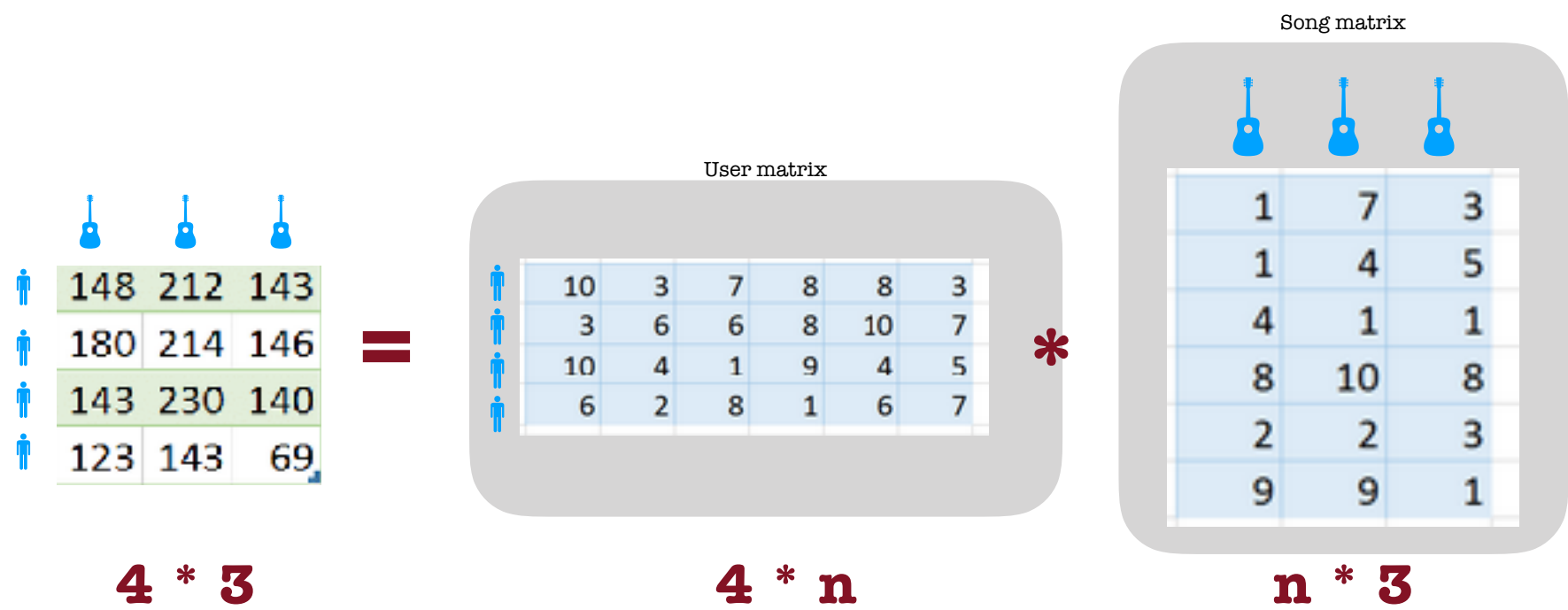


Attribute Detection



```
corpus = ["phone camera phone battery",
          "battery and camera of the phone",
          "cloth texture",
          "style and texture cloth"]
```

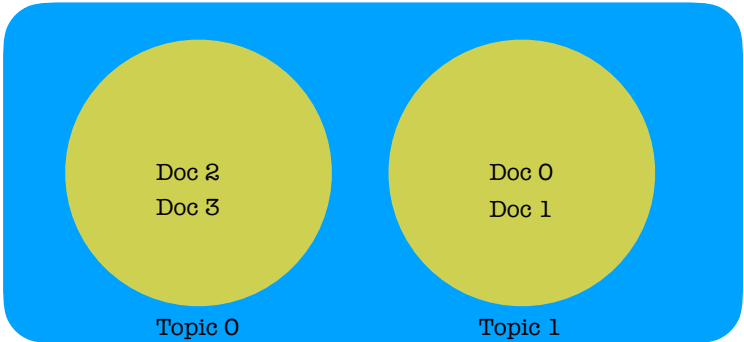
	phone	camera	battery	and	of	the	cloth	texture	style
doc_0	0.000000	0.408248	0.408248	0.000000	0.000000	0.816497	0.000000	0.000000	0.000000
doc_1	0.372225	0.372225	0.372225	0.000000	0.47212	0.372225	0.000000	0.000000	0.47212
doc_2	0.000000	0.000000	0.000000	0.707107	0.000000	0.000000	0.000000	0.707107	0.000000
doc_3	0.465809	0.000000	0.000000	0.465809	0.000000	0.000000	0.590819	0.465809	0.000000

