

# **Keywords Optimization via Learning Text Representations**

**Feng Gui (Sophomore)**

**Runliang Li (Sophomore)**

**Fred Zhang (Sophomore)**

**Wilson Zhang (Freshman)**

**Wuming Zhang (Sophomore)**

**Expansion is Easy; Prediction is Hard**

# Expansion is Easy; Prediction is Hard

- ❑ **Combinations of existing keywords**
- ❑ **Data-driven methods (e.g., “related search”)**
- ❑ **(Computational) Linguistics (e.g., thesaurus, WordNet)**

# Expansion is Easy; Prediction is Hard

- ❑ Combinations of existing keywords
- ❑ Data-driven methods (e.g., “related search”)
- ❑ (Computational) Linguistics (e.g., thesaurus, WordNet)

## Searches related to ticketmaster

<b>stubhub</b>	ticketmaster <b>locations</b>
<b>ticketon</b>	ticketmaster <b>refund</b>
<b>live nation</b>	ticketmaster <b>raleigh</b>
<b>purchase tickets</b> ticketmaster	ticketmaster <b>login</b>

# Expansion is Easy; Prediction is Hard

- ❑ **Combinations of existing keywords**
- ❑ **Data-driven methods (e.g., “related search”)**
- ❑ **(Computational) Linguistics (e.g., thesaurus, WordNet)**

# Expansion is Easy; Prediction is Hard

- ❑ Combinations of existing keywords
- ❑ Data-driven methods (e.g., “related search”)
- ❑ (Computational) Linguistics (e.g., thesaurus, WordNet)

1.	Input mode	<input checked="" type="radio"/> Word <input type="radio"/> Sentence
2.	Word 1	<input type="text" value="dog#n#1"/>
3.	Word 2	<input type="text" value="cat#n#1"/>
4.	Submit	<input type="button" value="Calculate Semantic Similarity"/>

# Expansion is Easy; Prediction is Hard

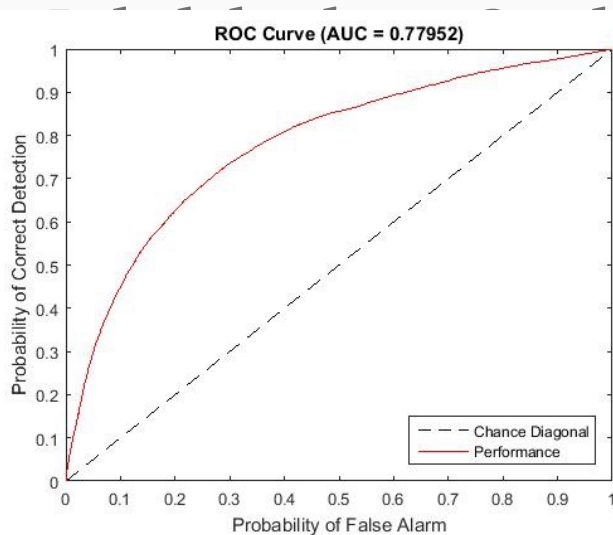
- ❑ **Combinations of existing keywords**
- ❑ **Data-driven methods (e.g., “related search”)**
- ❑ **(Computational) Linguistics (e.g., thesaurus, WordNet)**

# Predict What Keywords are Good

1. Label the data—Good or Bad.
2. Construct text representation — $\mathbb{R}^{2857}$  !
  - Bag-of-Words (BoW)
  - tf-idf vectors
3. Dimensionality Reduction (e.g., PCA)
4. Train Machine Learning classifier(s)— SVM, Random Forests, etc.



