B518 | Week 4 | Group Project | Submission 1

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2025-09-30

- 1 Project Idea One Covid 19 (2021 ONLY USA, UK, China, Belgium)
- 1.1 1) Original Source: URL: https://docs.owid.io/projects/covid/en/latest/dataset.html
- 1.2 2) Dataset moved: https://catalog.ourworldindata.org/garden/covid/latest/compact/compact.csv
- 1.2.1 Selection Criteria:
- 1.2.1.1 The data (see above) does meet the criteria of the assignment. In that it is relevant to health, publically accessible, sizable (61 columns and 530,292 rows), includes both categorical (e.g. country) and continuous variables (e.g. new_cases_per_million, total_deaths_per_million) and finally has been ethically sourced and de-identified.

```
## [1] "https://docs.owid.io/projects/covid/en/latest/dataset.html"
```

```
## n_rows n_cols
## 530292
##
   [1] "country"
                                          "date"
   [3] "total cases"
                                          "new cases"
##
## [5] "new_cases_smoothed"
                                          "total_cases_per_million"
## [7] "new_cases_per_million"
                                          "new_cases_smoothed_per_million"
## [9] "total_deaths"
                                          "new_deaths"
## [11] "new_deaths_smoothed"
                                          "total_deaths_per_million"
## [1] "Ukraine"
                                       "United Arab Emirates"
## [3] "United Kingdom"
                                       "United States"
## [5] "United States Virgin Islands"
```

1.3 2) Introduction (4-6 Sentences)

This project uses Covid 19 data from 'Our world in data'. We use this to primarily compare how daily new cases per million varied across four countries in 2021. We focus on 2021 to keep our comparisons on a common phase of the pandemic. The dataset itself does cover many more countries and years and also includes data on total cases and total deaths. We used the fields that have the suffix 'per_million'as any comparisons scale by population size.

1.4 3) Why this dataset? (1 paragraph)

This dataset is highly relevant to health outcomes. The dataset is also very well documented, large (61 columns and 530k rows). For analysis potential, this dataset has both continuous fields (total_deaths_per_million, new_cases_per_million) and categorical (e.g. Country), feasible for tables, histograms, boxplots, time trends. Using the fields with the suffix "per_million" allows better scaling for cross country comparisons and summaries.

1.5 4) Variables and structure

\$ excess mortality cumulative

```
## n rows n cols
## 530292
   [1] "country"
                                  "date"
## [3] "total_cases"
                                  "new_cases"
## [5] "new_cases_smoothed"
                                  "total_cases_per_million"
##
## character
               integer
                         logical
                                    numeric
##
           4
                    10
                                1
                                         46
                    530292 obs. of 61 variables:
  'data.frame':
                                                         "Afghanistan" "Afghanistan" "Afghanista
##
    $ country
                                                  : chr
                                                         "2020-01-01" "2020-01-02" "2020-01-03"
##
   $ date
                                                  : chr
   $ total cases
                                                        NA NA NA O O O O O O . . .
##
                                                  : int
##
    $ new_cases
                                                         NA NA NA O O O O O O . . .
    $ new_cases_smoothed
                                                        NA NA NA NA NA NA NA O O ...
                                                  : num
##
    $ total_cases_per_million
                                                  : num
                                                        NA NA NA O O O O O O . . .
    $ new_cases_per_million
                                                        NA NA NA O O O O O O . . .
##
                                                  : num
                                                        NA NA NA NA NA NA NA O O ...
##
    $ new_cases_smoothed_per_million
                                                  : num
##
   $ total_deaths
                                                        NA NA NA O O O O O O . . .
                                                   int
   $ new_deaths
##
                                                        NA NA NA O O O O O O O . . .
                                                  : int
    $ new_deaths_smoothed
                                                         NA NA NA NA NA NA NA O O ...
##
                                                  : num
   $ total_deaths_per_million
                                                  : num
                                                         NA NA NA O O O O O O . . .
   $ new_deaths_per_million
                                                        NA NA NA O O O O O O . . .
                                                  : num
##
    $ new_deaths_smoothed_per_million
                                                        NA NA NA NA NA NA NA O O ...
                                                  : num
    $ excess_mortality
                                                        NA NA NA NA NA NA NA NA NA ...
##
                                                  : num
```

: num

NA NA NA NA NA NA NA NA NA ...

