

CLUSTERING DATA COVID-19 DENGAN K-MEANS

Kelompok 4

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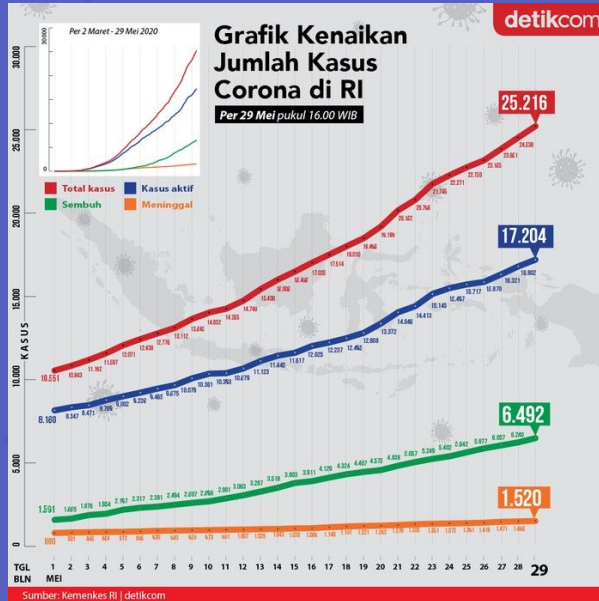
Kesimpulan



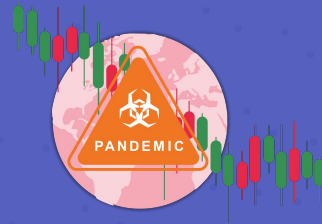
01

Pendahuluan

Latar Belakang



Rumusan Masalah



Bagaimana hasil dari
Pengclusteran ?



Provinsi mana yang
jumlah kasus tinggi



Provinsi mana yang
jumlah kasus rendah?

Deskripsi Dataset

Maret -
Desember
2020

Deret Waktu

Dataset COVID-19 Indonesia Dataset

Info KOMPETISI KOMENTAR KERNEL (KODE MODEL, CTH. PYTHON)

Info umum

☐ Diunggah pada 08-01-2021

☒ Oleh [remko weingarten](#) *****

☐ Ukuran file 0,36 MB



☐ Jumlah file Satu file

☒ Lisensi Creative Commons

☐ Kategori Predictive Analysis

☒ Deskripsi

The COVID-19 dataset in Indonesia was created to find out various factors that could be taken into consideration in decision making related to the level of stringency in each province in Indonesia. Content Data compiled based on time series, both on a country level (Indonesia), and on a province level. If needed in certain provinces, it might also be provided at the city / regency level. Demographic data is also available, as well as calculations between demographic data and COVID-19 pandemic data. Acknowledgements Thank you to those who have provided data openly so that we can compile it into a dataset here, which is as follows: covid19.go.id, kemendagri.go.id, bps.go.id, and bnph-inacovid19.hub.arcgis.com

  (Diunduh: 1631 x (Cannot download on phone))

atapdata.ai

Sumber

9659 Baris

Jumlah Baris

35 Kolom

Jumlah Baris

Deskripsi Dataset

| | Date | Location ISO Code | Location | New Cases | New Deaths | New Recovered | New Active Cases | Total Cases | Total Deaths | Total Recovered | ... | Longitude | Latitude | New Cases per Million | Total Cases per Million | New Deaths per Million | Total Deaths per Million | Case Fatality Rate | Case Recovered Rate |
|---|----------|----------------------|----------------|--------------|---------------|------------------|------------------------|----------------|-----------------|--------------------|-----|------------|-----------|--------------------------------|----------------------------------|---------------------------------|-----------------------------------|--------------------------|---------------------------|
| 0 | 3/1/2020 | ID-JK | DKI Jakarta | 2 | 0 | 0 | 2 | 489 | 20 | 39 | ... | 106.836118 | -6.204699 | 0.18 | 45.09 | 0.0 | 1.84 | 4.09% | 7.98% |
| 1 | 3/2/2020 | ID-JK | DKI Jakarta | 2 | 0 | 0 | 2 | 491 | 20 | 39 | ... | 106.836118 | -6.204699 | 0.18 | 45.27 | 0.0 | 1.84 | 4.07% | 7.94% |
| 2 | 3/2/2020 | IDN | Indonesia | 2 | 0 | 0 | 2 | 2 | 0 | 0 | ... | 113.921327 | -0.789275 | 0.01 | 0.01 | 0.0 | 0.00 | 0.00% | 0.00% |
| 3 | 3/2/2020 | ID-JB | Jawa Barat | 3 | 0 | 0 | 3 | 12 | 5 | 120 | ... | 107.603708 | -6.920432 | 0.07 | 0.27 | 0.0 | 0.11 | 41.67% | 1000.00% |
| 4 | 3/2/2020 | ID-RI | Riau | 1 | 0 | 0 | 1 | 2 | 1 | 1 | ... | 101.805109 | 0.511648 | 0.16 | 0.33 | 0.0 | 0.16 | 50.00% | 50.00% |

