Shortcomings of lexical-based similarity measures

- Invariant to sequence order: randomly shuffling the order of the words in each document yields the same result.
- Doesn't capture word synonymy, polysemy, or context
- Highly sensitive to text processing and tokenization scheme that is used
- Given the sparsity of the term document matrix, should we expect any distance-based similarity metric to be meaningful?

Low rank approximation of the term-document matrix

- We saw in the TF-IDF demo that documents can be characterized by its most heavily TF-IDF weighted words
- Idea: what if we were to project a document onto a set of basis' comprised of linear combinations of the constituent words such that the basis themselves capture semantic relationships between words?
- How would we learn such a transformation?
 - PCA?
 - SVD?
- Why is PCA not suitable for this problem?
- How many dimensions would we need for our sub manifold to capture most of the information in our sparse term-document matrix?