```
$ excess_mortality_cumulative_absolute
                                                          NA NA NA NA NA NA NA NA NA ...
                                                   : num
## $ excess_mortality_cumulative_per_million
                                                   : num
                                                          NA NA NA NA NA NA NA NA NA ...
## $ hosp_patients
                                                          NA NA NA NA NA NA NA NA NA ...
                                                   : int
##
    $ hosp_patients_per_million
                                                          NA NA NA NA NA NA NA NA NA ...
                                                   : num
##
     [list output truncated]
##
                         date total_cases new_cases new_cases_smoothed
          country
## 1
      Afghanistan 2020-01-01
                                        NA
                                                   NA
                                                                       NA
## 2
      Afghanistan 2020-01-02
                                        NA
                                                   NA
                                                                       NA
## 3
      Afghanistan 2020-01-03
                                        NA
                                                   NA
                                                                       NA
                                         0
                                                    0
## 4
     Afghanistan 2020-01-04
                                                                       NA
## 5
                                         0
                                                    0
      Afghanistan 2020-01-05
                                                                       NA
## 6 Afghanistan 2020-01-06
                                         0
                                                    0
                                                                       NA
## 7
      Afghanistan 2020-01-07
                                         0
                                                    0
                                                                       NA
## 8
     Afghanistan 2020-01-08
                                         0
                                                    0
                                                                       NA
                                         0
                                                    0
                                                                        0
## 9
      Afghanistan 2020-01-09
## 10 Afghanistan 2020-01-10
                                         0
                                                    0
                                                                        0
##
      total_cases_per_million new_cases_per_million new_cases_smoothed_per_million
## 1
                                                    NA
                            NA
## 2
                            NA
                                                    NA
                                                                                     NA
## 3
                             NA
                                                    NA
                                                                                     NA
## 4
                              0
                                                     0
                                                                                     NA
## 5
                              0
                                                     0
                                                                                     NA
## 6
                              0
                                                     0
                                                                                     NA
## 7
                              0
                                                     0
                                                                                     NA
## 8
                              0
                                                     0
                                                                                     NA
                              0
                                                     0
## 9
                                                                                      0
                              0
                                                     0
## 10
                                                                                      0
##
      total_deaths new_deaths new_deaths_smoothed total_deaths_per_million
## 1
                 NA
                            NA
                                                  NA
## 2
                                                                            NΑ
                 NΑ
                             NΑ
                                                  NΑ
## 3
                 NA
                            NA
                                                  NA
                                                                            NA
## 4
                  0
                              0
                                                  NA
                                                                              0
## 5
                  0
                              0
                                                  NA
                                                                              0
## 6
                              0
                                                                              0
                  0
                                                  NA
## 7
                  0
                              0
                                                  NA
                                                                              0
                  0
                              0
## 8
                                                  NA
                                                                              0
## 9
                  0
                              0
                                                   0
                                                                              0
                  0
                              0
                                                   0
## 10
##
      new_deaths_per_million new_deaths_smoothed_per_million excess_mortality
## 1
                           NA
                                                              NA
                                                                                NA
## 2
                           NA
                                                                                NA
                                                              NA
## 3
                           NA
                                                              NA
                                                                                NA
                            0
## 4
                                                              NA
                                                                                NA
## 5
                            0
                                                              NA
                                                                                NA
## 6
                            0
                                                              NA
                                                                                NA
## 7
                             0
                                                              NA
                                                                                NA
## 8
                             0
                                                              NA
                                                                                NA
```

```
## 9
                             0
                                                                0
                                                                                  NA
## 10
                             0
                                                                0
                                                                                 NA
##
      excess_mortality_cumulative excess_mortality_cumulative_absolute
## 1
                                 NA
                                                                          NA
## 2
                                 NA
                                                                          NA
## 3
                                 NA
                                                                          NA
## 4
                                 NA
                                                                          NA
## 5
                                 NA
                                                                          NA
## 6
                                 NA
                                                                          NA
## 7
                                 NA
                                                                          NΑ
## 8
                                                                          NA
                                 NA
## 9
                                 NA
                                                                          NA
## 10
                                 NA
                                                                          NA
##
      excess_mortality_cumulative_per_million hosp_patients
## 1
                                               NA
## 2
                                               NA
                                                              NA
## 3
                                               NA
                                                              NA
## 4
                                               NA
                                                              NA
## 5
                                               NA
                                                              NA
## 6
                                               NA
                                                              NA
## 7
                                               NA
                                                              NA
## 8
                                               NA
                                                              NA
## 9
                                               NA
                                                              NA
