

# APPENDIX A

This appendix contains the evaluation results for the TREC-7 runs. The initial pages describe the evaluation measures used for the main task and many of the tracks. Each run submitted for the difference task/tracks is listed (identified by the run tag). Associated with each tag is the organization that produced the run and additional information such as whether the queries were produced manually or automatically as appropriate. When a track uses different measures, the evaluation measures are described in the track report. The remainder of the appendix contains the evaluation results themselves, in the order given in the run list.

# Evaluation Techniques and Measures

## Categories

The results following this section are organized according to the task accomplished by the run: ad hoc or a track task. Some tracks do not use these evaluation tools. However, the evaluation tools used are described in the results section for the track.

### Ad hoc

Retrieval using an “ad hoc” topic such as a researcher might use in a library environment. In TREC this implies that the input topic has no training material such as relevance judgments to aid in the construction of the input query. Systems ran TREC topics against all documents from TREC Disks 4 and 5.

## Evaluation Measures

### I. Recall

A measure of the ability of a system to present all relevant items.

$$\text{recall} = \frac{\text{number of relevant items retrieved}}{\text{number of relevant items in collection}}$$

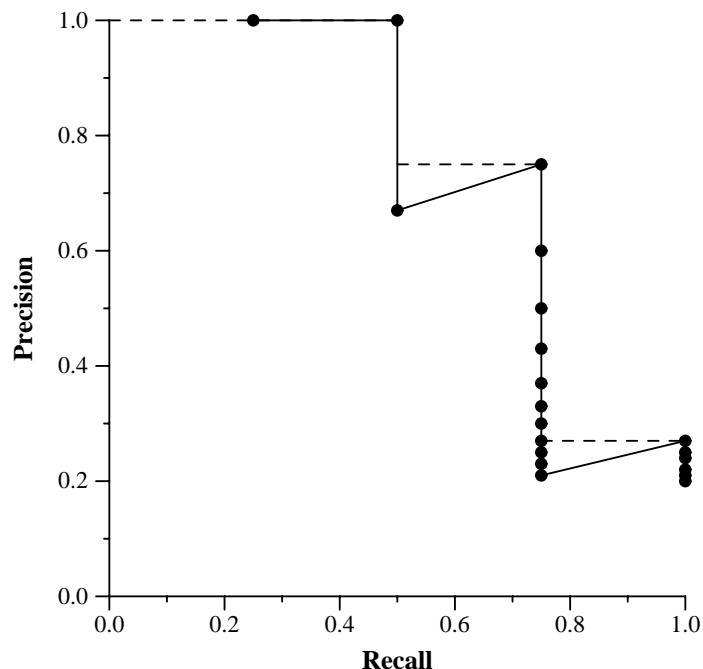
### II. Precision.

A measure of the ability of a system to present only relevant items.

$$\text{precision} = \frac{\text{number of relevant items retrieved}}{\text{total number of items retrieved}}$$

Precision and recall are set-based measures. That is, they evaluate the quality of an unordered set of retrieved documents. To evaluate ranked lists, precision can be plotted against recall after each retrieved document as shown in the example below. To facilitate computing average performance over a set of topics, each with a different number of relevant documents, individual topic precision values are interpolated to a set of standard recall levels (0 to 1 in increments of .1). The particular rule used to interpolate precision at standard recall level  $i$  is to use the maximum precision obtained for the topic for any actual recall level greater than or equal to  $i$ . Note that while precision is not defined at a recall of 0.0, this interpolation rule does define an interpolated value for recall level 0.0. In the example, the actual precision values are plotted with circles (and connected by a solid line) and the interpolated precision is shown with the dashed line.

Example: Assume a document collection has 20 documents, four of which are relevant to topic  $t$ . Further assume a retrieval system ranks the relevant documents first, second, fourth, and fifteenth. The exact recall points are 0.25, 0.5, 0.75, and 1.0. Using the interpolation rule, the interpolated precision for all standard recall levels up to .5 is 1, the interpolated precision for recall levels .6 and .7 is .75, and the interpolated precision for recall levels .8 or greater is .27.



## System Results Description

Each of the following pages contains the evaluation results for one run. A page is comprised of a header (containing the task and organization name), 3 tables, and 2 graphs.

### Tables

Tables are generated by *trec\_eval* courtesy of Chris Buckley using the SMART methodology.

