Quality of Education in Indonesia in 2022

Group: 1 Name:

Aaron Winston Gho
 Aldo Oktavianus
 Kelvin Jonathan Yusach
 Nicholas Ananda Heryanto
 Tyrone Yutanesy Iman
 2702210522
 2702234081
 2702209533
 2702213695
 2702211512

Hello everyone! Today, we're diving into a crucial topic: the quality of education in Indonesia in 2022. Education is the cornerstone of any nation's progress and development, and it's especially significant for Indonesia, a country with a vast and diverse population.

In this video, we'll explore various aspects of the educational landscape in Indonesia, focusing on recent statistics and trends. But first, let's frame our discussion within a global context by linking it to the United Nations Sustainable Development Goal number 4.

SDG 4 aims to "ensure inclusive and equitable quality education and promote lifelong learning opportunities for all." These targets are designed to address the global challenge of educational inequality and to ensure that education systems are equipped to prepare students for the future. Indonesia, like many countries, faces unique challenges in achieving these goals. The nation's vast archipelago, diverse cultures, and varying levels of economic development across regions create a complex educational landscape.

Since the data for 2023 is not yet complete, we decided to use data from 2022. We are using data from the Badan Pusat Statistik (BPS) and Kemendikbud Ristek. In 2022, significant efforts have been made to improve educational access and quality, but there remain areas that need further attention and resources.

In the following segments, we'll present detailed insights into:

- 1. Distribution of teachers and how it impacts educational quality.
- 2. The trends in school participation rates over the past two decades from 2002 2022.
- 3. The relationship between educational attainment and poverty levels.
- 4. The distribution and accessibility of libraries across the country.

By examining these aspects, we aim to provide a comprehensive overview of the state of education in Indonesia and highlight areas where progress aligns with the objectives of SDG 4. Let's get started!

======== Data Cleaning=========

1. Cleaning Data for Distribution of Teachers in Indonesia in 2022

```
library(dplyr)
data = read.table(file.choose(), sep=",", header = T, skip = 1)
# looking for missing data
missing summary <- data %>%
  summarise(across(everything(), ~ sum(is.na(.))))
print(missing summary)
     Aceh X3336 X193 X3529 X45823 X2718 X48541 X451027 X35931 X486958
## 1
                  0
                        0
                               0
                                     0
                                            0
summary(data)
##
        Aceh
                           X3336
                                             X193
                                                              X3529
                                                                               X45823
                                        Min.
                                             :
                                                                :
                                                                                 :
##
  Length:34
                       Min.
                                  437
                                                   29.0
                                                          Min.
                                                                     485
                                                                           Min.
                                                                                      5489
                       1st Qu.:
                                 1300
                                        1st Qu.: 182.5
   Class :character
                                                          1st Qu.:
                                                                    1821
                                                                           1st Qu.:
                                                                                     13490
##
  Mode :character
                       Median:
                                 2360
                                        Median:
                                                  327.5
                                                          Median:
                                                                    2645
                                                                           Median:
                                                                                     24892
##
                       Mean
                                 7551
                                        Mean : 1108.0
                                                          Mean
                                                                    8659
                                                                           Mean :
                                                                                     79432
##
                       3rd Qu.:
                                 4095
                                        3rd Qu.: 829.0
                                                          3rd Qu.:
                                                                    4680
                                                                           3rd Qu.:
                                                                                     44641
##
                       Max.
                              :130042
                                        Max.
                                             :18933.0
                                                                 :148975
                                                                                  :1373257
                                                          Max.
                                                                           Max.
##
        X2718
                         X48541
                                          X451027
                                                              X35931
                                                                               X486958
##
   Min.
               268
                     Min.
                               6095
                                       Min.
                                                  69072
                                                          Min.
                                                                     4228
                                                                            Min.
                                                                                       78529
                     1st Qu.:
                                                                    33530
                                                                                      217822
##
   1st Qu.:
             2228
                               18176
                                       1st Qu.:
                                                 158935
                                                          1st Qu.:
                                                                            1st Qu.:
##
  Median:
             4466
                     Median: 27168
                                       Median: 339414
                                                          Median: 65685
                                                                            Median: 397546
  Mean : 13582
                     Mean : 93014
                                       Mean : 1184745
                                                          Mean : 217198
                                                                            Mean : 1401943
## 3rd Qu.: 8365
                     3rd Qu.: 56237
                                       3rd Qu.: 698306
                                                          3rd Qu.: 172856
                                                                            3rd Qu.: 793096
   Max.
          :232252
                     Max.
                            :1605509
                                       Max.
                                              :20366178
                                                          Max.
                                                                 :3710333
                                                                            Max.
                                                                                   :24076511
column_types <- sapply(data, class)</pre>
# replace data with "Unknown" if missing data is char
dataNew <- data %>%
  mutate_if(is.character, ~ifelse(is.na(.), "Unknown", .))
# replace data with column's median if missing data is numerical
dataNew <- data %>%
  mutate_all(
    funs(if(is.numeric(.)) replace(., is.na(.), median(., na.rm = TRUE)) else .)
```

```
## Warning: 'funs()' was deprecated in dplyr 0.8.0.
## i Please use a list of either functions or lambdas:
##
## # Simple named list: list(mean = mean, median = median)
##
## # Auto named with 'tibble::lst()': tibble::lst(mean, median)
##
## # Using lambdas list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## Call 'lifecycle::last_lifecycle_warnings()' to see where this warning was generated.
## Looking for Duplicated Data
duplicated_rows <- duplicated(data)
duplicated_rows</pre>
```

[1] FALSE FALSE

```
# Make a new data without duplicates in variabel called unique data specific unique_data_specific <- distinct(data, .keep_all = TRUE) unique_data_specific
```

##		Aceh	X3336	X193	X3529	X45823	X2718	X48541	X451027	X35931	X486958
##		Sumatera Utara	8205	1577	9782	91137	18448	109585	1204565	344087	1548652
##		Sumatera Barat	3962	298	4260	42372	4461	46833	531193	66025	597218
##	_	Riau	3221	570	3791	42764	8614	51378	634909	138617	773526
##	-	Jambi	2308	155	2463	24989	2172	27161	335196	33498	368694
##	5	Sumatera Selatan	4252	444	4696	54232	5629	59861	796801	85733	882534
##	6	Bengkulu	1290	108	1398	14351	1684	16035	173543	20838	194381
##	7	Lampung	4314	418	4732	52422	5289	57711	719438	80181	799619
##	8	Kepulauan Bangka Belitung	760	72	832	8672	1006	9678	146317	16405	162722
##	9	Kepulauan Riau	684	289	973	9483	4550	14033	154066	71509	225575
##	10	DKI Jakarta	1308	931	2239	24794	15550	40344	546713	218377	765090
##	11	Jawa Barat	17302	2357	19659	177306	35543	212849	3883339	567595	4450934
##	12	Jawa Tengah	17472	1288	18760	156270	17401	173671	2322013	309161	2631174
##	13	DI Yogyakarta	1423	425	1848	14788	5667	20455	190728	83710	274438
##	14	Jawa Timur	16980	2027	19007	161954	24844	186798	2184504	395409	2579913
##	15	Banten	3895	739	4634	45266	11621	56887	996698	189185	1185883
##	16	Bali	2265	151	2416	23162	2557	25719	343632	39232	382864
##	17	Nusa Tenggara Barat	3011	298	3309	39286	2873	42159	472110	37359	509469
##	18	Nusa Tenggara Timur	3378	1825	5203	36362	17923	54285	417555	251670	669225
##	19	Kalimantan Barat	4139	299	4438	36209	3331	39540	504176	61472	565648
##	20	Kalimantan Tengah	2412	236	2648	22934	2551	25485	232282	42758	275040
##	21	Kalimantan Selatan	2740	175	2915	27785	2397	30182	323293	33626	356919
##	22	Kalimantan Timur	1652	267	1919	22416	3696	26112	346884	65345	412229
##	23	Kalimantan Utara	437	48	485	5489	606	6095	69072	9457	78529
##	24	Sulawesi Utara	1344	859	2203	12705	6090	18795	132584	82653	215237
##	25	Sulawesi Tengah	2670	256	2926	25032	2143	27175	281651	26071	307722
##	26	Sulawesi Selatan	6082	356	6438	65702	4702	70404	811242	68935	880177
##	27	Sulawesi Tenggara	2257	88	2345	24705	862	25567	279295	12428	291723
##	28	Gorontalo	896	32	928	8108	284	8392	103914	4228	108142
##	29	Sulawesi Barat	1297	29	1326	13487	268	13755	139578	4415	143993
##	30	Maluku	1276	536	1812	13498	4471	17969	148988	59008	207996

```
## 32
                    Papua Barat
                                    700
                                          404
                                                 1104
                                                         6705
                                                                3086
                                                                        9791
                                                                                 82955
                                                                                         48216
                                                                                                 131171
## 33
                           Papua
                                   1664
                                          978
                                                 2642
                                                        12610
                                                                7617
                                                                       20227
                                                                                288283
                                                                                        184269
                                                                                                 472552
## 34
                       Indonesia 130042 18933 148975 1373257 232252 1605509 20366178 3710333 24076511
# Function to detect outliers using IOR method
outliers iqr <- function(df) {
  df %>%
    summarise(across(where(is.numeric), ~{
      Q1 <- quantile(., 0.25, na.rm = TRUE)
      Q3 <- quantile(., 0.75, na.rm = TRUE)
      IQR <- Q3 - Q1
      lower bound <- Q1 - 1.5 * IQR
      upper bound <- Q3 + 1.5 * IQR
      sum(. < lower_bound | . > upper_bound, na.rm = TRUE)
    }, .names = "IQR {.col}"))
}
# Function to detect outliers using Z-Score method
outliers zscore <- function(df, threshold = 3) {
  df %>%
    summarise(across(where(is.numeric), ~{
      z scores <- scale(.)</pre>
      sum(abs(z scores) > threshold, na.rm = TRUE)
    }, .names = "ZScore {.col}"))
}
# Detecting outliers
igr outliers summary <- outliers igr(data)
zscore outliers summary <- outliers zscore(data)
# Print
print(iqr_outliers_summary)
```

```
IQR_X3336 IQR_X193 IQR_X3529 IQR_X45823 IQR_X2718 IQR_X48541 IQR_X451027 IQR_X35931 IQR_X486958
##
## 1
             4
                                 5
                                                        5
                                                                   4
                                                                                4
                                                                                            3
                                             4
print(zscore_outliers_summary)
     ZScore X3336 ZScore X193 ZScore X3529 ZScore X45823 ZScore X2718 ZScore X48541 ZScore X451027
##
## 1
                1
                             1
                                           1
                                                          1
                                                                       1
                                                                                      1
                                                                                                      1
```

