

May 21st, 2019 Applied Deep Learning

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HTTP://ADL.MIULAB.TW





FGC – Chinese Listening Comprehension

See an example <u>here</u>



Conversational QA – QuAC & CoQA

Given Given	Student Article / Section Title/ Article Summary	C
Provides	Ask a question to learn as much as possible about this topic!	STU FEA STU FEA STU FEA
		STU.
		STU. TEA
		STU FEA STU FEA
		STU:
		šTU



Collected 🏰 Dialogue Examples

Section: Daffy Duck, Origin & History DENT: What is the origin of Daffy Duck? ACHER: \hookrightarrow first appeared in Porky's Duck Hunt DENT: What was he like in that episode? ACHER:

assertive, unrestrained, combative DENT: Was he the star? ACHER: \hookrightarrow No, barely more than an unnamed bit player in this short DENT: Who was the star? ACHER: \checkmark No answer DENT: Did he change a lot from that first episode in future episodes? ACHER: \hookrightarrow Yes, the only aspects of the character that have remained consistent (...) are his voice characterization by Mel Blanc DENT: How has he changed? ACHER:

Daffy was less anthropomorphic DENT: In what other ways did he change? ACHER: \hookrightarrow Daffy's slobbery, exaggerated lisp (...) is barely noticeable in the early cartoons. DENT: Why did they add the lisp? ACHER: \hookrightarrow One often-repeated "official" story is that it was modeled after producer Leon Schlesinger's tendency to lisp. DENT: Is there an "unofficial" story? TEACHER:
→ Yes, Mel Blanc (...) contradicts that conventional belief

Section: Augusto Pinochet: Intellectual life... STUDENT: Was he known for being intelligent? TEACHER: \hookrightarrow No, Pinochet was publicly known as a man with a lack of culture. STUDENT: why did people feel that way? TEACHER: \(\rightarrow\) reinforced by the fact that he also portrayed himself as a common man STUDENT: did he have any hobbies? TEACHER: \hookrightarrow Yes, Before wresting power from Allende, Pinochet had written two books. STUDENT: what is the name of a book written by him? TEACHER:
→ Geopolitica (1968) and Campana de Tarapaca (1972). STUDENT: what were the books about? TEACHER:

Chile's military literature. STUDENT: was there anything noteworthy regarding his books? TEACHER: \hookrightarrow Yes, In Geopolitica Pinochet plagiarized (...) Gregorio Rodriguez Tascon STUDENT: did he deny those allegations? TEACHER:

→ No answer STUDENT: what did he plagiarize in Geopolitica? TEACHER: -> In Geopolitica Pinochet plagiarized (...) paragraphs from a 1949 presentation

PersonaChat ConvAl2 Data

Persona 1	Persona 2
I like to ski	I am an artist
My wife does not like me anymore	I have four children
I have went to Mexico 4 times this year	I recently got a cat
I hate Mexican food	I enjoy walking for exercise
I like to eat cheetos	I love watching Game of Thrones

[PERSON 1:] Hi

[PERSON 2:] Hello! How are you today?

[PERSON 1:] I am good thank you, how are you.

[PERSON 2:] Great, thanks! My children and I were just about to watch Game of Thrones.

[PERSON 1:] Nice! How old are your children?

[PERSON 2:] I have four that range in age from 10 to 21. You?

[PERSON 1:] I do not have children at the moment.

[PERSON 2:] That just means you get to keep all the popcorn for yourself.

[PERSON 1:] And Cheetos at the moment!

[PERSON 2:] Good choice. Do you watch Game of Thrones?

[PERSON 1:] No, I do not have much time for TV.

[PERSON 2:] I usually spend my time painting: but, I love the show.

Example dialog from the PERSONA-CHAT dataset. Person 1 is given their own persona (top left) at the beginning of the chat, but does not know the persona of Person 2, and vice-versa. They have to get to know each other during the conversation.

Chinese Emotional Conversation (Zhou+, 2018)

Post	M	odel	Response(Original)	Response(Translated)
	Seq2Seq		承诺,就是一个骗子说给一个傻子听的。	A promise is what a cheater says to a fool.
承诺,就是一个骗子说给一个傻子听的。 A promise is what a cheater says to a fool.	ECM	Like	承诺是一个专一的傻子	Promise is a single-minded fool
		Нарру	我就是一个开心的傻子	I'm just a happy fool
		Sad	我就是一个 <mark>悲伤</mark> 的傻子	I am a sad fool
		Disgust	一个 骗子 说给一个 <mark>傻子</mark> 听	A cheater says to a fool
		Angry	不管你信不信,反正我信了!	Whatever you believe or not, I trust in it!
	Sec	_q 2Seq	知道真相的我眼泪掉下来。	After knowing the truth, I burst into tears.
		Like	太可爱了,太可爱了!	Too lovely, it's too lovely.
知道真相的我眼泪笑下来 Knowing the truth, I laughed myself to tears	ECM	Нарру	笑得我眼泪都出来了。	I can't help laugh myself to tears.
		Sad	知道真相的我 <mark>眼泪</mark> 掉下来。	After knowing the truth, I burst into tears.
		Disgust	这是真的还是假的?	Is this true?
		Angry	什么意思?没看懂。	What do you mean? I don't understand.