Document matrix

	0	1
doc_0	0.000000	0.878597
doc_1	0.056260	0.840770
doc_2	0.691503	0.000000
doc_3	0.707012	0.025084

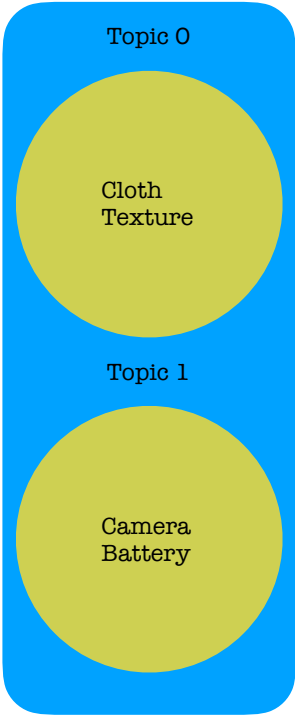
- What we can infer from this?

If we just know the number of categories/topics present in our corpus we can find out which document belongs to which topic or which category



Word matrix

	0	1
phone	0.369680	0.183829
camera	0.000489	0.455349
battery	0.000489	0.455349
and	0.826328	0.000000
of	0.028011	0.256675
the	0.000000	0.707207
cloth	0.431368	0.000000
texture	0.826328	0.000000
style	0.028011	0.256675



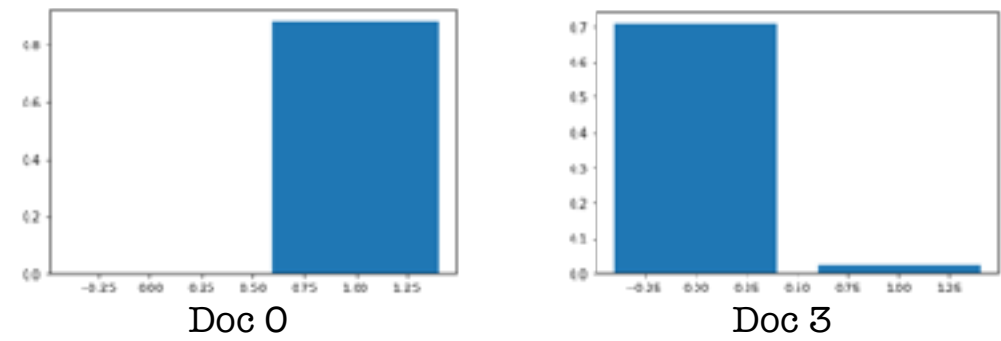
- What we can infer from this?

If we just know the number of categories/topics present in our corpus we can find out which word belongs to which topic or which category

Document matrix

	Topic 0	Topic 1
doc_0	0.000000	0.878597
doc_1	0.056260	0.840770
doc_2	0.691503	0.000000
doc_3	0.707012	0.025084

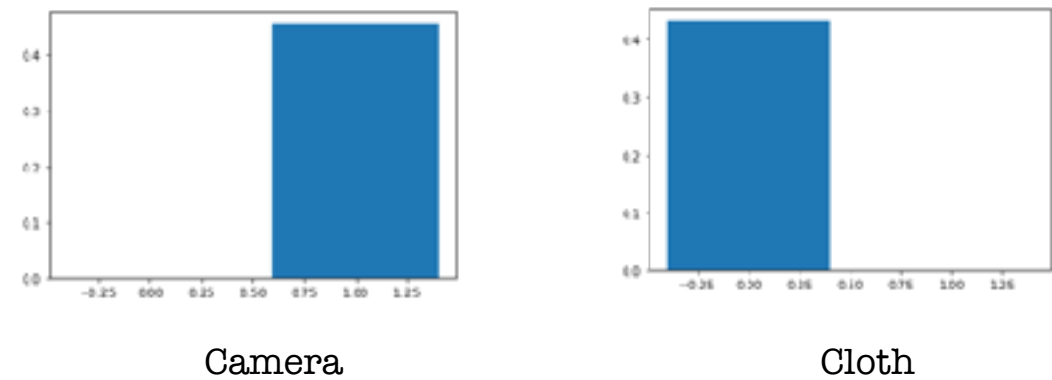
Document matrix represent the document distribution over topic



