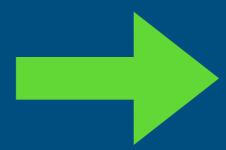
#### Singapore Govt Press Statements

**Outreach in the Indonesian Media** 

## Objective







Jakarta Post (English)

Merdeka

Inilah

Metrotynews

Kompas

**Tribunnews** 

Reputable, uses Google Custom Search Engine

To analyse to what extent our press statements have been covered by the Indonesian media

Time Frame: 01-01-2016 to 24-07-2017

#### Steps

Scraping

- 65% of my time / codes

Translating and Organising Data

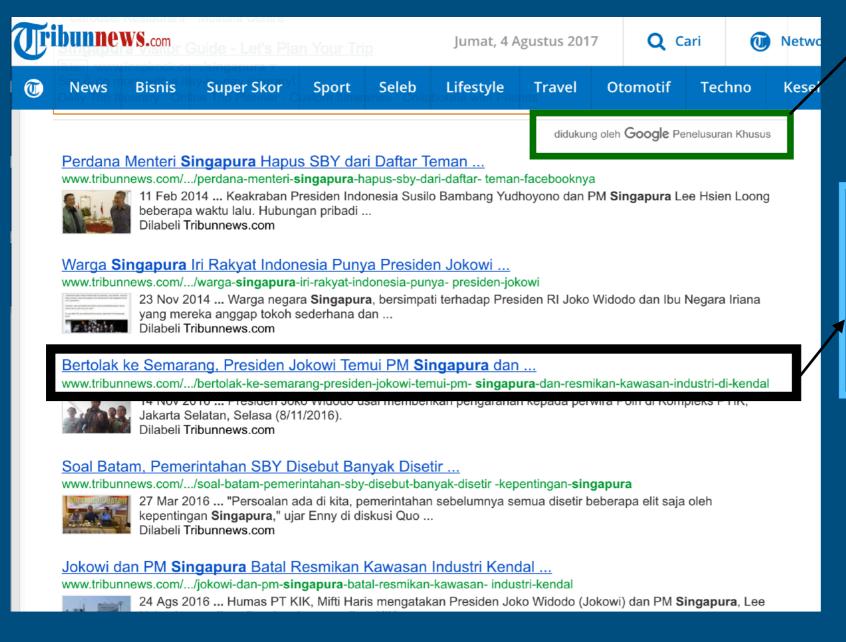
- 30% of my time

Comparing the Documents
Using Sklearn

# Scraping (1)

Indon News Site Uses uses Google Custom Search Engine (GCSE)

