## **Bachelor Thesis Defense:**

# Building Complex Queries in Conversational Search

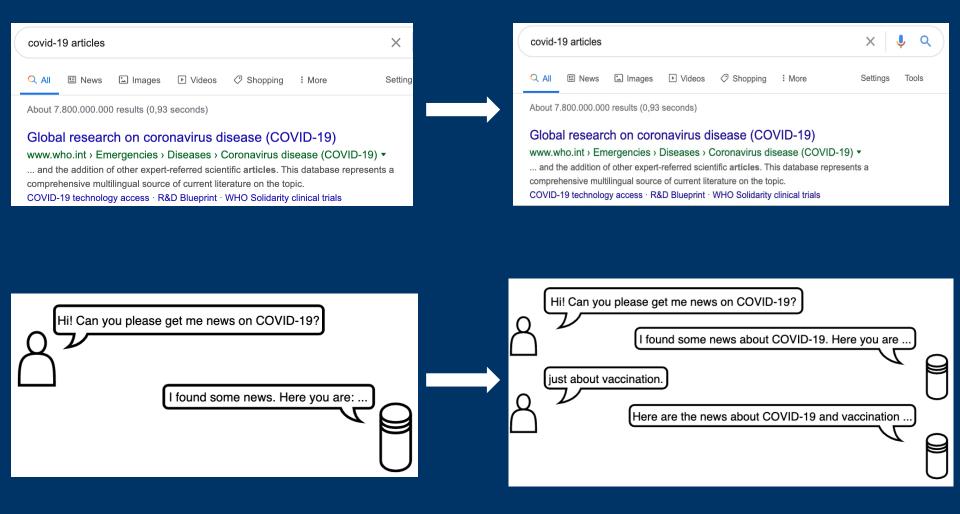
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Advisor: Johannes Kiesel

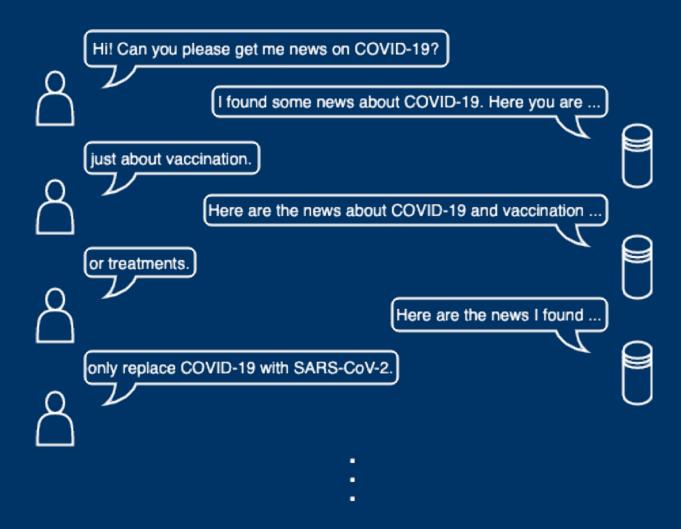
Referees: Prof. Benno Stein, Jr. Prof. Jan Ehlers

# **Build Queries**

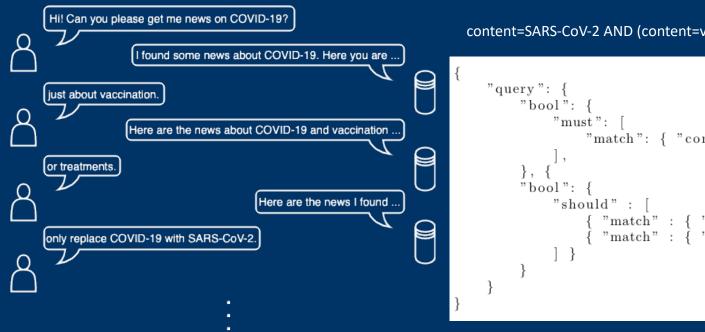
#### Traditional Search v.s. Conversational Search



# **Complex Queries**



# **Complex Queries**



content=SARS-CoV-2 AND (content=vaccination OR content=treatment)

```
"match": { "content": "SARS-CoV-2" }
{ "match" : { "content" : "vaccination" } }, 
{ "match" : { "content" : "treatment" } }
```