Equation Generation for Math Problems

Math23K: Chinese

MaWPS: English

Problem: Dan have 2 pens, Jessica have 4

pens. How many pens do they have in total?

Equation: x = 4+2

Solution: 6

BCWS: Bilingual Contextual Word Similarity

English sentence	Chinese sentence	Score
Judges must give both sides an equal	我非常喜歡這個故事,它<告訴>我們一些	7.00
opportunity to <state></state> their cases.	重要的啓示。 (I like this story a lot, which	
	<tells> us some important inspiration.)</tells>	
It was of negligible <importance< b="">> prior</importance<>	黄斑部病變的預防及早期治療是相當<重要>	6.94
to 1990, with antiquated weapons and	约。 (The prevention and early treatment of	
few members.	macular lesions is very <important></important> .)	
Due to the San Andreas Fault bisecting	水果攤老闆似乎很意外真有人買這<冷>貨	3.70
the hill, one side has <cold></cold> water, the	,露出「你真内行」的眼神與我聊了幾句。	
other has hot.	(The owner of the fruit stall seemed surprised	
	that someone bought this <unpopular></unpopular> product,	
	talking me few words about "you are such a pro".)	

Table 1: Sentence pair examples and average annotated scores in BCWS.

Oxford Dictionary

How to leverage knowledge resources for applications

Word	Definition	Example Sentence
bass	The lowest adult male singing voice.	His bass voice rings out attractively.
		These are the opening words of the play, sung as a <i>bass</i> solo.
	The common European freshwater perch.	Only leisure anglers are allowed to fish <i>bass</i> in Irish waters.
		I did manage a couple of hours fishing a <i>bass</i> pool the next morning.

Visual Question Answering (Agrawal+, 2015)



What color are the shoe laces?

Blue Blue Light blue Black Red White

What is he sitting on?

Skateboard Skateboard Skateboard Bench Chair Chair

Visual Question Answering (Zhang et al., 2015)

Question: Are the trees green?





Answer: No

Answer: Yes

Question: Is there a grandma?





Answer: Yes

Answer: No

Visual Question Answering (Goyal+, 2016)

Who is wearing glasses?
man woman





Where is the child sitting? fridge arms





Is the umbrella upside down?





How many children are in the bed?
2





Video Question Answering: MovieQA

(Tapaswi+, 2015)





Q: How does E.T. show his happiness that he is finally returning home?

A: His heart lights up

Q: Why do Joy and Jack get married that first night they meet in Las Vegas?

A: They are both vulnerable and totally drunk

Video Question Answering: TVQA (Lei+, 2018)



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00:00.688 --> 00:03.989
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(Raj:)seemed like a chance to show off.

00:06.360 --> 00:08.243

There he is!

00:08.245 --> 00:10.412

(Raj:)There's my happy Hebraic homeboy.

What Raj and Howard are drinking when sat at the table?

a0 Milk

al Beer V

a2 Juice

a3 Vodka

a4 Carrot juice.

Visual Dialogue (Das+, 2016)



VQA

Q: How many people on wheelchairs?

A: Two

Q: How many wheelchairs?

A: One

Captioning

Two people are in a wheelchair and one is holding a racket.

Visual Dialog

Q: How many people are on wheelchairs?

A: Two

Q: What are their genders?

A: One male and one female

Q: Which one is holding a racket?

A: The woman



Visual Dialog

Q: What is the gender of the one in the white shirt?

A: She is a woman

Q: What is she doing?

A: Playing a Wii game

Q: Is that a man to her right

A: No, it's a woman

Visual Dialogue (Kottur+, 2018)



C : The boat has a dragon head on the front.

Q1: Is the boat on water?

A1:Yes

Q2: What color is it?

A2: White

Q3: Does the dragon have a body?

A3: No, just the head

Q4: What color is it?

Known Entities

boat





dragon head



water

Audio Visual Scene-aware Dialog (AVSD) (Hori+, 2018)

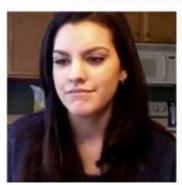
Sample Image	10120180		
Unimodal (VGG-16)	a monkey is running	a man is slicing a potato	a man is singing
Naïve Fusion (V)	a dog is playing	a woman is cutting an onion	a man is singing
Naïve Fusion (AV)	a monkey is running	a woman is peeling an onion	a man is playing a guitar
Attentional Fusion (V)	a monkey is pulling a dogs tail	a man is slicing a potato	a man is playing a guitar
Attentional Fusion (AV)	a monkey is playing	a woman is peeling an onion	a man is playing a violin
	Attentional Fusion (V)	Our inclusion of audio	Both audio features and
Discussion	(i.e., Multimodal atten-	features enabled the	multimodal attention are
Discussion	tion on visual features)	"peeling" action to be	needed to identify "vio-
	worked best.	identified.	lin".