Word matrix

	Topic 0	Topic 1
phone	0.369680	0.183829
camera	0.000489	0.455349
battery	0.000489	0.455349
and	0.826328	0.000000
of	0.028011	0.256675
the	0.000000	0.707207
cloth	0.431368	0.000000
texture	0.826328	0.000000
style	0.028011	0.256675

Word matrix represent word distribution over topics



Given a new document how will you find to what topic it belongs to?

New doc: cloth texture

TF-IDF representation

	phone	camera	battery	and	of	the	cloth	texture	style
new_doc	0.0	0.0	0.0	0.707107	0.0	0.0	0.0	0.707107	0.0

Find value of new_doc w.r.t Topic 0:

Word matrix

	Topic 0	Topic 1
phone	0.369680	0.183829
camera	0.000489	0.455349
battery	0.000489	0.455349
and	0.826328	0.000000
of	0.028011	0.256675
the	0.000000	0.707207
cloth	0.431368	0.000000
texture	0.826328	0.000000
style	0.028011	0.256675

Tf-IDF of new doc

	new_do
phone	0.000000
camer	0.000000
batter	0.000000
and	0.707107
of	0.000000
the	0.000000
cloth	0.000000
textur	0.707107
style	0.000000

$$= (0.369 * 0) + (0.0004 * 0) + \dots$$

So on

$$= 0.69150341$$

Find value of new_doc w.r.t Topic 1:

Word matrix

	Topic 0	Topic 1
phone	0.369680	0.183829
camera	0.000489	0.455349
battery	0.000489	0.455349
and	0.826328	0.000000
of	0.028011	0.256675
the	0.000000	0.707207
cloth	0.431368	0.000000
texture	0.826328	0.000000
style	0.028011	0.256675

Tf-IDF of new doc

	new_do
phone	0.000000
camer	0.000000
batter	0.000000
and	0.707107
of	0.000000
the	0.000000
cloth	0.000000
textur	0.707107
style	0.000000

$$= 0$$

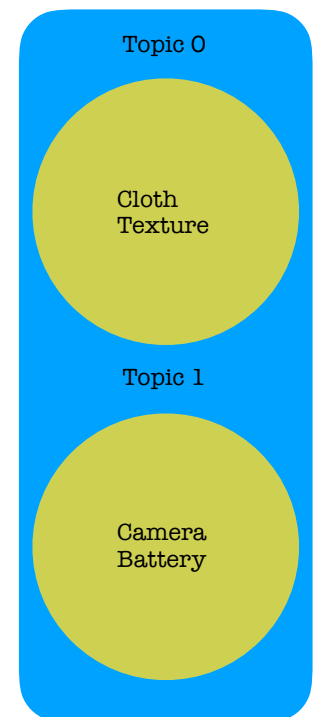
Given:

```
corpus = ["phone camera phone battery",  
          "battery and camera of the phone",  
          "cloth texture",  
          "style and texture cloth"]
```

	pho	camer	batter	and	of	the	cloth	textur	style
doc_0	0.000	0.4082	0.4082	0.0000	0.0000	0.8164	0.0000	0.0000	0.0000
doc_1	0.371	0.3722	0.3722	0.0000	0.472	0.3722	0.0000	0.0000	0.472
doc_2	0.000	0.0000	0.0000	0.7071	0.0000	0.0000	0.0000	0.7071	0.0000
doc_3	0.461	0.0000	0.0000	0.4658	0.0000	0.0000	0.5908	0.4658	0.0000

