



## RePair My Queries

Personalized Query Reformulation via Conditional Transformers

Fani's Lab!

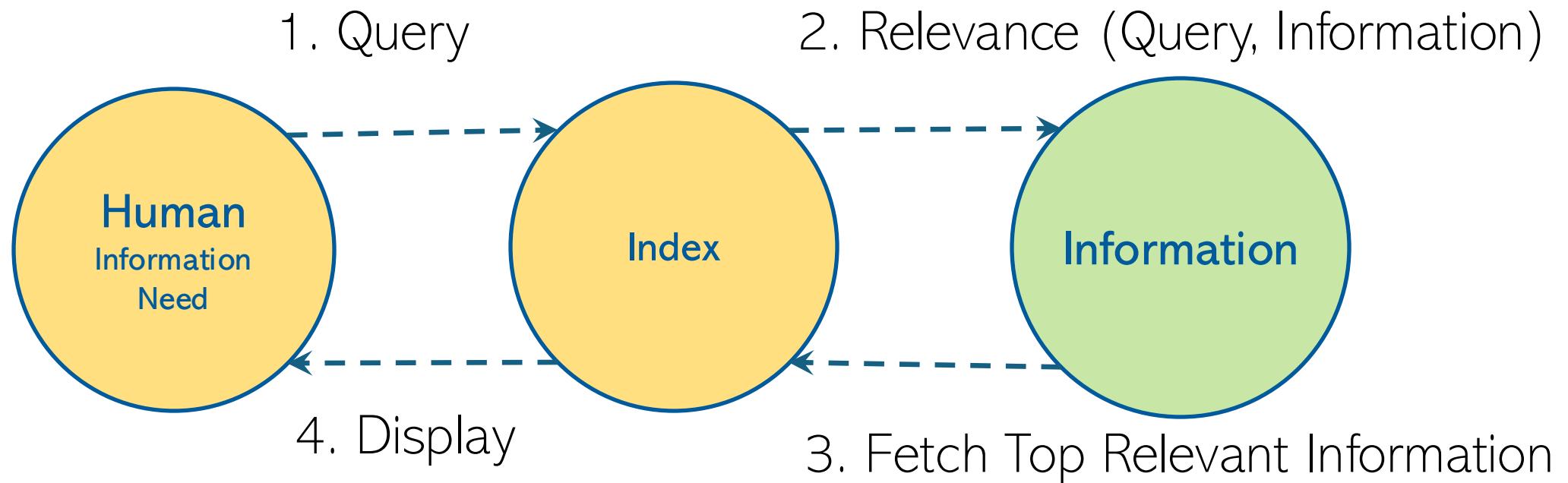


|

[Google Search](#)[I'm Feeling Lucky](#)

Google offered in: [Français](#)

# Information Retrieval: Yesterday



# Repair & RePair

**q:** “which type of viruses can be directly used for translation”

National Institutes of Health (.gov)  
<https://www.ncbi.nlm.nih.gov/articles/PMC3579402> ::

Tinkering with Translation: Protein Synthesis in Virus- ... ✓

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<https://www.ncbi.nlm.nih.gov/articles/PMC7158166> ::

Replication and Expression Strategies of Viruses - PMC ✗

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LibreTexts  
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22: The Viruses ✓

May 16, 2022 — **Class IV: +ssRNA Viruses** with plus-strand RNA, such as poliovirus, can use their genome directly as mRNA with translation by the host ribosome ...

Wikipedia  
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DNA viruses usually use host cell proteins and enzymes to make additional DNA that is used to copy the genome or be transcribed to messenger RNA (mRNA), which ...

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[https://en.wikipedia.org/wiki/Sense\\_\(molecular\\_biology\)](https://en.wikipedia.org/wiki/Sense_(molecular_biology)) ::

Sense (molecular biology) ✓

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## DNA Transcription | Learn Science at Scitable

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<https://bio.libretexts.org> > ... > Microbiology (Bruslind) ::

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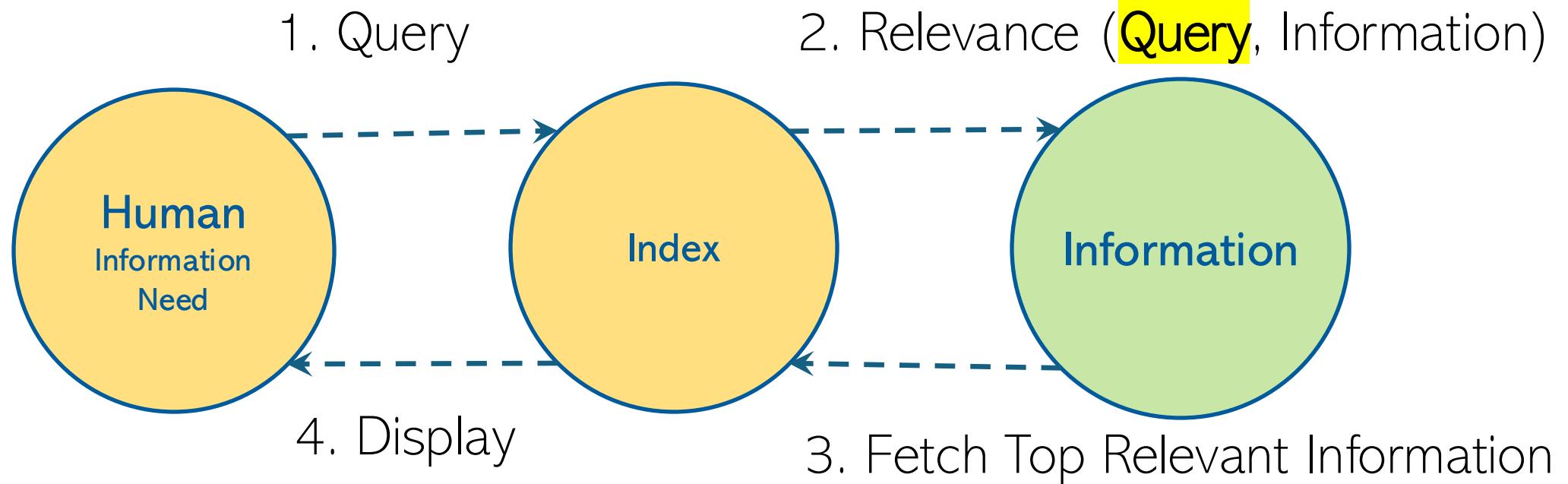




Photo: unknown

## Query Formulation by User: A Difficult Task

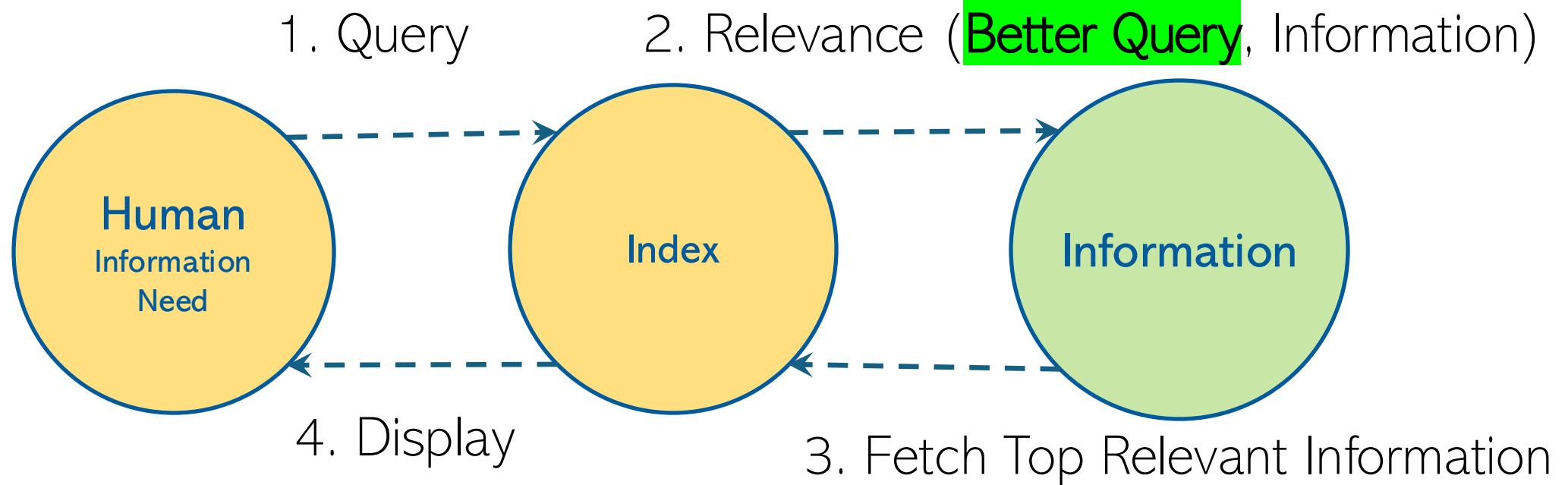
Unclear/Uncertain Knowledge [Belkin'97]  
Vocabulary Mismatch [Furnas'87]

