Predicting Patent Rejections with NLP

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About Me:

B.S. Mechanical Engineering M.S. Electrical Engineering

US Patent Bar Patent agent from 2016 - 2019



What can NOT be patented?

United States Code 101:

SUBJECTIVE!

- Laws of nature
- Natural phenomena
- Abstract ideas



Example Claim

1. A system for determining a direct memory access (DMA) transfer mode...[lots of boring text]

...the DMA transfer mode being one of a data copy mode and a map/umap mode.

<u>ABSTRACT IDEA</u>



... the DMA transfer mode being one of a data copy first mode and a map/umap or a second mode,

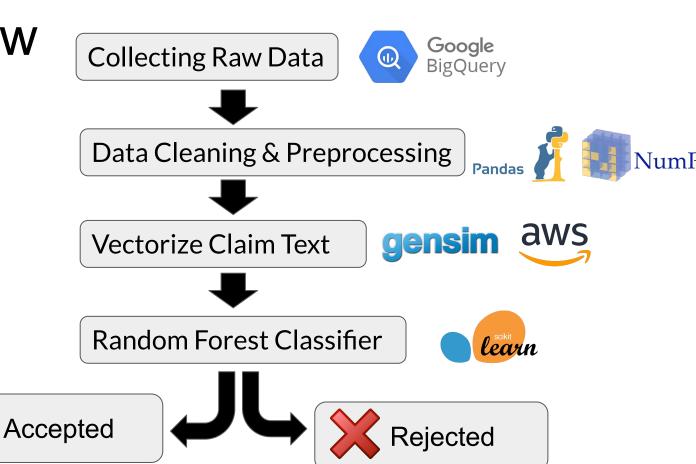
wherein, in the first mode, a first region of system memory is pre-allocated for use in DMA transfers, and

wherein, in the second mode, a second region of system memory for use in a particular DMA transfer is allocated for the particular DMA transfer and deallocated when the particular DMA transfer is complete.

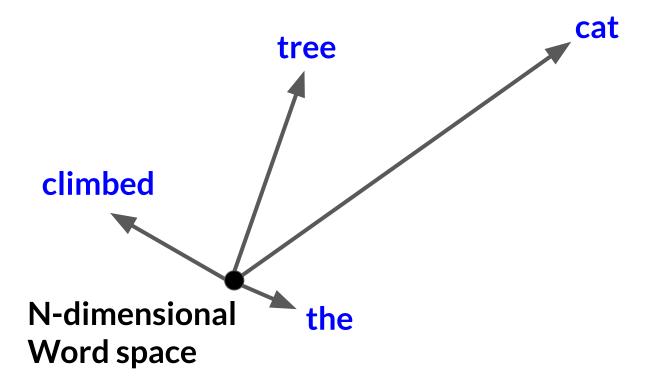
Project Goal

Build a model to automatically predict whether a claim will receive a 101 rejection