Document matrix

	Topic 0	Topic 1
doc_0	0.00000	0.878597
doc_1	0.05626	0.840770
doc_2	0.69150	0.000000
doc_3	0.70701	0.025084



Word matrix

	Topic 0	Topic 1
phone	0.369680	0.183829
camera	0.000489	0.455349
battery	0.000489	0.455349
and	0.826328	0.000000
of	0.028011	0.256675
the	0.000000	0.707207
cloth	0.431368	0.000000
texture	0.826328	0.000000
style	0.028011	0.256675

Case study 1:

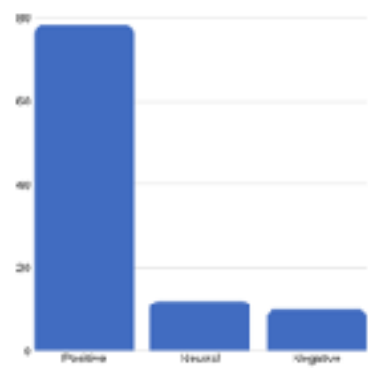
How is the camera of iPhone X?



Attribute model



Product popularity



Product sentiment

Attributes:

- ☐ Camera
- ☐ Display
- ☐ Battery
- ☐ Screen
- ☐ Durability
- ☐ Quality
- ☐ Charging
- ☐ Speaker

Camera of this phone is very good and I fell in love with this phone...



URL: <https://www.flipkart.com> › ... › Apple iPhone 6s (Gold, 32 GB)
Summary: Camera is very good
● positive

Camera of this phone is very good and I fell in love with this phone...



URL: <https://www.amazon.com> › ... › Apple iPhone 6s (Gold, 32 GB)
Summary: Camera is very good
● positive

Camera of this phone is very good and I fell in love with this phone...

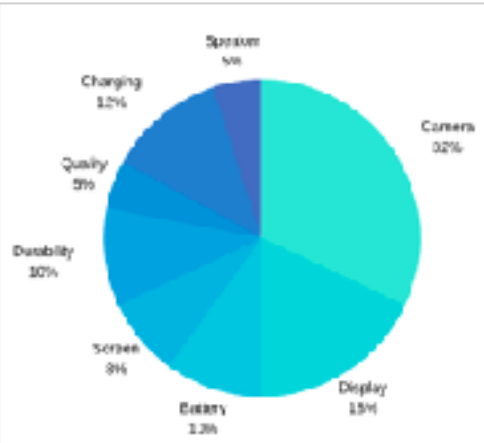


URL: <https://www.snapdeal.com> › ... › Apple iPhone 6s (Gold, 32 GB)
Summary: Camera is very good
● negative

Camera of this phone is very good and I fell in love with this phone...



URL: <https://www.amazon.com> › ... › Apple iPhone 6s (Gold, 32 GB)
Summary: Camera is very good
● neutral



Attribute popularity

Review 1 : Iphone x has very good camera. I bought this one in a local store near to my home. It has very good features.

Review 2 : Samsung s9 is one of the best phone. It has a good sound quality. The build is also very good.

Review 3 : Hello guys, I purchased this awesome shirt on Amazon with such a good price. I had to sell my kidney in order to buy this.
But I feel it is worth selling my kindey after wearing it.

Review 4 : This shirt has very good material. Texture and style is what makes this brand awesome.

Review 1 : Iphone x has very good camera. I bought this one in a local store near to my home. It has very good features.

Review 2 : Samsung s9 is one of the best phone. It has a good sound quality. The build is also very good.

Review 3 : Hello guys, I purchased this awesome shirt on Amazon with such a good price. I had to sell my kidney in order to buy this.
But I feel it is worth selling my kindey after wearing it.