Overview and Importing Datasets

ZScore X35931 ZScore X486958

Here's an explanation on our group's coding cleaning process. First of all we will access the dplyr and skimr libraries. After that we will read the file from the data we provide. Here there are 4 data, we take 4 factors, namely the number of libraries, the number of school participation per age level, the number of schools and teachers, and finally the influence of poverty on completing education. First of all, of course, we will overview the dataframe which will be reviewed with a view and see the summary data with a skim.

Detect Missing data

##

1

31

Maluku Utara

1110

205

1315

10439

1598

12037

117634

22930

140564

After that, we will see the amount of missing data in our file. Here the system will detect and count the number of missing data per column via summarise(across(everything(), ~ sum(is.na(.)))).

Changing Missing Data

After detecting missing data, we will change the missing data. If the data variable is in the form of characters and there is missing data, it will be changed to "Unknown", this aims to not eliminate the uniqueness of the data because if we replace it with the most mode then we have removed the uniqueness of the data. Meanwhile, we will change the numerical data by changing the value of the missing data to the median. This aims to prevent skewness in the data so that our data maintains its distribution.

Duplicated Data and Outliers

Next, we will look for whether there is duplicated data. If there is duplicated data, we will store our data in a new dataframe that does not have duplicated data. After cleaning missing and duplicated data, we clean outliers contained in the data. Here we use two methods at once to detect outliers using the IQR method and Z-score. Here we create an IQR and Z-score function that accepts data frame parameters so that we can easily know whether our data has outliers or not.

2. Cleaning Data for School Participation Rates in Indonesia from 2002 to 2022

```
library(dplyr)
data = read_excel(file.choose())
# looking for missing data
missing summary <- data %>%
  summarise(across(everything(), ~ sum(is.na(.))))
print(missing summary)
## # A tibble: 1 x 5
     Tahun '7-12' '13-15' '16-18' '19-24'
##
##
            <int>
                    <int>
                             <int>
## 1
         0
                        0
                                         0
summary(data)
##
        Tahun
                         7-12
                                        13-15
                                                         16-18
                                                                          19-24
##
    Min.
           :2002
                   Min.
                           :96.10
                                    Min.
                                           :79.21
                                                     Min.
                                                            :49.76
                                                                     Min.
                                                                            :11.38
##
   1st Qu.:2007
                   1st Qu.:97.58
                                    1st Qu.:84.65
                                                     1st Qu.:55.16
                                                                     1st Qu.:12.72
   Median:2012
                   Median :98.02
                                    Median: 89.76
                                                     Median :61.42
                                                                      Median :16.13
    Mean :2012
                                    Mean :89.48
                                                     Mean :62.56
##
                    Mean :98.17
                                                                      Mean :18.29
##
    3rd Qu.:2017
                   3rd Qu.:99.10
                                    3rd Qu.:95.08
                                                     3rd Qu.:71.42
                                                                     3rd Qu.:24.40
   Max.
           :2022
                    Max.
                           :99.26
                                    Max.
                                           :95.99
                                                     Max.
                                                            :73.15
                                                                      Max.
                                                                             :26.01
column types <- sapply(data, class)
# replace data with "Unknown" if missing data is char
dataNew <- data %>%
  mutate_if(is.character, ~ifelse(is.na(.), "Unknown", .))
```

```
# replace data with column's median if missing data is numerical
dataNew <- data %>%
    mutate all(
        funs(if(is.numeric(.)) replace(., is.na(.), median(., na.rm = TRUE)) else .)
   )
## Warning: 'funs()' was deprecated in dplyr 0.8.0.
## i Please use a list of either functions or lambdas:
## # Simple named list: list(mean = mean, median = median)
##
## # Auto named with 'tibble::lst()': tibble::lst(mean, median)
## # Using lambdas list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## Call 'lifecycle::last lifecycle warnings()' to see where this warning was generated.
# Looking for Duplicated Data
duplicated rows <- duplicated(data)
duplicated_rows
## [1] FALSE FALSE
## [16] FALSE FALSE FALSE FALSE FALSE
# Make a new data without duplicates in variabel called unique data specific
unique data specific <- distinct(data, .keep all = TRUE)
unique data specific
## # A tibble: 21 x 5
##
             Tahun '7-12' '13-15' '16-18' '19-24'
##
             <dbl> <dbl>
                                              <dbl>
                                                               <dbl>
                                                                                 <dbl>
## 1 2002
                              96.1
                                                79.2
                                                                  49.8
                                                                                    11.6
## 2 2003
                              96.4
                                                81.0
                                                                  51.0
                                                                                    11.7
## 3 2004
                                                                  53.5
                              96.8
                                                83.5
                                                                                    12.1
## 4 2005
                              97.1
                                                84.0
                                                                  53.9
                                                                                    12.2
## 5 2006
                              97.4
                                                84.1
                                                                  53.9
                                                                                    11.4
## 6 2007
                              97.6
                                                                  55.5
                                                84.6
                                                                                    13.1
## 7
               2008
                              97.9
                                                84.9
                                                                  55.5
                                                                                    13.3
## 8 2009
                              98.0
                                                85.5
                                                                  55.2
                                                                                    12.7
## 9 2010
                              98.0
                                                86.2
                                                                  56.0
                                                                                    13.8
## 10 2011
                              97.6
                                                87.8
                                                                  57.8
                                                                                    14.3
## # i 11 more rows
# Function to detect outliers using IQR method
outliers_iqr <- function(df) {</pre>
    df %>%
        summarise(across(where(is.numeric), ~{
             Q1 <- quantile(., 0.25, na.rm = TRUE)
             Q3 <- quantile(., 0.75, na.rm = TRUE)
             IQR <- Q3 - Q1
            lower bound <- Q1 - 1.5 * IQR
             upper bound <- Q3 + 1.5 * IQR
```

```
sum(. < lower_bound | . > upper_bound, na.rm = TRUE)
    }, .names = "IQR {.col}"))
}
# Function to detect outliers using Z-Score method
outliers_zscore <- function(df, threshold = 3) {
  df %>%
    summarise(across(where(is.numeric), ~{
      z_scores <- scale(.)</pre>
      sum(abs(z_scores) > threshold, na.rm = TRUE)
    }, .names = "ZScore_{.col}"))
}
# Detecting outliers
iqr outliers summary <- outliers_iqr(data)</pre>
zscore_outliers_summary <- outliers_zscore(data)</pre>
# Print
print(iqr outliers summary)
## # A tibble: 1 x 5
     IQR_Tahun 'IQR_7-12' 'IQR_13-15' 'IQR_16-18' 'IQR_19-24'
##
         <int>
                     <int>
                                 <int>
                                              <int>
## 1
             0
                         0
                                     0
                                                  0
                                                               0
print(zscore_outliers_summary)
## # A tibble: 1 x 5
    ZScore Tahun 'ZScore 7-12' 'ZScore 13-15' 'ZScore 16-18' 'ZScore 19-24'
##
            <int>
                           <int>
                                           <int>
                                                           <int>
                                                                           <int>
## 1
                0
                               0
                                               0
                                                               0
                                                                               0
```