## 10
                                                              NA
##
      hosp_patients_per_million weekly_hosp_admissions
## 1
                               NA
                                                        NA
## 2
                               NA
                                                        NA
## 3
                               NA
                                                        NA
## 4
                               NA
                                                        NA
## 5
                               NA
                                                        NA
## 6
                               NA
                                                        NA
## 7
                               NA
                                                        NA
## 8
                               NA
                                                        NA
## 9
                               NA
                                                        NA
## 10
                               NA
                                                        NA
##
      weekly_hosp_admissions_per_million icu_patients icu_patients_per_million
## 1
                                         NA
                                                       NA
                                                                                  NA
## 2
                                         NA
                                                       NA
                                                                                  NA
## 3
                                         NA
                                                       NA
                                                                                  NA
## 4
                                         NΑ
                                                       NΑ
                                                                                  NΑ
## 5
                                         NA
                                                       NA
                                                                                  NA
## 6
                                         NA
                                                       ΝA
                                                                                  NA
## 7
                                         NA
                                                       ΝA
                                                                                  NA
## 8
                                         NA
                                                       NA
                                                                                  NA
## 9
                                         NA
                                                       ΝA
                                                                                   NA
## 10
                                         NA
                                                       NA
##
      weekly_icu_admissions weekly_icu_admissions_per_million stringency_index
## 1
                           NA
                                                                NA
                                                                                    0
```

```
## 2
                           NA
                                                                 NA
                                                                                      0
## 3
                           NA
                                                                 NA
                                                                                      0
## 4
                                                                                      0
                           NA
                                                                 NA
## 5
                           NA
                                                                 NA
                                                                                      0
## 6
                           NA
                                                                 NA
                                                                                      0
## 7
                           NA
                                                                 NA
                                                                                      0
## 8
                                                                                      0
                           NA
                                                                 NA
## 9
                                                                                      0
                           NA
                                                                 NA
## 10
                           NA
                                                                                      0
##
      reproduction_rate total_tests new_tests total_tests_per_thousand
## 1
                       NA
                                     NA
                                                NA
                                                                            ΝA
## 2
                       NA
                                     NA
                                                NA
                                                                            NA
## 3
                                     NA
                                                NA
                       NA
                                                                            NA
## 4
                       NA
                                     NA
                                                NA
                                                                            NA
## 5
                       NA
                                     NA
                                                NA
                                                                            NA
## 6
                       NA
                                     NA
                                                NA
                                                                            NA
## 7
                       NA
                                     NA
                                                NA
                                                                            NA
## 8
                                                                            NA
                       NA
                                     NA
                                                NA
## 9
                       NA
                                     NA
                                                NA
                                                                            NA
## 10
                       NA
                                    NA
                                                NA
                                                                            NA
##
      new_tests_per_thousand new_tests_smoothed new_tests_smoothed_per_thousand
## 1
## 2
                             NA
                                                  NA
                                                                                      NA
## 3
                             NA
                                                  NA
                                                                                      NA
## 4
                             NA
                                                  NA
                                                                                      NA
## 5
                             NA
                                                  NA
                                                                                      NA
## 6
                             NA
                                                  NA
                                                                                      NA
## 7
                             NA
                                                  NA
                                                                                      NA
## 8
                             NA
                                                  NA
                                                                                      NA
## 9
                             NA
                                                  NA
                                                                                      NΑ
## 10
                             NA
                                                  NA
                                                                                      NA
      positive_rate tests_per_case total_vaccinations people_vaccinated
##
## 1
                   NA
                                   NA
                                                         NA
                                                                             NA
## 2
                   NA
                                   NA
                                                         NA
                                                                             NA
## 3
                   NA
                                   NA
                                                        NA
                                                                             NA
## 4
                   NA
                                   NA
                                                         NA
                                                                             NA
## 5
                                   NA
                                                                             NA
                   NA
                                                         NA
## 6
                   NA
                                   NA
                                                         NA
                                                                             NA
## 7
                   NA
                                   NA
                                                         NA
                                                                             NA
## 8
                   NA
                                   NA
                                                         NA
                                                                             NA
## 9
                   NA
                                   NA
                                                         NA
                                                                             NA
## 10
                   NA