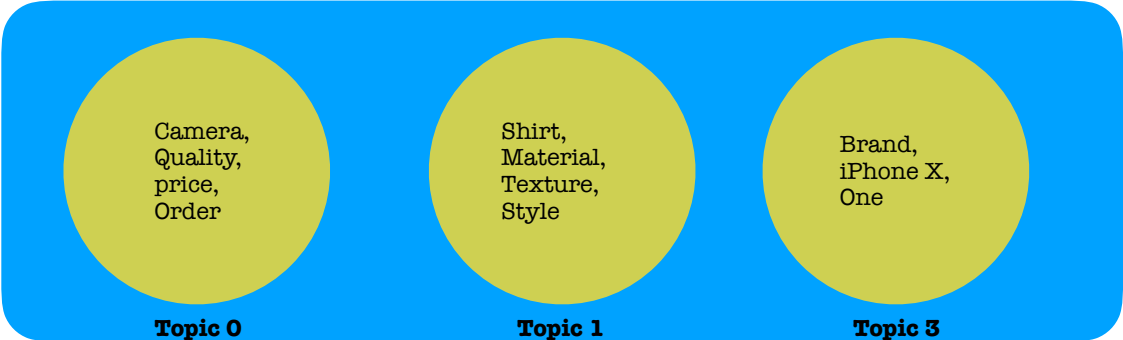
Review 4 : This shirt has very good material. Texture and style is what makes this brand awesome.

Review 1 : Iphone x, camera, one, store, home, features.

Review 2 : Samsung s9, phone, sound quality, build

Review 3 : Hello guys, shirt, Amazon, price, kidney, order

Review 4 : shirt, material, Texture, style, brand



1.Data Collection

	product_description	meta_description	description	bread_crumb	highlights	formatted_reviews
0	NaN	Buy Moto G5s (Lunar Gray, 32 GB) online at bes...	NaN	Home > Mobiles & Accessories > Mobiles > Motor...	👍	['Nice Good but over priced', 'Absolute rubbish...]
1	NaN	Buy Imported ShengShow Gold Mirror Rubik Magic...	Very Good Fantastic Product. No compromise on ...	Home > Toys > Puzzles & Board Games > Puzzles ...	👍	['Really Nice Smooth', 'Excellent It is a good...]
2	A revolutionary camera that adapts like the hu...	Buy Samsung Galaxy S9 (Midnight Black, 128 GB)...	Galaxy S9 Sleek and stunning the latest flagsh...	Home > Mobiles & Accessories > Mobiles > Samsu...	👍	['Must buy! Just woww', 'Fakruddin Nice Produc...]

(266242, 6)

2. Feature engineering

1 Outlier

Problems that we might face with such datasets are:

1. How to find outliers?
2. How to deal with these outliers?

2 Missing data

Problems that we might face with such datasets are:

1. How to find missing data?
2. How to deal with these missing data?

3 Different types of variables

Problems that we might face with such datasets are:

1. What are the different types of variables/data?
2. How to deal with different types of variables?

4 Irrelevant data

Problems that we might face with such datasets are:

1. How to identify irrelevant data?
2. How to deal with irrelevant data?

5 Extract Nouns

6 TFIDF

7 NMF

Perform feature engineering on all 6 columns

	product_description	meta_description	description	bread_crumb	highlights	formatted_reviews
0	NaN	Buy Moto G5s (Lunar Gray, 32 GB) online at bes...	NaN	Home > Mobiles & Accessories > Mobiles > Motor...	□	['Nice Good but over priced', 'Absolute rubbish...]
1	NaN	Buy Imported ShengShow Gold Mirror Rubik Magic...	Very Good Fantastic Product. No compromise on ...	Home > Toys > Puzzles & Board Games > Puzzles ...	□	['Really Nice Smooth', 'Excellent It is a good...]
2	A revolutionary camera that adapts like the hu...	Buy Samsung Galaxy S9 (Midnight Black, 128 GB)...	Galaxy S9 Sleek and stunning the latest flagsh...	Home > Mobiles & Accessories > Mobiles > Samsu...	□	['Must buy! Just woww', 'Fakruddin Nice Produc...]

Feature engineering in text

Nouns

Nouns

Nouns

Nouns

Nouns

Nouns

Review 1 : Iphone x, camera, one, store, home, features.

Review 2 : Samsung s9, phone, sound quality, build

Review 3 : Hello guys, shirt, Amazon, price, kidney, order

Review 4 : shirt, material, Texture, style, brand

5 TF IDF

6 NMF

Attribute detection solution

Thank you