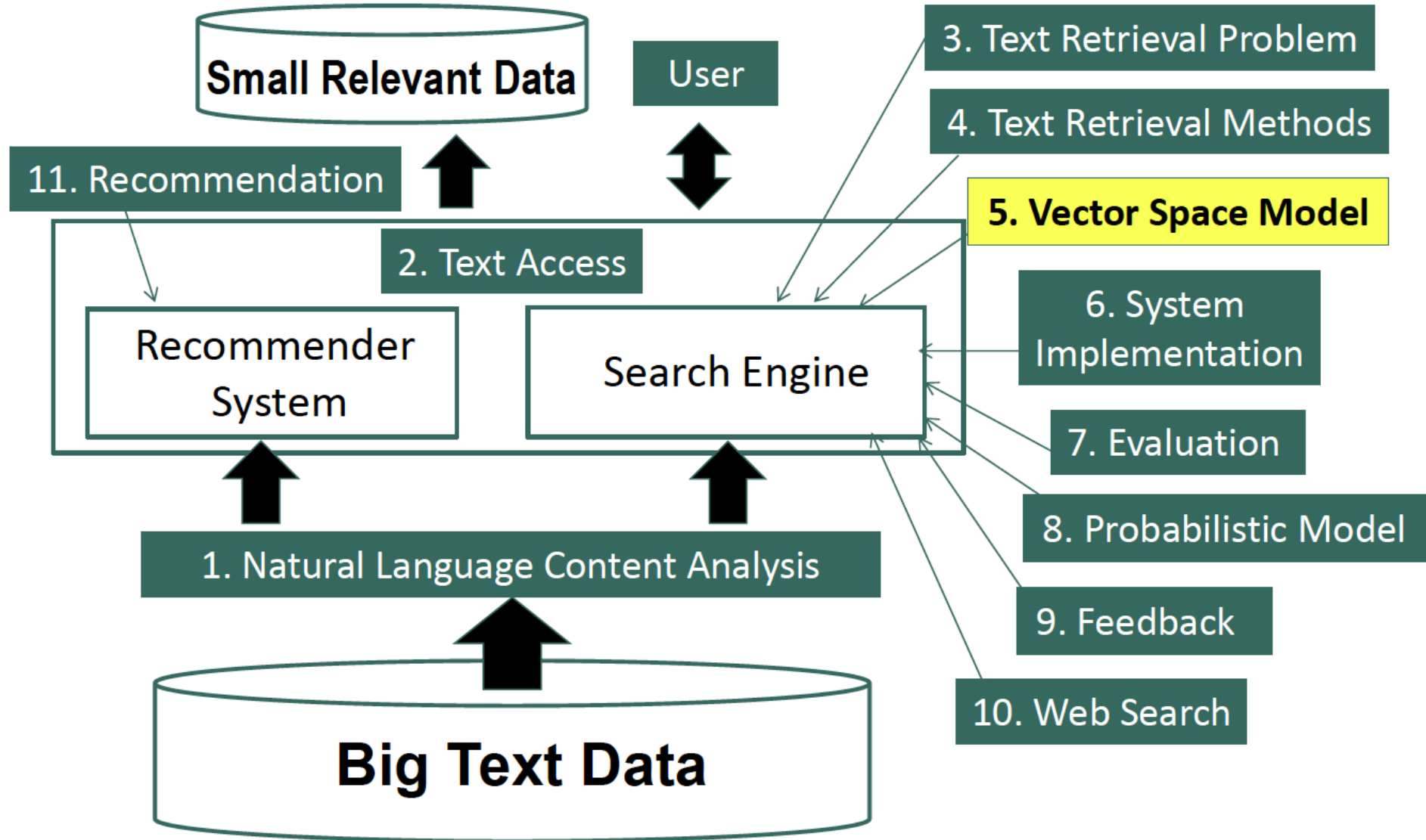


Information Retrieval & Text Mining

Vector Space Model **Term Frequency Transformation**

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Course Schedule



VSM with TF-IDF Weighting Still Has a Problem!

