# **Overview of the NTCIR-15 Data Search Task**

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### Task

### The very first IR evaluation campaign for data search

#### **Subtasks**

English and Japanese

#### Input

96 gueries for each of the subtasks

#### **Document (or Dataset) collection**

- e-Stats for Japanese
- Data.gov for English

#### Output

Ranked list of datasets for each query



# **Test Collection Stats.**

| lapanese | Documents (or <i>datasets</i> )          | 1,338,402 |
|----------|--|-----------|
|          | Training queries                         | 96        |
|          | Test queries                             | 96        |
|          | Relevance judgments for training queries | 2,035     |
|          | Relevance judgments for test queries     | 5,719     |
|          |  |           |
|          | Documents (or <i>datasets</i> )          | 46,615    |
| English  | Training queries                         | 96        |
|          | Test queries                             | 96        |
|          | Relevance judgments for training queries | 2,008     |
|          | Relevance judgments for test queries     | 6,240     |
|          |  |           |

## **Topics & Queries**

- Information needs, by which queries are generated and relevance of a dataset is judged, are derived from questions in cQA
  - Extracted 3,219 Q&As from Yahoo Chiebukuro (Yahoo Japan's cQA) that include links to a Japanese open data portal
  - They were manually assessed, from which we obtained only **192** questions that can be considered as information needs for datasets
  - Japanese-specific entities were transformed into corresponding **US-specific ones** 
    - e.g. Kansai  $\rightarrow$  East coast, Tokyo  $\rightarrow$  New York

#### **Examples of topics and queries**

### **Dataset Collections**

- Japanese
  - e-Stat

< データセット一覧に戻る 政府統計名

政府統計コー|

調査の概要

提供統計名

提供分類 提供分類

- https://www.e-stat.go.jp/
- 1,338,402 (~100GB)

ータセット情報 作物統計調査 / 作況調査(水陸稲、麦類、豆類、かんしょ、飼料作物、工芸農

本調査は、毎年、耕地の状況、収穫量等を調査し、耕地面積、農 作物の作付面積、収穫量、被害面積・被害量等を、全国、都道府 県(主産県)別等に提供しています。

作況調査(水陸稲、麦類、豆類、かんしょ、飼料作物、工芸農作)

令和元年産一番茶の摘採面積、生葉収穫量及び荒茶生産量(主産

作物統計調査

作物統計調子

速報

- English
  - Data.gov
    - https://www.data.gov/
    - 46,615 (~445GB)

|                         | Se  | arch Data.Gov Q   |   |  |  |  |  |  |  |
|-------------------------|---|---|---|--|--|--|--|--|--|
| DATA.GOV                | DATA TOPICS - RE  | SOURCES STRATEGY DEVELOPERS CONTACT   |   |  |  |  |  |  |  |
| DATA CATALOG            |   | Organizations 💿 👫 / Datasets  |   |  |  |  |  |  |  |
| 番/盦/City of New York/da | ata.cityofnewyork.us  | 🖉 Submit Data Story 🛛 🕫 Report Data Issue   | I |  |  |  |  |  |  |
| SLOF THE STATE          | OThis is a Non-Federal dataset covered  | I by different Terms of Use than Data.gov. <u>See Terms</u>                       |   |  |  |  |  |  |  |
| City of New York        | Demographic and Housing Profiles by Borough Metadata Updated March 29, 2019 Selected damographic and boards estimates data citywide and by borough. Five year estimates of population data from the Census Rureac's American Community Survey. Access & Use Information |   |   |  |  |  |  |  |  |
| Topics Local Government | Public: This dataset is intended for public     Non-Federal: This dataset is covered by d     License: No license information was prov  | access and use.<br>Ifferent Terms of Use than Data.gov. <u>See Terms</u><br>ided. |   |  |  |  |  |  |  |
| 盦 Publisher             |   |   |   |  |  |  |  |  |  |
| data.cityofnewyork.us   | Downloads & Resources   | puploade & Persurger  |   |  |  |  |  |  |  |
| ■Contact                | L'OWITORUS & RESOULCES  |   |   |  |  |  |  |  |  |
| NYC OpenData            | MS Excel File 18 views<br>demo 2016acs5w_rwc.alss   | Open With 👻 📥 Download  |   |  |  |  |  |  |  |
| #Share on Social Sites  |   |   |   |  |  |  |  |  |  |
| Goode+                  |   |   |   |  |  |  |  |  |  |

| Topic ID   | Торіс  | Query                             |
|------------|--|-----------------------------------|
| DS1-E-0001 | Do people in the East Coast dislike oysters?                         | oysters dislike east coast        |
| DS1-E-0004 | I am looking for evidences of domestic self-sufficiency rate of salt | domestic self salt rate.          |
| DS1-E-0007 | Are there many people who can't drive large trailers?                | people can't drive large trailers |
| DS1-E-0009 | How many people have a second house?                                 | many people second house          |
| DS1-E-0014 | Which city has a population of about 300,000?                        | city population 300,000           |

### **Relevance Judgments**

The relevance of each dataset for a given query is judged by crowd-sourcing workers

- 0: Not-relevant
- 1: Partially relevant
- 2: Highly relevant

#### Inter-rater agreement

- Japanese: 0.495
- English: 0.462 (Not high, but not low in IR evaluation)

#### Instructions

Please judge how useful a **DATASET** of a webpage is for answering a given **REQUEST**. Please carefully read a given **REQUEST**, visit a webpage describing a **DATASET**, and give a usefulness score (0, 1, or 2) to each of the datasets.