3. Cleaning Data for Relationship Between Educational Attainment and Poverty in Indonesia in 2022

```
library(dplyr)
data = read.table(file.choose(), sep=",", header = T, skip = 1)
# looking for missing data
missing summary <- data %>%
  summarise(across(everything(), ~ sum(is.na(.))))
print(missing_summary)
     ACEH X99.44 X99.45 X99.08 X93.43 X97.63 X94.55 X74.36 X70.67 X74.46 X89.25
##
## 1
              0
                      0
                             0
                                    0
                                           0
                                                  0
                                                         0
                                                                0
                                                                       0
summary(data)
```

```
##
                 ACEH
                                                         X99.44
                                                                                           X99.45
                                                                                                                             X99.08
                                                                                                                                                               X93.43
##
        Length:33
                                                 Min.
                                                                :78.43
                                                                                    Min.
                                                                                                  :81.99
                                                                                                                      Min.
                                                                                                                                     :80.09
                                                                                                                                                       Min.
                                                                                                                                                                      :66.06
##
        Class :character
                                                 1st Qu.:95.77
                                                                                   1st Qu.:96.94
                                                                                                                     1st Qu.:96.01
                                                                                                                                                       1st Qu.:86.09
##
        Mode :character
                                                  Median :97.02
                                                                                    Median :97.65
                                                                                                                      Median :97.76
                                                                                                                                                       Median :89.49
##
                                                  Mean :96.27
                                                                                    Mean :96.92
                                                                                                                      Mean :96.68
                                                                                                                                                       Mean :88.17
##
                                                  3rd Qu.:98.33
                                                                                    3rd Qu.:98.47
                                                                                                                      3rd Qu.:98.42
                                                                                                                                                        3rd Qu.:91.35
                                                                                                                                                                      :95.34
##
                                                                :99.26
                                                                                    Max.
                                                                                                  :99.18
                                                                                                                                     :99.09
                                                  Max.
                                                                                                                      Max.
                                                                                                                                                       Max.
##
                 X97.63
                                                   X94.55
                                                                                     X74.36
                                                                                                                       X70.67
                                                                                                                                                         X74.46
                                                                                                                                                                                            X89.25
##
        Min.
                                                                                           :32.95
                       :66.16
                                           Min.
                                                         :67.12
                                                                             Min.
                                                                                                               Min.
                                                                                                                             :38.47
                                                                                                                                                 Min.
                                                                                                                                                                :39.50
                                                                                                                                                                                   Min.
                                                                                                                                                                                                  :62.39
        1st Qu.:87.79
                                           1st Qu.:88.08
                                                                             1st Qu.:61.04
                                                                                                                                                 1st Qu.:59.99
                                                                                                                                                                                   1st Qu.:82.26
##
                                                                                                               1st Qu.:58.75
                                                                                                               Median :66.02
##
        Median :90.47
                                           Median :90.05
                                                                             Median :65.71
                                                                                                                                                 Median :66.62
                                                                                                                                                                                   Median: 84.45
       Mean :89.32
                                           Mean :89.40
                                                                             Mean :65.24
                                                                                                               Mean :64.50
                                                                                                                                                 Mean :65.55
                                                                                                                                                                                    Mean :83.58
##
        3rd Qu.:92.84
                                           3rd Qu.:92.95
                                                                             3rd Qu.:69.43
                                                                                                               3rd Qu.:67.81
                                                                                                                                                 3rd Qu.:68.96
                                                                                                                                                                                   3rd Qu.:85.64
##
        Max.
                       :97.06
                                           Max.
                                                         :97.02
                                                                            Max.
                                                                                           :90.12
                                                                                                               Max.
                                                                                                                             :87.92
                                                                                                                                                 Max.
                                                                                                                                                               :89.69
                                                                                                                                                                                   Max.
                                                                                                                                                                                                  :94.63
column types <- sapply(data, class)
# replace data with "Unknown" if missing data is char
dataNew <- data %>%
    mutate_if(is.character, ~ifelse(is.na(.), "Unknown", .))
# replace data with column's median if missing data is numerical
dataNew <- data %>%
    mutate all(
        funs(if(is.numeric(.)) replace(., is.na(.), median(., na.rm = TRUE)) else .)
## Warning: 'funs()' was deprecated in dplyr 0.8.0.
## i Please use a list of either functions or lambdas:
## # Simple named list: list(mean = mean, median = median)
## # Auto named with 'tibble::lst()': tibble::lst(mean, median)
## # Using lambdas list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## Call 'lifecycle::last_lifecycle_warnings()' to see where this warning was generated.
# Looking for Duplicated Data
duplicated_rows <- duplicated(data)</pre>
duplicated_rows
## [1] FALSE FALSE
```