5 rows x 37 columns

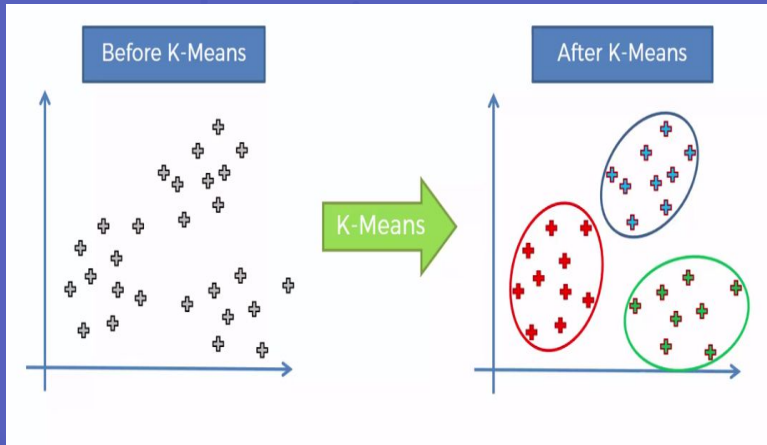


02

Metode

Gambaran Umum

K-Means merupakan salah satu algoritma dalam data mining yang digunakan untuk melakukan pengelompokan/clustering suatu data. Tujuan dari algoritma K-Means adalah meminimalkan fungsi dengan meminimalkan variasi antar data dalam suatu cluster dan memaksimalkan variasi data pada cluster lainnya.

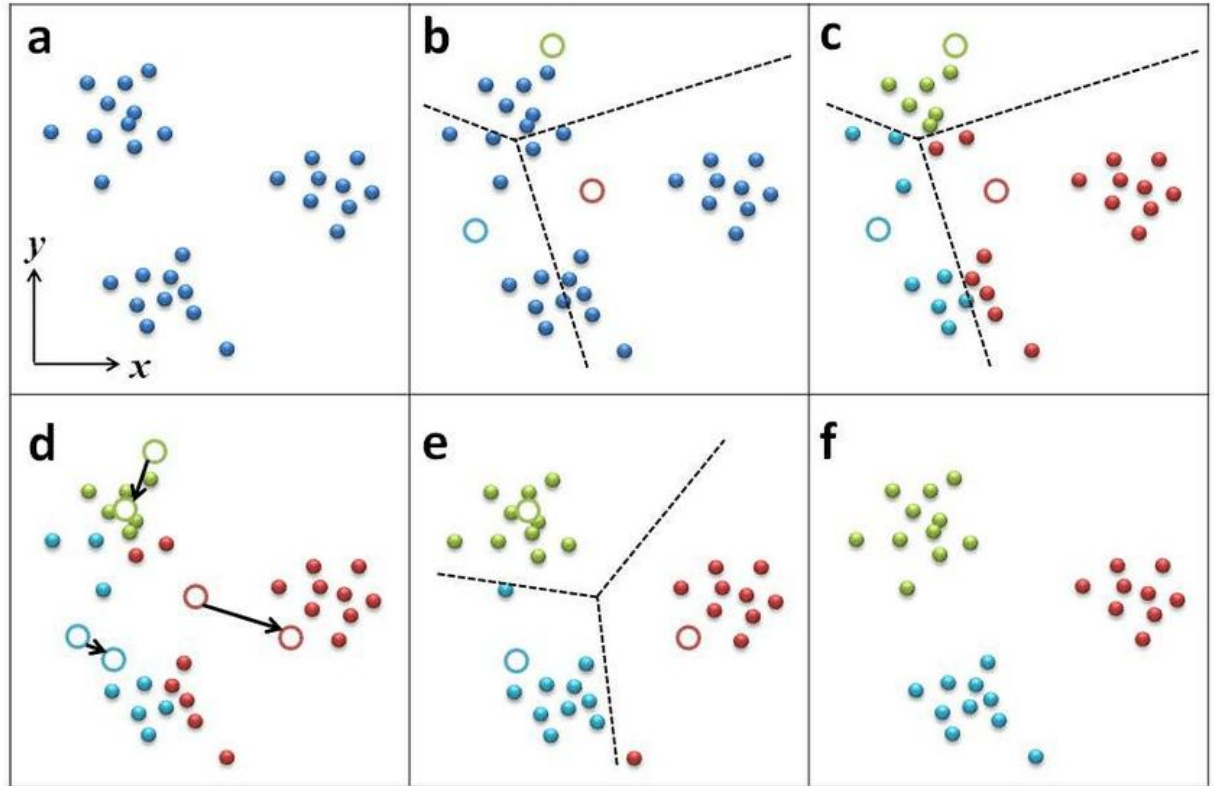
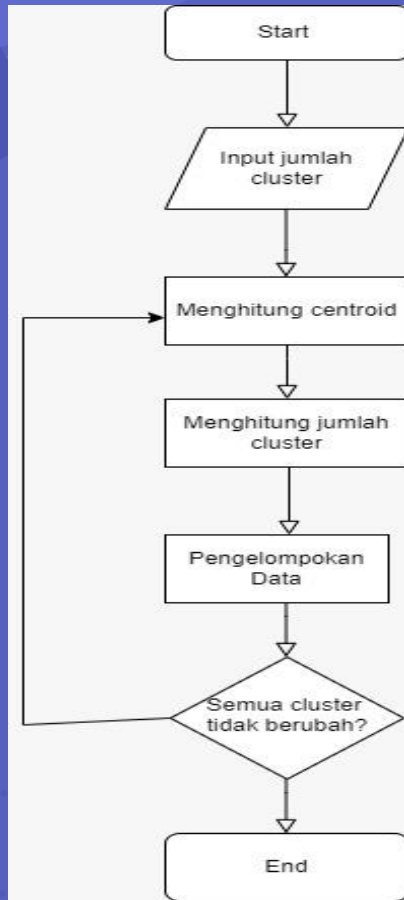