Query = “news about presidential campaign”

d1	... news about ...	$f(q,d1)=2.5$
d2	... news about organic food campaign ...	$f(q,d2)=5.6$
d3	... news of presidential campaign ...	$f(q,d3)=7.1$
d4	... news of presidential campaign presidential candidate ...	$f(q,d4)=9.6$
d5	... news of organic food campaign ... campaign...campaign...campaign...	$f(q,d5)=13.9?$

Ranking Function with TF-IDF Weighting

Total # of docs in collection

$$f(q, d) = \sum_{i=1}^N x_i y_i = \sum_{w \in q \cap d} c(w, q) c(w, d) \log \frac{M + 1}{df(w)}$$

All matched query words in d

Doc Frequency

d5

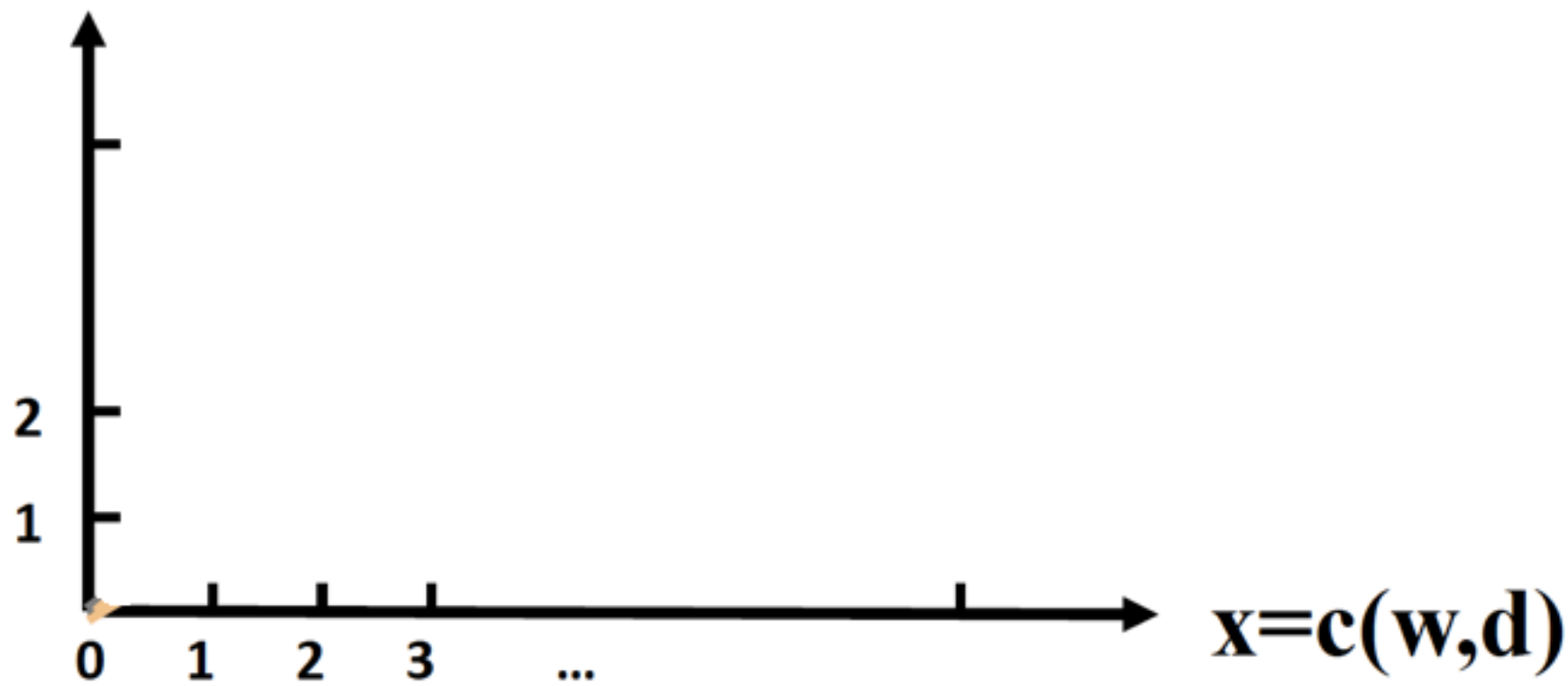
... news of organic food **campaign**...
campaign...**campaign**...**campaign**...