[16] FALSE ## [31] FALSE FALSE FALSE

```
# Make a new data without duplicates in variabel called unique data specific
unique_data_specific <- distinct(data, .keep_all = TRUE)</pre>
unique data specific
```

```
##
                      ACEH X99.44 X99.45 X99.08 X93.43 X97.63 X94.55 X74.36 X70.67 X74.46
                                                                                            X89.25
            SUMATERA UTARA 98.57 98.74
                                          98.75
                                                91.35
                                                       92.84 94.35
## 1
                                                                      72.81
                                                                            77.16
                                                                                   74.43 89.58000
## 2
            SUMATERA BARAT 95.29 97.87
                                          95.81
                                                89.49
                                                                             65.96
                                                       88.83 90.65
                                                                      70.06
                                                                                   68.64 84.22000
```

```
96.91
## 3
                        RIAU
                                      98.20
                                              98.09
                                                      87.11
                                                              88.53
                                                                      90.52
                                                                             68.94
                                                                                     66.91
                                                                                             67.79 84.54667
## 4
                       JAMBI
                               98.54
                                      97.62
                                              97.76
                                                      89.00
                                                              86.57
                                                                     89.35
                                                                             64.51
                                                                                     65.85
                                                                                             66.62 83.34667
## 5
           SUMATERA SELATAN
                               97.82
                                      97.53
                                              97.58
                                                      87.68
                                                              88.41
                                                                     87.95
                                                                             67.20
                                                                                     67.07
                                                                                             64.81 84.33667
## 6
                   BENGKULU
                               98.16
                                      97.65
                                              97.10
                                                      89.94
                                                              90.81
                                                                     89.25
                                                                             62.46
                                                                                     64.88
                                                                                             63.41 84.44667
##
   7
                    LAMPUNG
                               98.33
                                      98.41
                                              98.67
                                                      89.46
                                                              90.99
                                                                     87.67
                                                                             60.09
                                                                                     62.42
                                                                                             64.54 83.94000
##
   8
       KEP. BANGKA BELITUNG
                               96.61
                                      96.45
                                              96.01
                                                      80.99
                                                              84.72
                                                                     87.11
                                                                             63.98
                                                                                     66.87
                                                                                             68.96 82.68000
## 9
                                                              95.72
                                                                                     73.93
                   KEP. RIAU
                               98.16
                                      98.38
                                              97.92
                                                      92.71
                                                                     95.51
                                                                             81.07
                                                                                             78.97 89.34333
## 10
                DKI JAKARTA
                               99.26
                                      98.58
                                              98.66
                                                      95.00
                                                              95.40
                                                                     95.85
                                                                             84.98
                                                                                     87.71
                                                                                             88.10 93.89667
                               98.45
                                                              89.29
                                                                                     67.05
## 11
                 JAWA BARAT
                                      99.08
                                              99.09
                                                      88.18
                                                                     91.42
                                                                             64.89
                                                                                             66.47 85.14000
##
   12
                JAWA TENGAH
                               98.06
                                      98.01
                                              98.42
                                                      88.44
                                                              90.02
                                                                     90.64
                                                                             59.90
                                                                                     58.75
                                                                                             58.35 82.26000
##
   13
                               98.48
                                      98.91
                                              98.95
                                                      94.94
                                                              97.06
                                                                      97.02
                                                                                     87.92
             DI YOGYAKARTA
                                                                             90.12
                                                                                             89.69 94.63000
                               97.76
                                                      90.30
                                                              90.47
                                                                      90.74
##
   14
                 JAWA TIMUR
                                      98.71
                                              98.78
                                                                             66.33
                                                                                     66.87
                                                                                             68.65 85.35000
##
   15
                      BANTEN
                               98.82
                                      97.24
                                              97.15
                                                      90.63
                                                              92.65
                                                                     90.86
                                                                             66.90
                                                                                     66.02
                                                                                             70.07 85.30333
                               97.02
##
   16
                        BALI
                                      97.55
                                              98.43
                                                      94.26
                                                              94.15
                                                                      93.03
                                                                             75.86
                                                                                     76.59
                                                                                             76.51 89.43000
##
   17
                               98.71
                                      98.47
                                                      92.19
                                                              95.39
                                                                     92.95
                                                                             65.71
                                                                                     61.00
        NUSA TENGGARA BARAT
                                              98.11
                                                                                             63.66 84.95333
## 18
       NUSA TENGGARA TIMUR
                               91.84
                                      92.35
                                              93.41
                                                      78.83
                                                              83.25
                                                                     82.48
                                                                             44.88
                                                                                     38.47
                                                                                             43.46 71.35667
## 19
           KALIMANTAN BARAT
                               94.29
                                      95.13
                                              95.33
                                                      79.65
                                                              81.82
                                                                     81.56
                                                                             54.27
                                                                                     58.40
                                                                                             55.58 78.45000
##
  20
         KALIMANTAN TENGAH
                               97.45
                                      98.51
                                              97.47
                                                      89.76
                                                              87.79
                                                                      88.92
                                                                             61.04
                                                                                     61.88
                                                                                             63.93 82.72667
## 21
                               95.67
                                      94.68
                                              95.99
                                                      84.06
                                                              87.95
                                                                     88.19
                                                                                     67.81
         KALIMANTAN SELATAN
                                                                             63.59
                                                                                             68.35 83.48000
## 22
          KALIMANTAN TIMUR
                               96.82
                                      99.18
                                              97.88
                                                      95.34
                                                              95.32
                                                                     94.85
                                                                             74.26
                                                                                     74.00
                                                                                             73.63 89.50000
                               95.77
                                                              90.55
## 23
          KALIMANTAN UTARA
                                      96.94
                                              96.41
                                                      90.14
                                                                      88.08
                                                                             62.30
                                                                                     54.80
                                                                                             59.50 80.76333
## 24
             SULAWESI UTARA
                               96.10
                                      96.74
                                              96.18
                                                      91.05
                                                              91.98
                                                                     92.07
                                                                             68.56
                                                                                     66.66
                                                                                             67.57 85.12667
## 25
           SULAWESI TENGAH
                               96.19
                                      97.19
                                              97.56
                                                      85.42
                                                              88.90
                                                                     90.05
                                                                             61.16
                                                                                     53.73
                                                                                             55.69 79.94000
## 26
           SULAWESI SELATAN
                               97.30
                                      98.05
                                              98.37
                                                      88.18
                                                              90.55
                                                                      88.74
                                                                             69.43
                                                                                     68.32
                                                                                             67.41 85.64000
## 27
         SULAWESI TENGGARA
                               95.58
                                      97.24
                                              97.83
                                                      90.88
                                                              91.19
                                                                      89.55
                                                                             70.65
                                                                                     65.97
                                                                                             68.28 84.80000
##
   28
                  GORONTALO
                               93.44
                                      95.12
                                              93.69
                                                      81.22
                                                              80.56
                                                                     83.71
                                                                             53.73
                                                                                     45.12
                                                                                             46.19 73.60000
##
   29
             SULAWESI BARAT
                               95.93
                                      97.15
                                              95.13
                                                      86.09
                                                              84.14
                                                                      84.04
                                                                             56.22
                                                                                     55.18
                                                                                             54.79 78.82333
                                                              93.65
                                                                                             75.01 88.23667
##
   30
                     MALUKU
                               98.50
                                      98.98
                                              98.69
                                                      93.08
                                                                      93.90
                                                                             68.12
                                                                                     72.08
##
   31
               MALUKU UTARA
                               96.97