Use GCSE API to get the link and title of each article

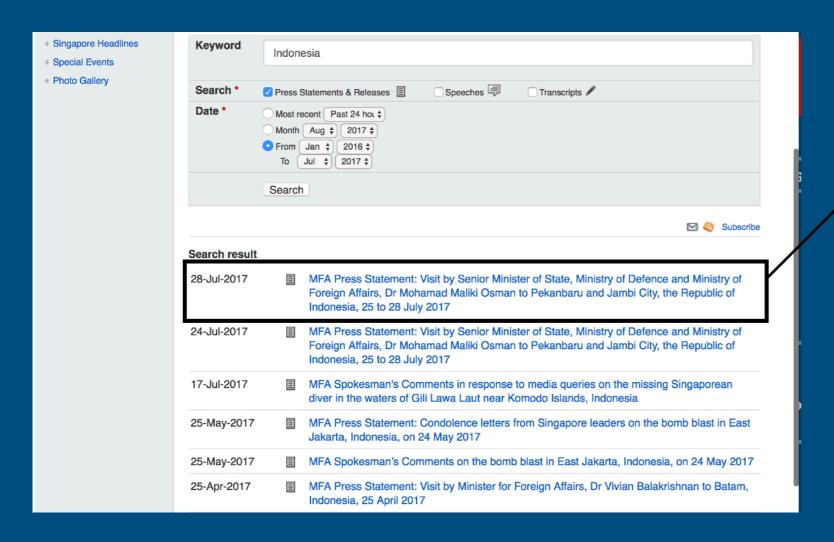


Go to the url

Extract the date and text of the article using BeautifulSoup

# Scraping (2)

SG Government press statements - use own search engines



Extract the date, title, url of the article using BeautifulSoup

Go to the url

Extract the body of the article using BeautifulSoup

### Organising the Data

In [181]: pd.options.display.max rows = 200 df idnSG Out[181]: title link snippet body date Hari Ketiga ASEAN 6 hari yang lalu ... Hari ketiga Laporan Wartawan Tribun 2017-School di Singapura, http://pekanbaru.tribunnews.com/2017/07/18/har... 07-18 Pekanbaru, Palti Siaha... pelaksanaan k... Perenan... Mau Terbang ke 2017-INILAHCOM, Jakarta -6 hari yang lalu ... la Singapura, Mathew http://metropolitan.inilah.com/read/detail/239... 07-18 menjelaskan, pagi ini ... Selain menetapkan putra... Thomas Dicega... Timnas U-16 Indonesia 6 hari yang lalu ... POS POS KUPANG.COM - Tim 2017-85 http://kupang.tribunnews.com/2017/07/18/timnas... Terhindar dari Posisi Ju... KUPANG.COM - Tim sepa... 07-18 sepak bola nasional U-16 ... Mikro | Seharusnya Dirjen 6 hari yang lalu ... Indonesia Metrotvnews.com, Jakarta: 2017-86 http://ekonomi.metrotvnews.com/mikro/RkjPOA3N-... Paiak Bisa Intip Dan... Kini Bisa Intip... Direktorat Jenderal ... 07-18 Sudah Mau Naik 6 hari yang lalu ... Axel WARTA KOTA, SEMANGGI 2017-Pesawat Menuju http://wartakota.tribunnews.com/2017/07/18/sud... 07-18 Matthew Thomas (19) ... Axel Matthew Thomas (19... Singapura Pagi T... Putra Jeremy Thomas 6 hari yang lalu ... Let's be Merdeka.com - Axel Mathew 2017dicegah saat mau https://www.merdeka.com/peristiwa/putra-jeremy... smart. Putra Jer... telah ditetapkan ter... 07-18 terbang k... Axel jadi tersangka, Merdeka.com - Axel 6 hari yang lalu ... Tadi pagi, 2017-Jeremy Thomas batal https://www.merdeka.com/peristiwa/axel-jadi-te... Matthew putra sulung dari 07-18 Axel hendak pe... pergi... Azzahra Raih Enam Emas 6 hari yang lalu ... Perenang Laporan Wartawan Tribun 2017di Kejuaraan Renang http://pekanbaru.tribunnews.com/2017/07/18/azz... andalan Riau Azz... 07-18 Pekanbaru, Palti Siaha... ASE...

Convert the date to datetime format

Removing articles from irrelevant categories - e.g sports, entertainment, travel

Select only articles which appear on the date of the SG press releases and the date thereafter

# Translating the text

In [181]: pd.options.display.max\_rows = 200
df\_idnSG

Out[181]:

	title	link	snippet	body	date	
83	Hari Ketiga ASEAN School di Singapura, Perenan	http://pekanbaru.tribunnews.com/2017/07/18/har	6 hari yang lalu Hari ketiga pelaksanaan k	Laporan Wartawan Tribun Pekanbaru, Palti Siaha	2017- 07-18	
84	Mau Terbang ke Singapura, Mathew Thomas Dicega	http://metropolitan.inilah.com/read/detail/239	6 hari yang lalu la menjelaskan, pagi ini	INILAHCOM, Jakarta - Selain menetapkan putra	2017- 07-18	
85	Timnas U-16 Indonesia Terhindar dari Posisi Ju	http://kupang.tribunnews.com/2017/07/18/timnas	6 hari yang lalu POS KUPANG.COM - Tim sepa	POS KUPANG.COM - Tim sepak bola nasional U-16	2017- 07-18	
86	Mikro   Seharusnya Dirjen Pajak Bisa Intip Dan	http://ekonomi.metrotvnews.com/mikro/RkjPOA3N	6 hari yang lalu Indonesia Kini Bisa Intip	Metrotvnews.com, Jakarta: Direktorat Jenderal	2017- 07-18	
87	Sudah Mau Naik Pesawat Menuju Singapura Pagi T	http://wartakota.tribunnews.com/2017/07/18/sud	6 hari yang lalu Axel Matthew Thomas (19)	WARTA KOTA, SEMANGGI - Axel Matthew Thomas (19	2017- 07-18	
	Putra Jeremy Thomas					