**“lost shot” vs. “stray bullet”**

N. J. Belkin, R. N. Oddy, and H. M. Brooks. 1997. Ask for information retrieval: part I.: background and theory. *Readings in information retrieval*. Morgan Kaufmann Publishers Inc., San Francisco, CA, USA, 299–304.

G. W. Furnas, T. K. Landauer, L. M. Gomez, and S. T. Dumais. 1987. The vocabulary problem in human-system communication. *Commun. ACM* 30, 11 (Nov. 1987), 964–971.

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Query Refinement, Reformulation, Suggestion, Expansion

Photo by: Julia Wimmerlin

# Repair & RePair

q: first submitted query “which type of viruses can be directly used for translation”

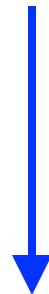


Search Session & Clickthrough

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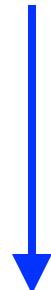


**Supervised Seq2Seq Neural Models** [Dehghani'17, Ahmad'19]

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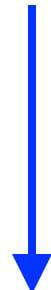


**Query (Topic) Drift** [Tamannaee'20]

**q\*: last submitted query** “computer viruses” or “language translation”

# Repair & RePair

**q:** first submitted query “which type of viruses can be directly used for translation”



**ReQue: No query drift, guaranteed!** [Tamannaee'20]

**q\*:** refined query (ies) “positive-sense rna”

“gene from cell transcribed rna”

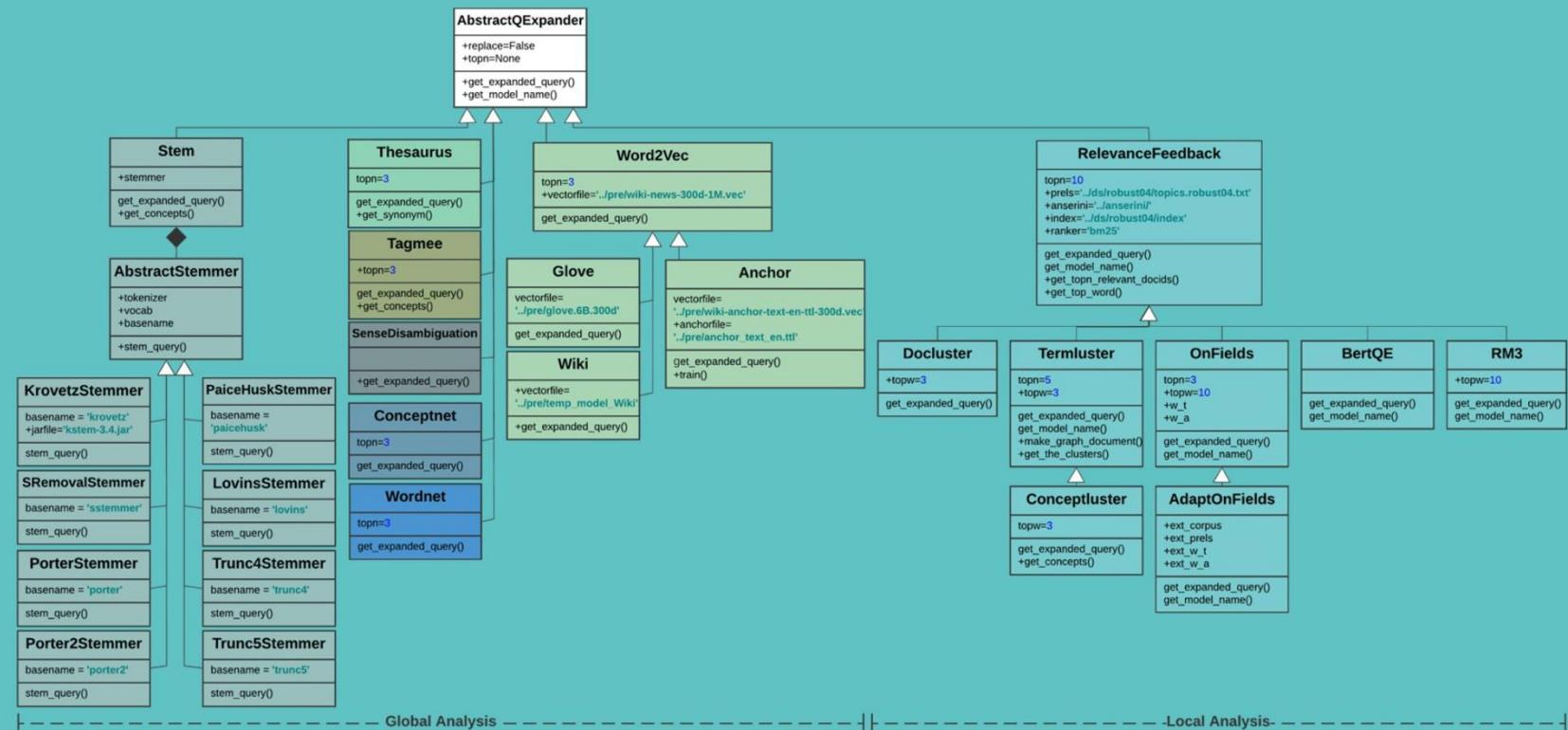
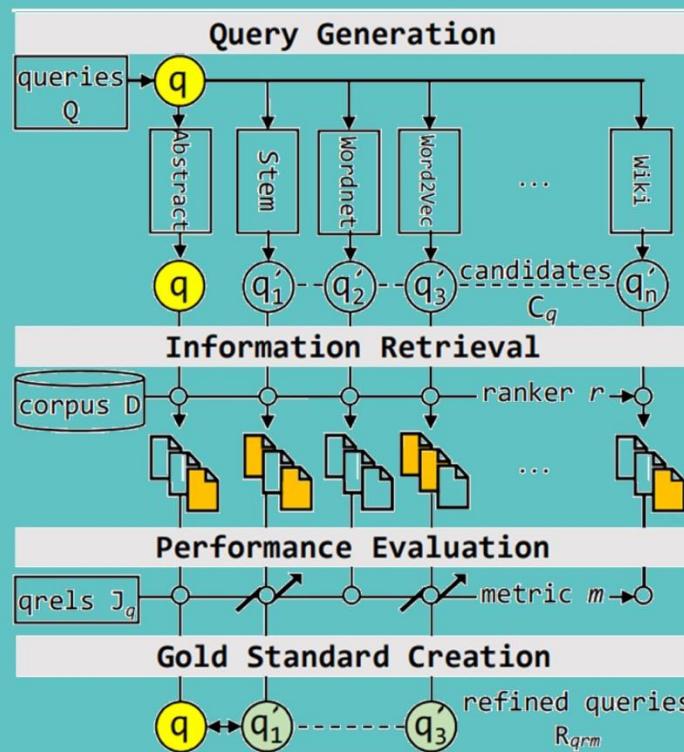
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# An Extensible Toolkit of Query Refinement Methods and Gold Standard Dataset Generation

H. Fani<sup>1</sup>, N. Arabzadeh<sup>2</sup>, M. Tamannaee<sup>2</sup>, F. Zarrinkalam<sup>2</sup>, J. Samouh<sup>2</sup>, S. Paydar<sup>2</sup>, E. Bagheri<sup>2</sup>

<sup>1</sup>University of Windsor, Canada. <sup>2</sup>Ryerson University, Canada.