                                      97.72
                                              98.30
                                                      92.93
                                                              94.92
                                                                      93.46
                                                                             66.95
                                                                                     67.10
                                                                                             64.61 86.58000
## 32
                                                              87.03
                                                                             59.08
                PAPUA BARAT
                               91.81
                                      93.94
                                              92.69
                                                      85.18
                                                                      88.63
                                                                                     57.07
                                                                                             59.99 79.34667
## 33
                       PAPUA
                               78.43
                                      81.99
                                              80.09
                                                      66.06
                                                              66.16
                                                                     67.12
                                                                             32.95
                                                                                     39.01
                                                                                             39.50 62.38667
```

```
# Function to detect outliers using IQR method
outliers iqr <- function(df) {
  df %>%
    summarise(across(where(is.numeric), ~{
      Q1 <- quantile(., 0.25, na.rm = TRUE)
      Q3 <- quantile(., 0.75, na.rm = TRUE)
      IQR <- Q3 - Q1
      lower bound <- Q1 - 1.5 * IQR
      upper bound <- Q3 + 1.5 * IQR
      sum(. < lower bound | . > upper bound, na.rm = TRUE)
    }, .names = "IQR {.col}"))
}
# Function to detect outliers using Z-Score method
outliers zscore <- function(df, threshold = 3) {
  df %>%
    summarise(across(where(is.numeric), ~{
      z scores <- scale(.)</pre>
      sum(abs(z scores) > threshold, na.rm = TRUE)
    }, .names = "ZScore_{.col}"))
}
```

```
iqr outliers summary <- outliers_iqr(data)</pre>
zscore_outliers_summary <- outliers_zscore(data)</pre>
# Print
print(iqr_outliers_summary)
     IQR X99.44 IQR X99.45 IQR X99.08 IQR X93.43 IQR X97.63 IQR X94.55 IQR X74.36 IQR X70.67
##
## 1
                                               1
                         3
                                                          1
##
     IQR_X74.46 IQR_X89.25
## 1
              5
print(zscore outliers summary)
     ZScore X99.44 ZScore X99.45 ZScore X99.08 ZScore X93.43 ZScore X97.63 ZScore X94.55
## 1
                 1
                               1
                                             1
                                                           1
                                                                         1
                                                                                        1
##
     ZScore X74.36 ZScore X70.67 ZScore X74.46 ZScore X89.25
                 1
                               0
                                             0
## 1
4. Cleaning Data for Distribution of Libraries in Indonesia for the
Academic Year 2022/2023
library(dplyr)
data = read.table(file.choose(), sep=",", header = T, skip = 1)
# looking for missing data
missing_summary <- data %>%
  summarise(across(everything(), ~ sum(is.na(.))))
print(missing summary)
     Prov..D.K.I..Jakarta X1831 X264 X70 X45 X0 X2210 X950 X119 X25 X7 X0.1 X1101 X435 X45.1 X7.1 X4
##
## 1
                                     4
    X0.2 X491 X469 X91 X11 X6 X0.3 X577 X4379
                      4
summary(data)
                                             X264
                                                                                              Χ0
    Prov..D.K.I..Jakarta
                             X1831
                                                             X70
                                                                            X45
    Length:37
                         Min. : 187
                                        Min. : 93
                                                        Min. : 39
                                                                       Min. : 40.0
                                                                                        Min.
                                                                                               :0
                                        1st Qu.: 283
                                                        1st Qu.: 230
                                                                       1st Qu.: 146.0
    Class :character
                         1st Qu.: 529
                                                                                        1st Qu.:0
    Mode :character
                         Median: 995
                                         Median: 590
                                                        Median: 381
                                                                       Median: 208.0
                                                                                        Median:0
                                         Mean : 936
##
                         Mean :1463
                                                        Mean : 590
                                                                       Mean : 347.5
                                                                                        Mean :0
##
                         3rd Qu.:1573
                                         3rd Qu.: 982
                                                        3rd Qu.: 655
                                                                       3rd Qu.: 340.0
                                                                                        3rd Qu.:0
##
                                :6550
                                               :4705
                                                              :2525
                                                                       Max.
                                                                             :1447.0
                         Max.
                                        Max.
                                                       Max.
                                                                                        Max.
                                                                                               :0
##
                         NA's
                                :4
                                        NA's
                                               :4
                                                       NA's
                                                              :4
                                                                       NA's
                                                                             :4
                                                                                        NA's
                                                                                               :4
##
        X2210
                         X950
                                          X119
                                                            X25
                                                                            X7
                                                                                             X0.1
##
          : 359
                           : 95.0
                                            : 30.0
                                                      Min. : 13.0
                                                                       Min.
                                                                            : 12.00
    Min.
                    Min.
                                     Min.
                                                                                        Min.
                                                                                               :0
    1st Qu.: 1265
                    1st Qu.: 262.0
                                     1st Qu.: 98.0
                                                      1st Qu.: 68.0
                                                                       1st Qu.: 39.00
                                                                                        1st Qu.:0
```

Detecting outliers

```
Median: 2174
                                     Median: 179.0
                    Median: 358.0
                                                       Median :119.0
                                                                        Median: 74.00
                                                                                         Median:0
                                                                        Mean : 90.03
##
    Mean : 3336
                    Mean : 576.5
                                     Mean : 278.7
                                                       Mean :166.4
                                                                                         Mean :0
##
    3rd Qu.: 3378
                    3rd Qu.: 621.0
                                     3rd Qu.: 315.0
                                                       3rd Qu.:202.0
                                                                        3rd Qu.:112.00
                                                                                         3rd Qu.:0
##
   Max.
           :15022
                    Max.
                           :2692.0
                                      Max.
                                            :1306.0
                                                       Max.
                                                              :665.0
                                                                        Max.
                                                                              :313.00
                                                                                         Max.
                                                                                                :0
##
   NA's
           :4
                    NA's
                           :4
                                      NA's
                                             :4
                                                       NA's
                                                              :4
                                                                        NA's
                                                                              :4
                                                                                         NA's
                                                                                                :4
##
        X1101
                        X435
                                        X45.1
                                                           X7.1
                                                                             X4
                                                                                              X0.2
           : 160
                                           : 4.00
##
   Min.
                          : 31.0
                                                      Min.
                                                             : 2.00
                                                                        Min.
                                                                              : 2.00
                                                                                         Min.
                   Min.
                                     Min.
##
    1st Qu.: 455
                   1st Qu.: 123.0
                                     1st Qu.: 36.00
                                                      1st Qu.: 20.00
                                                                        1st Qu.: 10.00
                                                                                         1st Qu.:0
                   Median: 144.0
                                     Median: 60.00
                                                      Median: 32.00
                                                                        Median: 19.00
##
   Median: 712
                                                                                         Median:0
##
   Mean :1112
                   Mean : 243.5
                                     Mean : 89.58
                                                      Mean : 44.52
                                                                        Mean : 25.97
                                                                                         Mean :0
##
   3rd Qu.:1242
                   3rd Qu.: 315.0
                                     3rd Qu.:111.00
                                                      3rd Qu.: 62.00
                                                                        3rd Qu.: 37.00
                                                                                         3rd Qu.:0
                                                                              :100.00
##
   Max.
           :4961
                   Max.
                          :1011.0
                                     Max.
                                            :377.00
                                                      Max.
                                                             :148.00
                                                                        Max.
                                                                                         Max.
##
   NA's
           :4
                   NA's
                          :4
                                     NA's
                                            :4
                                                      NA's
                                                             :4
                                                                        NA's
                                                                               :4
                                                                                         NA's
                                                                                                :4
         X491
                                            X91
##
                          X469
                                                             X11
                                                                               Х6
                                                                                               X0.3
##
   Min.
                     Min.
                            : 14.0
                                       Min.
                                             : 5.00
                                                        Min.
                                                               : 3.00
                                                                         Min.
                                                                                : 0.00
                                                                                          Min.
          : 54.0
    1st Qu.: 182.0
                     1st Qu.: 60.0
                                       1st Qu.: 21.00
                                                        1st Qu.: 12.00
                                                                         1st Qu.: 4.00
                                                                                          1st Qu.:0
##
    Median: 240.0
                     Median: 107.0
                                       Median: 43.00
                                                        Median: 17.00
                                                                         Median: 9.00
                                                                                          Median:0
##
   Mean : 403.6
                     Mean : 240.5
                                       Mean : 93.42
                                                        Mean : 31.79
                                                                         Mean :14.21
                                                                                          Mean
                                                        3rd Qu.: 34.00
                                                                         3rd Qu.:18.00
##
   3rd Qu.: 530.0
                     3rd Qu.: 174.0
                                       3rd Qu.: 64.00
                                                                                          3rd Qu.:0
   Max.
           :1609.0
                     Max.
                            :1707.0
                                       Max.
                                              :695.00
                                                        Max.
                                                               :191.00
                                                                         Max.
                                                                                 :77.00
                                                                                          Max.
##
    NA's
                     NA's
                            :4
                                       NA's
                                                        NA's
                                                               :4
                                                                         NA's
                                                                                 :4
                                                                                          NA's
           :4
                                              :4
         X577
                         X4379
##
##
   Min.
           : 22.0
                            : 595
                     Min.
                     1st Qu.: 1994
    1st Qu.: 105.0
##
##
   Median: 170.0
                     Median: 3211
##
   Mean : 379.9
                     Mean
                            : 5231
##
   3rd Qu.: 271.0
                     3rd Qu.: 5768
##
   Max.
           :2670.0
                     Max.
                            :21762
##
   NA's
           :4
                     NA's
                            :4
column_types <- sapply(data, class)
# replace data with "Unknown" if missing data is char
dataNew <- data %>%
  mutate_if(is.character, ~ifelse(is.na(.), "Unknown", .))
# replace data with column's median if missing data is numerical
dataNew <- data %>%
  mutate_all(
    funs(if(is.numeric(.)) replace(., is.na(.), median(., na.rm = TRUE)) else .)
## Warning: 'funs()' was deprecated in dplyr 0.8.0.
## i Please use a list of either functions or lambdas:
## # Simple named list: list(mean = mean, median = median)
## # Auto named with 'tibble::lst()': tibble::lst(mean, median)
## # Using lambdas list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## Call 'lifecycle::last_lifecycle_warnings()' to see where this warning was generated.
```