#### I. “Summary Statistics” Table

Table 1 is a sample “Summary Statistics” Table

Table 1: Sample “Summary Statistics” Table.

| Summary Statistics                        |                            |
|---|----------------------------|
| Run                                       | Cor7A1clt-automatic, title |
| Number of Topics                          | 50                         |
| Total number of documents over all topics |                            |
| Retrieved:                                | 50000                      |
| Relevant:                                 | 4674                       |
| Rel <sub>ret</sub> :                      | 2621                       |

A. Run

A description of the run. It contains the run tag provided by the participant, and as applicable, whether queries were constructed manually or automatically, and whether the title, description, or narrative of the topic was used.

B. Number of Topics

Number of topics searched in this run (generally 50 topics are run for each task).

C. Total number of documents over all topics (the number of topics given in B).

i. Retrieved

Number of documents submitted to NIST. This is usually 50,000 (50 topics  $\times$  1000 documents), but is less when fewer than 1000 documents are retrieved per topic.

ii. Relevant

Total possible relevant documents within a given task and category.

iii. Rel<sub>ret</sub>

Total number of relevant documents returned by a run over all the topics.

II. “Recall Level Precision Averages” Table.

Table 2 is a sample “Recall Level Precision Averages” Table.

A. Precision at 11 standard recall levels

The precision averages at 11 standard recall levels are used to compare the performance of different systems and as the input for plotting the recall-precision graph (see below). Each recall-precision average is computed by summing the interpolated precisions at the specified recall cutoff value (denoted by  $\sum P_\lambda$  where  $P_\lambda$  is the interpolated precision at recall level  $\lambda$ ) and then dividing by the number of topics.

$$\frac{\sum_{i=1}^{NUM} P_\lambda}{NUM} \quad \lambda = \{0.0, 0.1, 0.2, 0.3, \dots, 1.0\}$$

- Interpolating recall-precision

Standard recall levels facilitate averaging and plotting retrieval results.

Table 2: Sample “Recall Level Precision Averages” Table.

| Recall Level Precision Averages          |           |
|--|-----------|
| Recall                                   | Precision |
| 0.00                                     | 0.6169    |
| 0.10                                     | 0.4517    |
| 0.20                                     | 0.3938    |
| 0.30                                     | 0.3243    |
| 0.40                                     | 0.2715    |
| 0.50                                     | 0.2224    |
| 0.60                                     | 0.1642    |
| 0.70                                     | 0.1342    |
| 0.80                                     | 0.0904    |
| 0.90                                     | 0.0472    |
| 1.00                                     | 0.0031    |
| Average precision over all relevant docs |           |
| non-interpolated                         | 0.2329    |

B. Average precision over all relevant documents, non-interpolated

This is a single-valued measure that reflects the performance over all relevant documents. It rewards systems that retrieve relevant documents quickly (highly ranked).

The measure is not an average of the precision at standard recall levels. Rather, it is the average of the precision value obtained after each relevant document is retrieved. (When a relevant document is not retrieved at all, its precision is assumed to be 0.)

As an example, consider a query that has four relevant documents which are retrieved at ranks 1, 2, 4, and 7. The actual precision obtained when each relevant document is retrieved is 1, 1, 0.75, and 0.57, respectively, the mean of which is 0.83. Thus, the average precision over all relevant documents for this query is 0.83.

III. “Document Level Averages” Table

Table 3 is a sample “Document Level Averages” Table.

A. Precision at 9 document cutoff values

The precision computed after a given number of documents have been retrieved reflects the actual measured system performance as a user might see it. Each document precision average is computed by summing the precisions at the specified document cutoff value and dividing by the number of topics (50).

B. R-Precision

R-Precision is the precision after R documents have been retrieved, where R is the number of relevant documents for the topic. It de-emphasizes the exact ranking of the retrieved relevant documents, which can be particularly useful in TREC where there are large numbers of relevant documents.

The average R-Precision for a run is computed by taking the mean of the R-Precisions of the individual topics in the run. For example, assume a run consists of two topics,

Table 3: Sample “Document Level Averages” Table.

| Document Level Averages   |           |
|---|-----------|
|   | Precision |
| At 5 docs   | 0.4280    |
| At 10 docs  | 0.3960    |
| At 15 docs  | 0.3493    |
| At 20 docs  | 0.3370    |
| At 30 docs  | 0.3100    |
| At 100 docs   | 0.2106    |
| At 200 docs   | 0.1544    |
| At 500 docs   | 0.0875    |
| At 1000 docs  | 0.0524    |
| R–Precision (precision after<br>R docs retrieved (where R<br>is the number of relevant<br>documents)) |           |
| Exact   | 0.2564    |

one with 50 relevant documents and another with 10 relevant documents. If the retrieval system returns 17 relevant documents in the top 50 documents for the first topic, and 7 relevant documents in the top 10 for the second topic, then the run’s R-Precision would be  $\frac{\frac{17}{50} + \frac{7}{10}}{2}$  or 0.52.