Workflow

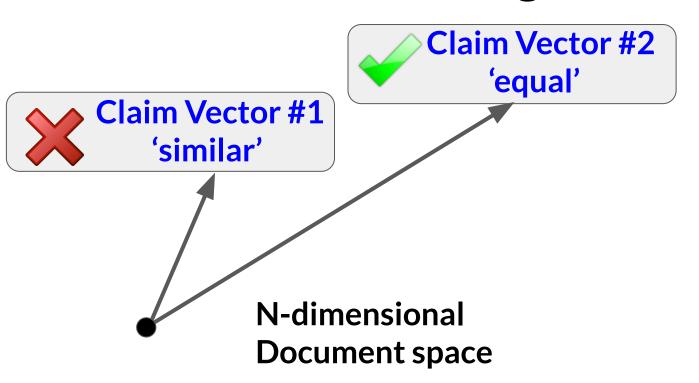


Word Embeddings



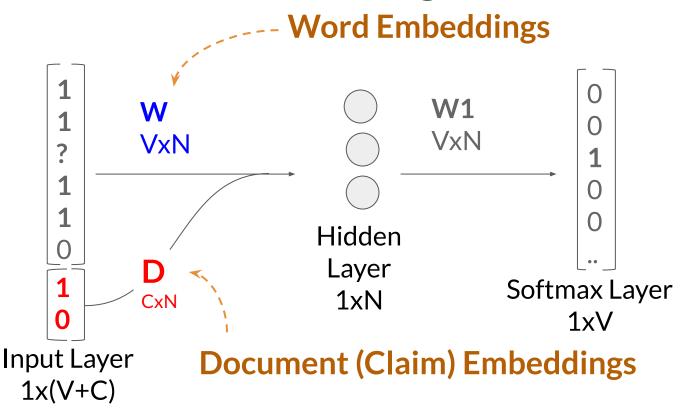
the cat climbed a tree

Claim Embeddings

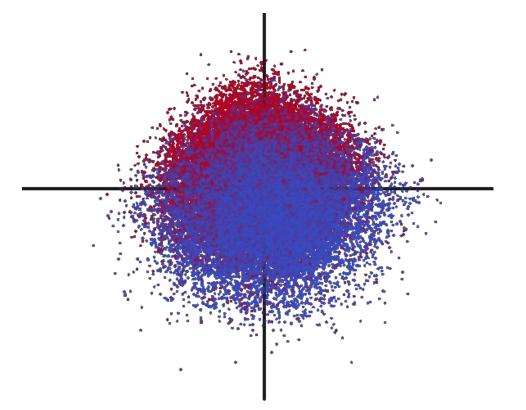


. . . second side ??? length to the first side

Claim Embeddings



Principal Component Analysis



Accepted

Rejected

First 3 Principal Components

Results

Test Set: 31,916 Unseen claims 50% Rejected 50% Approved

Accuracy: 96.5%

Rejected Claims Identified Correctly:

94.5 %

Business Value?

Samsung (in year 2016)

Low Estimate	Moderate estimate
496 (rejections, only 101)	3096 (total 101 rejections)
x \$4000 ¹ (cost of rejection)	x \$4000/2 (estimate cost)
x 94.5% (recall)	x 94.5% (recall)
= \$1,874,880 (Savings)	= \$5,851,440 (Savings)

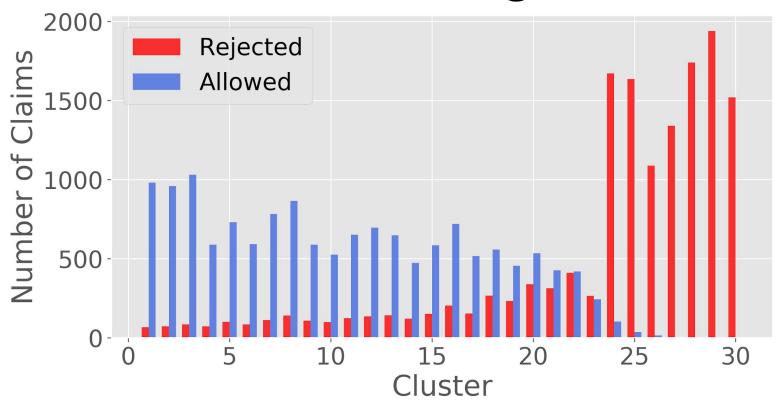
¹ Average cost of responding to rejection: American Intellectual Property Lawyers Association

Thank you.

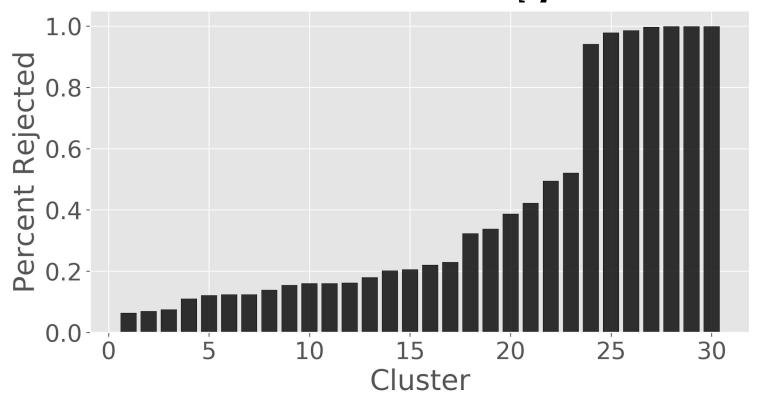


Appendix

K-Means Clustering



K-Means Clustering



Narrowing Words/Phrases

Examples:

'corresponding to...'

'each...'

'responsive to...'

'containing...'

'only...'

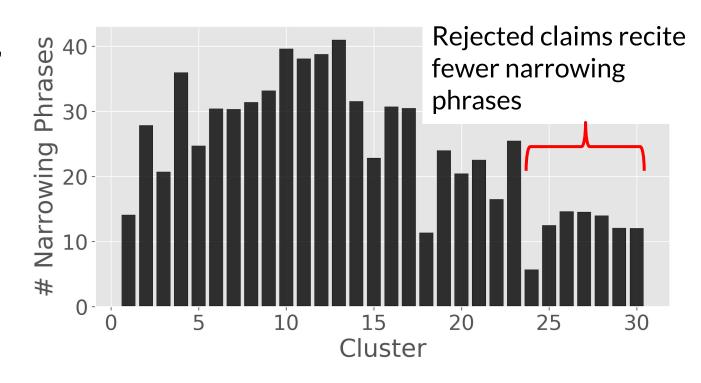
'using the...'

'a first...'

'consisting...'