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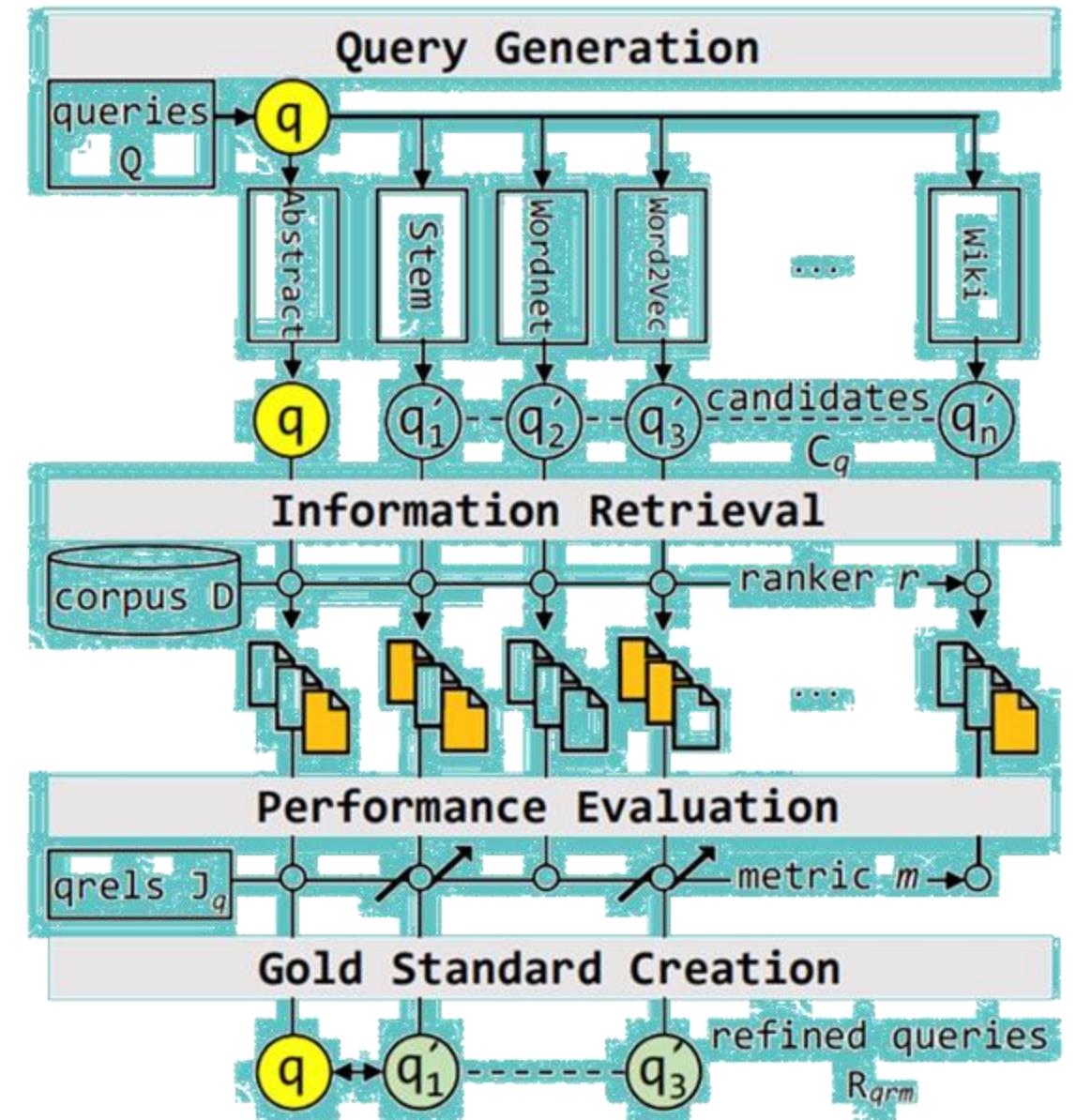


# Repair & RePair

$q$ : first submitted query

↓  
**ReQue**

$q^*$ : refined query (ies)

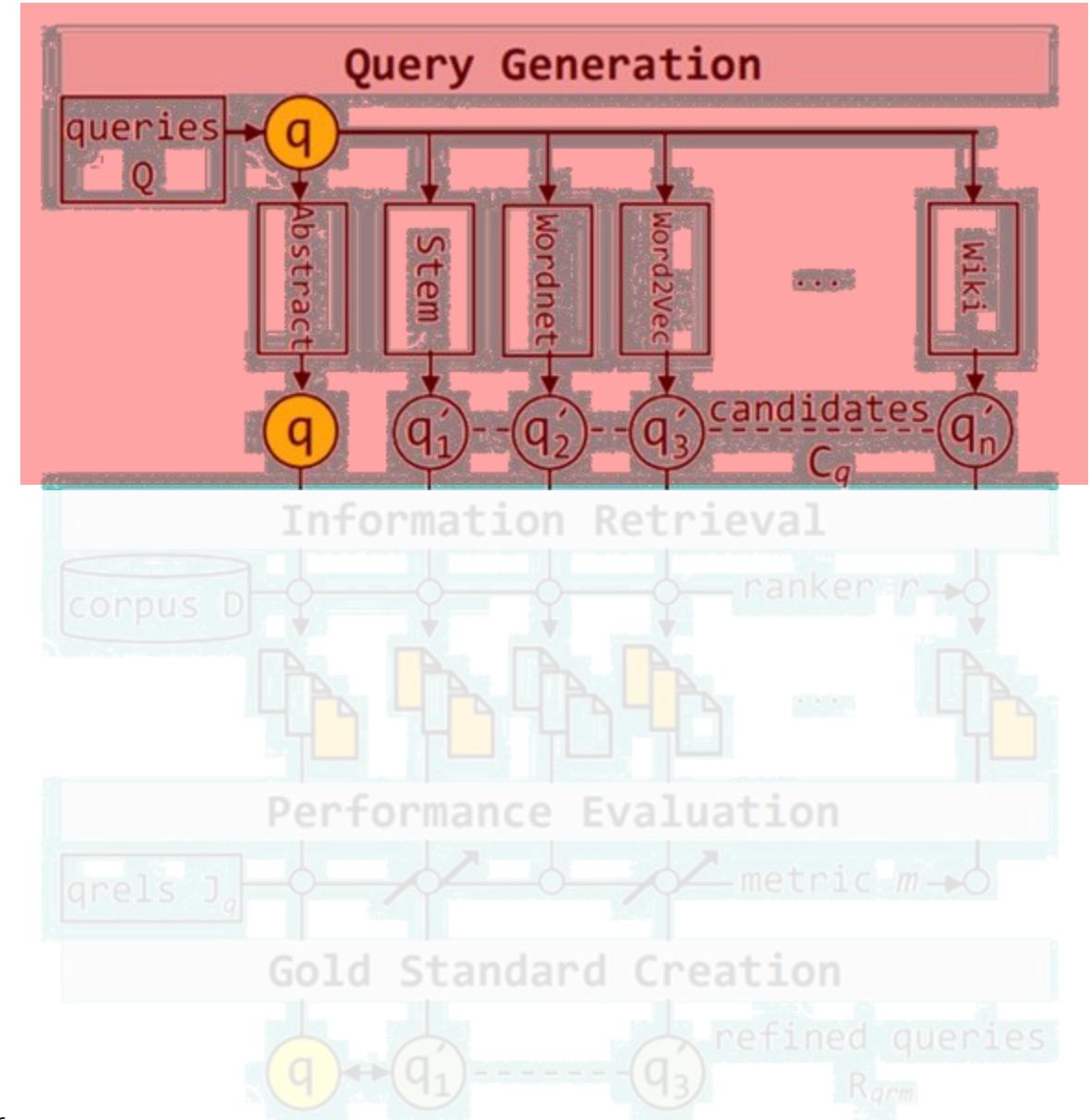


# Repair & RePair

$q$ : first submitted query

ReQue: Time Consuming.

