



Google AI ML Winter Camp  
谷歌 AI 机器学习应用冬令营

# “Personalized” Chatting Machine

Personality Representation &  
Personality based Chatting

三个咕咕呆写出了一群bug  
Three hero & A Bunch of Bug

# “Personalized” Chatting Machine

(MBTI) Myers-Briggs Personality Classification



**“ENTREPRENEUR”**

**ESTP (-A/-T)**

Smart, energetic and very perceptive people, who truly enjoy living on the edge.

Target of this part is classifying people into 16 distinct personality types across 4 axis, showing their some dialogues or some declaration (or Twitter, Wechat ...)

Introversion (I) – Extroversion (E)

Intuition (N) – Sensing (S)

Thinking (T) – Feeling (F)

Judging (J) – Perceiving (P)



**“ARCHITECT”**

**INTJ (-A/-T)**

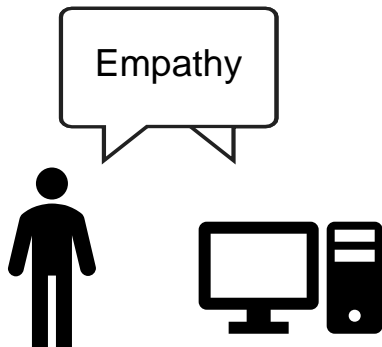
Imaginative and strategic thinkers, with a plan for everything.

# “Personalized” Chatting Machine

## Chatting Machine

We work on Chatting Machine that can generate appropriate responses not only in content (relevant and grammatical) but also in personality of human speaker (personality consistent).

The chat robot first judges speaker's personality, and then gives the response according to the one's personality. In the end of the conversation, that give more accurate personality, according to historical chat information.



# Data

Train Personality classifier using  
Kaggle Myers-Briggs Personality  
Type Dataset

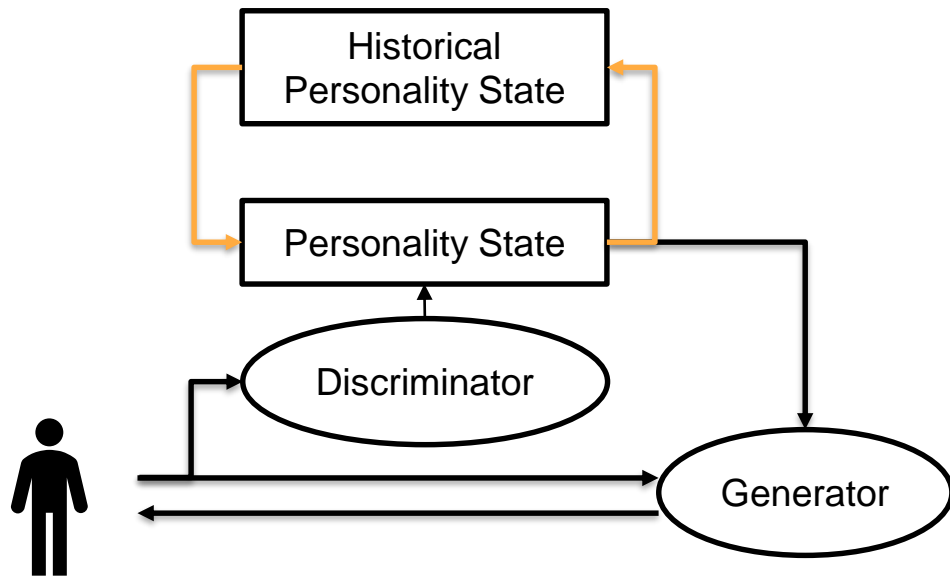
Used the classifier to annotate the  
Twitter and “ParIAI” daily  
conversation Dataset.

Used the conversation Dataset  
that contained Personality label to  
train chatting machine

	type	posts
0	INFJ	'http://www.youtube.com/watch?v=qsXHcwe3krw   ...
1	ENTP	'I'm finding the lack of me in these posts ver...
2	INTP	'Good one _____ https://www.youtube.com/wat...
3	INTJ	'Dear INTP, I enjoyed our conversation the o...
4	ENTJ	'You're fired.    That's another silly misconce...

```
A: u know why i'm up u need to do ur homework and u could be sleep pussyy
B: go back to sleep ! ! !
MBTI Score: [0.12544563 0.3110942 0.66989878 0.69659827]
```

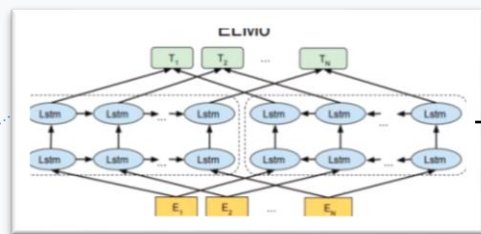
# Structure



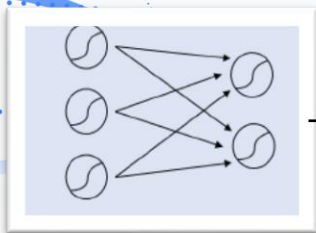
# Discriminator

## —Personality Classification Network

ELMo Pretrain (Word Char Embedding)

