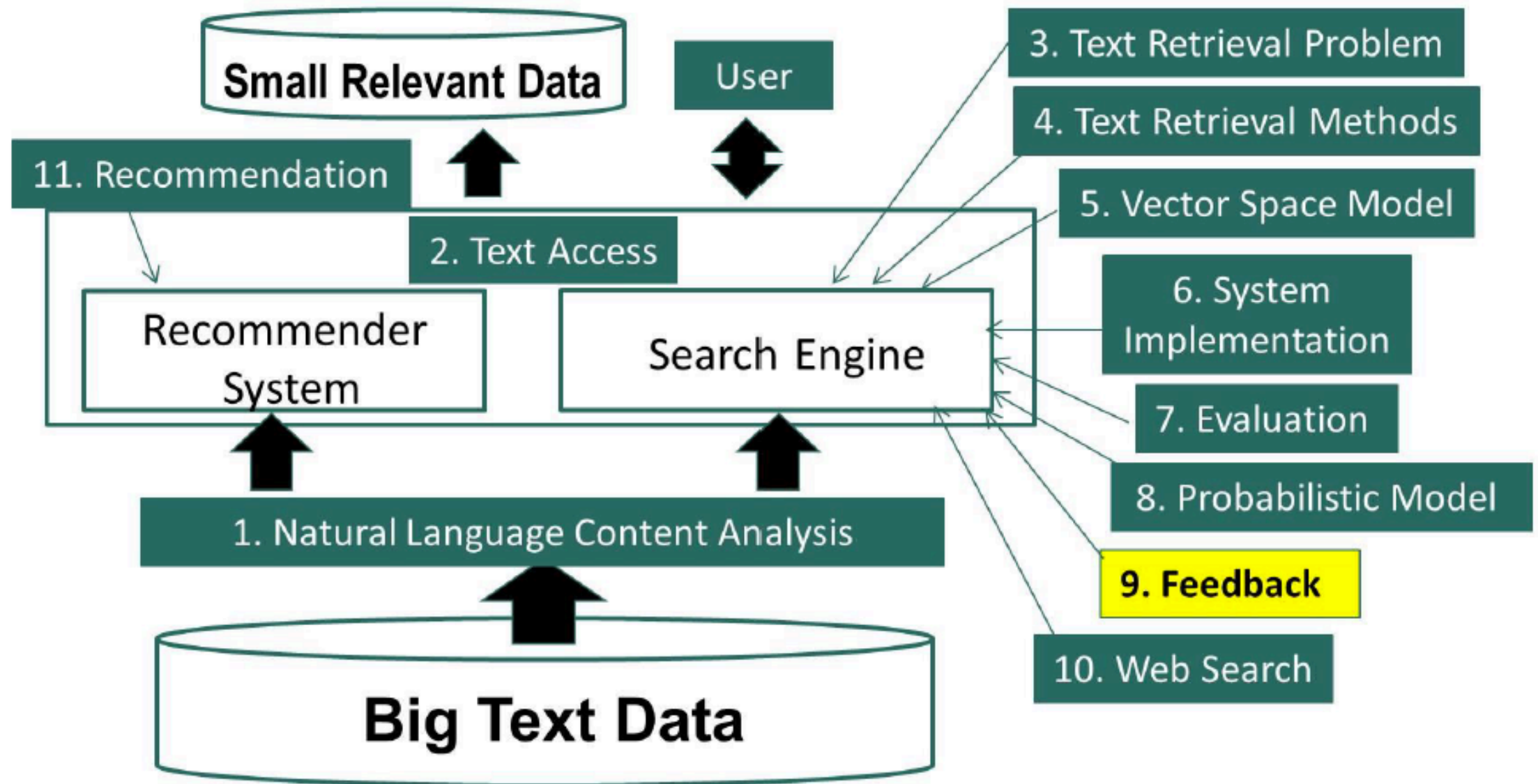


Information Retrieval & Text Mining

**Retrieval Method:
Feedback in VSM**

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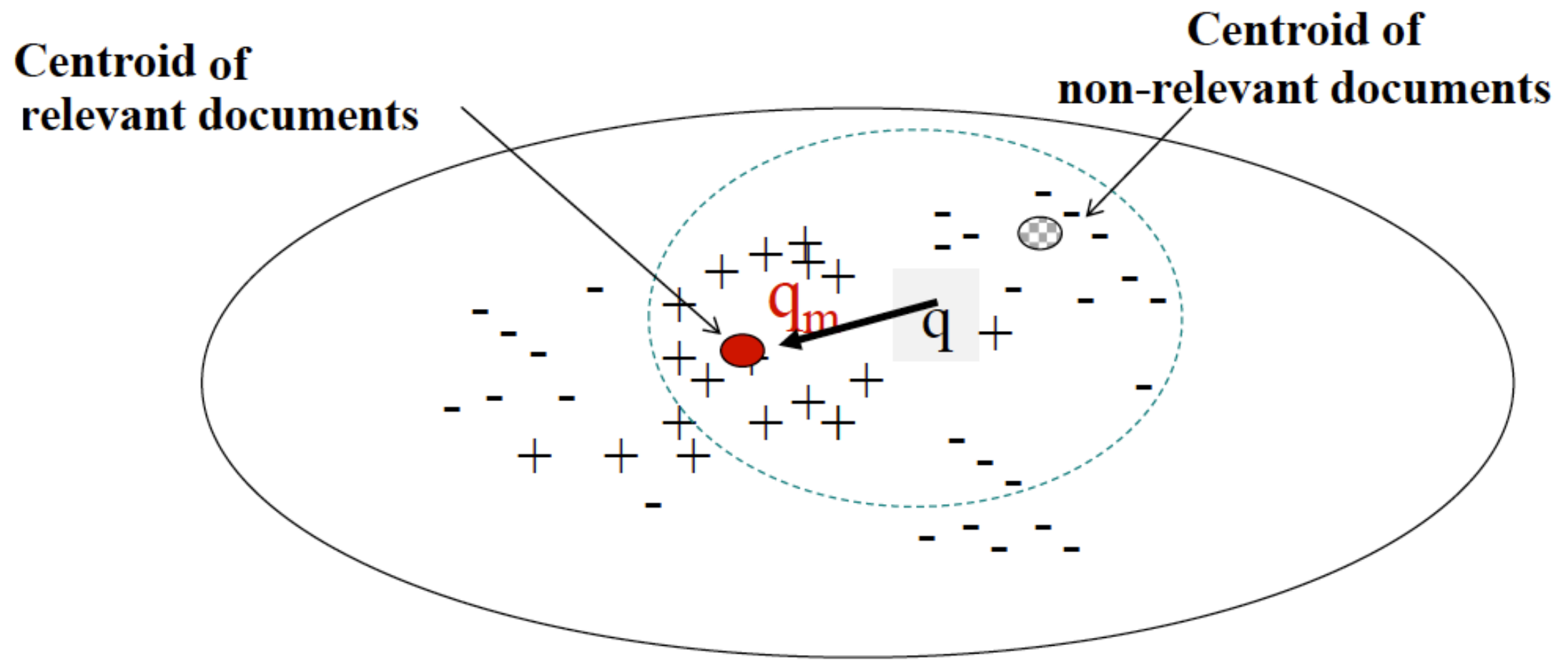
Text Retrieval Methods: Feedback in TR



Feedback in Vector Space Model

- How can a TR system learn from examples to improve retrieval accuracy?
 - Positive examples: docs known to be relevant
 - Negative examples: docs known to be non-relevant
- General method: query modification
 - Adding new (weighted) terms (query expansion)
 - Adjusting weights of old terms

Rocchio Feedback: Illustration



Rocchio Feedback: Formula

New query

Parameters

$$\vec{q}_m = \alpha \vec{q} + \frac{\beta}{|D_r|} \sum_{\forall \vec{d}_j \in D_r} \vec{d}_j - \frac{\gamma}{|D_n|} \sum_{\forall \vec{d}_j \in D_n} \vec{d}_j$$

Rocchio Feedback: Formula

New query

Parameters

$$\vec{q}_m = \alpha \vec{q} + \frac{\beta}{|D_r|} \sum_{\forall \vec{d}_j \in D_r} \vec{d}_j - \frac{\gamma}{|D_n|} \sum_{\forall \vec{d}_j \in D_n} \vec{d}_j$$

Original query

Rel docs

Non-rel docs

The diagram illustrates the Rocchio Feedback formula. At the top, the word 'Parameters' has three arrows pointing to the coefficients α , β , and γ in the formula. On the left, 'New query' has an arrow pointing to \vec{q}_m . Below the formula, 'Original query' has an arrow pointing to \vec{q} . 'Rel docs' has an arrow pointing to the summation term $\sum_{\forall \vec{d}_j \in D_r} \vec{d}_j$. 'Non-rel docs' has an arrow pointing to the summation term $\sum_{\forall \vec{d}_j \in D_n} \vec{d}_j$.

Example of Rocchio Feedback

$V = \{\text{news about presidential camp. food}\}$

Query = "news about presidential campaign"

$Q = (1, 1, 1, 1, 0, 0, \dots)$

D1

... news about ...

- $D1 = (1.5, 0.1, 0, 0, 0, 0, \dots)$

D2

... news about organic food campaign...

- $D2 = (1.5, 0.1, 0, 2.0, 2.0, 0, \dots)$

D3

... news of presidential campaign ...