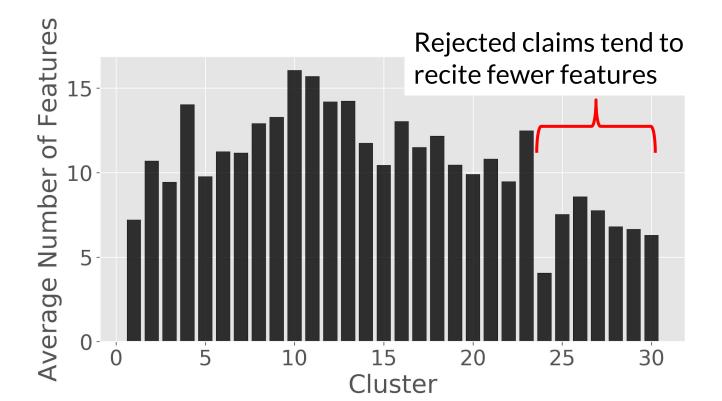
'more than...'

'between...'

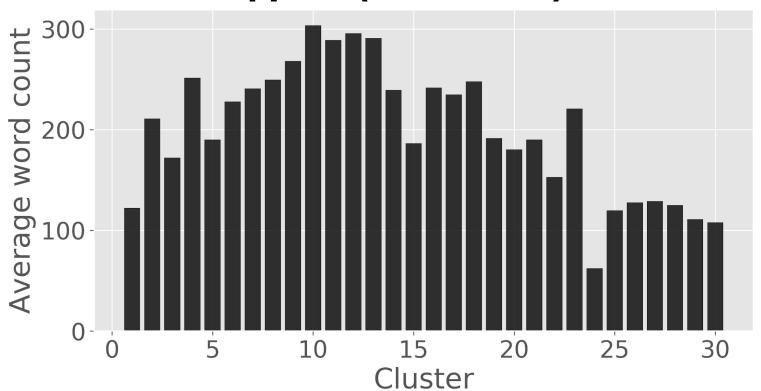


Number of Features

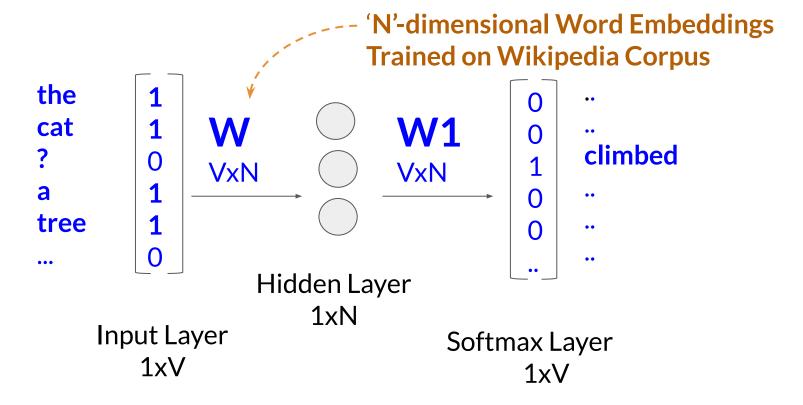
'<u>a</u> first CPU'
'<u>a</u> power supply'
'<u>a</u> display'
'<u>a</u> user interface'
'<u>a</u> communication module'



Claim length (words)



Word Embeddings



Document Embeddings

Document 1 -

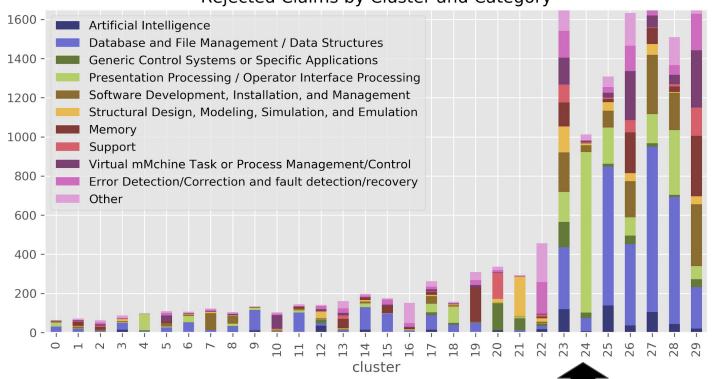
an object having a first side that is **(substantially)** longer than a second side.

Document 2 -

an object having a first side that is (between 120-150%) longer than a second side.

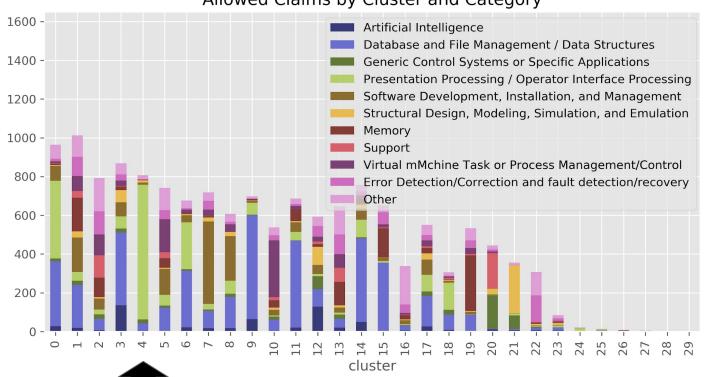
K-Means Clustering

Rejected Claims by Cluster and Category



K-Means Clustering

Allowed Claims by Cluster and Category



Results