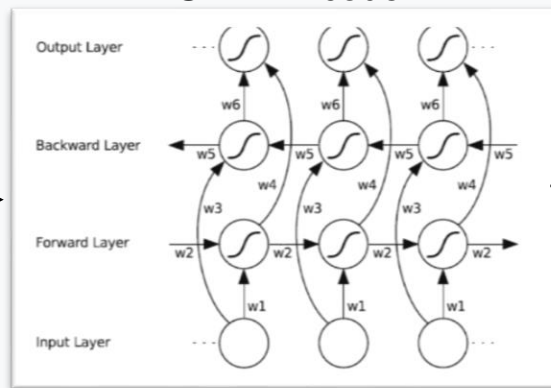


Trainable Word Embedding



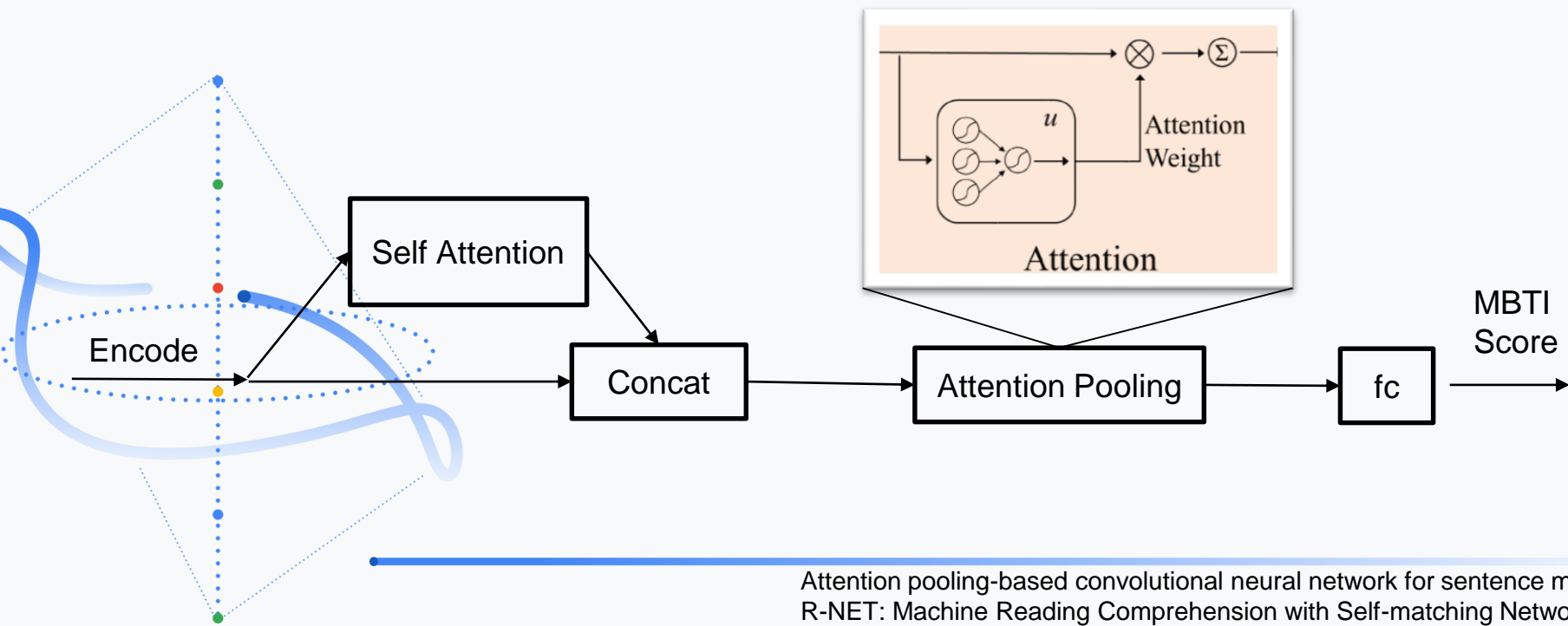
Concat

Bi-LSTM Encoder



# Discriminator

## —Personality Classification Network



# Results

## Personality Classification

	I/E	N/S	T/F	J/P	Average
F1	0.72	0.66	0.88	0.87	0.782
auc	0.91	0.94	0.94	0.91	0.925

Introversion (I) – Extroversion (E)

Intuition (N) – Sensing (S)

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# Generator

## —Chatting Machine Network

Given a post  $X = (x_1, x_2, \dots, x_n)$  and a personality type  $e$  of the response to be generated, the goal is to generate a response  $Y = (y_1, y_2, \dots, y_n)$  that is coherent with the personality type  $e$ .