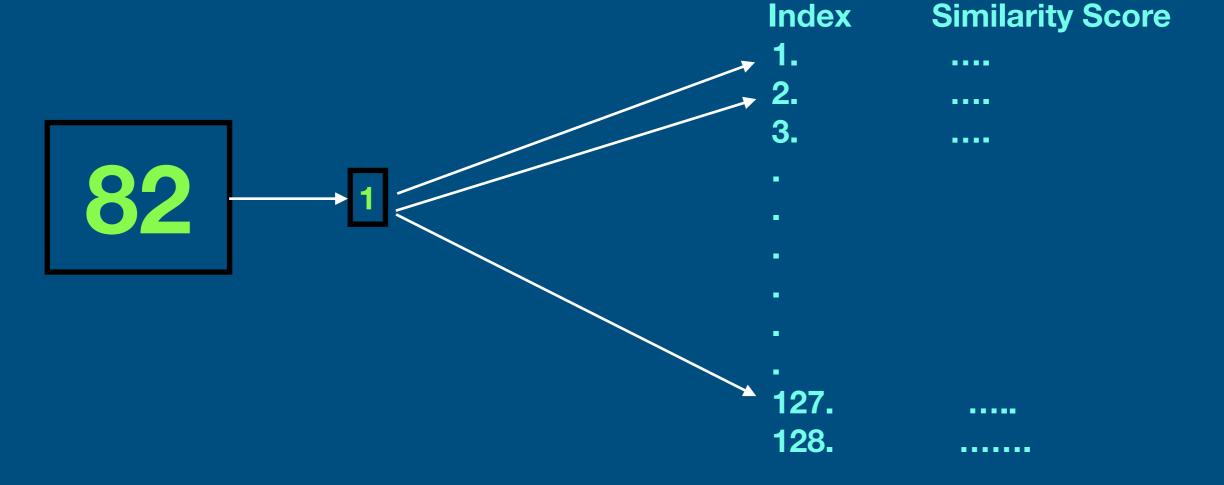
In [209]: df\_rel\_noJpost

Out[209]:

:		title			body	date	
	0	Hari Ketiga ASE School di Singa Perenan	ogle Translat	e API ketiga	The third day of ASEAN School championships in	2017- 07-18	
	1	Mau Terbang ke Singapura, Mathew Thomas Dicega	http://metropolitan.inilah.com/read/detail/239	6 hari yang lalu la menjelaskan, pagi ini	In addition to assigning the son of actor Je	2017- 07-18	
	2	Timnas U-16 Indonesia Terhindar dari Posisi Ju	http://kupang.tribunnews.com/2017/07/18/timnas	6 hari yang lalu POS KUPANG.COM - Tim sepa	POS KUPANG.COM - U-16 national football team d	2017- 07-18	
	3	Mikro   Seharusnya Dirjen Pajak Bisa Intip Dan	http://ekonomi.metrotvnews.com/mikro/RkjPOA3N	6 hari yang lalu Indonesia Kini Bisa Intip	Metrotvnews.com, Jakarta: The Directorate Gene	2017- 07-18	
	4	Sudah Mau Naik Pesawat Menuju Singapura Pagi T	http://wartakota.tribunnews.com/2017/07/18/sud	6 hari yang lalu Axel Matthew Thomas (19)	,	2017- 07-18	