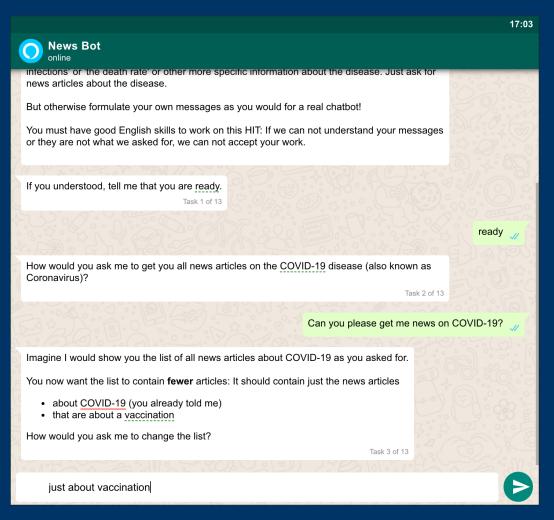
# Question

How will seekers formulate their queries while interacting with a system in a multi-turn conversational search?

## Contribution

- 1. Conduct a study to collect human utterances
- 2. Analyze the collected utterances and recognize patterns
- 3. Build the interaction model as front-end of a prototype

# **Crowdsourcing Study**



- Mechanical Turk
- 5 countries (Australia, Canada, India, the United Kingdom, the United States)
- 4 scenarios (argument, book, news, trip)
- 1 'ready' task + 12 query reformulation tasks
- 20\*4\*5 = 400 participants
- 400\*12 = 4800 human natural language utterances
- 8 pilot studies for news scenario

# **Tasks of Crowdsourcing Study**

## **CRUD** operations

Operation	Target						
	Query	Part	Literal				
Create	Show me news about COVID-19.	Show me news that contain NCD, NI or WHO in the headline.					
$\mathbf{R}$ ead	What do I have so far?	What filters did I set for the headline?	What was the last filter?				
$\mathbf{U}\mathrm{pdate}$	Please start a new search on flu.	Remove my criteria for headline and search any news about economy.	I don't mean North Ireland by NI.				
Delete	No, let's start again.	Remove the word filters vaccination and treatment.	Remove news about treatment.				

## Query Reformulation Intent: Operation + Target

- ReadQuery: Memorization & Navigation
- UpdateLiteral: e.g., Negative Feedback
- DeleteQuery: start v.s. restart