$c(\text{"campaign"}, d5) = 4$
 $\rightarrow f(q, d5) = 13.9?$

TF Transformation: $c(w,d) \rightarrow TF(w,d)$

Term Frequency Weight

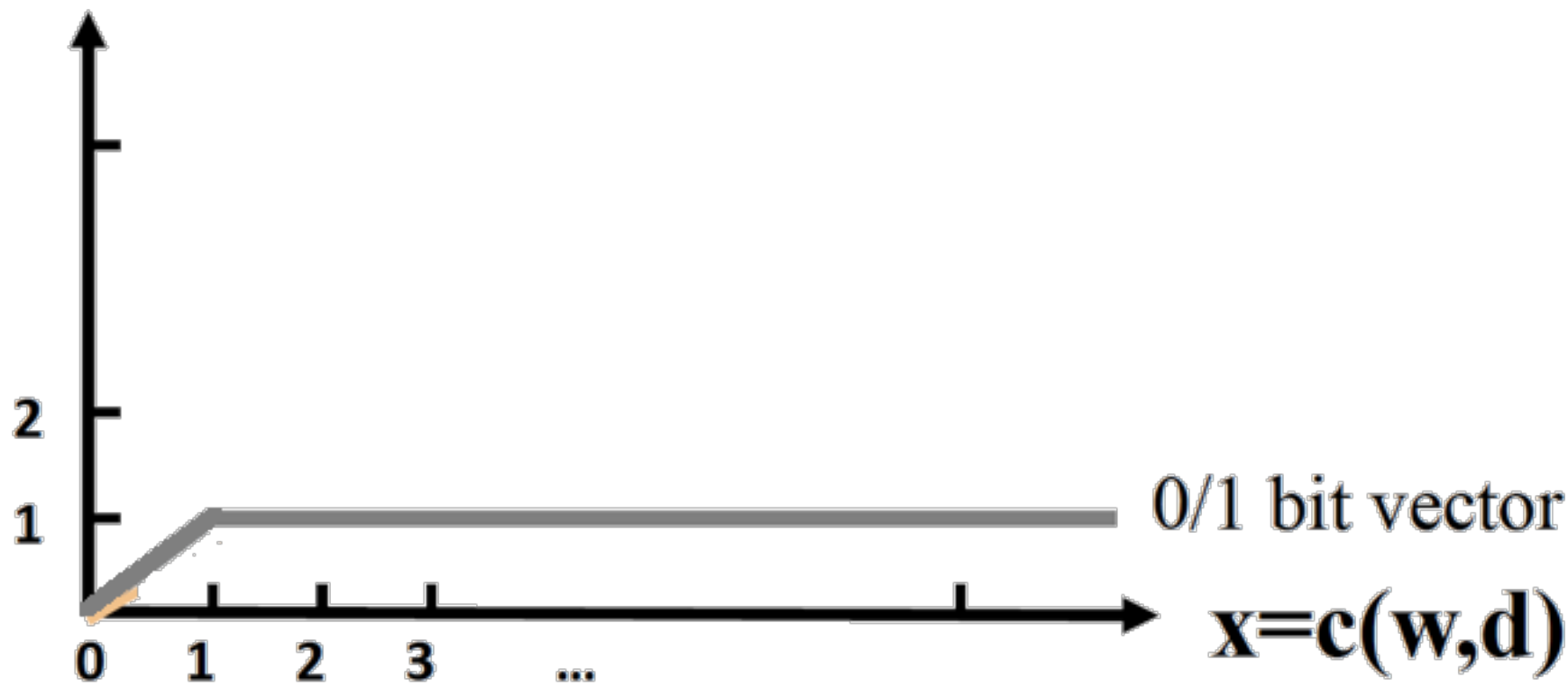
$$y = TF(w,d)$$



TF Transformation: $c(w,d) \Rightarrow TF(w,d)$

Term Frequency Weight

