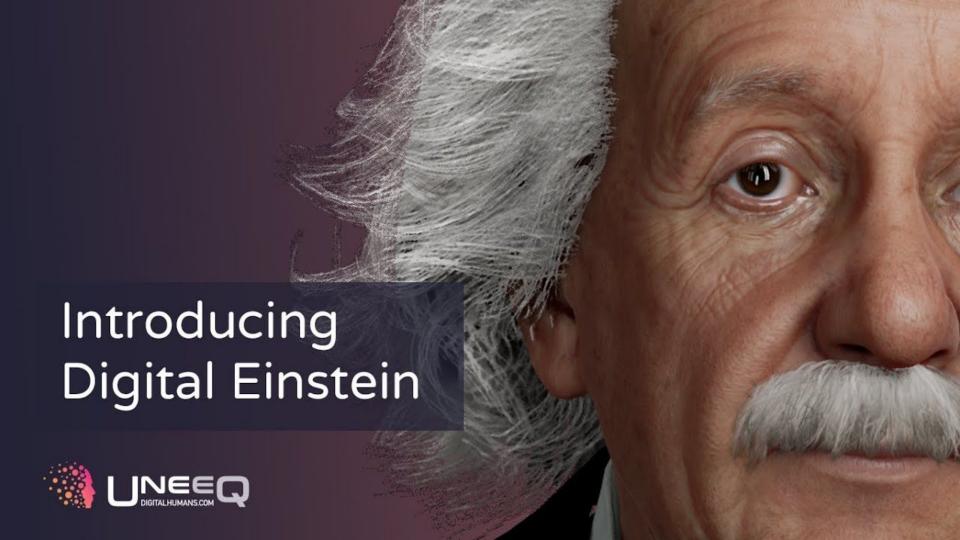




MATYLDA







# Conv. Al 3D Avatars = \*\*