:0

:0

:0

:0

:0

:4

Looking for Duplicated Data duplicated_rows <- duplicated(data) duplicated_rows</pre>

[1] FALSE FALSE

```
# Make a new data without duplicates in variabel called unique data specific unique_data_specific <- distinct(data, .keep_all = TRUE) unique data specific
```

```
##
                                                               X45 X0 X2210 X950 X119 X25
                   Prov..D.K.I..Jakarta
                                            X1831 X264
                                                         X70
                                                                                                X7 X0.1 X1101 X435
## 1
                        Prov. Jawa Barat
                                             4890 3673 2525 1434
                                                                     0 12522 2692 1306
                                                                                          665
                                                                                              298
                                                                                                       0
                                                                                                          4961 1011
                                                                                                          3408
##
   2
                       Prov. Jawa Tengah
                                             6550 4705 2436 1331
                                                                     0 15022 1780
                                                                                     934 489 205
                                                                                                       0
                                                                                                                 590
                  Prov. D.I. Yogyakarta
##
   3
                                              995
                                                    487
                                                          197
                                                                 83
                                                                     n
                                                                         1762
                                                                               282
                                                                                      98
                                                                                           43
                                                                                                42
                                                                                                       n
                                                                                                           465
                                                                                                                 144
##
   4
                        Prov. Jawa Timur
                                             6345
                                                  3985
                                                        2054
                                                              1447
                                                                     0
                                                                       13831
                                                                              2304
                                                                                    1201 559 313
                                                                                                       0
                                                                                                          4377
                                                                                                                 909
                                                                340
                                                                         3104
                                                                               539
                                                                                                          1190
##
   5
                               Prov. Aceh
                                             1275
                                                    847
                                                          642
                                                                     n
                                                                                     307
                                                                                          230
                                                                                              114
                                                                                                       0
                                                                                                                 272
##
   6
                   Prov. Sumatera Utara
                                             3348 1945
                                                        1028
                                                                618
                                                                     0
                                                                         6939
                                                                              1319
                                                                                     568
                                                                                          328
                                                                                              194
                                                                                                       0
                                                                                                          2409
                                                                                                                 673
##
   7
                   Prov. Sumatera Barat
                                             1573
                                                    976
                                                          526
                                                                250
                                                                     0
                                                                         3325
                                                                               485
                                                                                     191 119
                                                                                                61
                                                                                                       0
                                                                                                           856
                                                                                                                 216
##
   8
                               Prov. Riau
                                             1272
                                                    666
                                                          392
                                                                207
                                                                     0
                                                                         2537
                                                                               613
                                                                                     209
                                                                                          135
                                                                                                91
                                                                                                       0
                                                                                                          1048
                                                                                                                 316
##
   9
                              Prov. Jambi
                                              783
                                                    590
                                                          376
                                                                195
                                                                     0
                                                                         1944
                                                                               262
                                                                                     179 115
                                                                                                74
                                                                                                       0
                                                                                                           630
                                                                                                                 137
##
                                                                         3860
  10
                 Prov. Sumatera Selatan
                                             1822
                                                  1068
                                                          655
                                                                315
                                                                     0
                                                                                627
                                                                                     315
                                                                                          204
                                                                                                96
                                                                                                       0
                                                                                                          1242
                                                                                                                 351
                                                          734
##
                           Prov. Lampung
                                             1390
                                                    982
                                                                418
                                                                     0
                                                                         3524
                                                                               621
                                                                                     347
                                                                                          202 112
                                                                                                       0
                                                                                                          1282
                                                                                                                 274
   11
##
   12
                 Prov. Kalimantan Barat
                                             1279
                                                  1014
                                                          685
                                                                400
                                                                     0
                                                                         3378
                                                                               584
                                                                                     333
                                                                                          185
                                                                                               112
                                                                                                       0
                                                                                                          1214
                                                                                                                 218
                                                                                           98
##
  13
                Prov. Kalimantan Tengah
                                              813
                                                    556
                                                          316
                                                                201
                                                                     0
                                                                         1886
                                                                               358
                                                                                     178
                                                                                                72
                                                                                                       0
                                                                                                           706
                                                                                                                 141
##
  14
               Prov. Kalimantan Selatan
                                             1068
                                                    639
                                                          381
                                                                200
                                                                     0
                                                                         2288
                                                                               357
                                                                                     153
                                                                                           93
                                                                                                34
                                                                                                       0
                                                                                                           637
                                                                                                                 149
##
   15
                 Prov. Kalimantan Timur
                                              833
                                                    345
                                                          155
                                                                146
                                                                     0
                                                                         1479
                                                                                381
                                                                                     132
                                                                                           67
                                                                                                39
                                                                                                       0
                                                                                                           619
                                                                                                                 134
##
   16
                   Prov. Sulawesi Utara
                                              731
                                                    411
                                                          289
                                                                241
                                                                     0
                                                                         1672
                                                                                298
                                                                                     181
                                                                                          144
                                                                                                89
                                                                                                       0
                                                                                                           712
                                                                                                                 136
##
                                              999
                                                    547
                                                                285
                                                                     0
                                                                         2268
                                                                                                           794
   17
                  Prov. Sulawesi Tengah
                                                          437
                                                                                376
                                                                                     185
                                                                                          128
                                                                                              105
                                                                                                       0
                                                                                                                 157
##
   18
                 Prov. Sulawesi Selatan
                                             2135 1587 1181
                                                                618
                                                                     0
                                                                         5521
                                                                               748
                                                                                     375
                                                                                          319
                                                                                               145
                                                                                                       0
                                                                                                          1587
                                                                                                                 333
##
   19
                Prov. Sulawesi Tenggara
                                              850
                                                    444
                                                          414
                                                                280
                                                                     0
                                                                         1988
                                                                               379
                                                                                     166
                                                                                          137
                                                                                                88
                                                                                                       0
                                                                                                           770
                                                                                                                 145
##
   20
                            Prov. Maluku
                                              568
                                                    245
                                                          311
                                                                208
                                                                     0
                                                                         1332
                                                                               265
                                                                                     102
                                                                                           78
                                                                                                75
                                                                                                       0
                                                                                                           520
                                                                                                                 132
##
   21
                               Prov. Bali
                                             1260
                                                    603
                                                          230
                                                                81
                                                                     0
                                                                         2174
                                                                                286
                                                                                      75
                                                                                           31
                                                                                                17
                                                                                                       0
                                                                                                           409
                                                                                                                 125
## 22
                                                                251
                                                                         2536
                                                                                                           788
             Prov. Nusa Tenggara Barat
                                              899
                                                    765
                                                          621
                                                                     0
                                                                               340
                                                                                     230
                                                                                          166
                                                                                                52
                                                                                                       0
                                                                                                                 132
##
   23
             Prov. Nusa Tenggara Timur
                                             1627
                                                   1189
                                                          895
                                                                596
                                                                     0
                                                                         4307
                                                                               823
                                                                                     400
                                                                                          254
                                                                                               149
                                                                                                       0
                                                                                                           1626
                                                                                                                 315
##
                                                                     0
                                                                         1093
                                                                                           88
                                                                                                       0
                                                                                                           550
                                                                                                                  89
   24
                              Prov. Papua
                                              434
                                                    283
                                                          219
                                                                157
                                                                               225
                                                                                     169
                                                                                                68
##
   25
                          Prov. Bengkulu
                                              506
                                                    359
                                                          307
                                                                93
                                                                     0
                                                                         1265
                                                                                199
                                                                                     137
                                                                                           85
                                                                                                34
                                                                                                       0
                                                                                                           455
                                                                                                                  84
##
   26
                     Prov. Maluku Utara
                                              284
                                                    221
                                                          283
                                                                147
                                                                          935
                                                                                142
                                                                                      95
                                                                                          109
                                                                                                       0
                                                                                                           397
                                                                                                                  95
                                                                     0
                                                                                                51
##
   27
                            Prov. Banten
                                             1661
                                                    793
                                                          399
                                                                337
                                                                     0
                                                                         3190
                                                                               797
                                                                                     291
                                                                                          202
                                                                                                78
                                                                                                       0
                                                                                                           1368
                                                                                                                 396
                                                                     0
                                                                                                       0
##
   28
               Kepulauan Bangka Belitung
                                              400
                                                    183
                                                          138
                                                                114
                                                                          835
                                                                                150
                                                                                       44
                                                                                           13
                                                                                                13
                                                                                                           220
                                                                                                                  45
      Prov.
##
  29
                         Prov. Gorontalo
                                                          192
                                                                 79
                                                                     0
                                                                          874
                                                                                183
                                                                                      65
                                                                                           52
                                                                                                30
                                                                                                       0
                                                                                                                   54
                                              414
                                                    189
                                                                                                           330
## 30
                    Prov. Kepulauan Riau
                                              529
                                                    145
                                                           77
                                                                 78