Kmeans

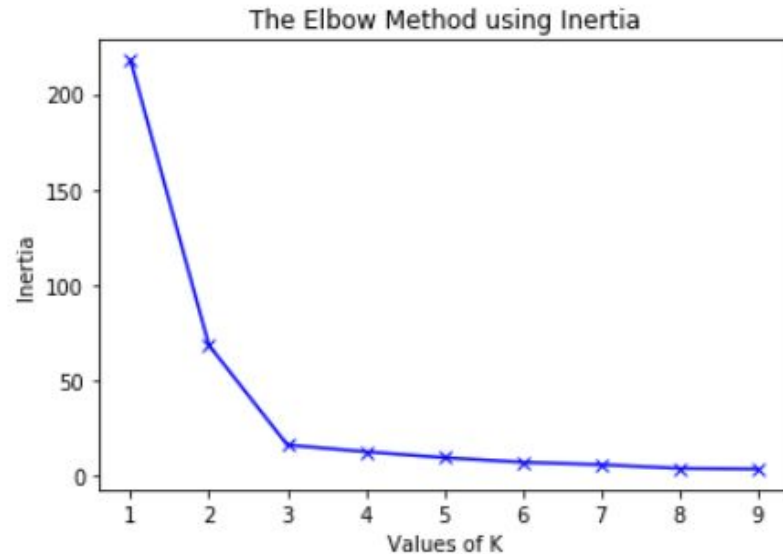
Clustering

Unsupervised Learning

Flowchart Sistem



Metrics Evaluation



Metode Elbow



03

Hasil dan Pembahasan

Tahapan yang Dilakukan

**Pengumpulan
Data**

1

2

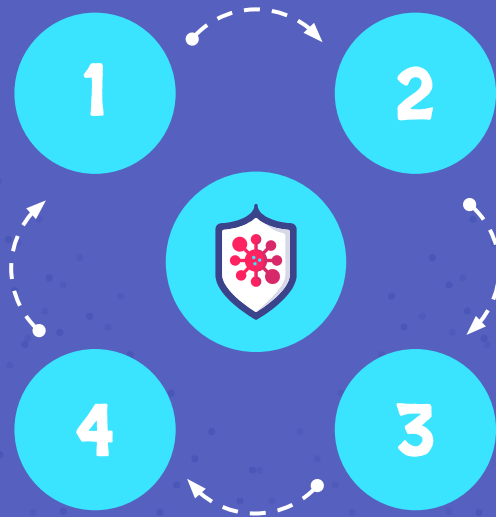
**Processing
Data**

**Modeling,
Pengujian,
Analisis**

4

3

**Visualisasi
Data**



Memproses Data

1

```
read_csv('~/Users/dines/Documents/Programming/tubes/datin/covid_19_indonesia_time_series_all.csv')
data
```