                                   NA
                                                                             NA
                                                         NA
##
      people_fully_vaccinated total_boosters new_vaccinations
## 1
                              NA
                                              NA
## 2
                              NA
                                                                  NA
                                              NA
## 3
                              NA
                                              NA
                                                                 NA
## 4
                              NA
                                              NA
                                                                 NA
## 5
                              NA
                                              NA
                                                                 NA
```

```
## 6
                             NA
                                             NA
                                                                NA
## 7
                             NA
                                             NA
                                                                NA
## 8
                             NA
                                             NA
                                                                NA
## 9
                             NA
                                             NA
                                                                NA
## 10
                             NA
                                             NA
                                                                NA
##
      new_vaccinations_smoothed total_vaccinations_per_hundred
## 1
                               NA
## 2
                               NA
                                                                 NA
## 3
                               NA
                                                                 NA
## 4
                               NA
                                                                 NA
## 5
                               NA
                                                                 NA
## 6
                               NA
                                                                 NA
## 7
                               NA
                                                                 NA
## 8
                               NA
                                                                 NA
## 9
                               NA
                                                                 NA
## 10
                               NA
                                                                 NA
##
      people_vaccinated_per_hundred people_fully_vaccinated_per_hundred
## 1
                                    NA
                                                                           NA
## 2
                                   NA
                                                                           NA
## 3
                                    NA
                                                                           NA
## 4
                                    NA
                                                                           NA
## 5
                                    NA
                                                                           NA
## 6
                                    NA
                                                                           NA
## 7
                                    NA
                                                                           NA
## 8
                                   NA
                                                                           NA
## 9
                                    NA
                                                                           NA
## 10
                                    NA
                                                                           NA
##
      total_boosters_per_hundred new_vaccinations_smoothed_per_million
## 1
                                NA
                                                                          NΑ
## 2
                                NA
                                                                          NA
## 3
                                NA
                                                                          NA
## 4
                                NA
                                                                          NA
## 5
                                NA
                                                                          NA
## 6
                                NA
                                                                          NA
## 7
                                NA
                                                                          NA
                                                                          NA
## 8
                                NA
## 9
                                NA
                                                                          NA
## 10
                                NA
##
      new_people_vaccinated_smoothed new_people_vaccinated_smoothed_per_hundred
## 1
                                     NA
                                                                                    NA
## 2
                                    NA
                                                                                    NA
## 3
                                    NA
                                                                                    NA
## 4
                                    NA
                                                                                    NA
## 5
                                     NA
                                                                                    NA
## 6
                                     NA
                                                                                    NA
## 7
                                     NA
                                                                                    NA
## 8
                                    NA
                                                                                    NA
## 9
                                    NA
                                                                                    NA
```

```
## 10
                                    NA
                                                                                   NA
##
      code continent population population_density median_age life_expectancy
## 1
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 2
       AFG
                 Asia
                                                           16.752
                                                                            65.617
                        40578847
                                             62.21555
## 3
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 4
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 5
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
                                                           16.752
## 6
       AFG
                 Asia
                        40578847
                                             62.21555
                                                                            65.617
## 7
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 8
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 9
       AFG
                 Asia
                        40578847
                                             62.21555
                                                           16.752
                                                                            65.617
## 10
       AFG
                                                           16.752
                 Asia
                        40578847
                                             62.21555
                                                                            65.617
##
      gdp_per_capita extreme_poverty diabetes_prevalence handwashing_facilities
## 1
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 2
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 3
                                    NA
                                                        10.9
                                                                            48.21469
             1516.273
## 4
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
             1516.273
## 5
                                    NA
                                                        10.9
                                                                            48.21469
## 6
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 7
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 8
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 9
             1516.273
                                    NA
                                                        10.9
                                                                            48.21469
## 10
             1516.273
                                    NA
                                                                            48.21469
##
      hospital_beds_per_thousand human_development_index
## 1
                              0.39
                                                          NA
## 2
                              0.39
                                                          NA
## 3
                              0.39
                                                          NA
## 4
                              0.39
                                                          NA
## 5
                              0.39
                                                          NA
## 6
                              0.39
                                                          NA
## 7
                              0.39
                                                          NA
## 8
                              0.39
                                                          NA
## 9
                              0.39
                                                          NA
## 10
                              0.39
                                                          NA
##
      country
                             date
                                              total_cases
                                                                     new_cases
    Length: 530292
                        Length:530292
                                             Min.