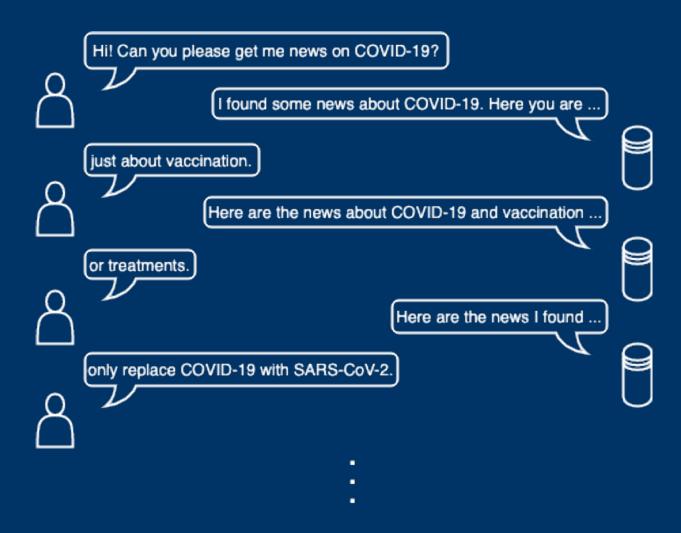
## **Curation of Crowdsourcing Study**

Choose File news-in-2.csv													
Status Time	ask for COVID-19	add vaccination	add 'or treatment'	delete two filters(so results should include all articles about virus whether they are related to both filters or not)	specify headline with NCD, NI, WHO	say not North Ireland(indicate the error made by chatbot)	say National Insurance	say not COVID-19 but SARS-CoV-2	ask chatbot to repeat your query	replace NCD, NI, WHO(headline filters) with economy	change to flu	ask flu but not about COVID- 19	Comment
reject 11:11	Covid-19 disease? good ○ bad	I want to know all about vaccination	it?	and treatment of this disease	and NCD in headline		What do you know about national insurance? good obad very bad	How COVID-19 is related to SARS-CoV-2 disease? good O bad O very bad O	know about it good O bad • very	what comes in headlines	good O	how THIS is related to COVID- 19 good Obad Overy bad O	THANKS
reject 36:56	COVID-19 good © bad  very bad	show me the news about vaccination good • bad o very bad	available good • bad • very bad	show me the news articles that are not on vaccination or	show me the articles that contain NCD or NI or Who as headline.	contain North Ireland instead it should contain NI only.	show me the articles that has discusses about National Insurance in the disease. good © bad ○ very bad ○	show me the articles about SARS-Cov-2 instaed of COVID-19 which should contain at least NCD or NI means National Insurance or WHO as headline. good @ bad O very bad O	show me the details about my previous search. good • bad ○ very bad ○	the economy that does not have NCD or NI or WHO as headline.	about Hu.	show me only those articles that are not about COVID-19 good ● bad ○ very bad ○	na
reject	on COVID-19 pandemic good • bad very bad	show me article having details about	detail about treatment	doesn't have vaccination or		hey you misunderstood NI doesn't means North Ireland good © bad O very bad	so correct it's National Insurance good © bad O very bad	Now show me articles about SARS-CoV2 rather than COVID-19 good © bad ○ very bad ○	all previous filters good	about the economy as headline good obad o	articles	filter that don't have COVID-19 good ● bad ○ very bad ○	{}

- News scenario: 5 countries (AU, CA, GB, IN, US)
- Argument, news and book scenarios: 3 countries (CA, GB, US)
- Number of approved participants: 284
- Three categories: "good", "bad", "very bad"
- 2919 "good" utterances (85.65%), 1434 patterns

## **Analysis of Crowdsourcing Study**

**Ambiguity** 



**Ambiguity** 

- A. mix up with other tasks due to the existence of overlapping patterns
- Task 2 (createQuery) v.s. Task 3 (createLiteral) v.s. Task 4 (updatePart)
- Task 7 (rejectLiteral) v.s. Task 13 (createNegLiteral)
- Task 2 (createQuery) v.s. Task 12 (updateQuery)
- B. misunderstood by participants
- Task 5 (deletePart)
- Task 11 (updatePart)

## **Ambiguity**

A. mix up with other tasks due to the existence of overlapping patterns

Bauhaus-Universität Weimar

How would you ask me to get you all news articles on the <u>COVID-19</u> disease (also known as Coronavirus)?

Imagine I would show you the list of all news articles about COVID-19 as you asked for.

You now want the list to contain fewer articles: It should contain just the news articles

- about COVID-19 (you already told me)
- · that are about a vaccination

How would you ask me to change the list?

Assume I changed the list accordingly.

You now want the list to contain more articles: It should contain the news articles

- about COVID-19 (you already told me)
- that are about either:
  - vaccination (you already told me), or
  - treatment (as a new alternative to vaccination).

How would you ask me to change the list?

Task 2 Create(COVID-19): start a search for main-topic COVID-19

Task 3 Create(vaccination): add subtopic vaccination to filter previously obtained results

- just show me news about vaccination.
- ⇒ Create(vaccination) OR Update(COVID-19, vaccination)
- show me news that are only about vaccination.
- ⇒ Update(COVID-19, vaccination) OR Update (COVID-19, COVID-19 ∨ vaccination)

Task 4 Update(vaccination, vaccination V treatment): add another subtopic treatment as an alternative to vaccination

- please also add news about treatment to the list.
- ⇒ Update(vaccination, vaccination V treatment) OR Create(treatment)
- show me news about treatment.
- $\Rightarrow$  Update(vaccination, vaccination V treatment) OR Update(COVID-19  $\land$  vaccination, treatment)

- Use pronouns (co-reference):
- can you [only|just] [show|give] [me|] [ones|those] [about|on] vaccination?
- which [of|] [these|ones] [include|relate to] vaccination?
- 2. Use verbs like filter, trim down, narrow down, reduce, shorten
- can you [filter|shorten|trim down|reduce] list to [those|ones|] about vaccination?
- filter [these|this list] [with|for] vaccination [only|].
- 3. Elimination
- [please] [remove|filter out] {collection} that are not [relate to|about]] vaccination.