#### Rules

- 1. Carefully read a **REQUEST** (Note: this page contains a few types of requests.) Carefully read a REQUEST (Note: this page contains a few types of requests.)
   Make sure that you visit a webpage that describes a DATASET, and judge how useful the DATASET is for answering the REQUEST.
   Usefulness score is defined as:

   O: (Useless) The DATASET is not useful to answer the REQUEST at all, or was not accessible for some reasons.
   1: (Partially useful) The DATASET is useful to partially answer the REQUEST, but cannot fully answer the REQUEST.
   2: (Highly useful) The DATASET is useful to fully answer the REQUEST, but cannot fully answer the REQUEST.

#### aution

- stad if the website is not as
- There are some **REQUEST** and **DATASET** for which a true usefulness score is know

REQUEST: Do people in the East Coast dislike ovsters DATASET: LINK

O 0: Useless O 1: Partially useful O 2: Highly useful

# **Evaluation Results**

NTCIR-15 Data Search attracted six research groups and received 54 systems' results in total (17 for Japanese and 37 for English)

#### Japanese (Top 9 runs)

|           | nDCG@3 | nDCG@5 | nDCG@10 | nERR@3 | nERR@5 | nERR@10 | Q     | Note   |
|-----------|--------|--------|---------|--------|--------|---------|-------|--|
| KSU-J-5   | 0.388  | 0.403  | 0.448   | 0.283  | 0.448  | 0.477   | 0.498 | BM25 + Category classification                 |
| KSU-J-1   | 0.362  | 0.381  | 0.421   | 0.295  | 0.423  | 0.453   | 0.473 | BM25 + Table header + Category classification  |
| ORGJ-J-3  | 0.407  | 0.413  | 0.421   | 0.325  | 0.450  | 0.47    | 0.484 | BM25   |
| uhai-J-10 | 0.403  | 0.406  | 0.415   | 0.312  | 0.447  | 0.466   | 0.484 | BM25 + Query modification                      |
| ORGJ-J-2  | 0.402  | 0.405  | 0.415   | 0.328  | 0.447  | 0.467   | 0.483 | BM25 (lucene)                                  |
| ORGJ-J-6  | 0.379  | 0.386  | 0.406   | 0.321  | 0.423  | 0.447   | 0.464 | Query likelihood                               |
| ORGJ-J-1  | 0.382  | 0.396  | 0.405   | 0.308  | 0.426  | 0.452   | 0.464 | BM25 + PRF                                     |
| ORGJ-J-7  | 0.380  | 0.386  | 0.401   | 0.323  | 0.430  | 0.452   | 0.471 | BM25 + Sequential dependency model             |
| ORGJ-J-4  | 0.365  | 0.377  | 0.400   | 0.318  | 0.409  | 0.433   | 0.452 | Query likelihood + Sequential dependency model |

#### **English** (Top 9 runs)

|                     | nDCG@3 | nDCG@5 | nDCG@10 | nERR@3 | nERR@5 | nERR@10 | Q     | Note  |
|---------------------|--------|--------|---------|--------|--------|---------|-------|---|
| KSU-E-2             | 0.204  | 0.231  | 0.255   | 0.238  | 0.229  | 0.257   | 0.276 | BM25 + Table header + Category classification |
| KSU-E-6             | 0.204  | 0.231  | 0.255   | 0.238  | 0.229  | 0.257   | 0.276 | BM25 + Category classification                |
| NIITableLinker-E-4  | 0.233  | 0.237  | 0.248   | 0.251  | 0.251  | 0.264   | 0.278 | BM25 + PRF + BERT Reranking                   |
| ORGE-E-2            | 0.219  | 0.225  | 0.238   | 0.240  | 0.235  | 0.250   | 0.264 | BM25 (lucene)                                 |
| uhai-E-5            | 0.219  | 0.225  | 0.238   | 0.240  | 0.235  | 0.250   | 0.264 | BM25 + Query modification                     |
| NIITableLinker-E-10 | 0.221  | 0.226  | 0.237   | 0.238  | 0.235  | 0.248   | 0.264 | BM25 + PRF + BERT Reranking                   |
| STIS-E-2            | 0.23   | 0.228  | 0.237   | 0.217  | 0.248  | 0.255   | 0.264 | BM25 + RM3 + BERT Reranking                   |
| ORGE-E-7            | 0.216  | 0.220  | 0.236   | 0.237  | 0.228  | 0.242   | 0.256 | BM25 + Sequential dependency model            |
| ORGE-E-8            | 0.224  | 0.230  | 0.233   | 0.238  | 0.244  | 0.255   | 0.264 | Query likelihood + RM3                        |

### KSU (Kyoto Sangyo University) achieved the best performances

(though there is no significant differences among the tops)

### **Possibly effective techniques**

Category classifier (used by KSU)

- Train a category classifier by cQA datasets and applied it to queries and documents
- A document is considered relevant if its category is the same as that of a query
- A simple, but effective technique that can be seen in production systems
- Dataset header (used by KSU and NII)
  - The headers of datasets were also used as a • part of documents
  - Possibly effective but may need more exploration
- BERT (used by all the teams)
  - A successful technique often used in NLP tasks
  - Not conclusive again, probably due to lack of large training data