

## **AQM+:** A new model for visual dialog question generation

March 8 2019, by Ingrid Fadelli



Credit: Lee et al.

Researchers at Clova AI Research, NAVER and LINE, have recently proposed a new framework called AQM+ that allows dialog systems to generate context-relevant questions and answers. Their model, outlined in a paper pre-published on arXiv, will be presented at the 7th International Conference on Learning Representation (ICLR 2019), in New Orleans.

"Intra-machine and human-machine collaboration has been considered as a significant and meaningful research topic, in particular, from the perspective of ethics and public interest in AI," Sang-Woo Lee, one of the researchers who carried out the study, told TechXplore. "Focusing on



task-oriented dialog (TOD), researchers have gained considerable insight from GO games between humans and AlphaGo. More specifically, these researchers think that goal-oriented dialog models can be improved by training models on giant-scale machine-machine interactions, which allows AlphaGo to beat human experts. However, I do not totally agree with this idea, because dialog is a task based on collaboration between two players and is fundamentally different from Go, which is a competition game."

According to Lee, task-oriented dialogue (TOD) resembles the game 20 Questions, as the dialog system's goal should be that of narrowing down a user's intents and requests. In a previous study, Lee and his colleagues introduced a framework for task-oriented dialog systems called "answerer in questioner's mind" (AQM) that is based on this idea. AQM allows dialog systems to ask questions that maximize their information gain, reducing the uncertainty of the user's intent.



n	SL-Q		AQM+ w/ indA		
are there	e any people?	no	are there any people?	no	
	lor of water?	blue	what kind of bird is it 's body ?	falcon maybe, it 's small	
	lor is water ?	blue	what color of parrot ?	green	
is it sun		yes	are there leaves ?	yes	
	e any people?	yes	what color is bird ?	black and white	
	e any other animals	no	what color of water ?	blue	
in pictur		no	does it is water?		
				yes	
is it 's sl		yes	are there trees in ocean?	yes	
in the water are there is bird 's	e clouds?	ca n't ell	are there grass?	yes	
is ond :		yes	can you see sky ?	dA (rondO)	
1	AQM+ w/ indA (gen1Q, Q = 100)  AQM+ w/ indA (randQ)				
	lor is there is there?	it is black and white	what is man wearing?	i can only see his shirt which is blue	
	lor is sky ?	ca n't see it	any words on bus ?	yes, it says UNK	
100000000000000000000000000000000000000	nd of lake?	i ca n't tell	, ,	yes, it is green	
	nd of lake ?	i ca n't tell	can you tell what time of day it is?		
	nd of lake?	i ca n't tell	are cows on farm?	i ca n't tell, but i think so	
- The second sec	nd of lake ?	i ca n't tell	any words on bus ?	yes, it says UNE	
	nd of lake?	i ca n't tell	what is man wearing?	i can only see his shirt which is blue	
is there		i ca n't see any	any words on bus ?	yes , it says UNK	
what co	lor is stream?	it 's light brown	is anything in vase?	no	
what kir	nd of water ?	it looks like stream	does man look happy ?	yes	
			RL-QA		
how ma	ny birds are there?	i see 6	seagulls and it would say that it is that	it is that caption they are real picture	
can you	tell what kind of water is?		no, it is it it is it	is it it is it is it caption caption is	
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n :-:-:-	SL-Q		AQM+1		
	ox on plate?	yes	are there see any people?	nc	
	olor is plate?	white	what kind of restaurant?	ca n't tel	
	ge pizza ?	yes	any other than pizza on ?	no	
	appear to cut?	no	any silverware?	no	
	ook like drinks?	no	what color of pizza?	white and green	
is this or	n plate?	yes	what is on pizza?	cheese	
is there	is there ?	no	are there is table?	ye:	
is this is	there?	no	is table have table ?	no	
white plate is there	is restaurant?				
		no	are there anything else?		
is there	is pizza ?	no yes	are there anything else? what else can you?	no there is pizza in background	
is there		yes		no there is pizza in background	
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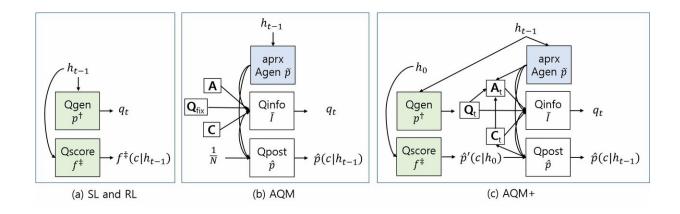
Credit: Lee et al.



Unlike other approaches, AQM explicitly calculates the posterior distribution and finds solutions analytically. Despite its many advantages, AQM was found to generalize poorly in real-world tasks, where the number of objects, questions and answers are typically unrestricted.

In their recent study, the researchers addressed this limitation and proposed a new approach, AQM+. Unlike their previous approach, AQM+ can be applied to large-scale problems, generating questions and answers that are more coherent with the changing context of a given dialog.

"Similar to human dialog, our AQM+ models what the opponent says and reasons the most effective strategy to grasp the opponent's mind and intent, using an information theory metric (information gain)," Lee explained. "This approach is different from previous neural network-based methods for TOD, which mainly employed sequence-to-sequence (Seq2Seq) for directly generating questions by responding to the previous utterance."



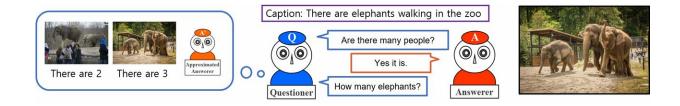
Credit: Lee et al.



Lee and his colleagues evaluated AQM+ on a challenging task-oriented visual dialog problem called GuessWhich. Their model achieved remarkable results, outperforming state-of-the-art approaches by a considerable margin.

"The approach based on our 20 Questions game in AQM+ for questioning users can tackle complex dialog situations where there exist many and various answers and cases related to general-formed questions, as well as yes or no questions," Lee said. "This means that our AQM+ can be applied to different TOD situations in the real world."

In their tests, Lee and his colleagues Jung-Woo Ha, Tong Gao, Sohee Yang and Jaejun Yoo found that AQM+ reduced errors by 60 percent as a dialog proceeds, while existing algorithms achieved an error reduction of less than 6 percent. According to the researchers, AQM+ could be used to generate both open and closed questions.



Credit: Lee et al.

"Effectively training models from dialog data in an end-to-end manner remains highly challenging, particularly for the development of TOD systems," Jung-Woo Ha, another researcher involved in the study, told TechXplore. "Although AQM+ mainly focuses on questioning to get useful information from the answerer, it can be naturally extended by



including answering the questions based on the same approach."

Lee, Ha and their colleagues are now considering a number of directions for future research. Firstly, they would like to develop their approach further in order to achieve a general learning framework for dialog. Their ultimate objective is to design a system that can achieve human-like accuracy in communicating with humans.

"Ultimately, we aim to develop a general AI framework that enables human-like machine-machine and machine-human dialogs," Ha said. "As industrial research scientists, we will apply our technologies to diverse services such as messenger and AI assistant platform, thus offering greater value for global users."

**More information:** Large-scale answerer in questioner's mind for visual dialog question generation. arXiv:1902.08355 [cs.CL]. <a href="mailto:arxiv.org/abs/1902.08355">arxiv.org/abs/1902.08355</a>

Answerer in questioner's mind: information theoretic approach to goal-oriented visual dialog. arXiv:1802.03881 [cs.CV]. <a href="mailto:arxiv.org/abs/1802.03881">arxiv.org/abs/1802.03881</a>

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