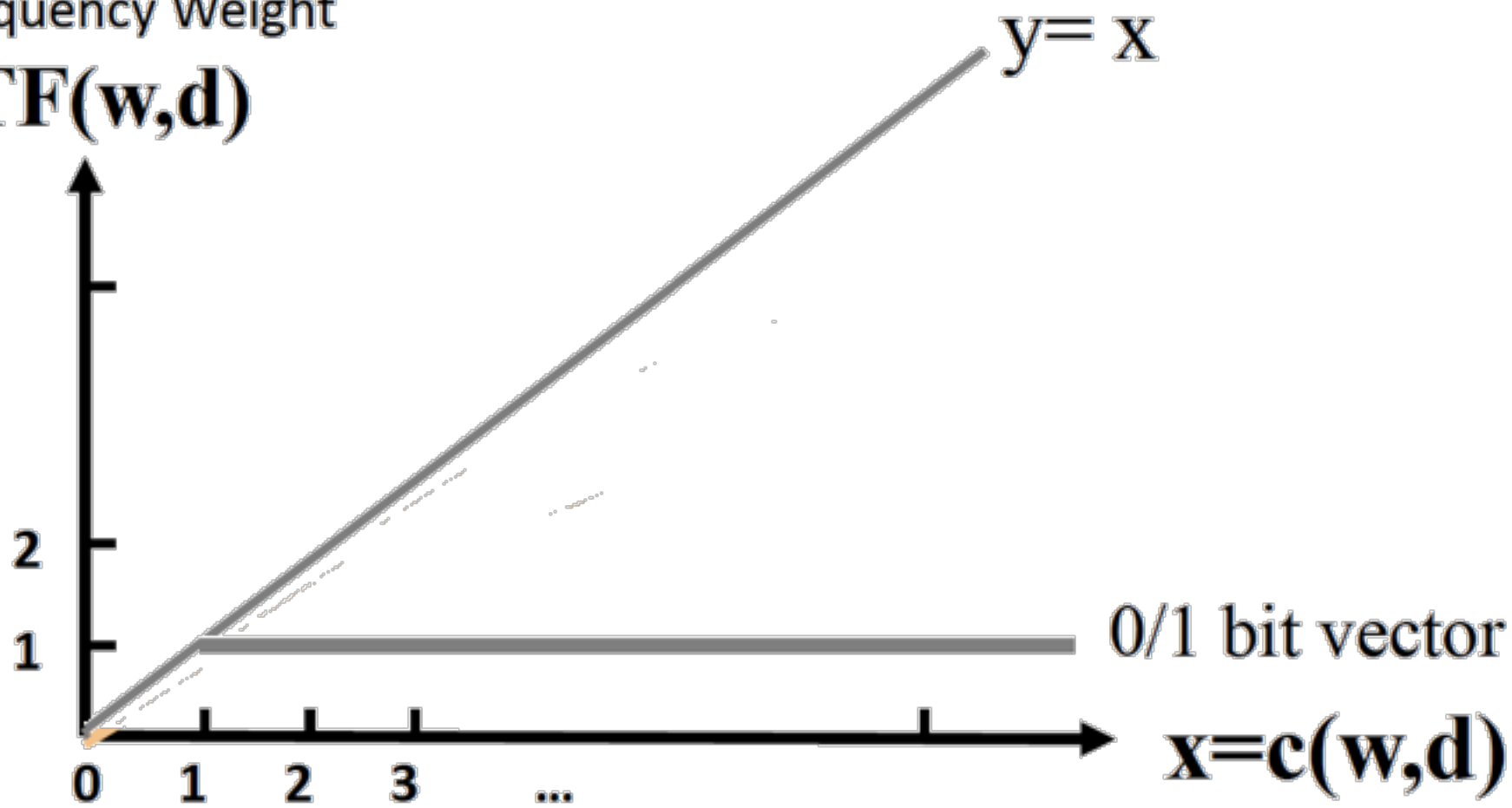
$$y = TF(w,d)$$



TF Transformation: $c(w,d) \Rightarrow TF(w,d)$

Term Frequency Weight

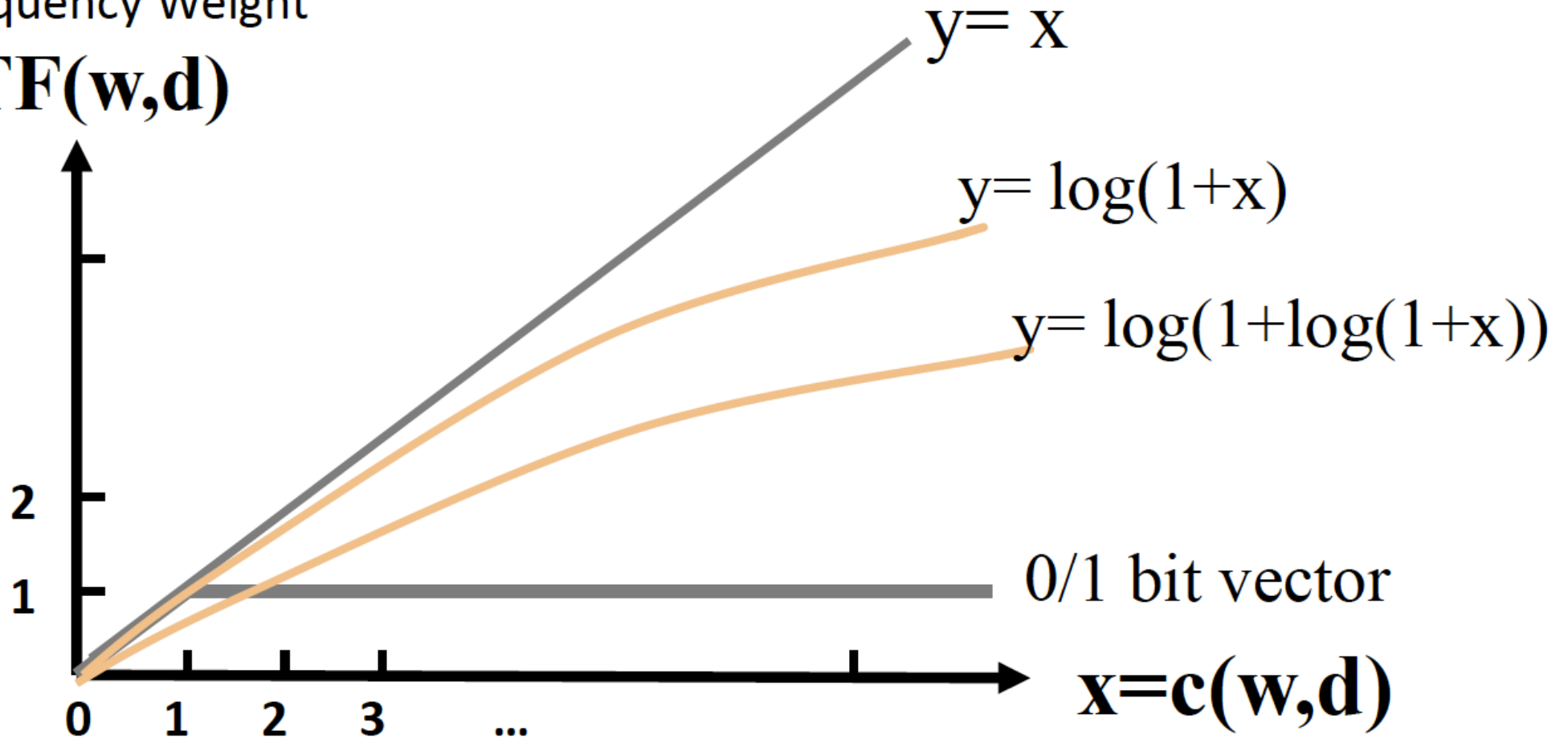
$$y = TF(w,d)$$



TF Transformation: $c(w,d) \rightarrow TF(w,d)$

Term Frequency Weight