$q^*$ : refined query (ies)



# Repair & RePair

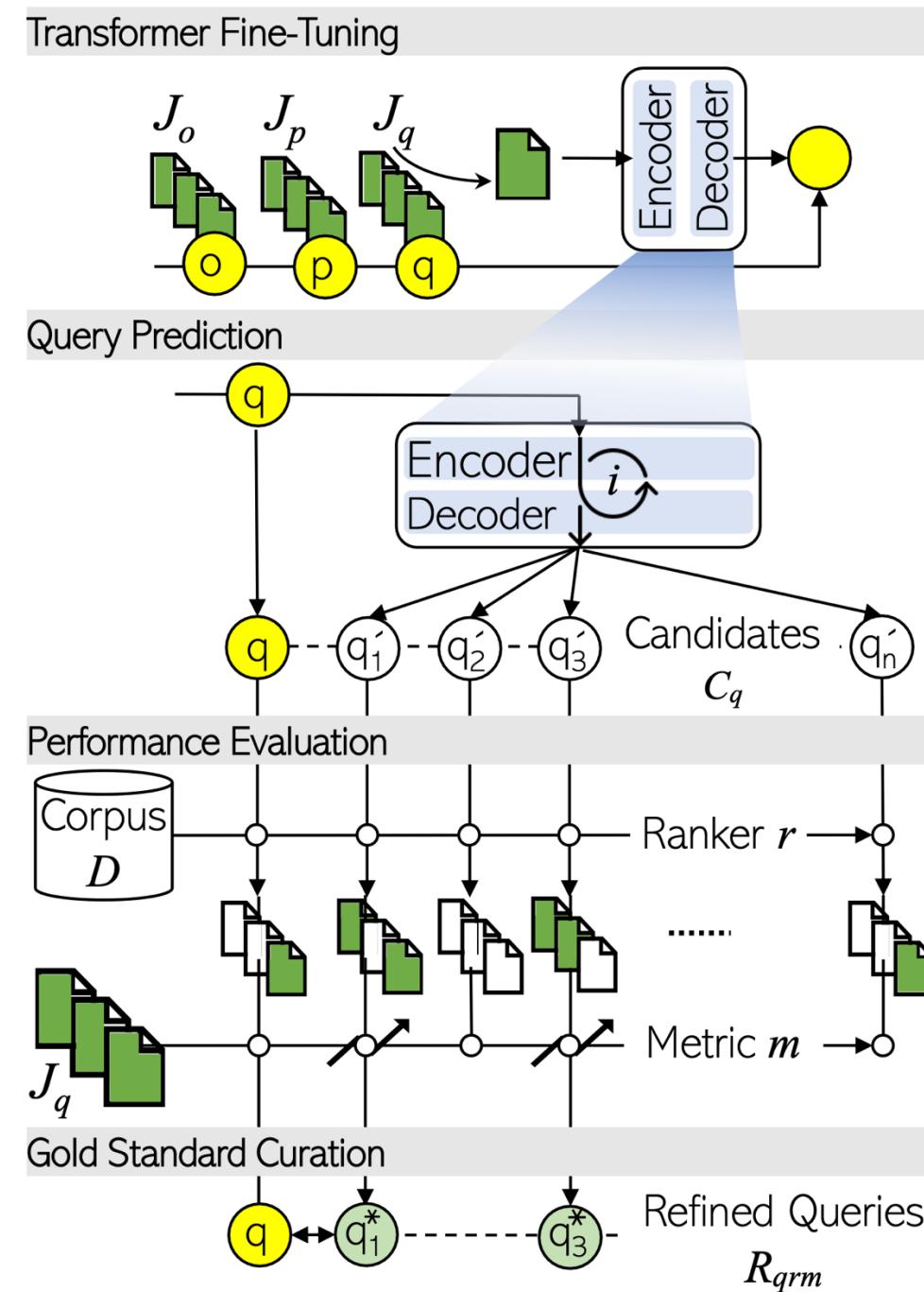
$q$ : first submitted query

RePair: Transformer-based.

$q^*$ : refined query (ies)

Arabzadeh et al. Matches Made in Heaven: Toolkit and Large-Scale Datasets for Supervised Query Reformulation. CIKM '21.

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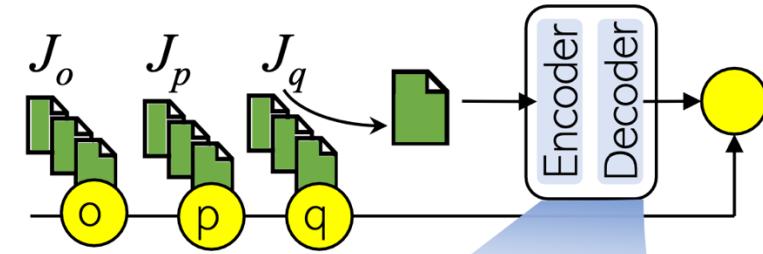
$J_q$ : relevant docs (rels)

$$P(q | J_q)$$

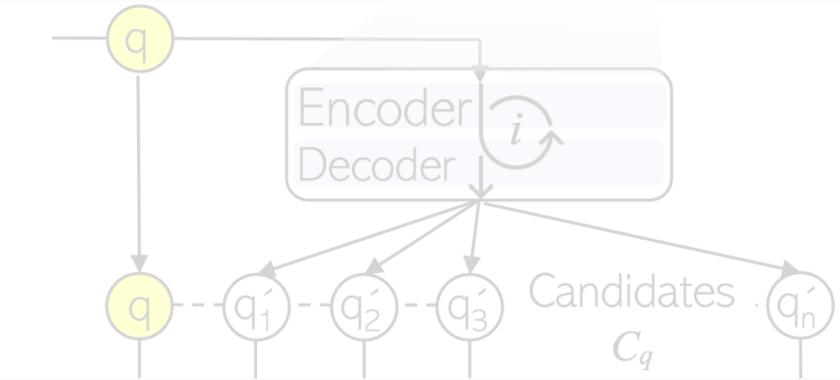
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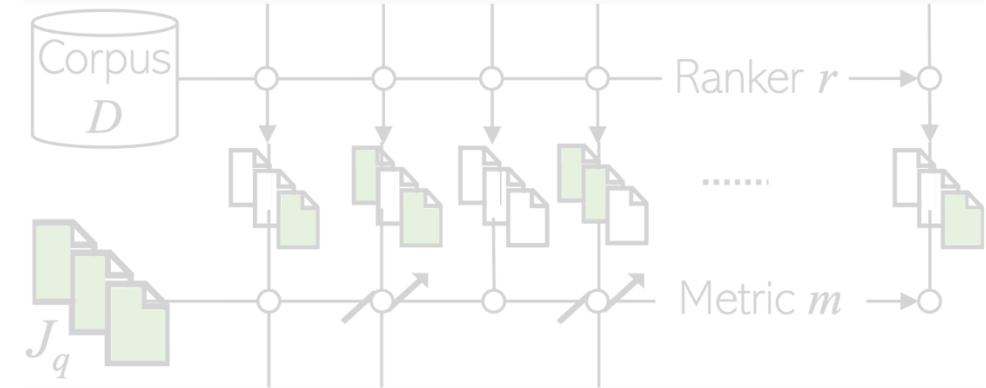
## Transformer Fine-Tuning