+ $D3 = (1.5, 0, 3.0, 2.0, 0, 0, \dots)$

D4

... news of presidential campaign ...

... presidential candidate ...

+ $D4 = (1.5, 0, 4.0, 2.0, 0, 0, \dots)$

D5

... news of organic food campaign... campaign...campaign...campaign...

- $D5 = (1.5, 0, 0, 6.0, 2.0, 0, \dots)$

Example of Rocchio Feedback

$V = \{\text{news about presidential camp. food}\}$

Query = "news about presidential campaign"

$Q = (1, 1, 1, 1, 0, 0, \dots)$

D1

... news about ...

- $D1 = (1.5, 0.1, 0, 0, 0, 0, \dots)$

D2

... news about organic food campaign...

- $D2 = (1.5, 0.1, 0, 2.0, 2.0, 0, \dots)$

D3

... news of presidential campaign ...

+ $D3 = (1.5, 0, 3.0, 2.0, 0, 0, \dots)$

+ Centroid Vector = $((1.5+1.5)/2, 0, (3.0+4.0)/2, (2.0+2.0)/2, 0, 0, \dots)$
 $= (1.5, 0, 3.5, 2.0, 0, 0, \dots)$

+ $D4 = (1.5, 0, 4.0, 2.0, 0, 0, \dots)$

D5

... news of organic food campaign... campaign...campaign...campaign...

- $D5 = (1.5, 0, 0, 6.0, 2.0, 0, \dots)$

Example of Rocchio Feedback

$V = \{\text{news about presidential camp. food}\}$

Query = "news about presidential campaign"

$Q = (1, 1, 1, 1, 0, 0, \dots)$

- $D1 = (1.5, 0.1, 0, 0, 0, 0, \dots)$

D2

... news about organic food campaign...

- $D2 = (1.5, 0.1, 0, 2.0, 2.0, 0, \dots)$

D3

... news of presidential campaign ...

+ $D3 = (1.5, 0, 3.0, 2.0, 0, 0, \dots)$

D4

+ Centroid Vector = $((1.5+1.5)/2, 0, (3.0+4.0)/2, (2.0+2.0)/2, 0, 0, \dots)$

$= (1.5, 0, 3.5, 2.0, 0, 0, \dots)$

+ $D4 = (1.5, 0, 4.0, 2.0, 0, 0, \dots)$

- Centroid Vector = $((1.5+1.5+1.5)/3, (0.1+0.1+0)/3, 0, (0+2.0+6.0)/3, (0+2.0+2.0)/3, 0, \dots)$

$= (1.5, 0.067, 0, 2.6, 1.3, 0, \dots)$

- $D5 = (1.5, 0, 0, 6.0, 2.0, 0, \dots)$

Example of Rocchio Feedback

$V = \{\text{news about presidential camp. food}\}$

Query = "news about presidential campaign"

$Q = (1, 1, 1, 1, 0, 0, \dots)$

New Query $Q' = (\alpha * 1 + \beta * 1.5 - \gamma * 1.5, \alpha * 1 - \gamma * 0.067, \alpha * 1 + \beta * 3.5, \alpha * 1 + \beta * 2.0 - \gamma * 2.6, -\gamma * 1.3, 0, 0, \dots)$

- $D1 = (1.5, 0.1, 0, 0, 0, 0, \dots)$

D2

... news about organic food campaign...

- $D2 = (1.5, 0.1, 0, 2.0, 2.0, 0, \dots)$

D3

... news of presidential campaign ...

+ $D3 = (1.5, 0, 3.0, 2.0, 0, 0, \dots)$

D4

+ Centroid Vector = $((1.5+1.5)/2, 0, (3.0+4.0)/2, (2.0+2.0)/2, 0, 0, \dots)$
 $= (1.5, 0, 3.5, 2.0, 0, 0, \dots)$

+ $D4 = (1.5, 0, 4.0, 2.0, 0, 0, \dots)$

- Centroid Vector = $((1.5+1.5+1.5)/3, (0.1+0.1+0)/3, 0, (0+2.0+6.0)/3, (0+2.0+2.0)/3, 0, \dots)$
 $= (1.5, 0.067, 0, 2.6, 1.3, 0, \dots)$

- $D5 = (1.5, 0, 0, 6.0, 2.0, 0, \dots)$

Rocchio in Practice

- Negative (non-relevant) examples are not very important (why?)
- Often truncate the vector (i.e., consider only a small number of words that have highest weights in the centroid vector) (efficiency concern)
- Avoid “over-fitting” (keep relatively high weight on the original query weights) (why?)
- Can be used for relevance feedback and pseudo feedback (β should be set to a larger value for relevance feedback than for pseudo feedback)
- Usually robust and effective