"Question answering using structured and unstructured data"

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WSDM'16 Doctoral Consortium

Percentage of question search queries is growing^[1]

Q

Feedback



ANSWERS	Trending Angela Raiola Oil prices Ankara Turkey Volvo XC90 Mortgage rates Big Lots Hotmail inbox Gavin Rossdale							
nswers Home								
I Categories								
s & Humanities	Do you truly believe that your date want to meet you for dinner but is just innocently running late? Do you trust that your sister honestly has no idea where your favorite sweater could be?							
auty & Style	How can you tell if a friend is lying in a text message?							
iness & Finance	asked by Yahoo Answers Team							
s & Transportation								
nputers & Internet								
sumer Electronics	Discover Answer							
na Out	Discover Answer							
cation & Reference	Is Angelina Jolie really Bisexual?							
ertainment & Music	Is it true she's a bisexual. Man I bet all the lesbians are going crazy over her.							
ironment	110 answers - Celebrities - 3 days ago							
nily & Relationships								
d & Drink	Is it safe to buy Freedom 251, World's cheapest smartphone ?							
nes & Recreation	20 answers - Cell Phones & Plans - 1 day ago							
lth								
ne & Garden	What is your opinion about Ronda Rousey being suicidal after her loss?							
al Businesses	180 answers · Celebrities · 1 day ago							
vs & Events								
s	How will Leftists twist this for their straw man arguments?							
tics & Government	Best answer: Well one thing for sure is the political tide is turning especially in race related incidents which is absolutely great. Democrats can't really make false rhetoric of how republicans are racist. Just look with his newest endorsement. A young Indian American female governor joins young black senator in endorsingshow more							
gnancy & Parenting								
ence & Mathematics	21 answers - Politics - 14 hours ago							
ial Science								
tiety & Culture	What other holidays apart from India and France should the Cambridges go on this year?							
irts	27 answers · Royalty · 2 days ago							
vel								
noo Products	Does it count as domestic violence if the female tries to cause harm? I've heard it said that when women hit men, men should not hit women back because "men are stronger than women". So							
	does that mean that if a woman is stronger than a man she shouldn't hit HIM? I don't have all the details, but I'm quessing							
mational >	that former olympian Picabo Street is probably show more							
ut>	128 answers - Gender Studies - 2 days ago							

[1] "Questions vs. Queries in Informational Search Tasks", Ryen W. White et al, WWW 2015

Factoid







Performance of the performanc

Mars", and so on, so forth.

In constrast, a non-factoid question can be about anything. You can be asked to provide an answer to a math problem, to explain how to fix a specific model of a car, and so on, so forth. Answering multiple-choice questions also belongs to the area of non-factoid QA, though, there might be some overlan with factoid OA in this task.



(AP Photo/Jeopardy Productions, Inc.)