                                                                   Min.
                                                                                  0
##
                                                              0
    Class : character
                        Class : character
                                                           9106
                                                                   1st Qu.:
##
                                             1st Qu.:
                                                                                  0
##
    Mode :character
                        Mode :character
                                             Median:
                                                          84204
                                                                   Median:
                                                                                  0
##
                                                     : 14120121
                                                                             10590
                                             Mean
                                                                   Mean
##
                                             3rd Qu.:
                                                        1067030
                                                                   3rd Qu.:
                                                                                 64
##
                                                                          :8401906
                                             Max.
                                                     :778523540
                                                                   Max.
##
                                             NA's
                                                     :13866
                                                                   NA's
                                                                          :17148
    new_cases_smoothed total_cases_per_million new_cases_per_million
## Min.
                   0.0
                         Min.
                                       0
                                                   Min.
                                                           :0.000e+00
    1st Qu.:
##
                   0.0
                         1st Qu.: 2988
                                                   1st Qu.:0.000e+00
##
    Median:
                   4.7
                         Median : 46164
                                                   Median :0.000e+00
              10615.0
                                 :129928
##
    Mean
                         Mean
                                                   Mean
                                                           :9.928e+01
```

```
3rd Qu.:
               198.4
                      3rd Qu.:192015
                                             3rd Qu.:7.427e+00
##
  Max.
##
          :6402033.0
                      Max. :769807
                                             Max. :2.308e+05
                      NA's
##
   NA's
          :18353
                             :13866
                                             NA's
                                                    :17148
##
   new_cases_smoothed_per_million total_deaths
                                                    new_deaths
               0.000
                                 Min.
                                                  Min. :
##
   Min.
                                      :
                                              0
                                                             0.0
   1st Qu.:
               0.000
                                 1st Qu.:
                                             68
                                                  1st Qu.:
                                                             0.0
##
##
   Median:
              0.872
                                 Median:
                                           1020
                                                  Median :
                                                             0.0
   Mean
##
              99.514
                                 Mean
                                        : 154260
                                                  Mean
                                                         : 101.2
   3rd Qu.:
              32.357
                                 3rd Qu.: 12283
                                                  3rd Qu.:
                                       :7100783
                                                  Max. :57167.0
   Max. :37463.746
##
                                 Max.
##
   NA's :18353
                                 NA's
                                        :13866
                                                  NA's
                                                         :16277
##
   new_deaths_smoothed total_deaths_per_million new_deaths_per_million
              0.000
                      Min. :
                                 0.00
                                              Min. : 0.0000
##
##
   1st Qu.:
               0.000
                      1st Qu.: 40.66
                                              1st Qu.: 0.0000
   Median :
              0.000
                      Median: 390.36
                                              Median: 0.0000
##
   Mean : 101.435
                      Mean : 921.58
                                              Mean : 0.6188
##
   3rd Qu.:
             1.857
                      3rd Qu.:1440.10
                                              3rd Qu.: 0.0000
                             :6603.65
                                              Max.
## Max.
          :14820.714
                      Max.
                                                    :608.6427
##
   NA's
          :17489
                      NA's
                             :13866
                                              NA's
                                                     :16277
## new deaths smoothed per million excess mortality excess mortality cumulative
          : 0.0000
                                  Min.
                                                 Min. :-44.23
## Min.
                                        :-95.92
## 1st Qu.: 0.0000
                                  1st Qu.: -1.51
                                                  1st Qu.: 2.19
## Median: 0.0000
                                  Median: 5.59
                                                  Median: 8.23
## Mean
          : 0.6203
                                  Mean : 10.87
                                                  Mean : 9.79
##
   3rd Qu.: 0.1951
                                  3rd Qu.: 15.50
                                                  3rd Qu.: 15.15
## Max.
          :129.0729
                                  Max.
                                        :378.55
                                                  Max.
                                                         : 78.08
## NA's
                                  NA's
                                                  NA's
          :17489
                                        :516619
                                                         :516619
   excess_mortality_cumulative_absolute excess_mortality_cumulative_per_million
##
                                            :-2936.4
   Min.
          : -37726.1
                                       Min.