# Comparing the docs (1)

SG Press Statements with 'Indonesia' from 01-01-2016 to 24-07-2017 Indonesian News with the word 'Singapore' from 01-01-2016 to 24-07-2017



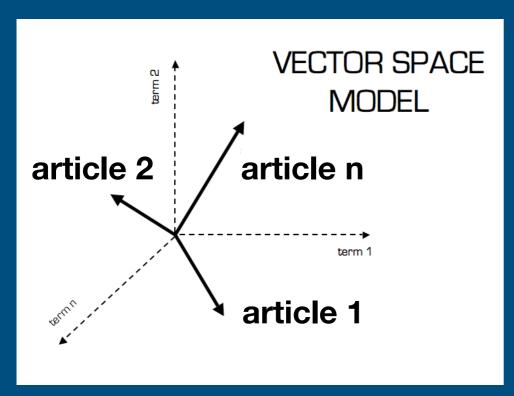
Take one

Compare with each of the Indonesian articles

**Calculate Similarity Score** 

# Comparing the docs (2)

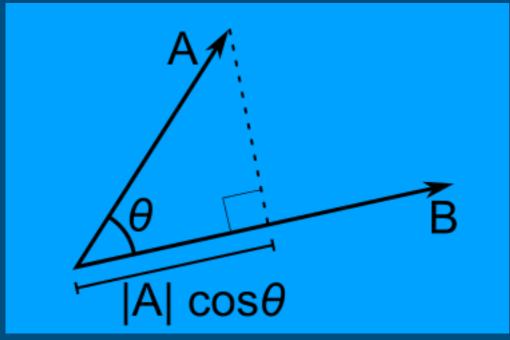
Lesson 12 and 13: Sklearn - CountVectorizer, tf-idf, cosine-similarity



Imagine each article as a vector in N-dim N-dim = { number of terms}

Each vector is normalised - i.e magnitude 1

Direction of the vector is determined by the "term-frequency \* inverse document frequency of each term" of every term in the article



The more similar the article, the smaller the angle

If angle is 0,  $\cos 0 = 1$ 

To determine "degree of similarity", train the data

#### Results

In [8]: df\_SGstatement[df\_SGstatement.similarity != ''][['date','title', 'similarity','idnIndex']]

Out[8]:

	date	title	similarity	idnIndex
3	2017-07- 12	SINGAPORE IS READY TO HAVE AN AEOI RELATIONSHI	[0.469825612539, 0.292979489258]	[34, 9]
9	2017-05- 25	MFA Press Statement: Condolence letters from S	[0.378049168735, 0.214133953562]	[99, 106]
18	2017-04- 25	MFA Press Statement: Visit by Minister for For	[0.448266158004, 0.315823334478]	[75, 52]
24	2017-03- 06	MFA Press Statement: Visit by Deputy Prime Min	[0.323663971221, 0.23653833858]	[89, 88]
34	2016-12- 08	MFA Press Statement: Condolence letters from P	[0.725894277803, 0.254928964727]	[99, 106]
36	2016-12- 07	MFA Spokesman's Comments on the earthquake in	[0.427787953723, 0.0584689414219]	[99, 41]
39	2016-11- 15	PM Lee Hsien Loong at Joint Press Conference f	[0.32024721843, 0.316656526725]	[117, 119]
42	2016-11- 14	MFA Press Statement: Singapore-Indonesia Leade	[0.403800207628, 0.347692089295]	[104, 112]

Through training data - Two articles are considered similar when the cosine angle is more than 0.32

Out of the 82 SG Press Statements, only 7 of them were reported before

## Learning Points

- A) Similarity testing using Gensim library did not yield useful results it gave me high similarity scores even though the articles were not similar
- B) SG Press Statements are not useful tools to influence the Indonesian media
- C) Natural language processing tools to determine:
  - (a) the top ten dates on news about Singapore in the last 1.5 years
  - (b) The top ten Names and Organisations mentioned in the articles
- D) Steps can be repeated for larger time frames and for other Indonesian news websites that have their own search engines