                                                                     0
                                                                          829
                                                                               263
                                                                                       58
                                                                                           22
                                                                                                12
                                                                                                       0
                                                                                                           355
                                                                                                                 123
                                                    136
                                                           89
                                                                 76
                                                                     0
                                                                                                       0
##
   31
                       Prov. Papua Barat
                                              237
                                                                          538
                                                                               124
                                                                                       68
                                                                                           44
                                                                                                34
                                                                                                           270
                                                                                                                  58
                                                    216
## 32
                                                                200
                                                                                                58
                                                                                                                   52
                    Prov. Sulawesi Barat
                                              313
                                                          246
                                                                     0
                                                                          975
                                                                                126
                                                                                       76
                                                                                           68
                                                                                                       0
                                                                                                           328
##
  33
                 Prov. Kalimantan Utara
                                              187
                                                     93
                                                           39
                                                                 40
                                                                     0
                                                                          359
                                                                                 95
                                                                                      30
                                                                                           19
                                                                                                16
                                                                                                       0
                                                                                                           160
                                                                                                                  31
##
   34
                                               NA
                                                     NA
                                                           NA
                                                                NA NA
                                                                           NA
                                                                                 NA
                                                                                      NA
                                                                                           NA
                                                                                                NA
                                                                                                     NA
                                                                                                            NA
                                                                                                                  NA
##
      X45.1 X7.1
                    X4 X0.2 X491 X469 X91 X11 X6 X0.3 X577 X4379
## 1
         377
               148
                    73
                           0 1609 1707 695
                                              191
                                                  77
                                                          0 2670 21762
##
   2
         202
                73
                    41
                           0
                               906
                                   1039 400
                                               99
                                                  41
                                                          0 1579
                                                                 20915
##
   3
          30
                22
                     8
                           0
                               204
                                          51
                                               12
                                                             232
                                     163
                                                    6
                                                          O
                                                                   2663
## 4
         320
               146
                   100
                           0 1475
                                   1280
                                         483
                                              139 61
                                                          0 1963 21646
## 5
         115
                89
                    54
                               530
                                     110
                                          51
                                               34
                                                  18
                                                          0
                                                             213
                                                                   5037
                           0
```

```
## 6
         238
                    57
                            0 1043
                                     579 195
                                               75 39
                                                             888 11279
                75
                                                          0
## 7
                                                             214
          61
                38
                    31
                            0
                               346
                                     146
                                          41
                                               17 10
                                                          0
                                                                   4741
## 8
          87
                37
                    18
                            0
                               458
                                     174
                                          52
                                               15
                                                   2
                                                          0
                                                             243
                                                                   4286
          60
                                                             170
## 9
                28
                    14
                            0
                               239
                                     101
                                          43
                                               21
                                                   5
                                                          0
                                                                   2983
## 10
         129
                72
                    31
                            0
                               583
                                     185
                                          64
                                               24
                                                    8
                                                          0
                                                             281
                                                                   5966
##
   11
         111
                86
                    42
                            0
                               513
                                     270 117
                                               43 19
                                                          0
                                                             449
                                                                   5768
## 12
                    37
                               402
                                                    9
                                                             196
          92
                55
                           0
                                     114
                                          57
                                               16
                                                          0
                                                                   5190
## 13
          60
                20
                    13
                            0
                               234
                                      70
                                           30
                                                9
                                                    6
                                                          0
                                                             115
                                                                   2941
                      9
                               204
                                                4
## 14
          27
                19
                            0
                                      88
                                          19
                                                   4
                                                          0
                                                             115
                                                                   3244
## 15
          59
                23
                     10
                            0
                               226
                                     107
                                          62
                                               14 12
                                                          0
                                                             195
                                                                   2519
## 16
          53
                    19
                            0
                               240
                                     100
                                          39
                                               20 10
                                                             169
                                                                   2793
                32
                                                          O
## 17
          43
                    13
                               237
                                          28
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                                                             149
                                                                   3448
                24
                            0
                                      86
                                                   8
                                                          0
## 18
         150
                68
                    45
                           0
                               596
                                     218 102
                                               43 11
                                                          0
                                                             374
                                                                   8078
                    47
                                               25 19
                                                             139
##
   19
          63
                59
                           0
                               314
                                      73
                                          22
                                                          0
                                                                   3211
## 20
          56
                    32
                               275
                                          21
                                               13
                                                   8
                                                             102
                                                                   2229
                55
                            0
                                      60
                                                          0
## 21
          25
                 4
                      6
                            0
                               160
                                     129
                                          32
                                                6
                                                   1
                                                          0
                                                             168
                                                                   2911
## 22
          76
                62
                     22
                           0
                               292
                                     147
                                          73
                                               36 11
                                                          0
                                                             267
                                                                   3883
                                               25 29
## 23
         142
                57
                    32
                            0
                               546
                                     166
                                          51
                                                          0
                                                             271
                                                                   6750
## 24
          86
                27
                     15
                               217
                                          45
                                               22 14
                                                             134
                            0
                                      53
                                                          0
                                                                   1994
## 25
          36
                23
                      7
                           0
                               150
                                      53
                                          27
                                               16
                                                   4
                                                          0
                                                             100
                                                                   1970
                    21
                                                    3
## 26
          42
                24
                           0
                               182
                                      48
                                          20
                                               14
                                                          0
                                                              85
                                                                   1599
## 27
         110
                54
                    20
                           0
                               580
                                     418 192
                                               53 18
                                                          0
                                                             681
                                                                   5819
## 28
           4
                10
                      6
                            0
                                65
                                      44
                                            6
                                                6
                                                    0
                                                          0
                                                              56
                                                                   1176
## 29
          11
                 4
                      2
                            0
                                71
                                      37
                                          13
                                                3
                                                    2
                                                          0
                                                              55
                                                                   1330
## 30
          18
                 8
                      6
                            0
                               155
                                      80
                                          19
                                                5
                                                    1
                                                          0
                                                             105
                                                                   1444
                    10
## 31
          40
                               123
                                      23
                                          13
                                                4
                                                              44
                15
                            0
                                                    4
                                                          0
                                                                    975
##
  32
          18
                10
                    10
                            0
                                90
                                      53
                                          15
                                               15
                                                    9
                                                          0
                                                              92
                                                                   1485
## 33
          15
                 2
                      6
                           0
                                54
                                      14
                                            5
                                                3
                                                   0
                                                          0
                                                              22
                                                                    595
## 34
          NA
                NA
                    NA
                          NA
                                NA
                                      NA NA
                                               NA NA
                                                        NA
                                                              NA
                                                                     NA
```

```
# Function to detect outliers using IQR method
outliers iqr <- function(df) {
  df %>%
    summarise(across(where(is.numeric), ~{
      Q1 <- quantile(., 0.25, na.rm = TRUE)
      Q3 <- quantile(., 0.75, na.rm = TRUE)
      IQR <- Q3 - Q1
      lower bound <- Q1 - 1.5 * IQR
      upper_bound <- Q3 + 1.5 * IQR
      sum(. < lower_bound | . > upper_bound, na.rm = TRUE)
    }, .names = "IQR_{.col}"))
}
# Function to detect outliers using Z-Score method
outliers zscore <- function(df, threshold = 3) {
  df %>%
    summarise(across(where(is.numeric), ~{
      z scores <- scale(.)</pre>
      sum(abs(z scores) > threshold, na.rm = TRUE)
    }, .names = "ZScore_{.col}"))
}
# Detecting outliers
iqr_outliers_summary <- outliers_iqr(data)</pre>
```

```
zscore_outliers_summary <- outliers_zscore(data)
# Print
print(iqr_outliers_summary)
##
     IQR X1831 IQR X264 IQR X70 IQR X45 IQR X0 IQR X2210 IQR X950 IQR X119 IQR X25 IQR X7 IQR X0.1
## 1
                      3
                              3
                                       3
                                                        4
                                                                           3
                                              0
                                                                  4
                                                                                   3
                                                                                           2
##
     IQR_X1101 IQR_X435 IQR_X45.1 IQR_X7.1 IQR_X4 IQR_X0.2 IQR_X491 IQR_X469 IQR_X91 IQR_X11 IQR_X6
## 1
                      3
                                          2
                                                 1
                                                          0
                                                                    2
                                                                             5
                                                                                     5
             3
                                 3
     IQR_X0.3 IQR_X577 IQR_X4379
            0
                     5
## 1
print(zscore_outliers_summary)
##
     ZScore_X1831 ZScore_X264 ZScore_X70 ZScore_X45 ZScore_X0 ZScore_X2210 ZScore_X950 ZScore_X119
## 1
                2
                             1
                                                   0
                                                              0
                                        1
                                                                           1
                                                                                        1
##
     ZScore_X25 ZScore_X7 ZScore_X0.1 ZScore_X1101 ZScore_X435 ZScore_X45.1 ZScore_X7.1 ZScore_X4
## 1
                                                  1
     ZScore_X0.2 ZScore_X491 ZScore_X469 ZScore_X91 ZScore_X11 ZScore_X6 ZScore_X0.3 ZScore_X577
##
## 1
                                                   1
               0
                            1
                                        1
                                                               1
                                                                         1
                                                                                     0
                                                                                                  1
##
     ZScore_X4379
## 1
```



```
library(shiny)
library(bslib)
library(ggplot2)
library(plotly)
library(dplyr)
library(readxl)
data = read.table(file.choose(), sep=",", header = T)
data2 = read.table(file.choose(), sep=",", header = T)
data3 = read.table(file.choose(), sep=",", header = T)
data4 = read.table(file.choose(), sep=",", header = T)
dataPartisipasi = read_excel(file.choose())
education_2022 = read.table(file.choose(), sep=",", header = T)
poverty_2022 = read.table(file.choose(), sep=",", header = T)
education 2022 <- na.omit(education 2022)
poverty_2022 <- na.omit(poverty_2022)</pre>
education 2022$Provinsi <- tolower(education 2022$Provinsi)
poverty 2022$Provinsi <- tolower(poverty 2022$Provinsi)
```

```
education_2022$Provinsi[education_2022$Provinsi == "kep. bangka belitung"] <- "kepulauan bangka belitun
education 2022$Provinsi[education 2022$Provinsi == "kep. riau"] <- "kepulauan riau"
education 2022$Provinsi[education 2022$Provinsi == "di yogyakarta"] <- "di. yogyakarta"
final <- merge(poverty_2022,education_2022, by.x= "Provinsi")
library_data <- read.table(file.choose(), sep=",", header = T)</pre>
library_data <- library_data %>%
  select(Province = `Provinsi`, Total_perpustakaan_per_provinsi = `Total.perpustakaan.per.provinsi`) %>
  filter(!is.na(Total_perpustakaan_per_provinsi))
  mutate(
    Province = gsub("Prov. ", "", Province),
   Total perpustakaan per provinsi = as.numeric(Total perpustakaan per provinsi)
  )
ui <- navbarPage(
  title = "Quality of Education in Indonesia in 2022",
  theme = bs_theme(bootswatch = "morph"),
  navbarMenu
   title = "Plots".
   tabPanel(
      title = "Distribution of Teachers in Indonesia in 2022",
      fluidPage(
        fluidRow(
          titlePanel("Distribution of Teachers in Indonesia in 2022"),
          column(
            width = 6,
            selectInput(
              inputId = "x",
              label = "Choice of Option:",
              choices = unique(data$Provinsi),
              selected = "Aceh"
            )
          )
        ),
        fluidRow(
          column(
            width = 12,
            plotlyOutput(outputId = "barplot")
          )
       )
     )
   ),
   tabPanel(
      title = "School Participation Rates in Indonesia from 2002 to 2022",
      fluidPage(
        fluidRow(
          titlePanel("School Participation Rates in Indonesia from 2002 to 2022")
        ),
        fluidRow(
          column(
```

```
width = 12,
            plotlyOutput(outputId = "lineplot")
          )
       )
     )
    ),
    tabPanel(
      title = "Relationship Between Educational Attainment and Poverty in Indonesia in 2022",
      fluidPage(
        fluidRow(
          titlePanel("Relationship Between Educational Attainment and Poverty in Indonesia in 2022"),
        ),
        fluidRow(
          column(
            width = 12.
            plotlyOutput(outputId = "scatter")
          )
       )
     )
    ),
    tabPanel(
      title = "Distribution of Libraries in Indonesia for the Academic Year 2022/2023",
      fluidPage(
        fluidRow(
          titlePanel("Distribution of Libraries in Indonesia for the Academic Year 2022/2023"),
          column(
            width = 6,
            selectInput(
              inputId = "library choice",
              label = "Choose an Option:",
              choices = c("5 Highest", "5 Lowest"),
              selected = "5 Highest"
            )
          )
        ),
        fluidRow(
          column(
            width = 12,
            plotlyOutput(outputId = "library_plot")
          )
       )
     )
    )
 )
server <- function(input, output) {</pre>
 output$barplot <- renderPlotly({</pre>
    plot_ly(
      data = subset(data, Provinsi %in% input$x),
```

```
y = data[data$Provinsi %in% input$x, "Jumlah.Guru.SD..Negeri.Swasta."],
    x = subset(data, Provinsi %in% input$x)$Provinsi,
    type = "bar",
    color = "blue",
    name = "Total SD Teachers"
  ) %>%
    add_bars(
      data = subset(data2, Provinsi %in% input$x),
      x = subset(data2, Provinsi %in% input$x)$Provinsi,
      y = data2[data2$Provinsi %in% input$x, "Jumlah.Guru.SMP..Negeri.Swasta."],
     color = "orange",
     name = "Total SMP Teachers"
    ) %>%
    add bars(
      data = subset(data3, Provinsi %in% input$x),
      x = subset(data3, Provinsi %in% input$x)$Provinsi,
      y = data3[data3$Provinsi %in% input$x, "Jumlah.Guru.SMA..Negeri.Swasta."],
      color = "red",
      name = "Total SMA Teachers"
    ) %>%
    add bars(
      data = subset(data4, Provinsi %in% input$x),
      x = subset(data4, Provinsi %in% input$x)$Provinsi,
      y = data4[data4$Provinsi %in% input$x, "Jumlah.Guru.SMK..Negeri.Swasta."],
      color = "green",
      name = "Total SMK Teachers"
    )
})
output$lineplot <- renderPlotly({
 plot_ly(
    data = dataPartisipasi,
    x = ~dataPartisipasi$Tahun,
    y = ~dataPartisipasi$`7-12`,
    type = 'scatter',
    mode = 'lines',
    name = '7-12'
 ) %>%
    add_trace(
     y = "dataPartisipasi$\`13-15\`,
     name = '13-15',
     mode = 'lines'
    ) %>%
    add trace(
     y = ~dataPartisipasi$\`16-18\`,
     name = '16-18',
     mode = 'lines'
    ) %>%
    add trace
     y = "dataPartisipasi$`19-24`,
      name = '19-24',
     mode = 'lines'
    ) %>%
```

```
layout(
        title = "Participation by Age Group",
        xaxis = list(title = "Year"),
        yaxis = list(title = "Participation Percentage")
      )
  })
 output$scatter <- renderPlotly({
  Im_model <- Im(Rata.rata.kemiskinan.tahun.2022 ~ Rata.rata.penyelesaian.pendidikan.tahun.2022, data =
  final$trendline <- predict(Im_model)
  cor_test <- cor.test(final$Rata.rata.penyelesaian.pendidikan.tahun.2022, final$Rata.rata.kemiskinan.t
  cor_value <- round(cor_test$estimate, 2)</pre>
  p_value <- format.pval(cor_test$p.value, digits = 3)</pre>
  plot_ly(
    data = final,
    x = "Rata.rata.penyelesaian.pendidikan.tahun.2022,
    y = "Rata.rata.kemiskinan.tahun.2022,
    type = 'scatter',
    mode = 'markers',
    text = ~Provinsi,
    name = 'Correlation',
    marker = list(size = 10)
 ) %>%
    add lines
      x = "Rata.rata.penyelesaian.pendidikan.tahun.2022,
      y = "trendline,
      line = list(color = 'darkorange'),
      name = 'Trendline'
    ) %>%
    layout(
      title = paste("Relationship Between Educational Attainment and Poverty in Indonesia in 2022",
                    "<br/>correlation: ", cor_value, ", p-value: ", p_value),
      xaxis = list(title = "Average Educational Attainment (2022)"),
      yaxis = list(title = "Average Poverty Rate (2022)")
    )
})
 output$library_plot <- renderPlotly({</pre>
   library_data_sorted <- library_data %>%
     arrange(desc(Total perpustakaan per provinsi))
   top5_highest <- library_data_sorted %>%
     head(5)
   top5_lowest <- library_data_sorted %>%
   selected_data <- if(input$library_choice == "5 Highest"){</pre>
     top5 highest
  }else {
     top5_lowest
```

```
plot_ly(
     data = selected data,
     x = "Province,
     y = "Total_perpustakaan_per_provinsi,
     type = 'bar',
     color = "Province,
     text = "Total perpustakaan per provinsi
   ) %>%
     layout(
       title = paste(input$library_choice, "Distribution of Libraries in Indonesia for the Academic Yea
       xaxis = list(title = "Province"),
       yaxis = list(title = "Total Libraries")
     )
 })
}
shinyApp(ui = ui, server = server)
```