# Predict What Keywords are Good



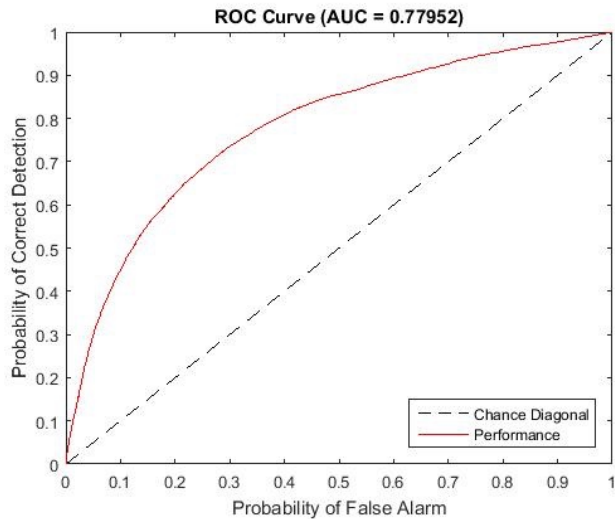
Bad.

tation —  $\mathbb{R}^{2857}$  !

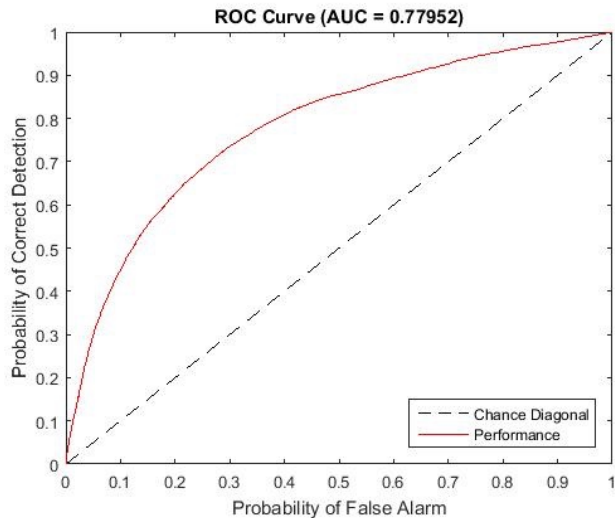
on (e.g., PCA)

classifier(s)— SVM, Random Forests, etc.

# Predict What Keywords are Good



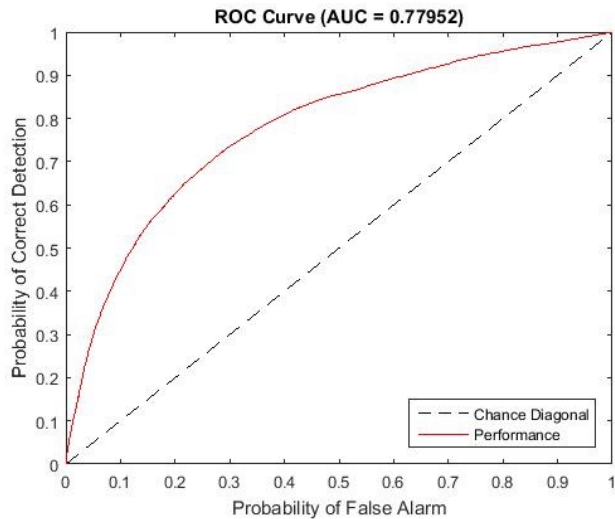
# Predict What Keywords are Good



**This beats an early result from  
research community**

**“Keyword Optimization in Sponsored  
Search via Feature Selection” (JMLR 08)**

# Predict What Keywords are Good



# Expand Your Keyword Set

- **Fix a word. See what combinations are good.**
- **(Asynchronizable) script to query Bing's related search API.**

# Expand Your Keyword Set

Expand Your Keyword Set

# Expand Your Keyword Set

```
→ fest git:(master) X python bing.py duke\ basketball
```

```
[u'duke basketball', u'duke basketball schedule', u'duke basketball report', u'duke basketball recruiting', u'duke basketball news', u'duke basketball roster', u'duke basketball schedule 2016 2017', u'duke basketball camp', u'duke basketball tickets', u'duke basketball schedule 2015 2016', u'duke basketball roster 2015 2016', u'duke basketball recruiting news', u'duke basketball score', u'duke basketball live', u'famous duke basketball players', u'jeter duke basketball', u'duke college basketball', u'duke basketball players']
```

# Expand Your Keyword Set

Expand Your Keyword Set



# Expand Your Keyword Set

- **Fix a word. See what combinations are good.**
- **(Asynchronizable) script to query Bing's related search API.**