## **Ambiguity**

B. misunderstood by participants

• Task 5 (deletePart)

Assume I changed the list accordingly.

You now want the list to contain more articles: It should again contain all news articles

 about <u>COVID-19</u> (you already told me, but now again with those news articles that are not about vaccination or treatment)

How would you ask me to change the list?

Task 5a delete(vaccination V treatment): remove part of filters

- add back all news that are not about vaccination or treatment to the list.
- can you show me all news not just the ones about vaccination or treatment?
- please remove filters vaccination and treatment.

Task 5b update(vaccination  $\lor$  treatment,  $\neg$ vaccination  $\lor$   $\neg$ treatment): update part of filters to negation of filters

- now please show me news that are not about vaccination or treatment.
- please remove all news about vaccination or treatment.

## **Front-end of Prototype**

#### Interaction Model

Task	Intent	Utterances	Slots	Descriptions
2	CreateQueryIntent	274	2	Seekers start a search session for collection about a main-topic.
3	CreateLiteralIntent	82	2	Seekers add a subtopic to filter previously obtained result list.
4	${\bf Update PartIntent}$	55	3	Seekers add an alternative subtopic.
5	DeletePartIntent	70	3	Seekers remove part of filters.
6	CreatePartIntent	262	5	Seekers specify certain field with part of filters.
7	RejectLiteralIntent	155	4	Seekers indicate a error made by the system and reject the unexpected filter.
9	Update Literal Intent	258	4	Seekers replace a existing filter with a new filter.
10	ReadQueryIntent	189	1	Seekers ask for system to recall the search history.
11	${\bf Update Part Field Intent}$	133	6	Seekers replace part of filters for certain field with another new filter.
12	Update Query Intent	140	2	Seekers replace the entire query with a new filter.
13	${\bf Create Neg Literal Intent}$	263	2	Seekers add a negation of existing filter.

- 11 custom Intents
- Max. 6 custom Slot Types
- Replace patterns with human annotations as sample utterances
- Bad generalizability for different scenarios

## **Front-end of Prototype**

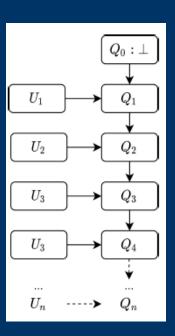
**Evaluation** 

	< Go Back	Evaluation /	3714083	32-3f	Source: TASK2
-	0%	Passed () Falled (275) Total Test Cases: 275	in <b>DEVELOPME</b> I	S_ENDED_LABEL NT	
	#	UTTERANCE		EXPECTED [E] [A] INTENT	VS ACTUAL
	256	Show me all trips to S	San Jose	E: createQuery updateQuery	y, A:
	257	Show me trips to San	Jose	E: createQuery updateQuery	y, A:
	258	list trips to San jose			у
	259	Can you open up all t Jose	rips to San	E: createQuery updateQuery	y, A:
	260	I want you to get all t Jose	rips to San	E: createQuery updateQuery	y, A:
	261	Can you find me all tr Jose please.	ips to San	createQuer	у
	262	Trips to San Jose.		E: createQuer confirmLiteral	
	263	Show me trips to San	Jose.	E: createQuery updateQuery	y, A:

- Prove the existence of ambiguous patterns (explicit)
- Figure out the implicit ambiguity

## **Future Work**

- Implement back-end of the prototype
  - Detect ambiguity of human utterances
  - Minimize ambiguity
    - Check correlation between different filters in the documents (semantic, occurrence etc.)
  - Reasoning & Memorization (e.g. Negative Feedback)
- Follow-up studies
  - Test for resolving ambiguity
  - Test for prototype



# Thank you for your attention!

**Question Time**