## Query Prediction



## Performance Evaluation



## Gold Standard Curation



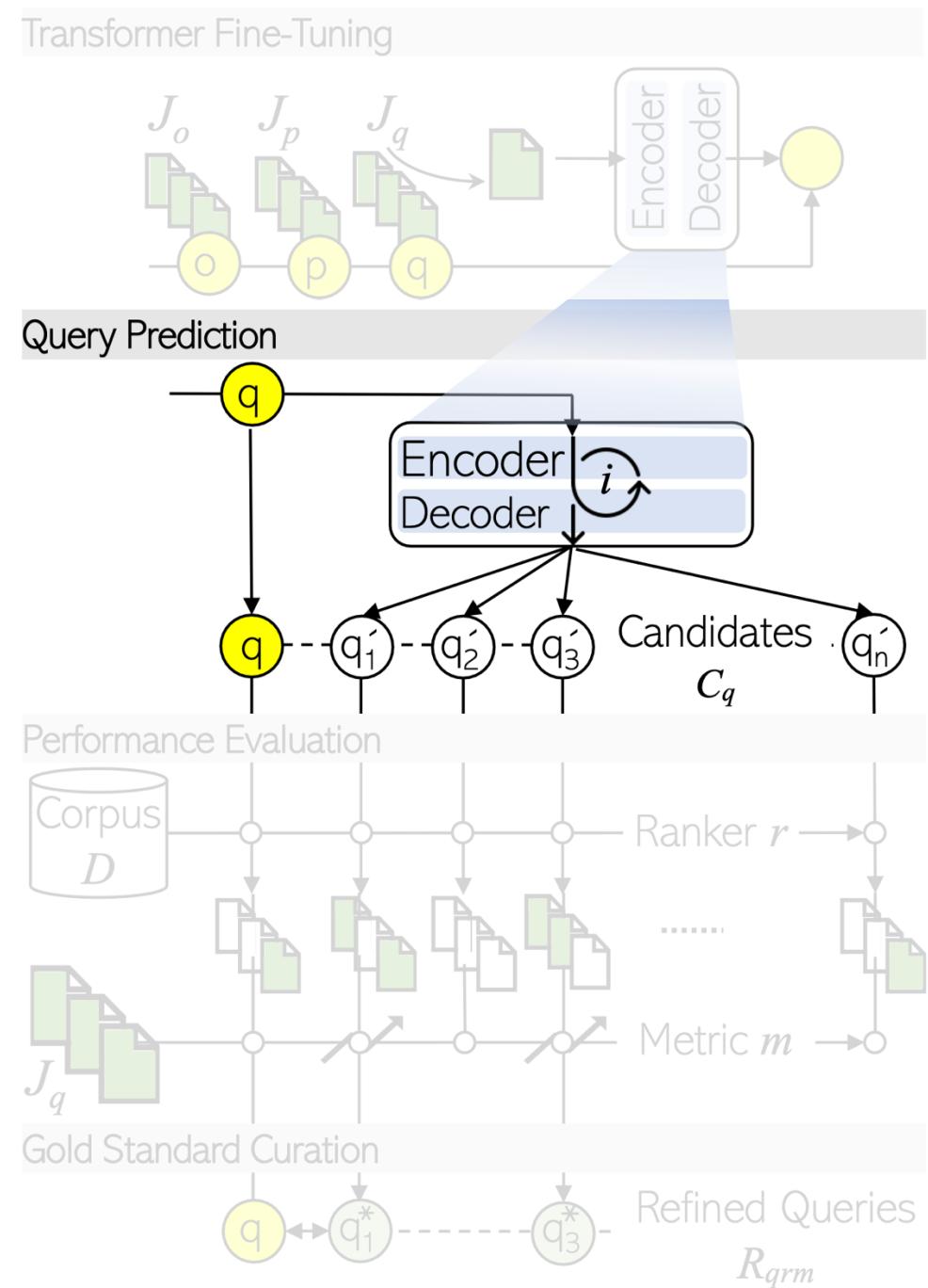
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$q$ : first submitted query

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$q^*$ : refined query (ies)

$$P(q^* | q)$$



# Repair & RePair

**q:** first submitted query “which type of viruses can be directly used for translation”



Query-driven, **but user-less**

**q\*:** refined query “the gene from cell transcribed positive-sense rna”

# Repair & RePair My Query

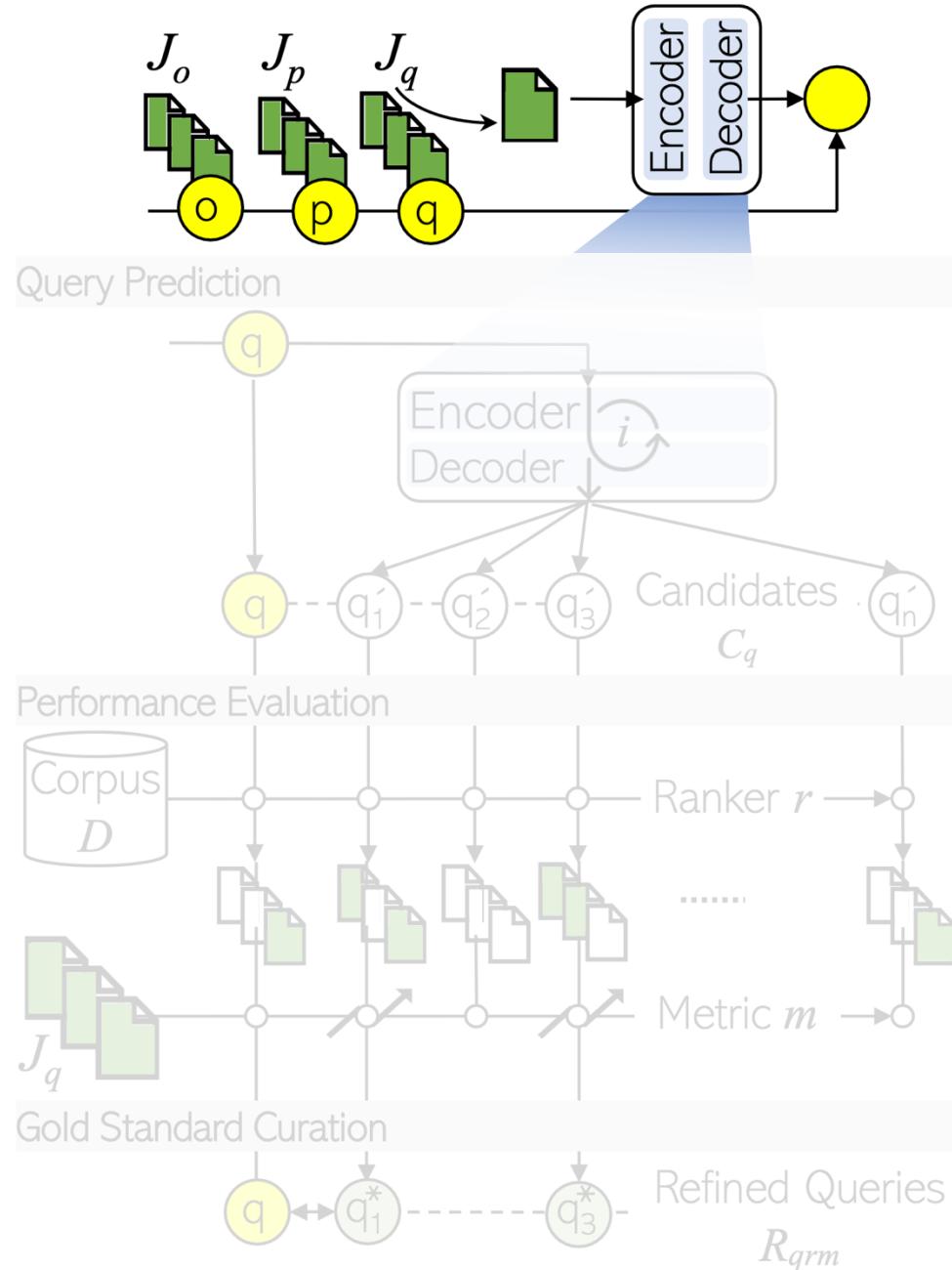
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User-based (subjective relevance), query-driven

