## CondorcetFuse

# Condoret voting for run fusion

Evalutation and comparison of an implementation with order fusion strateg

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#### 1 Abstract

In Information Retrieval, data fusion is the combination of the results of independent searches on a document collection into one single output result set.

It has been shown in the past that this can greatly improve retrieval effectiveness over that of the individual results.

The aim of this project is to show a possible implementation of basic fusion strategy and an advanced one.

#### 2 Introduction

Retrieval experiments uses data from the TREC ad hoc collection.

The following procedure illustrates the organization of the work:

- Indexing (with or without query expansion)
- Retrieval (10 different retrieval models)
- Fusion strategy (with or without cutting the run at depth 100)
  - 6 basic strategies
  - Condorcet fusion (advanced strategy)

Retrieval models		
BB2		
BM25		
DLH13		
$Hiemstra\_LM$		
IFB2		
$\mathrm{TF}_{-}\mathrm{IDF}$		
$\overline{\mathrm{DFIC}}$		
DFIZ		
DirichletLM		
InL2		

Tabella 1: Retrieval models used

### 3 Basic fusion strategies

The following table shows a list of basic fusion methods:

Basic fusion methods	New score	
CombMNZ	SUM(Individual similari-	
	ties)*Nonzero similarities	
CombSUM	SUM(Individual similari-	
	ties)	
CombMIN	MIN(Individual similari-	
	ties)	
CombMAX	MAX(Individual similari-	
	ties)	
CombMED	MED(Individual similari-	
	ties)	
$\operatorname{CombANZ}$	SUM(Individual similari-	
	ties)/Nonzero similarities	
	<u> </u>	

Tabella 2: Basic fusion methods used

#### 4 Condorcet fusion

The Condorcet voting algorithm is a majoritarian method which specifies that the "winner" of the fusion is the document(s) that beats or ties with every other document in a pair-wise comparison between the input systems (i.e. runs).

#### 4.1 The Condorcet Graph

Given 10 models of retrieval with n documents, the corresponding Condorcet graph G = (V, E) has one vertex for each of the n documents.

For each document pair (x, y), there exists an edge from x to y (denoted by  $x \to y$ ) if x would have at least a score equal as y in a head-to-head contest.

Cyces can simply be viewed as ties.

The relative ordering of documents within a cycle is only of secondary importance, whereas their ordering with respect to the rest of the documents is of primary importance.

#### 4.2 Condorcet paths

A Condorcet-consistent hamiltonian path (or condorcet path) is any hamiltonian path through the Condorcet graph.

The goal is to efficiently find such a path.

#### 5 Implementation

The implementation of Condorcet used quicksort, with the following algorithm as comparing function:

```
count = 0
for each of the k search systems do:
   if sys i ranks d1 above d2, count++
   if sys i ranks d2 above d1, count-
   if count > 0, rank d1 better than d2
   else rank d2 better than d1
```

#### 6 Evaluation

The evaluation criteria based on the given pool used two binary relevance scores: Relevant and Non-Relevant. The documents left out from the pool were considered to be non relevant.

#### 6.1 Evaluation metrics

#### 6.2 Results

Fusion methods	MAP	
CombMNZ		
CombSUM		
CombMIN		
CombMAX		
CombMED		
CombANZ		
Condorcet		

Tabella 3: Mean Average Precision for the 10 fused runs

#### 7 Conclusions