Data Preparation

The app starts by loading several datasets using the read.table and read_excel functions. These datasets include information about the distribution of teachers and libraries, school participation rates, educational attainment, and poverty rates in various provinces of Indonesia. Data cleaning steps are performed, such as removing missing values with na.omit, converting province names to lowercase for consistency, and merging the education and poverty datasets on the province column.

Data Transformation

For the library data, the app selects and filters relevant columns, removes any "Prov." prefixes from province names, and abbreviates "Kepulauan" to "Kep." using the gsub function. The numeric values for the total number of libraries are also converted to ensure proper plotting.

User Interface

The UI is created using navbarPage from the Shiny library, with a bootswatch theme applied using bs_theme. The UI is divided into multiple tabs, each corresponding to a different plot:

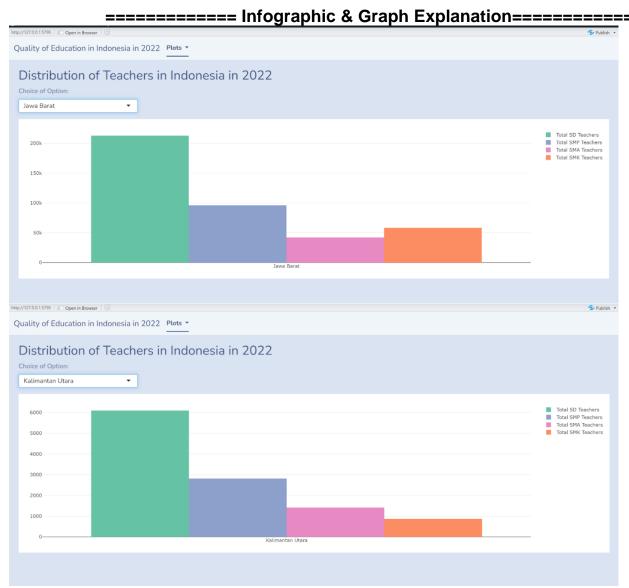
- Distribution of Teachers: Users can select a province to view the distribution of teachers at various school levels (SD, SMP, SMA, SMK) using a bar plot.
- School Participation Rates: A line plot shows school participation rates for different age groups over the years 2002 to 2022.
- Educational Attainment and Poverty: A scatter plot displays the relationship between educational attainment and poverty rates, with a trendline and correlation information.
- Distribution of Libraries: Users can choose to see the top 5 provinces with the highest or lowest number of libraries in a bar plot.

Server Logic

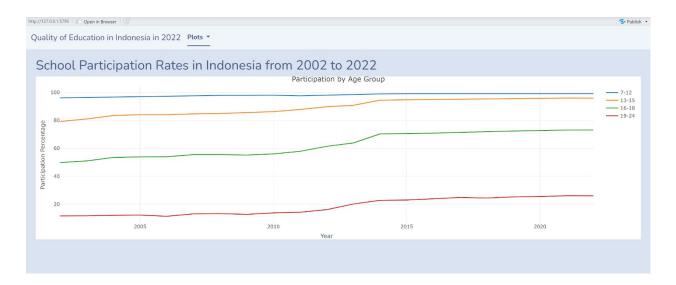
The server logic handles the rendering of the plots based on user inputs:

• Bar Plot for Teachers: Uses plot_ly to create bar plots showing the number of teachers at different school levels. The plot updates based on the selected province.

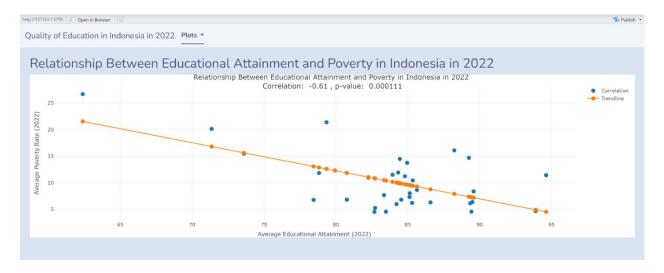
- Line Plot for Participation Rates: Plots participation rates for various age groups over time using plot_ly.
- Scatter Plot for Educational Attainment and Poverty: A scatter plot with a trendline is created using plot_ly, showing the relationship between educational attainment and poverty rates. The correlation coefficient and p-value are displayed in the plot title.
- Bar Plot for Libraries: Based on the user's choice of top 5 highest or lowest, the app sorts the data and creates a bar plot using plot_ly.



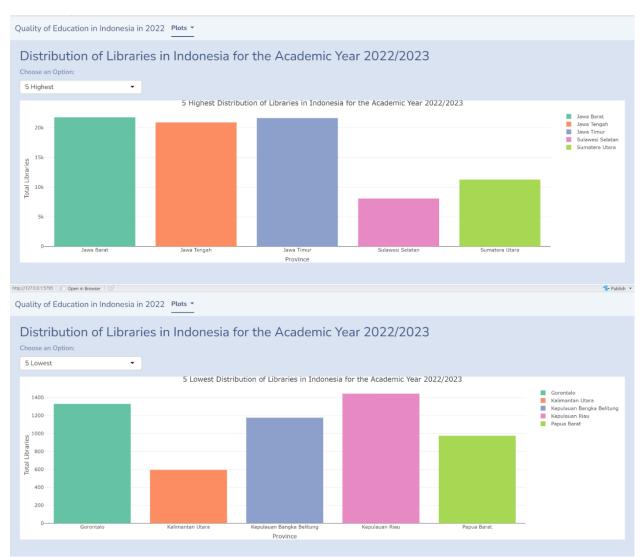
The first graph discusses the distribution of teachers in each province of Indonesia in 2022. We use a bar chart to make it easier to see the distribution of teachers. Based on this graph, we find that the highest teacher distribution is in West Java province, and the lowest teacher distribution is in North Kalimantan province.



The second graph explains the growth in the percentage of school participation, showing the number of people still in school from 2002 to 2022. We use a line chart to make it easier to see the growth percentage. Based on this graph, we find that there is an increase in the percentage of people still in school, both male and female, across all age ranges from 7 to 24 years. This proves that there is growing awareness among the community about the importance of education.



The third graph discusses the relationship between educational attainment and poverty in Indonesia in 2022. We use a scatter plot to determine whether there is a relationship between educational attainment and poverty. Through this graph, we get a p-value of 0.000111. This value is smaller than the alpha value of 0.05, indicating that there is a correlation between poverty and the quality of education received.



The fourth graph discusses the distribution of libraries in Indonesia for the academic year 2022/2023. We use a bar chart to make it easier to see the distribution of libraries. Based on this graph, we can see the five regions with the most library distribution and the five regions with the least library distribution. From these two graphs, we find that West Java has the highest distribution of libraries with 21,762 libraries, and North Kalimantan has the lowest distribution of libraries with 595 libraries.

Based on the analysis of the four presented graphics, it is evident that education plays a crucial role in driving Indonesia's social and economic progress. The significant increase in the percentage of school participation across various age ranges highlights the advancements in the educational sector and the growing awareness of the importance of education among the population.

However, Indonesia still faces challenges in achieving equitable distribution of educational resources. The disparity in the distribution of teachers and libraries, particularly between regions like West Java and North Kalimantan, indicates a need for more focused efforts to ensure educational equity across the nation. Moreover, the correlation between education levels and poverty underscores the critical need to address educational disparities to alleviate poverty and promote inclusive growth.

In conclusion, while Indonesia has made noteworthy strides in improving educational access and quality, continued efforts are essential to address regional inequalities and ensure that all citizens, regardless of their location, have access to quality education. Achieving this will be instrumental in

fulfilling the targets of SDG 4 and fostering a more equitable and prosperous future for Indonesia. Thank you for joining us in this exploration of the educational landscape in Indonesia. We appreciate your attention and support. With that, we bid you farewell.

Source

1. Distribution of Teachers in Indonesia in 2022

https://www.bps.go.id/id/statistics-

table/3/VWtKTmFFbDZaSFJWWVhOYU16WmhaRzlCYlM5Wlp6MDkjMw==/jumlah-sekolah--guru--dan-murid-sekolah-dasar--sd--di-bawah-kementerian-pendidikan-dan-kebudayaan-menurut-provinsi--2017-2018.html

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<u>table/3/YTFsRmNubEhOWE5ZTUZsdWVHOHhMMFpPWm5VMFp6MDkjMw==/jumlah-sekolah--guru-dan-murid-sekolah-menengah-atas--sma--di-bawah-kementerian-pendidikan-dan-kebudayaan-menurut-provinsi--2016-2017.html</u>

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- 2. School Participation Rates in Indonesia from 2002 to 2022 https://www.bps.go.id/id/statistics-table/1/MTUzMyMx/persentase-penduduk-usia-7-24-tahun-menurut-jenis-kelamin-kelompok-umur-dan-partisipasi-sekolah-2002-2023.html
- 3. Relationship Between Educational Attainment and Poverty in Indonesia in 2022 https://www.bps.go.id/id/statistics-table/2/MTk4MCMy/tingkat-penyelesaian-pendidikan-menurut-jenjang-pendidikan-dan-provinsi.html

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4. Distribution of Libraries in Indonesia for the Academic Year 2022/2023 https://data.kemdikbud.go.id/dataset/detail/33/L0-000000/2022/SD-1#filter-section