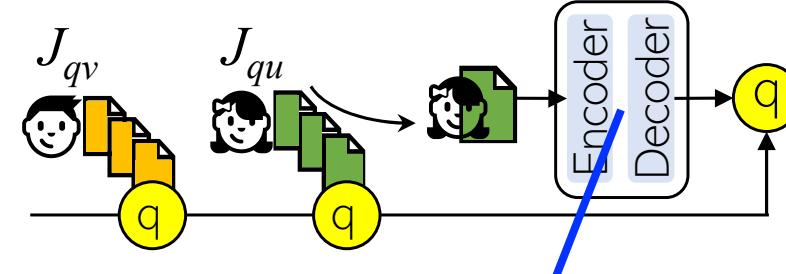
**q\*<sub>Yoges</sub>:** refined query “positive-sense rna”

**q\*<sub>Hossein</sub>:** refined query “protein synthesis in virus-infected cells”

## Transformer Fine-Tuning



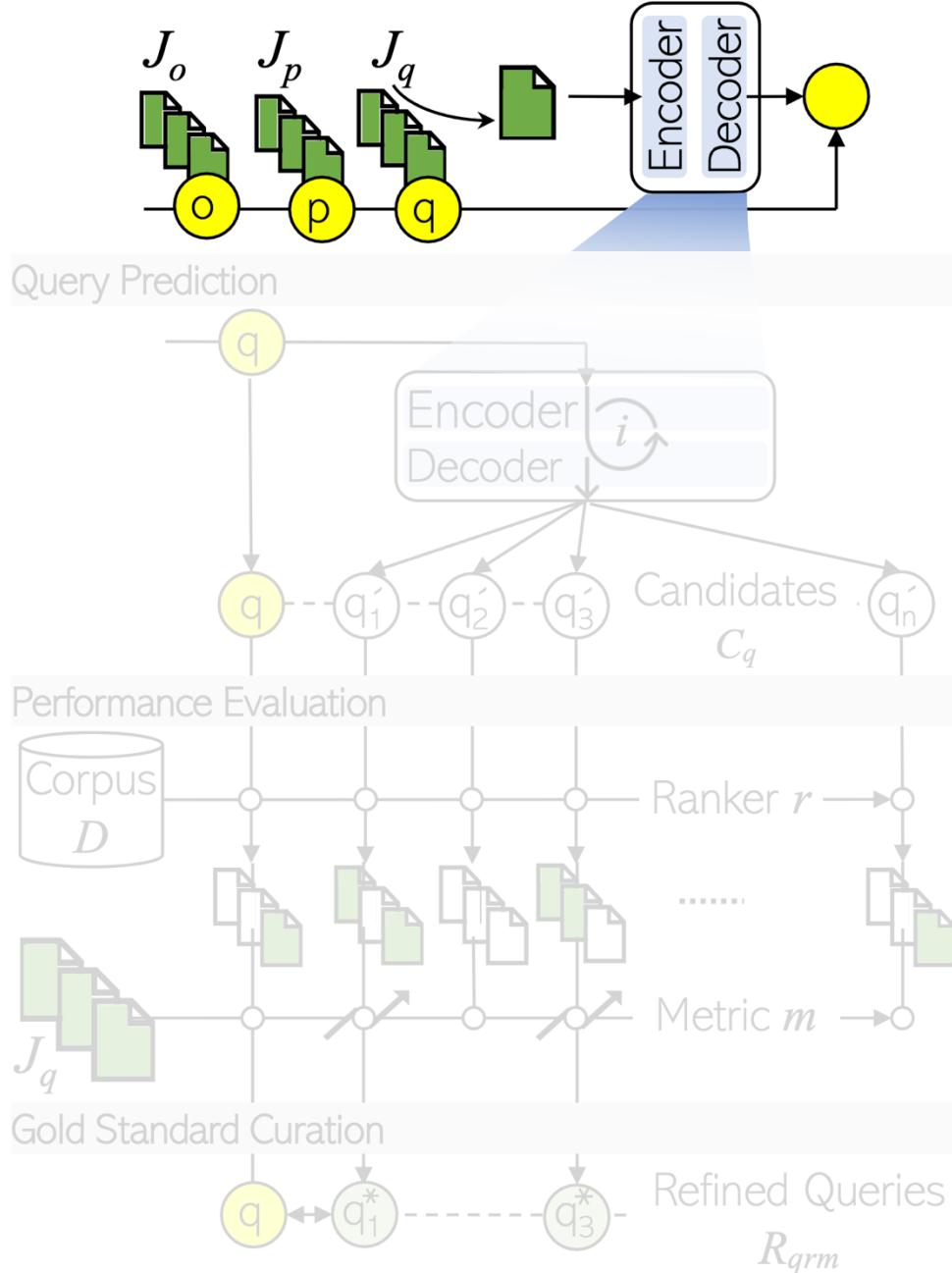
## Training



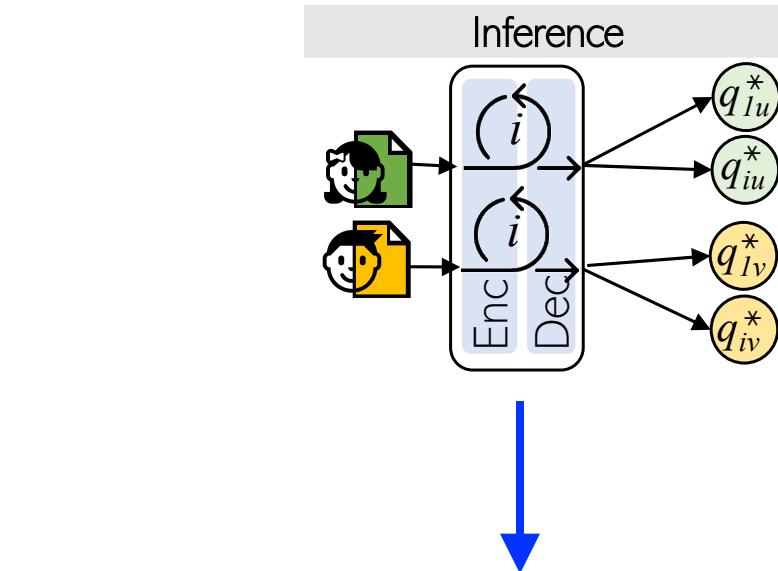
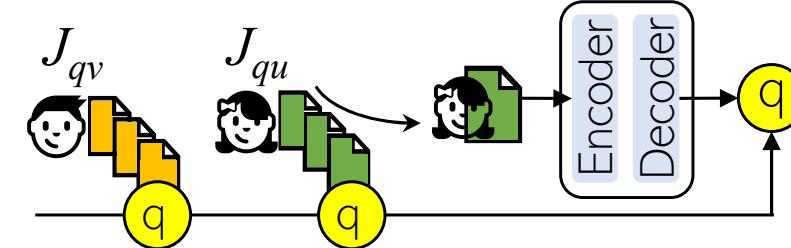
$$P(q | X=\text{uid}, J_q^{\text{uid}})$$