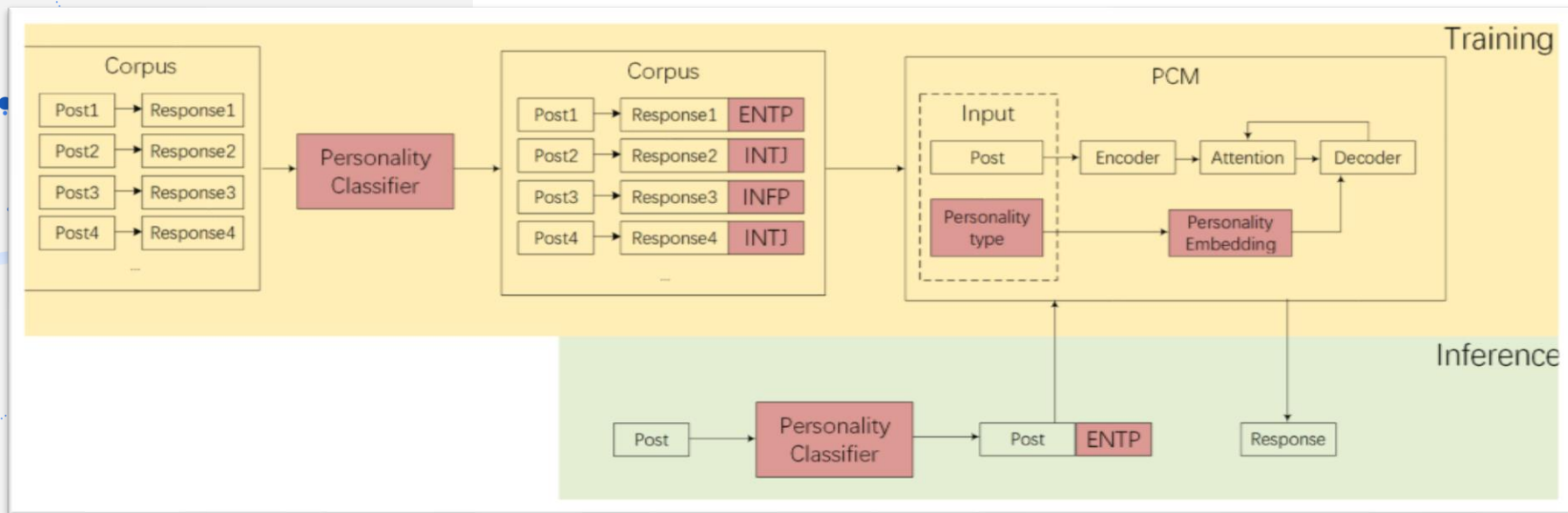
The most intuitive approach to modeling emotion in response generation is to take as additional input the emotion category of a response to be generated.

$$s_t = GRU(s_{t-1}, [c_t; e_{y_{t-1}}; v_e])$$

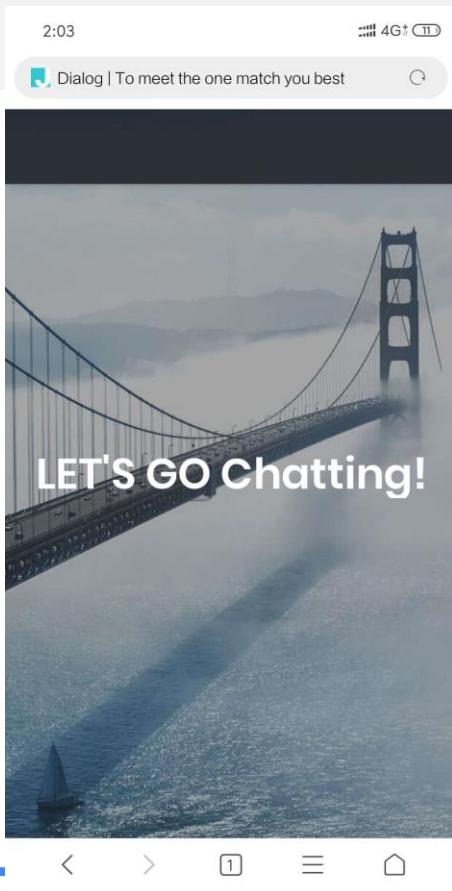
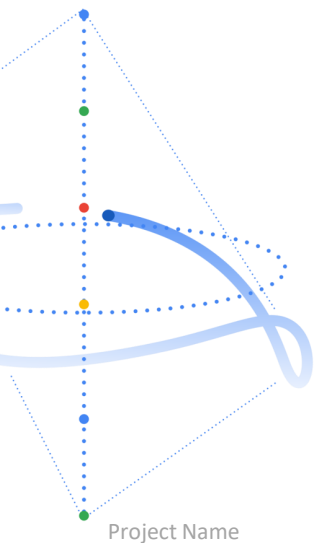
Vector of a personality type  $v_e$

# Generator


## —Chatting Machine Network



# Results



# Future Work

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- Deep personality analysis
  - Better personality dialogue generation

# Reference

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# Thank You

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