## Graphs

### I. Recall-Precision Graph

Figure 1 is a sample Recall-Precision Graph.

The Recall-Precision Graph is created using the 11 cutoff values from the Recall Level Precision Averages. Typically these graphs slope downward from left to right, enforcing the notion that as more relevant documents are retrieved (recall increases), the more nonrelevant documents are retrieved (precision decreases).

This graph is the most commonly used method for comparing systems. The plots of different runs can be superimposed on the same graph to determine which run is superior. Curves closest to the upper right-hand corner of the graph (where recall and precision are maximized) indicate the best performance. Comparisons are best made in three different recall ranges: 0 to 0.2, 0.2 to 0.8, and 0.8 to 1. These ranges characterize high precision, middle recall, and high recall performance, respectively.

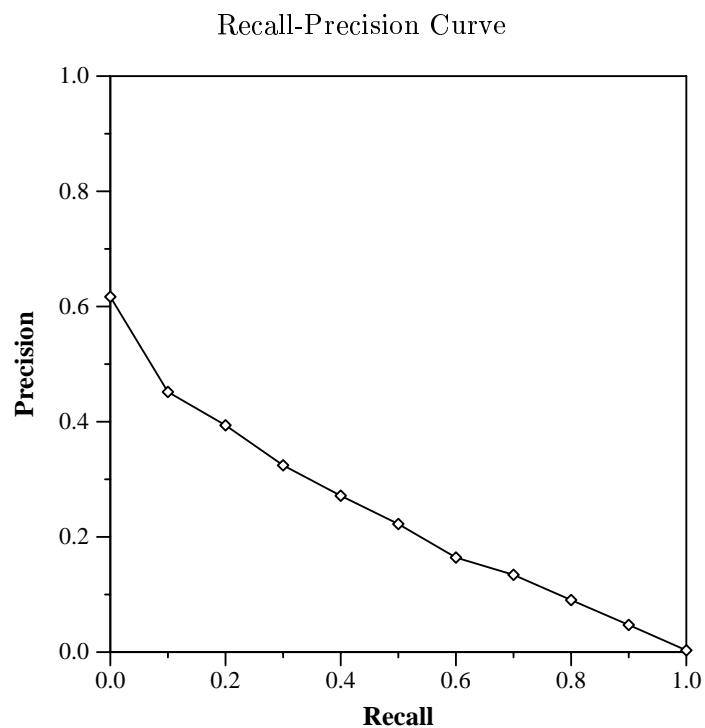


Figure 1: Sample Recall-Precision Graph.

## II. Average Precision Histogram.

Figure 2 is a sample Average Precision Histogram.

The Average Precision Histogram measures the average precision of a run on each topic against the median average precision of all corresponding runs on that topic. This graph is intended to give insight into the performance of individual systems and the types of topics that they handle well.

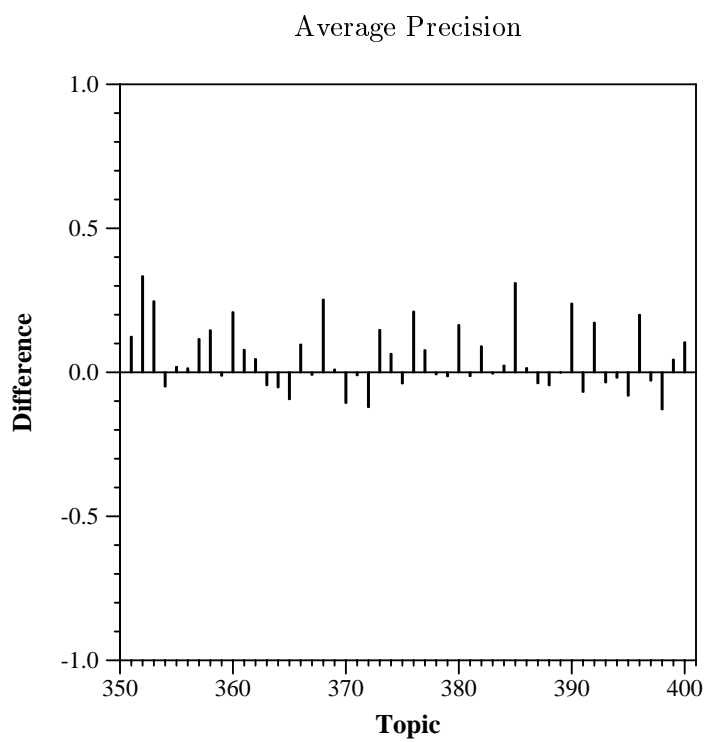


Figure 2: Sample Average Precision Histogram.