Conditional  
Language Model

## Transformer Fine-Tuning



## Training



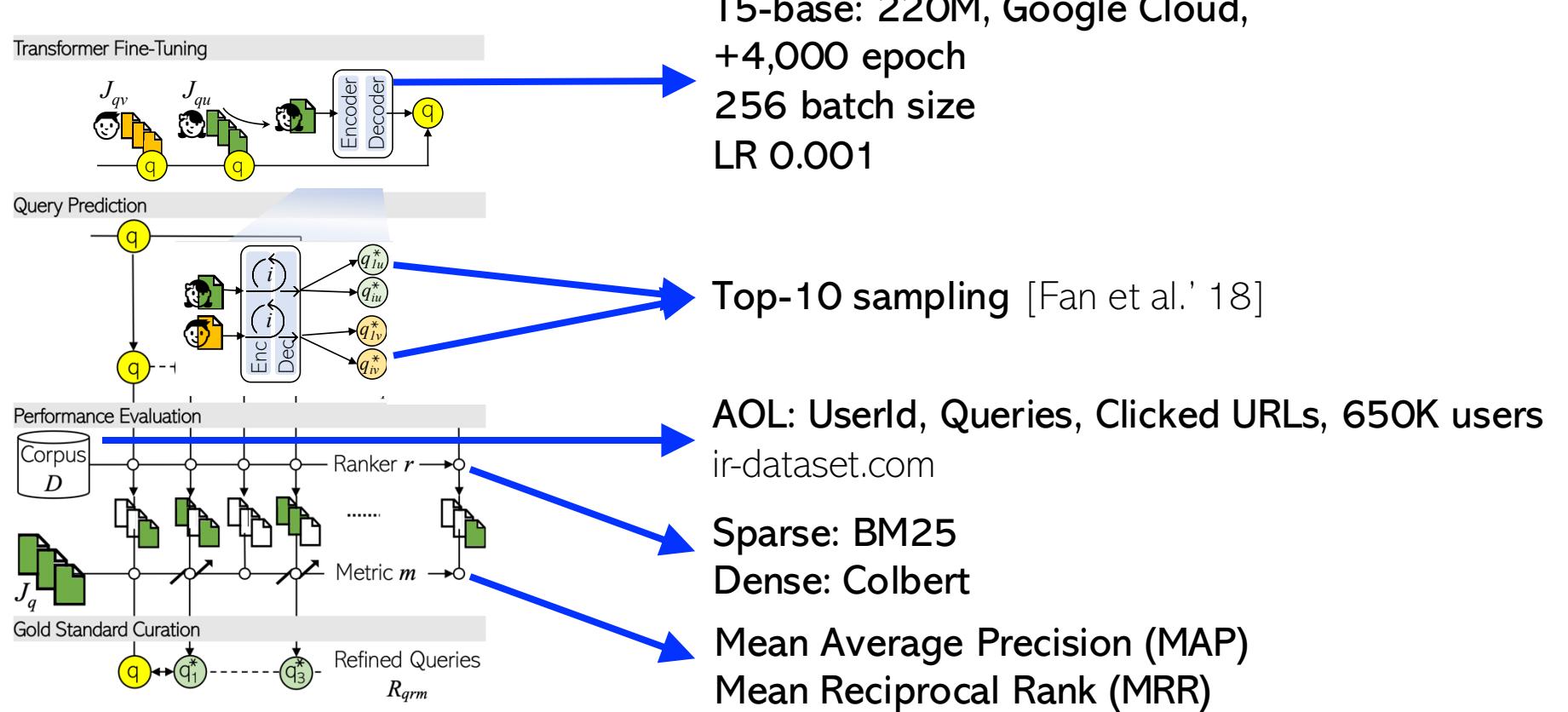
$$P(q^{*}_{uid} | X=\text{uid}, J_q^{\text{uid}})$$

 $R_{qrm}$



5 MB hard drive being shipped by IBM - 1956.

# Experiment RePair My Query



# Evaluation

**RQ:** Does personalized query refinement via conditional transformers improve the search experience for each user compared to when users are overlooked?

<i>q</i>	user-less $q^*$	map	uid	clicked url	user intent	user-based $q^*$	map
'tanning bed lotions' 'sunless tanning bed'	0.142 0.014 0.000	05183534 13149841 09469379	<a href="http://www.tanforless.com">www.tanforless.com</a> <a href="http://www.suntanning.com">www.suntanning.com</a> <a href="http://www.bodyconcept.com">www.bodyconcept.com</a>	airbrush salons bodybuilding	'tanforless com' 'tanning salons' 'fitness tech'	1.000 0.083 0.500	

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
bm25.mrr( $\cdot : \mathcal{J}_{qu}$ )				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
bm25.map( $\cdot : \mathcal{J}_{qu}$ )				
avg map( $q$ )		0.0241		0.0308
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
colbert.mrr( $\cdot : \mathcal{J}_{qu}$ )				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
colbert.map( $\cdot : \mathcal{J}_{qu}$ )				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

Evaluation

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531			<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )	0.		0.0308	
avg map( $q^*$ )	0.4702			<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023			<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%			<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

While a webpage has **url**, it may be missing title. In **aol.title**, we filter out queries whose relevant webpages have no title.

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )	0.0297		0.0364	
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )	0.0241		0.0308	
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )	0.0807		0.0802	
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )	0.0661		0.0603	
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MRR

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	<b>0.6670</b>	<b>0.7937</b>	<b>0.6807</b>	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0241		0.0308
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MRR

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	<b>0.6670</b>	<b>0.7937</b>	<b>0.6807</b>	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0241		0.0308
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MRR

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	<b>2,276,965</b>	<b>4,503,321</b>	<b>2,845,642</b>	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0241		0.0308
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MRR

MAX  
MRR  
1.00

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	<b>1,069,531</b>	<b>1,132,741</b>	<b>1,037,103</b>	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0241		0.0308
avg map( $q^*$ )	0.4702	<b>0.5693</b>	0.4783	<b>0.5562</b>
#map( $q^*$ ) > \text{map}(q)	2,583,023	<b>4,491,856</b>	2,421,347	<b>4,884,799</b>
%map( $q^*$ ) > \text{map}(q)	58%	<b>61%</b>	52%	<b>61%</b>
#oracle $q^*$	649,764	<b>686,682</b>	591,001	<b>855,355</b>
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MRR

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
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<b>bm25.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	<b>4,503,321</b>	2,845,642	<b>4,891,602</b>
%	51%	<b>61%</b>	60%	<b>61%</b>
#oracle $q^*$	1,069,531	<b>1,132,741</b>	1,037,103	<b>1,347,612</b>
<b>bm25.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
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<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
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#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

BM25.MAP

	aol.title		aol.title.url	
	-user	+user	-user	+user
# $q$	4,459,613	7,348,389	4,672,506	8,020,979
avg #words in $q$	3.5849	3.0245	3.5817	2.9766
avg #words in $q^*$ vs. $q_u^*$	3.0543	2.0527	3.4778	3.0717
bm25.mrr( $\cdot : \mathcal{J}_{qu}$ )				
avg mrr( $q$ )		0.0297		0.0364
avg mrr( $q^*$ )	0.6670	<b>0.7937</b>	0.6807	<b>0.8172</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,276,965	4,503,321	2,845,642	4,891,602

Computational need is very high for all queries per user

Let's evaluate it under pressure but for small number of queries

Those queries that are *hard*: no  $q^*$  found for them using BM25

20,000 *hard queries*

#hard query	0-10,000	100,000	0-1,000	100,000
<b>colbert.mrr(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg mrr( $q$ )		0.0807		0.0802
avg mrr( $q^*$ )	0.2790	<b>0.2989</b>	0.2224	<b>0.310</b>
#mrr( $q^*$ ) > \text{mrr}(q)	2,200	<b>2,288</b>	2,281	<b>3,216</b>
%mrr( $q^*$ ) > \text{mrr}(q)	11%	<b>11.4%</b>	11.4%	<b>16%</b>
#oracle $q^*$	0	0	0	0
<b>colbert.map(<math>\cdot : \mathcal{J}_{qu}</math>)</b>				
avg map( $q$ )		0.0661		0.0603
avg map( $q^*$ )	0.1357	<b>0.215</b>	0.0990	<b>0.1967</b>
#map( $q^*$ ) > \text{map}(q)	2,334	<b>3,355</b>	2,715	<b>3,321</b>
%map( $q^*$ ) > \text{map}(q)	11.6%	<b>16.7%</b>	13.57%	<b>16.60%</b>
#oracle $q^*$	0	0	0	0

Colbert.\*

fani-lab / RePair

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**RePair** Public

uid-wise24 7 Branches 0 Tags

This branch is 85 commits behind main.