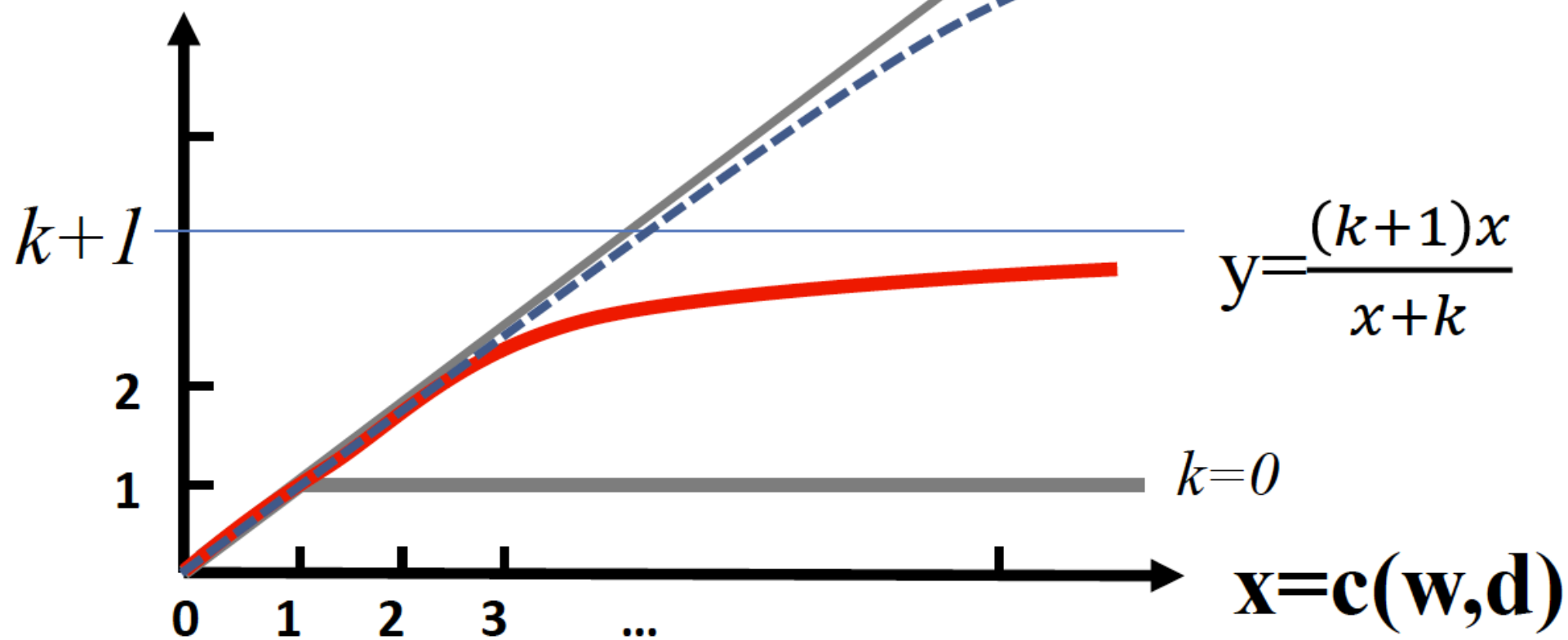
$$y = TF(w,d)$$



TF Transformation: BM25 Transformation

Term Frequency Weight

$$y = \text{TF}(w, d)$$



Summary

- Sublinear TF Transformation is needed to
 - capture the intuition of “diminishing return” from higher TF
 - avoid dominance by one single term over all others
- BM25 Transformation
 - has an upper bound
 - is robust and effective
- Ranking function with BM25 TF ($k \geq 0$)

$$f(q, d) = \sum_{i=1}^N x_i y_i = \sum_{w \in q \cap d} c(w, q) \frac{(k+1)c(w, d)}{c(w, d) + k} \log \frac{M+1}{df(w)}$$
