You Impress Me: Dialogue Generation via Mutual Persona Perception

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Outline

- Background
- Motivation
- Method
- Experiment
- Conclusion



• Personalized Dialogue Generation states a scenario where two interlocutors meet for the first time and have a conversation to get to know each other.

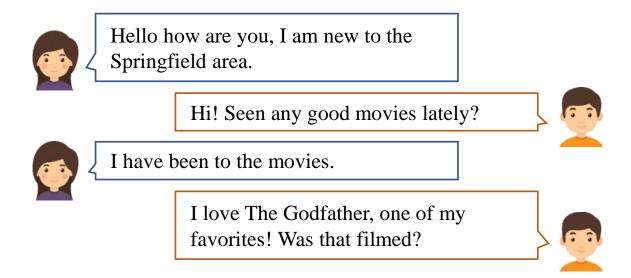


Hello how are you, I am new to the Springfield area.

Hi! Seen any good movies lately?



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- Personalized Dialogue Generation states a scenario where two interlocutors meet for the first time and have a conversation to get to know each other.
- Their persona are explicitly described using several profile sentences.



Persona

I bought my first home.
I love to barbecue.
I live in Springfield.
I'm a writer.



Persona

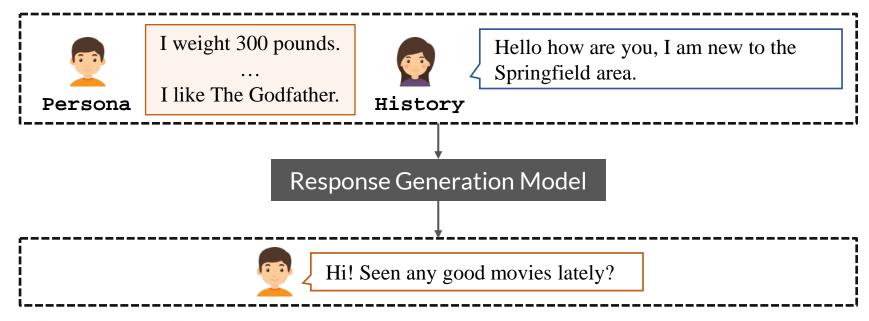
I weight 300 pounds. I am not healthy.

I am a man.

I like The Godfather.



 Imposing such an explicit persona facilitates the training of model with configurable and persistent personalities (Zhang et al. 2018).





Motivation

 Existing works (Wolf et al. 2019) on personalized dialogue generation demonstrate promising results, and they usually focus more on mimicking human-like responses, leaving understudied the aspects of modeling understanding between interlocutors.

Motivation

 However, the understanding between interlocutors (i.e. persona perception) is essential for a high-quality conversation.



I don't believe so. I don't watch movies more of a writer.



OK... I know she is a writer

Rellay? He is not very healthy...



What do you write? Any diet books? I am not very healthy.



 More understanding means more personalized information conveyed by the dialogue , making a higher quality.

 Based on the above intuition, we propose a transmitter-receiver framework to facilitate dialogue generation via the understanding of persona.



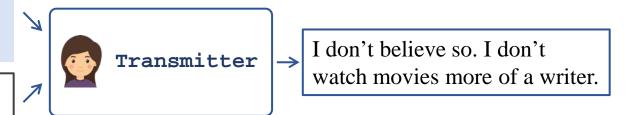
What are Transmitter and Receiver?



- Based on the above intuition, we propose a transmitter-receiver framework to facilitate dialogue generation via the understanding of persona.
- Transmitter is responsible for dialogue generation. It accepts the persona and the dialogue history as input, and aims to generate the response.

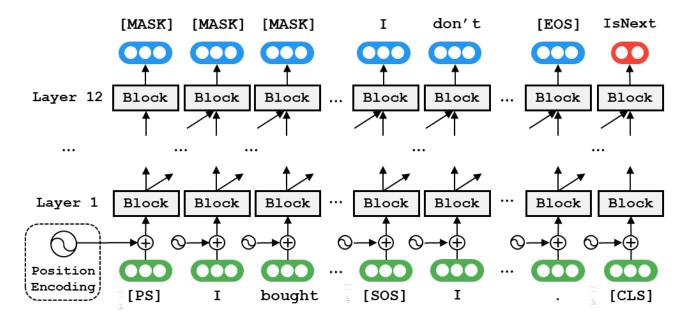
I bought my first home. I love to barbecue. I live in Springfield. I'm a writer.

I love The Godfather, one of my favorites! Was that filmed?

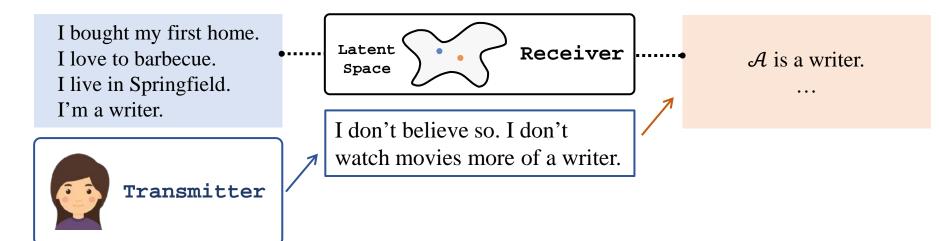




• Transmitter follows the GPT architecture (Radford et al. 2018).