##
##
   1st Qu.:
              185.8
                                       1st Qu.: 130.8
                                       Median: 1313.0
##
   Median :
              6558.0
##
   Mean : 55285.1
                                       Mean : 1785.7
                                       3rd Qu.: 2873.2
##
   3rd Qu.: 38780.6
## Max.
          :1349776.2
                                       Max. :10293.5
## NA's
          :516619
                                      NA's
                                             :516653
                   hosp_patients_per_million weekly_hosp_admissions
##
   hosp_patients
                              0.00
                                            Min. :
                                                        0
##
   Min. :
             0
                   Min. :
                                            1st Qu.:
##
   1st Qu.:
              186
                   1st Qu.: 31.00
                                                       223
## Median :
            776
                   Median: 74.24
                                            Median :
                                                       864
   Mean : 3912
                         : 125.99
                                            Mean : 4292
##
                   Mean
##
   3rd Qu.: 3051
                   3rd Qu.: 159.76
                                            3rd Qu.:
                                                      3893
##
   Max.
          :154497
                   Max.
                          :1526.85
                                            Max.
                                                   :153977
## NA's
          :489636
                   NA's
                          :489636
                                            NA's
                                                   :505795
  weekly_hosp_admissions_per_million icu_patients
                                                     icu_patients_per_million
          : 0.00
                                                          : 0.00
## Min.
                                     Min.
                                                0
                                                     Min.
## 1st Qu.: 23.73
                                     1st Qu.:
                                               21
                                                     1st Qu.: 2.33
## Median: 56.28
                                     Median:
                                               90
                                                     Median: 6.43
## Mean : 82.62
                                     Mean : 661
                                                     Mean : 15.66
```

```
3rd Qu.:110.00
                                       3rd Qu.: 413
                                                       3rd Qu.: 18.78
##
##
          :717.08
                                      Max.
                                             :28891
                                                       Max.
                                                              :180.68
   Max.
                                      NA's
##
   NA's
          :505795
                                              :491176
                                                       NA's
                                                               :491176
##
   weekly_icu_admissions weekly_icu_admissions_per_million stringency_index
   Min. :
              0.0
                         Min. : 0.00
                                                           Min. : 0.00
##
    1st Qu.: 17.0
                          1st Qu.: 1.55
                                                            1st Qu.: 22.22
##
##
   Median: 92.0
                         Median: 4.64
                                                           Median: 42.59
          : 317.9
                                                                 : 42.68
##
   Mean
                         Mean
                               : 9.67
                                                           Mean
   3rd Qu.: 353.0
                         3rd Qu.: 12.65
                                                           3rd Qu.: 62.04
   Max.
                         Max.
                                :224.98
##
          :4838.0
                                                           Max.
                                                                  :100.00
   NA's
                         NA's
                                :519299
                                                           NA's
##
          :519299
                                                                  :327532
##
   reproduction_rate
                     total_tests
                                           new_tests
          :-0.07
                     Min. :0.000e+00
##
   Min.
                                         Min.
                                                        1
   1st Qu.: 0.71
##
                      1st Qu.:3.647e+05
                                          1st Qu.:
                                                      2244
   Median: 0.95
                     Median :2.067e+06
##
                                         Median :
                                                     8783
   Mean
         : 0.91
                     Mean
                            :2.110e+07
                                         Mean
                                                    67285
##
   3rd Qu.: 1.14
                      3rd Qu.:1.025e+07
                                         3rd Qu.:
                                                     37229
## Max.
          : 5.87
                     Max.
                            :9.214e+09
                                         Max.
                                                 :35855632
##
   NA's
           :344609
                     NA's
                             :450905
                                         NA's
                                                 :454889
##
   total tests per thousand new tests per thousand new tests smoothed
                            Min. : 0.00
##
               0.00
                                                   Min.
   1st Qu.:
              43.59
                            1st Qu.: 0.29
##
                                                   1st Qu.:
                                                                1486
   Median: 234.14
                            Median: 0.97
                                                   Median :
                                                                6570
##
   Mean
          : 924.25
                            Mean
                                    : 3.27
                                                   Mean
                                                           : 142178
##
   3rd Qu.: 894.37
                            3rd Qu.: 2.91
                                                   3rd Qu.:
                                                              32205
##
   Max.
           :32925.82
                                    :531.06
                                                           :14769984
                            Max.
                                                   Max.
   NA's
##
           :450905
                            NA's
                                    :454889
                                                   NA's
                                                          :426327
##
   new_tests_smoothed_per_thousand positive_rate
                                                    tests_per_case
          : 0.00
   Min.
                                          : 0.00
##
                                   Min.