| Date | Location ISO Code | Location | New Cases | New Deaths | New Recovered | New Active Cases | Total Cases | Total Deaths | Total Recovered | ... | Longitude | Latitude | |
|------|-------------------|----------|-------------|------------|---------------|------------------|-------------|--------------|-----------------|-----|-----------|-------------|-----------|
| 0 | 3/1/2020 | ID-JK | DKI Jakarta | 2 | 0 | 0 | 2 | 489 | 20 | 39 | ... | -106.836110 | -6.204899 |
| 1 | 3/2/2020 | ID-JK | DKI Jakarta | 2 | 0 | 0 | 2 | 491 | 20 | 39 | ... | -106.836110 | -6.204899 |
| 2 | 3/2/2020 | ID-N | Indonesia | 2 | 0 | 0 | 2 | 2 | 0 | 0 | ... | -113.921327 | -7.789275 |
| 3 | 3/2/2020 | ID-JS | Jawa Barat | 3 | 0 | 0 | 3 | 12 | 5 | 120 | ... | -107.603708 | -6.920432 |
| 4 | 3/2/2020 | ID-RI | Riau | 1 | 0 | 0 | 1 | 2 | 1 | 1 | ... | -101.460109 | 0.016648 |

5 rows x 37 columns

```
[23]: data.shape
```

```
[23]: (9959, 37)
```

Load Dataset

2

```
[3]: class ColumnData:
    date = 'Date'
    province = 'Province'
    island = 'Island'
    cases = 'Total Cases'
    deaths = 'Total Deaths'
    recovered = 'Total Recovered'
    active_cases = 'Total Active Cases'
    population = 'Population'
    area = 'Area (km2)'
    mortality = 'Mortality'
    density = 'Population Density'
```

Pendefinisian Nama Kolom

3

Memilih kolom yang akan digunakan

```
[34]: data = data[[
    ColumnData.date,
    ColumnData.province,
    ColumnData.island,
    ColumnData.cases,
    ColumnData.deaths,
    ColumnData.recovered,
    ColumnData.active_cases,
    ColumnData.population,
    ColumnData.area,
    ColumnData.density
]]
```

```
[38]: data.shape
```

```
[38]: (9959, 10)
```

```
[35]: data
```

| | Date | Province | Island | Total Cases | Total Deaths | Total Recovered | Total Active Cases | Population | Area (km2) | Population Density |
|------|------------|-------------------|----------|-------------|--------------|-----------------|--------------------|------------|------------|--------------------|
| 0 | 3/1/2020 | DKI Jakarta | Jawa | 489 | 20 | 39 | 430 | 10846145 | 664 | 16334.31 |
| 1 | 3/2/2020 | DKI Jakarta | Jawa | 491 | 20 | 39 | 432 | 10846145 | 664 | 16334.31 |
| 2 | 3/2/2020 | NaN | NaN | 2 | 0 | 0 | 2 | 265185520 | 1916907 | 138.34 |
| 3 | 3/2/2020 | Jawa Barat | Jawa | 12 | 5 | 120 | -113 | 45161325 | 35378 | 1276.55 |
| 4 | 3/2/2020 | Riau | Sumatera | 2 | 1 | 1 | 0 | 6074100 | 87024 | 69.80 |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 9954 | 12/31/2020 | Sulawesi Tenggara | Sulawesi | 7907 | 147 | 6696 | 1064 | 2635461 | 38068 | 69.23 |
| 9955 | 12/31/2020 | Sulawesi Utara | Sulawesi | 9671 | 310 | 7003 | 2358 | 2641884 | 13892 | 190.17 |
| 9956 | 12/31/2020 | Sumatera Barat | Sumatera | 23464 | 522 | 18030 | 4912 | 5519245 | 42013 | 131.37 |
| 9957 | 12/31/2020 | Sumatera Selatan | Sumatera | 11826 | 599 | 9364 | 1863 | 8217551 | 91592 | 89.72 |
| 9958 | 12/31/2020 | Sumatera Utara | Sumatera | 18149 | 679 | 15403 | 2067 | 14874889 | 72981 | 203.82 |

9959 rows x 10 columns

Memproses Data

4

```
[51]: data.isnull().sum()
```

```
Date          0
Province      305
Island        305
Total Cases    0
Total Deaths  0
Total Recovered 0
Total Active Cases 0
Population     0
Area (km2)     0
Population Density 0
dtype: int64
```

Menghapus jika ada data yang kosong

```
[9]: data = data.dropna(axis=0, how="any")
```