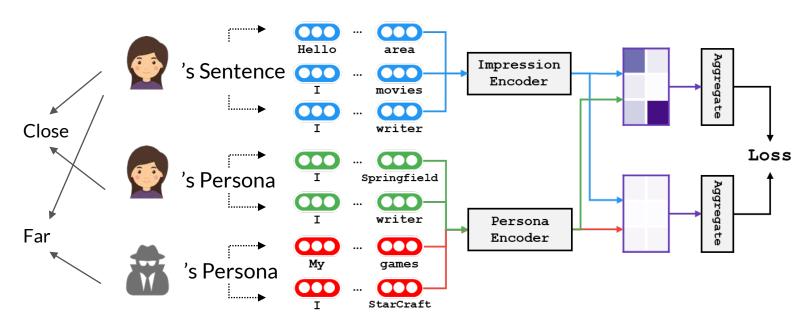


- Based on the above intuition, we propose a transmitter-receiver framework to facilitate dialogue generation via the understanding of persona.
- \bigoplus Receiver is responsible for persona perception (i.e. understanding).

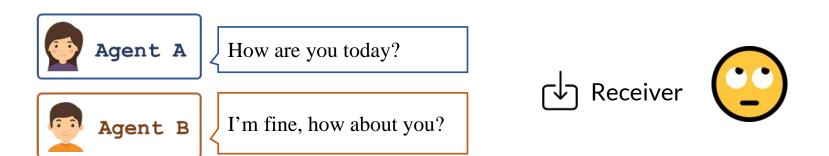




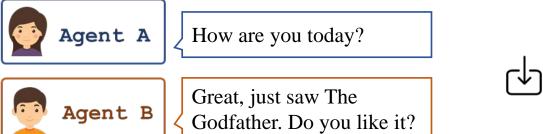
• Receiver is devised to learn the proximity between sentences and persona by a contrastive learning paradigm.



- Transmitter is fine-tuned during a *self-play procedure* (Lewis et al. 2017) with persona perception as a kind of reward.
- We have two Transmitters (Agent A & B) communicate for several turns. Then we collect rewards to give feedback, part of which is provided by Receiver.

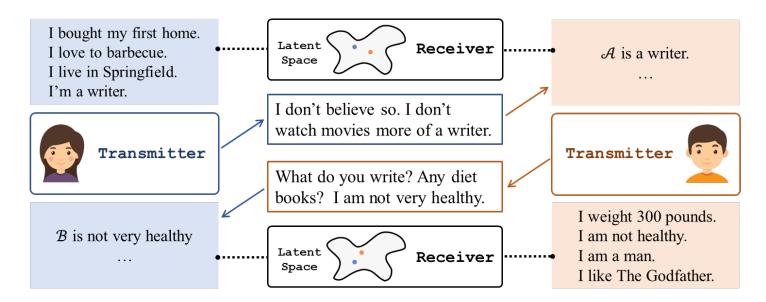


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 Considering both ends of two interlocutors, we enhance dialogue generation via mutual persona perception.





Experiment

• We conduct experiments on the Persona-Chat dataset (Original & Revised).

Category	Model		Original			Revised	
		Hits@1(%)↑	ppl↓	F1(%) †	Hits@1(%)↑	ppl↓	F1(%) ↑
Retrieval	KV Profile Memory	54.8	-	14.25	38.1	-	13.65
	Dually Interactive Matching	78.8	-	-	70.7	-	-
Generative	Generative Profile Memory	10.2	35.01	16.29	9.9	34.94	15.71
	Language Model	-	50.67	16.30	-	51.61	13.59
	SEQ2SEQ-ATTN	12.5	35.07	16.82	9.8	39.54	15.52
Pretrain Fintune	Lost In Conversation	17.3	-	17.79	16.2	-	16.83
	Transfertransfo	82.1	17.51	19.09	_		
	\mathcal{P}^2 Bot (Our)	81.9 [0.1]	15.12 [0.16]	$19.77_{[0.08]}$	68.6 [0.2]	18.89 [0.11]	19.08 [0.07]



Experiment



Persona



context

Human

Lost In Conversation

Transfertransfo



Oui

I've an allergy to water.

I'm a famous twitch streamer.

I helped design the game StarCraft.

I am working on building a robot to be my body double.

Cool. I did hardcore exercise four hours everyday.

That's a lot of exercising. I hate exercising. I just work on my robot most days.

That sounds like a lot of fun!

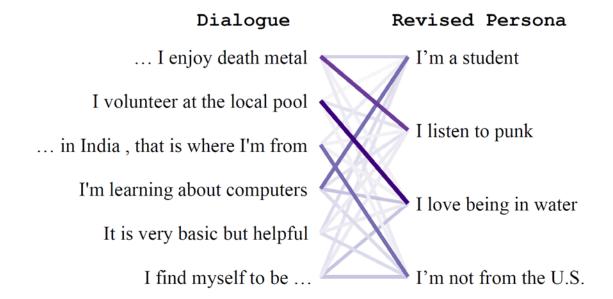
I work at a computer company. I could make you an Android!

I do not exercise at all. I'm busy with my robot project.



Experiment

 Visualization of the relevance scores between a sampled dialogue and its corresponding revised persona.





Conclusion

- We propose a transmitter-receiver framework which explicitly models understanding between interlocutors.
- Under this framework, mutual persona perception is incorporated as a reward signal to achieve the personalized dialogue generation.
- For future work, we would like to extend Receiver to conversational recommender systems.

Thanks

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Code: https://github.com/SivilTaram/Persona-Dialogue-Generation