QA system architecture



Data Sources



				Change +	2014 land area +	2010 population density +	Location 4
New York ^[6]	New York	8,491,079	8,175,133	+3.86%	302.6 sq mi 783.8 km ²	27,012 per sq mi 10,430 km ⁻²	😂 40.6643'N 73.9385'W
Los Angeles	California	3,928,864	3,792,621	+3.59%	468.7 sq mi 1,213.9 km ²	8,092 per sq mi 3,124 km ⁻²	🚇 34.0194°N 118.4108°V
Chicago	Ilinois	2,722,389	2,695,598	+0.99%	227.6 sq mi 589.6 km ²	11,842 per sq mi 4,572 km ⁻²	😂 41.8376'N 87.6818'V
Houston ^[7]	Texas	2,239,558	2,100,263	+6.63%	599.6 sq mi 1,552.9 km ²	3,501 per sq mi 1,352 km ⁻²	😂 29.7806 'N 96.3863 'V
Philadelphia ⁽⁸⁾	Pennsylvania	1,560,297	1,526,006	+2.25%	134.1 sq mi 347.3 km ²	11,379 per sq mi 4,394 km ⁻²	40.0094"N 75.1333"W
Phoenix	Arizona	1,537,058	1,445,632	+6.32%	516.7 sq mi 1,338.3 km ²	2,798 per sq mi 1,080 km ⁻²	Q 33.5722'N 112.0880'V
	Chicago Houston ^[7] Philade(phia ^[8]	Chicago Illinois Houston ^[7] Texas Philadelphie ^[8] Pennsylvania	Chicago Illinois 2,722,389 Houston ^{PTI} Texas 2,239,558 Philadeiphile ^{PII} Pennsylvania 1,560,297	Chicago Illinois 2,722,309 2,095,596 Houstor/I ^{TI} Texas 2,239,598 2,100,283 Philadsphal ^{TI} Pernsylvania 1,560,0297 1,556,009	Chicago Illinois 2.722.889 2.685.588 -0.994 Houstor/ ¹⁷ Texas 2.239.508 2.100.265 -6.6374 Philadephal ⁴¹ Permykania 1.860.297 1.536.06 -2.2544	Los Angeles Calformia 3.950,864 3.792,021 4.3.09 468.7 3 g min Chicago Illinois 2.722,289 2.605,509 4.00 9% 360.6 km ² Houston ⁽⁷⁾ Texas 2.239,556 2.100,269 4.00 % 356.0 km ² Philodephi/4% Pennsylvania 1.560.2 % 1.560.0 % 4.25 % J min 3.43 M m ² Philodephi/4% Pennsylvania 1.550.7 % 1.557.0 % 1.557.0 % 4.55 % J m m ²	Los Argeles Callorina 3.958,84 3.752,622 9-59 469.5 mpl 50.020 program Chicago Ilinois 2.722,389 2.095,598 2.009 50.696 sprtt 1.1324 km ⁻² Houston ⁽⁷⁾ Texas 2.2295,508 2.000,208 460.5 mpl 30.501 per sqrtt Houston ⁽⁷⁾ Texas 2.239,508 2.000,208 460.5 mpl 30.501 per sqrtt Houston ⁽⁷⁾ Texas 2.239,508 2.000,208 460.5 mpl 30.501 per sqrtt Houston ⁽⁷⁾ Texas 2.239,508 2.000,208 460.5 mpl 30.73 km ⁻¹ 1.332 km ⁻² Phildséphul ⁽⁹⁾ PermyNamina 1.550,207 1.560,208 2.259 \$3.73 km ⁻² 30.73 km ⁻²

San Francisco, California Consolidated city-county City and County of San Francisco Nickname(s): The City by the Bay; Fog City; San Fran;^[1] Frisco (locally disparaged);^{[2][3][4][5]} The City that Knows How (past):[6] Baghdad by the Bay (past):[7] The Paris of the West (past)[8] Motto: Oro en Paz, Fierro en Guerra (English: "Gold in Peace, Iron in War") Coordinates: 🥥 37°47'N 122°25'W Country United States State California CSA San Jose-San Francisco-Oakland Metro San Francisco-Oakland-Hayward Mission June 29, 1776^[9] Incorporated April 15, 1850^[10] Founded by José Joaquin Moraga Francisco Palóu Named for St. Francis of Assisi Government • Type Mayor-council . Body Board of Supervisors Edwin M. Lee (D)[11] Mayor Supervisors^[13] List [show] Assembly members^{[14][15]} David Chiu (D) Phil Ting (D) State senator Mark Leno (D)[12] United States Nancy Pelosi (D) Representatives^{[16][17]} Jackie Speier (D)



Food & Drink > Cooking & Recipes

How do i cook lasagne?

Hi, i have never cooked lasagne before, i am house sitting and they have left me a fresh lasagne in a metal baking dish, do i put this in the oven? what temperature? how long should i cook it? i have no idea hey!

