Relevance

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Let's Take a Step Back



Information Retrieval Task

- Given a query and a corpus, retrieve documents that are relevant
 - query: textual representation of the user's information need
 - corpus: collection of textual documents
 - relevance: satisfaction of the user's information need



Why Talk about Relevance?

- The goal of an IR system is to <u>predict relevance</u> in the same way that users <u>judge relevance</u>
- So, it seems natural to ask: what is relevance and how do "real" users judge relevance?

What is relevance?

- Relevance is a relation
- Relevance is <u>judged</u> (it is subjective)
- The ability to judge relevance is not learned; it is innate
- Judgements are made within a <u>context</u>
 - internal context: the user's knowledge, feelings, and expectations about the information need, the corpus, and the system
 - external context: the user's higher-level task at hand and the search environment
- Context is dynamic, so relevance is dynamic across users and for the same user across time (Saracevic '07)

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How do users judge relevance?

- A survey of the literature reveals four major findings:
 - 1. Users make relevance judgements based on <u>different</u> document attributes (content is one of them)
 - 2. The attributes that matter most depend upon the user's internal and external context
 - 3. Context varies across users, so relevance judgements vary across users
 - 4. Context varies over time, so relevance judgements (for the same user) vary over time

Relevance Clues document attributes

- Content attributes: topic, quality, depth, scope, freshness, readability, clarity
- Object attributes: organization, representation, format, availability, accessibility, cost
- Validity: accuracy, authority, trustworthiness, verifiability

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Relevance Clues internal and external influences

- Situational match: appropriateness to situation or task, usability, urgency, value in use
- Cognitive match: understanding, novelty, mental effort
- Affective match: emotional responses to information
- Belief match: personal credence given to information

Relevance Clues the good news

- There is a limited number of document attributes that seem to strongly influence how users judge relevance
- One of the most important document attributes is topical relevance
- There is a limited number of internal/external factors that seem to strongly influence how users judge relevance

Relevance Clues the bad news

- A user's internal/external factors affect which document attributes are most important (there are interaction effects)
- For example, level of time pressure affects which document attributes matter most
- A user's internal/external factors change over time, so relevance changes over time

- Most IR test-collections are constructed and used under the following assumptions about relevance:
 - 1. Type of relevance?
 - 2. Discreet or continuous?
 - 3. The relevance of a document is impacted by the relevance of another document?
 - 4. Relevance judgement are consistent across judges?
 - 5. Relevance is stable over time?

 Most IR test-collections are constructed and used under the following assumptions about relevance:

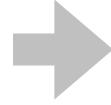


- 1. Topical: relevance is solely topical
- 2. Binary: a document is either relevant or non-relevant
- 3. Independent: the relevance of a document is not affected by the relevance of another document
- 4. Consistent: relevance judgements are consistent across users/judges
- 5. Stable: relevance is stable over time

Batch Evaluation Assumptions relevance is topical

- As we've already discussed, relevance is not only topical
- Various other document attributes and internal/external factors affect a user's relevance judgements
- Topicality, however, is a key component

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Batch Evaluation Assumptions relevance is binary

- As you might expect, relevance is not binary (or even discreet)
- Users tend to judge relevance along a continuum
- However, relevance appears to be bimodal
- That is, most judgements fall within the two extremes (e.g., perfect/poor)

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Batch Evaluation Assumptions relevance is independent

- Relevance judgements are not independent
- Documents that are seen early have a higher probability of being relevant
- Suggests that novelty is important

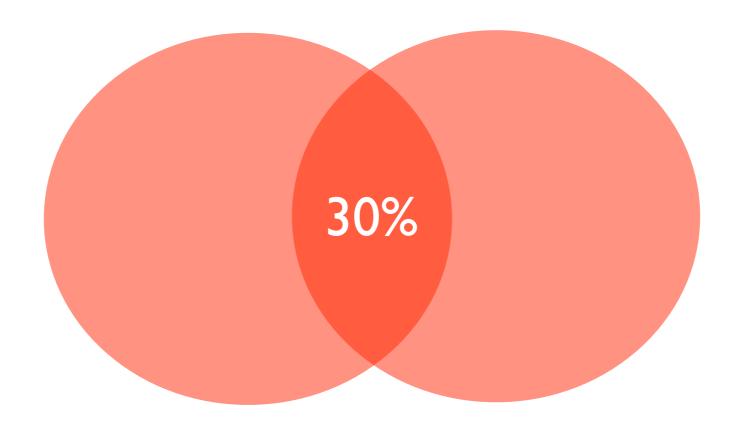
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relevance is consistent across users

- Relevance is in the eye of the beholder
- In general, overlap between assessors tends to be 30%
- The intersection divided by the union = 30%



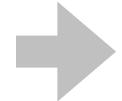
relevance is consistent across users

- Yes, relevance is in the eye of the beholder
- However, there are some regularities!
 - agreement is greater when assessors have a high level of expertise on the subject
 - overlap can be as high as 80%
 - using relevance grades, overlap is greater on the most relevant grade (arguably the most important findings?)

relevance is consistent across users

- As it turns out, when we average across queries, the ranking of systems by performance stays the same when we use different assessors
- The best system remains the best system
- The second best system remains the second best system
- The worst system remains the worst system (and so on...)
- That is, when we average across queries!
- For individual queries, changes in the ranking of systems can occur

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5. Stable: relevance is stable over time

Batch Evaluation Assumptions relevance is stable

- As previously discussed, relevance is dynamic
- The user's internal/external factors are dynamic
- Therefore, the document attributes that influence relevance judgements are dynamic
- What internal factors change as the user searches?

- Most IR test-collections have been build under the following assumptions about relevance:
 - 1. Topical: relevance is solely topical
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- So, are decades of batch-evaluation results meaningless?
- What do you think?

Interactive Information Retrieval

- How are relevance judgements affected by a user's many internal states (cognitive, affective, belief states)?
- How are relevance judgements affected by a user's many external/situational states?
- How can these internal and external states be communicated to the system?
- How can these internal and external states be predicted by the system?
- How do these states change as a task evolves and how does this affect changes in relevance judgements?