CMU-MOSEI Dataset (Zadeh+, 2018)

Language: And he I don't think he got mad when hah I don't know maybe.

Vision:

Gaze aversion

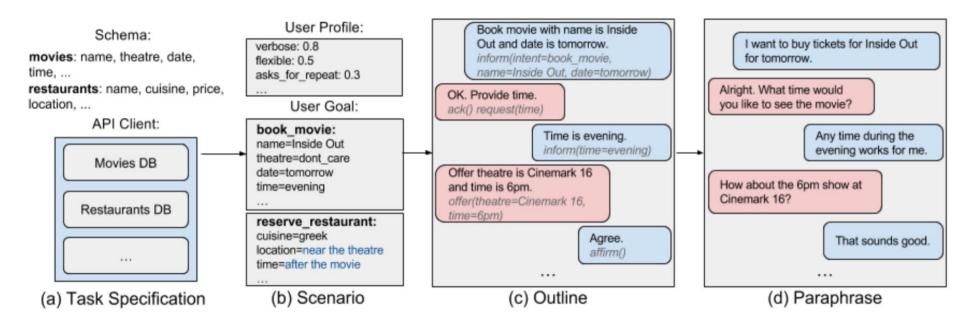




Acoustic:

(frustrated voice)

Machines Talking to Machines (M2M)



M2M

Data Samples

Outline		Paraphrase
Annotation (a_i)	Template utterances (t_i)	NL utterances (u _i)
S: greeting()	Greeting.	Hi, how can I help you?
U: inform(intent=book_movie, name=Inside Out, date=tomorrow, num_tickets=2)	Book movie with name is Inside Out and date is tomorrow and num tickets is 2.	I want to buy 2 tickets for Inside Out for tomorrow.
S: ack() request(time)	OK. Provide time.	Alright. What time would you like to see the movie?
U: inform(time=evening)	Time is evening.	Anytime during the evening works for me.
S: offer(theatre=Cinemark 16,	Offer theatre is Cinemark 16 and	How about the 6pm show at
time=6pm)	time is 6pm.	Cinemark 16?
U: affirm()	Agree.	That sounds good.
S: notify_success()	Reservation confirmed.	Your tickets have been booked!
U: inform(intent=find_restaurant, meal=dinner, location=near the theatre)	Find restaurant with meal is dinner and location is near the theatre.	I want to get dinner at a restaurant near the theatre.
S: request(cuisine, price_range)	Provide cuisine and price range.	Do you have any preference for cuisine or price range?
U: inform(cuisine=DontCare, price_range=moderate, rating=high)	Cuisine is I don't care and price range is moderate and rating is high.	I'm fine with any cuisine. Look for something moderately priced, but make sure it has a high rating.
S: select(restaurant={First Wok,	Select restaurant from First Wok,	First Wok and Lucy's Grill are
Lucy's Grill}, location=near the	Lucy's Grill with location is near the	some good options near the
theatre)	theatre.	theatre.
U: inform(intent=reserve_restaurant,	Reserve restaurant with restaurant is	First Wok sounds perfect. Can you
restaurant=First Wok, time=after the	First Wok and time is after the	reserve a table there for dinner
movie)	movie.	after the movie?
S: ack() confirm(restaurant=First	OK. Confirm restaurant is First Wok	Sure. Please confirm that it is a table
Wok, time=8pm, num_people=2)	and time is 8pm and num people is 2.	for 2 at First Wok for 8pm.
U: affirm()	Agree.	That is correct.
S: notify_success()	Reservation confirmed.	Your table has been reserved.
U: thank_you() good_bye()	Thank you and good bye.	Thanks! That's all for now.



Final Project

Task: choose by yourself

- Improve results from assignments
- Try new tasks
- Advance the current model performance
- Compare various models' performance

Rules

- Models should be related to this course
- Only running published models is not preferred
- Using project from other courses or research is accepted
- Divide the work load

Presentation

- Progress oral presentation: June 4th 9:10am (10 mins for each)
- Final presentation: June 25th 9:10am

Report

- Due at June 29th
- Contact me if you need the grade for graduation



Remaining Course Schedule

Attendance is required for project presentation!

Date	Event	Note
2019/05/28	Microsoft Company Workshop	8:30am 集合
2019/06/04	Break	
2019/06/11	Project Progress Presentation	9:10am
2019/06/18	Yahoo! Company Workshop	8:30am 集合
2019/06/25	Final Project Presentation	9:10am