Memeriksa dan Menghapus Null Value

5

```
[58]: data
```

| | Date | Province | Island | Total Cases | Total Deaths | Total Recovered | Total Active Cases | Population | Area |
|------|------------|-------------------|---------------|-------------|--------------|-----------------|--------------------|------------|------|
| 0 | 3/1/2020 | DKI Jakarta | Jawa | 489 | 20 | 39 | 430 | 10846145 | |
| 1 | 3/2/2020 | DKI Jakarta | Jawa | 491 | 20 | 39 | 432 | 10846145 | |
| 3 | 3/2/2020 | Jawa Barat | Jawa | 12 | 5 | 120 | -113 | 45161325 | |
| 4 | 3/2/2020 | | Riau Sumatera | 2 | 1 | 1 | 0 | 6074100 | |
| 5 | 3/3/2020 | DKI Jakarta | Jawa | 493 | 20 | 39 | 434 | 10846145 | |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 9954 | 12/31/2020 | Sulawesi Tenggara | Sulawesi | 7907 | 147 | 6696 | 1064 | 2635461 | |
| 9955 | 12/31/2020 | Sulawesi Utara | Sulawesi | 9671 | 310 | 7003 | 2358 | 2641884 | |
| 9956 | 12/31/2020 | Sumatera Barat | Sumatera | 23464 | 522 | 180 | | | |
| 9957 | 12/31/2020 | Sumatera Selatan | Sumatera | 11826 | 599 | 93 | | | |
| 9958 | 12/31/2020 | Sumatera Utara | Sumatera | 18149 | 679 | 154 | | | |

9654 rows x 10 columns

```
[58]: data.shape
```

```
[58]: (9654, 10)
```

Melihat Data yang Sekarang

6

Membuat format data pada tanggal menjadi date.

```
[39]: data[ColumnData.date] = pd.to_datetime(data.Date, infer_datetime_format=True).dt.date
```

Membuat kolom baru yaitu 'Mortality'

```
[41]: data[ColumnData.mortality] = data[ColumnData.deaths] / data[ColumnData.cases]
```

Membuat Kolom Baru, Mengubah Format Data

Memproses Data

7

: data

| | Date | Province | Island | Total Cases | Total Deaths | Total Recovered | Total Active Cases | Population | Area (km2) | Population Density | Mortality |
|------|------------|-------------------|----------|-------------|--------------|-----------------|--------------------|------------|------------|--------------------|-----------|
| 0 | 2020-03-01 | DKI Jakarta | Jawa | 489 | 20 | 39 | 430 | 10846145 | 664 | 16334.31 | 0.040900 |
| 1 | 2020-03-02 | DKI Jakarta | Jawa | 491 | 20 | 39 | 432 | 10846145 | 664 | 16334.31 | 0.040733 |
| 2 | 2020-03-02 | NaN | NaN | 2 | 0 | 0 | 2 | 265185520 | 1916907 | 138.34 | 0.000000 |
| 3 | 2020-03-02 | Jawa Barat | Jawa | 12 | 5 | 120 | -113 | 45161325 | 35378 | 1276.55 | 0.416667 |
| 4 | 2020-03-02 | Riau | Sumatera | 2 | 1 | 1 | 0 | 6074100 | 87024 | 69.80 | 0.500000 |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 9954 | 2020-12-31 | Sulawesi Tenggara | Sulawesi | 7907 | 147 | 6696 | 1064 | 2635461 | 38068 | 69.23 | 0.018591 |
| 9955 | 2020-12-31 | Sulawesi Utara | Sulawesi | 9671 | 310 | 7003 | 2358 | 2641884 | 13892 | 190.17 | 0.032055 |
| 9956 | 2020-12-31 | Sumatera Barat | Sumatera | 23464 | 522 | 18030 | 4912 | 5519245 | 42013 | 131.37 | 0.022247 |
| 9957 | 2020-12-31 | Sumatera Selatan | Sumatera | 11826 | 599 | 9364 | 1863 | 8217551 | 91592 | 89.72 | 0.050651 |
| 9958 | 2020-12-31 | Sumatera Utara | Sumatera | 18149 | 679 | 15403 | 2067 | 14874889 | 72981 | 203.82 | 0.037413 |

9959 rows x 11 columns

Data Final yang
Digunakan

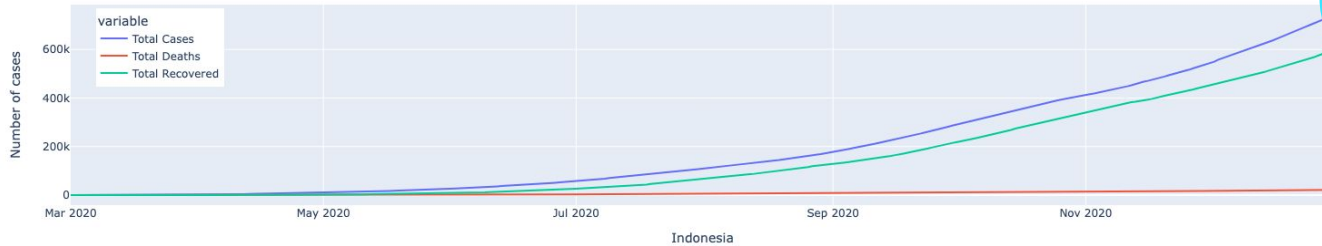
[99]:

| | Total Cases | Total Recovered | Population Density | Total Deaths | Total Active Cases | Population | Mortality |
|------------------|-------------|-----------------|--------------------|--------------|--------------------|------------|-----------|
| Province | | | | | | | |
| DKI Jakarta | 183735 | 164776 | 16334.31 | 3270 | 15689 | 10846145 | 0.017797 |
| Jawa Timur | 84152 | 72135 | 846.78 | 5827 | 6190 | 40479023 | 0.069244 |
| Jawa Barat | 83579 | 70896 | 1276.55 | 1172 | 11511 | 45161325 | 0.014023 |
| Jawa Tengah | 81716 | 54212 | 1108.64 | 3361 | 24143 | 36364072 | 0.041130 |
| Sulawesi Selatan | 31047 | 25861 | 201.78 | 580 | 4606 | 9426885 | 0.018681 |

Visualisasi Data

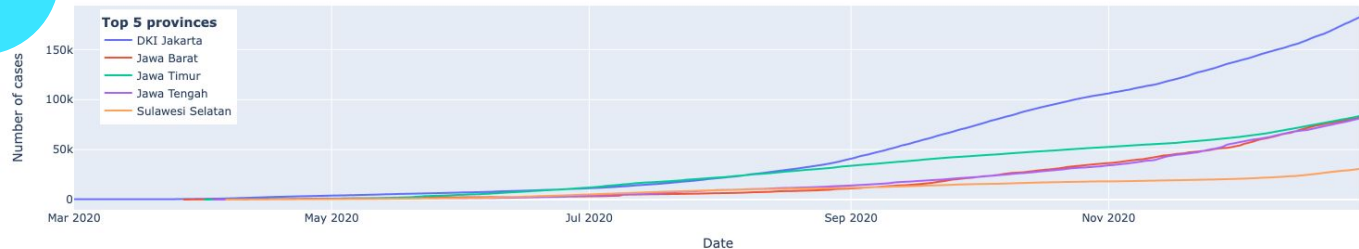
1

COVID-19 in Indonesia: total number of cases over time



2

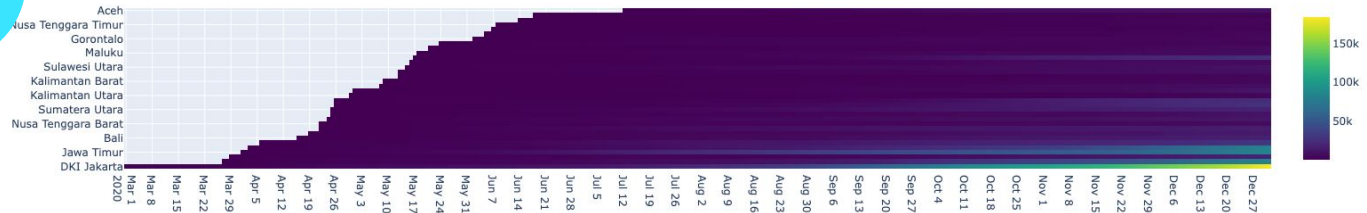
COVID-19 in Indonesia: total number of cases over time



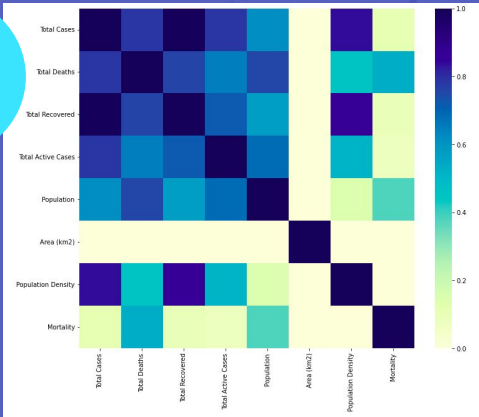
Visualisasi Data

3

COVID-19 in Indonesia: number of cases over time



4



1. Total Cases
2. Total Recovered
3. Total Active Cases
4. Population Density
5. Total Deaths
6. Population
7. Mortality

Akan digunakan
untuk pengolahan
data Selanjutnya

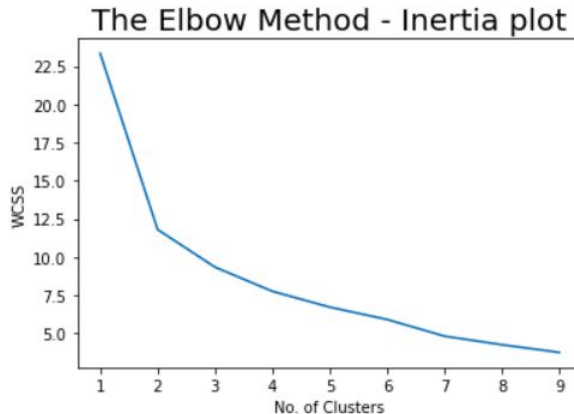
Modelling Data

1

```
[18]: #selecting_features
X = d[['Mortality', 'Total Cases', 'Total Active Cases', 'Population Density', 'Population', 'Total Deaths']]
```

Load Dataset

2



Menggunakan WCSS
dengan Metode Elbow
Graph untuk
menentukan nilai
cluster(k)

Digunakan k = 6.