Follow 🕅 3 answers

Answers

Relevance V

Best Answer: Heyl. Cock at 325 degrees in oven, on middle rack II pan is really klul you may want to place on cookie sheet so it doesn't overflow as it heats up. How long you cook it depends on the depth of the pan. If three pan is three or so inches deep (like a "tegular lasagna pan), I would heat it for 35 minutes to an hour. You want the cheese to sort-of solidity, when it's nice and hout and builty and the ricotta is sort-of solid, take out of the oven and let "rest" (that is, let is sit of adval I dimitus or so plere you cut it, to let the cheese coal and setup. Then, yun!

PS: If it's covered with plastic wrap, take that off first. If it's aluminum foil, you can leave it on

Source(s): I've been making lasagna for 25+ years......

C. L. H · 6 years ago

Unstructured data

Semi-structured data

Structured data

Structured and Unstructured data sources for QA

	Unstructured data	Structured data		
factoid questions	 <u>Text collections</u> easy to match against question text cover a variety of different information types each text phrase encodes a limited amount of information about mentioned entities 	 Knowledge Bases (KB) aggregate all the information about entities allow complex queries over this data using special languages (e.g. SPARQL) hard to translate natural language questions into special query languages KBs are incomplete (missing entities, facts and properties) 		
non-factoid questions	 <u>Text collections</u> contain relevant information to a big chunk of user needs hard to extract semantic meaning of a paragraph to match against the question (lexical gap) 	 <u>Question-Answer pairs</u> easy to find a relevant answer by matching the corresponding questions cover a smaller subset of user information needs 		

Combining text and KB for factoid QA



Using the structure of web documents for non-factoid QA



Research Questions

- 1. What types of questions can be answered using text, KB or a combination of both?
- 2. How does semantic annotation of unstructured data compare to information extraction for question answering?
 - information extraction for KB construction vs open information extraction vs unstructured data annotation

3. How does a combination of structured and unstructured data sources improve each of the main QA system components: question analysis, candidate generation, evidence extraction and answer selection?

Experiments: factoid QA

- → Datasets
 - TREC QA
 - WebQuestions
 - new factoid QA dataset
 - ✓ derived from Yahoo! Answers CQA archive
 - filter factoid non-subjective questions (heuristics + mechanical turk)
 - ✓ mturk to label answers (KB entities, mentioned in CQA user answer)
 - ✓ Examples:
 - What is the name of Sponge Bob's pet snail?
 - \cdot ~ What is the boot-shaped country found in Southern Europe?
 - \cdot ~ Who was the first model to ever appear on the cover of Sports Illustrated?
- → Comparison
 - state-of-the-art KBQA systems (WebQuestions benchmark)
 - Open QA approach based on OpenIE extractions
 - collection-based and hybrid techniques: AskMSR+, QuASE

Experiments: non-factoid QA

- → TREC LiveQA shared task (http://trec-liveqa.org/): real user question answering in real-time
 - systems need to respond to questions posted to Yahoo! Answers
- → Comparison:
 - baseline system developed for last year shared task
 - participants of TREC LiveQA 2016



Expected results

- 1. new factoid question answering dataset
- 2. new approach to combining unstructured text and structured KB data, that:
 - ✓ improves QA precision
 - ✓ improves recall, including questions that could only be answered with a combination of text and KB data
- 3. new system for non-factoid question answering with improved performance due to better utilization of the information provided in web documents

Open Questions

- → How to incorporate other available sources of factual information, including semi-structured, e.g. tables, diagrams, etc?
- → Non-factoid questions often include unique context information, that makes reusing information non effective. How a system can generate the answer given all potentially useful extracted information?
- \rightarrow How to construct KBs for non-factoid information needs?

Thank you!

Society & Culture > Languages



How to say thank you in different languages (German, Italian,....)? 2 following 🖄 31 answers

Answers



Best Answer: spanish - gracias french - merci german - danke italian - grazi portugese - obrigado norwegian - takk mandarin chinese - xie xie finnish - kiitos danish - tak hebrew - toda russian - spasibo swahili - asante swedish - tack polish - dziekuje korean - kamsa hamnida japanese - arigato indonesian - termi kasih greek - efharisto hindi - sukria

Krysti · 10 years ago

0 10 1 3



Comment