Go to file Add file Code Contribute

yogeswarl Update README.md ✓ 9569fbe · last year 307 Commits

.github/workflows fix testing.yml last year

data readme for preprocessed last year

misc Add files via upload last year

output

<https://github.com/fani-lab/RePair/tree/uid-wise24>

src fix files last year

.gitignore readme for preprocessed last year

.gitmodules Trec eval as submodule. T5 script for linux/tpu-vm 2 years ago

README.md Update README.md last year

RUNT5.md Update RUNT5.md last year

environment.yml Update environment.yml last year

requirements.txt Update requirements.txt last year

testing\_reqs.txt create new testing requirements file last year

README

About

Extensible and Configurable Toolkit for Query Refinement Gold Standard Generation Using Transformers

information-retrieval query-refinement

query-suggestions query-refinement

Readme Activity Custom properties

Forks 3 watching

5 forks Report repository

Releases No releases published Create a new release

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Contributors 6

Languages Python 98.9% Other 1.1%

**RePair : A Toolkit for Query Refinement Gold Standard Generation Using Transformers**



Fani's Lab, School of Computer Science, University of Windsor, Canada



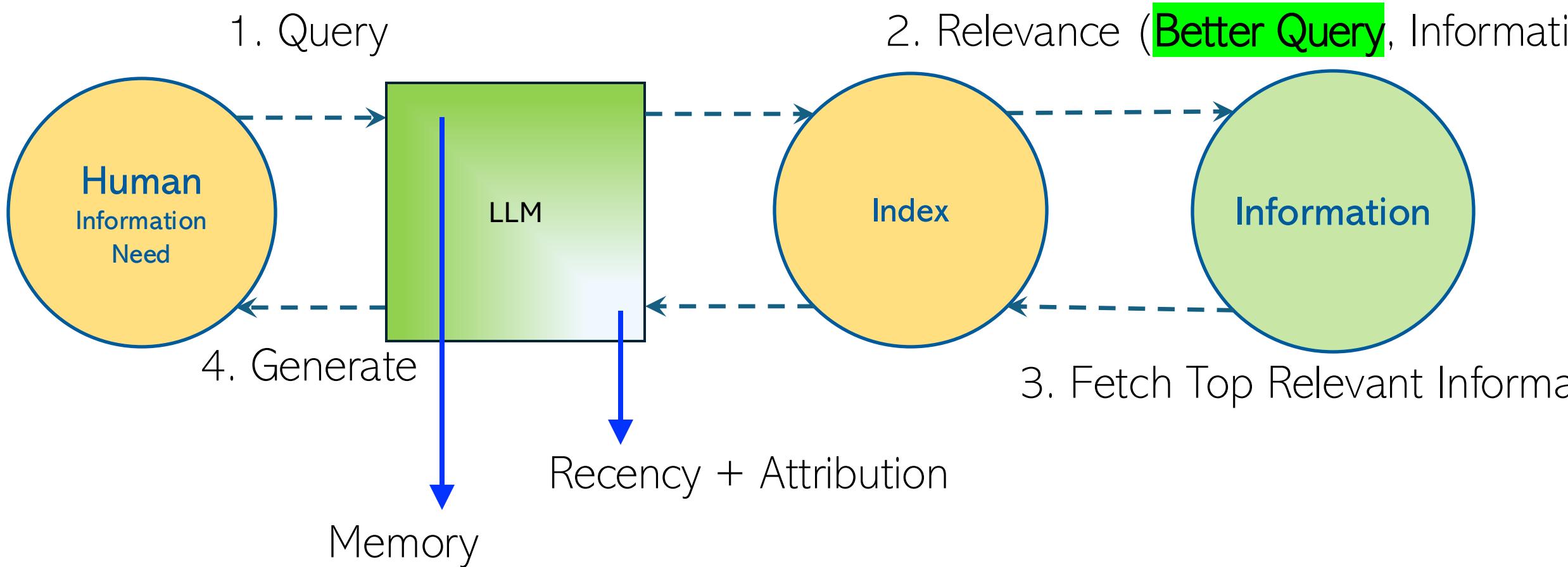
Yoges

Hossein



Future Direction: User Vector Representation vs. uid

# RAGs: Nowadays



## **Retrieval-augmented generation (rag)**

Session 27 – Query Processing & Information Extraction  
Same Room (B116) @ 13:30



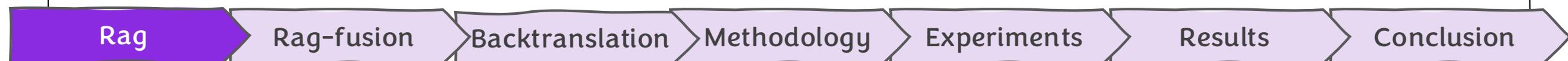
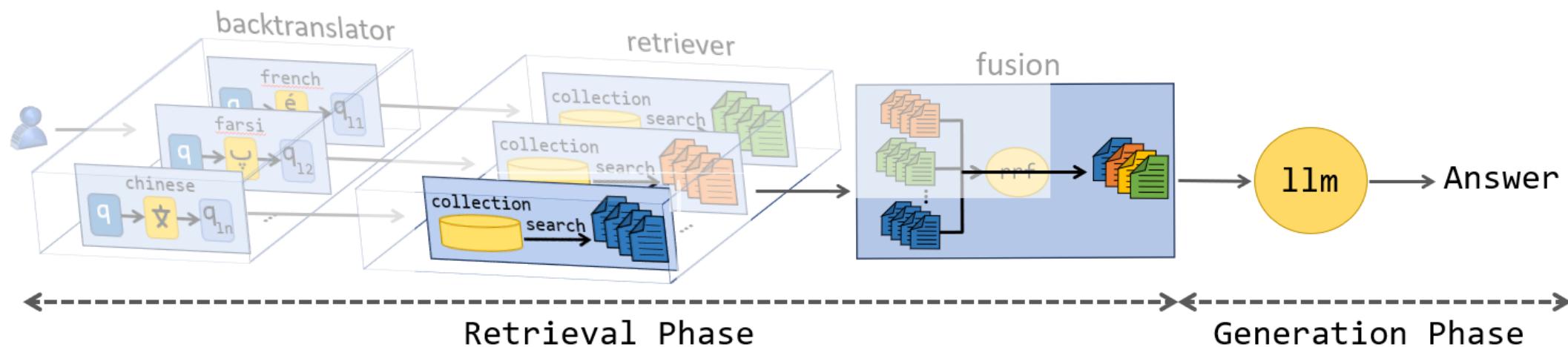
Delaram Rajaei  
(MSc)



Zahra Taheri  
(PhD)



Hossein Fani





A slide for people affected by the disaster of wars ...