Modelling Data

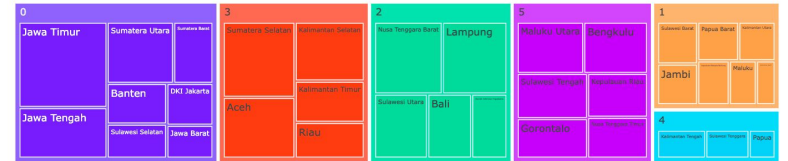
3

| [20]: | Total Cases | Total Recovered | Population Density | Total Deaths | Total Active Cases | Population | Mortality | K-means |
|----------------------------|-------------|-----------------|--------------------|--------------|--------------------|------------|-----------|---------|
| Province | | | | | | | | |
| Maluku Utara | 0.000000 | 0.166667 | 0.166667 | 0.166667 | 0.000000 | 0.000000 | 0.833333 | 5 |
| Sulawesi Tengah | 0.166667 | 0.000000 | 0.166667 | 0.333333 | 0.500000 | 0.333333 | 0.666667 | 5 |
| Bengkulu | 0.166667 | 0.166667 | 0.500000 | 0.333333 | 0.333333 | 0.166667 | 0.666667 | 5 |
| Gorontalo | 0.166667 | 0.166667 | 0.500000 | 0.166667 | 0.000000 | 0.000000 | 0.666667 | 5 |
| Kepulauan Riau | 0.333333 | 0.500000 | 0.833333 | 0.333333 | 0.166667 | 0.166667 | 0.500000 | 5 |
| Nusa Tenggara Timur | 0.000000 | 0.000000 | 0.566667 | 0.000000 | 0.166667 | 0.666667 | 0.500000 | 5 |
| Kalimantan Tengah | 0.500000 | 0.333333 | 0.000000 | 0.500000 | 0.833333 | 0.166667 | 0.333333 | 4 |
| Sulawesi Tenggara | 0.500000 | 0.500000 | 0.166667 | 0.333333 | 0.333333 | 0.333333 | 0.333333 | 4 |
| Papua | 0.666667 | 0.500000 | 0.000000 | 0.333333 | 0.833333 | 0.500000 | 0.000000 | 4 |
| Sumatera Selatan | 0.666667 | 0.666667 | 0.333333 | 0.833333 | 0.666667 | 0.833333 | 1.000000 | 3 |
| Kalimantan Selatan | 0.666667 | 0.833333 | 0.500000 | 0.833333 | 0.166667 | 0.500000 | 0.833333 | 3 |
| Aceh | 0.500000 | 0.666667 | 0.333333 | 0.666667 | 0.333333 | 0.666667 | 0.833333 | 3 |
| Kalimantan Timur | 0.833333 | 0.833333 | 0.000000 | 0.666667 | 0.666667 | 0.333333 | 0.666667 | 3 |
| Riau | 0.833333 | 0.833333 | 0.333333 | 0.833333 | 0.333333 | 0.833333 | 0.500000 | 3 |
| Lampung | 0.333333 | 0.333333 | 0.833333 | 0.500000 | 0.500000 | 0.833333 | 1.000000 | 2 |
| Nusa Tenggara Barat | 0.333333 | 0.333333 | 0.833333 | 0.500000 | 0.500000 | 0.666667 | 1.000000 | 2 |
| Sulawesi Utara | 0.500000 | 0.500000 | 0.666667 | 0.666667 | 0.666667 | 0.333333 | 0.833333 | 2 |
| Bali | 0.666667 | 0.666667 | 0.833333 | 0.666667 | 0.833333 | 0.500000 | 0.666667 | 2 |
| Daerah Istimewa Yogyakarta | 0.666667 | 0.666667 | 1.000000 | 0.500000 | 0.666667 | 0.500000 | 0.333333 | 2 |
| Papua Barat | 0.333333 | 0.333333 | 0.000000 | 0.166667 | 0.000000 | 0.000000 | 0.166667 | 1 |
| Kalimantan Utara | 0.166667 | 0.000000 | 0.000000 | 0.166667 | 0.500000 | 0.000000 | 0.166667 | 1 |
| Jambi | 0.166667 | 0.166667 | 0.333333 | 0.000000 | 0.166667 | 0.333333 | 0.166667 | 1 |
| Sulawesi Barat | 0.000000 | 0.000000 | 0.500000 | 0.000000 | 0.000000 | 0.166667 | 0.166667 | 1 |
| Maluku | 0.333333 | 0.333333 | 0.166667 | 0.166667 | 0.333333 | 0.166667 | 0.000000 | 1 |
| Kepulauan Bangka Belitung | 0.000000 | 0.000000 | 0.333333 | 0.000000 | 0.166667 | 0.000000 | 0.000000 | 1 |
| Kalimantan Barat | 0.000000 | 0.166667 | 0.166667 | 0.000000 | 0.000000 | 0.666667 | 0.000000 | 1 |
| Jawa Tengah | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 0 |
| Jawa Timur | 1.000000 | 1.000000 | 0.833333 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 0 |
| Sumatera Utara | 0.833333 | 0.833333 | 0.666667 | 0.833333 | 0.666667 | 1.000000 | 0.833333 | 0 |
| Sumatera Barat | 0.833333 | 0.833333 | 0.666667 | 0.666667 | 0.833333 | 0.666667 | 0.500000 | 0 |
| Sulawesi Selatan | 1.000000 | 1.000000 | 0.666667 | 0.833333 | 0.833333 | 0.833333 | 0.333333 | 0 |
| Banten | 0.833333 | 0.666667 | 1.000000 | 0.666667 | 1.000000 | 0.833333 | 0.333333 | 0 |
| DKI Jakarta | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 0.166667 | 0 |
| Jawa Barat | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 0.000000 | 0 |

K-means clusters



K-means clusters

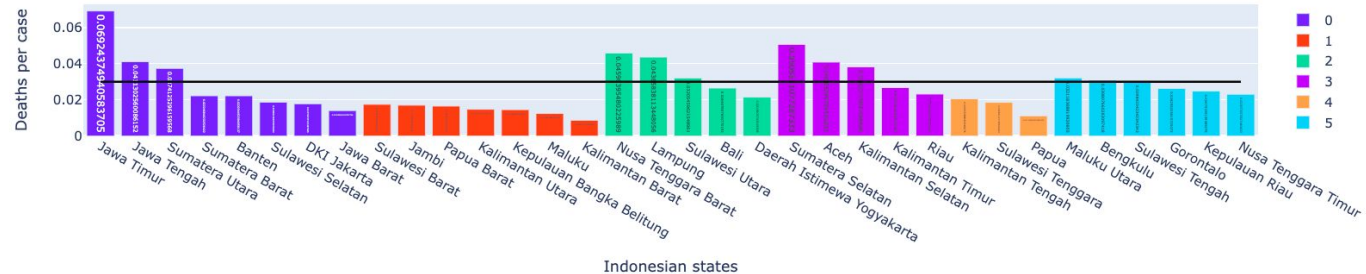


Modelling Data

K-means Clustering: number of cases by cluster



K-means Clustering: mortality rate by cluster



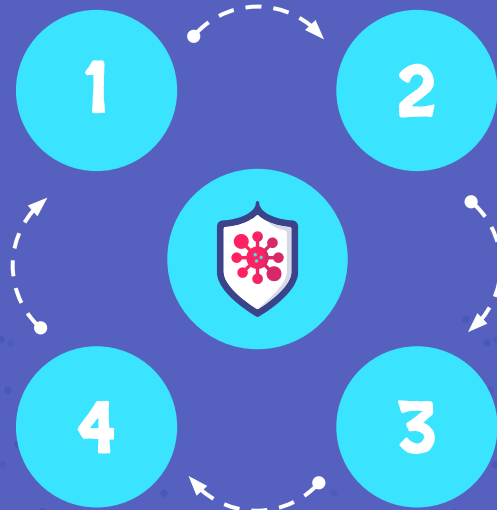


04

Kesimpulan

Jambi menempati posisi pertama dengan jumlah kasus terendah yakni sebanyak **4.687 kasus**

Pembagian Klasterisasi penanganan COVID-19 dipengaruhi tingkat **kemungkinan kematian, jumlah kasus yang masih aktif, kepadatan penduduk dan luas area provinsi** tersebut.



DKI Jakarta menempati posisi pertama dengan jumlah kasus tertinggi yakni sebanyak **86.963 kasus**

Tingkat **kematian** paling tinggi akibat COVID-19 yaitu provinsi **Jawa Timur**

The background is a solid blue color with a fine, light blue dot pattern. Various geometric shapes are scattered across the frame: a cyan circle and a white circle at the top center; a cyan circle and a white circle at the bottom center; a dark blue square at the top right; a dark blue square at the bottom left; and a dark blue square at the bottom right. There are also some faint, curved lines and a small dark blue square near the top right.

Thank u!