                                                    Min.
                                                                 0.00
##
   1st Qu.: 0.20
                                    1st Qu.: 1.61
                                                     1st Qu.:
                                                                 6.83
##
   Median: 0.85
                                    Median : 5.49
                                                    Median :
                                                                17.60
   Mean
##
          : 2.83
                                    Mean
                                          :10.42
                                                    Mean
                                                          : 1833.14
##
   3rd Qu.: 2.58
                                    3rd Qu.:14.27
                                                     3rd Qu.:
                                                                58.51
## Max.
          :147.60
                                   Max.
                                           :94.51
                                                    Max.
                                                           :789603.80
##
   NA's
          :426327
                                   NA's
                                           :428732
                                                    NA's
                                                            :429647
                                           people fully vaccinated
##
   total vaccinations
                       people vaccinated
   Min.
          :0.000e+00
                       Min. :0.000e+00
                                                  :0.000e+00
##
                                           Min.
                       1st Qu.:1.011e+06
##
   1st Qu.:1.893e+06
                                           1st Qu.:8.626e+05
## Median :1.574e+07
                       Median :6.980e+06
                                           Median :6.801e+06
   Mean
          :5.837e+08
                              :2.641e+08
                                           Mean :2.430e+08
##
                       Mean
##
   3rd Qu.:1.292e+08
                       3rd Qu.:5.497e+07
                                           3rd Qu.:5.269e+07
## Max.
          :1.372e+10
                       Max.
                              :5.645e+09
                                           Max.
                                                  :5.198e+09
## NA's
          :447070
                       NA's
                              :451281
                                           NA's
                                                  :453281
   total boosters
##
                       new vaccinations
                                          new vaccinations smoothed
## Min.
          :0.000e+00
                       Min.
                                      0
                                          Min.
                                                         0
## 1st Qu.:3.853e+05
                       1st Qu.:
                                    1784
                                          1st Qu.:
                                                        216
## Median :6.124e+06
                       Median :
                                  22056
                                          Median:
                                                       3250
## Mean :1.431e+08
                       Mean
                             : 766640
                                          Mean : 275096
```

```
3rd Qu.:
   3rd Qu.:4.441e+07
                       3rd Qu.: 196541
##
                                                     29708
          :2.841e+09
                              :49673200
## Max.
                       Max.
                                          Max.
                                                 :43691812
## NA's
          :471508
                       NA's
                              :461416
                                          NA's
                                                 :327452
   total_vaccinations_per_hundred people_vaccinated_per_hundred
##
   Min. : 0.00
##
                                  Min.
                                       : 0.00
   1st Qu.: 42.99
                                  1st Qu.: 26.79
##
##
   Median :126.98
                                  Median : 63.22
##
   Mean
          :121.55
                                  Mean
                                         : 52.67
   3rd Qu.:193.10
                                  3rd Qu.: 76.75
##
## Max.
          :415.88
                                  Max.
                                         :112.08
## NA's :447070
                                  NA's
                                         :451281
##
   people_fully_vaccinated_per_hundred total_boosters_per_hundred
         : 0.00
## Min.
                                       Min. : 0.00
   1st Qu.: 19.48
                                       1st Qu.: 2.03
##
   Median: 56.59
                                       Median: 27.94
##
## Mean
         : 47.26
                                             : 31.14
                                       Mean
##
   3rd Qu.: 73.06
                                       3rd Qu.: 53.80
                                              :140.53
## Max.
          :110.19
                                       Max.
## NA's
          :453281
                                       NA's
                                              :471508
## new vaccinations smoothed per million new people vaccinated smoothed
## Min.
                0.00
                                         Min.
                                                :0.000e+00
   1st Qu.:
               97.04
                                         1st Qu.:1.940e+01
##
## Median :
              513.02
                                         Median :5.660e+02
                                                :1.001e+05
## Mean
          : 1728.33
                                         Mean
## 3rd Qu.: 2160.33
                                         3rd Qu.:8.047e+03
## Max.
          :117342.85
                                         Max.
                                                :2.107e+07
## NA's
                                         NA's
                                                :327452
          :327452
##
  new_people_vaccinated_smoothed_per_hundred
                                                  code
          : 0.00
## Min.
                                              Length: 530292
##
  1st Qu.: 0.00
                                              Class : character
## Median: 0.01
                                              Mode :character
## Mean
         : 0.07
##
   3rd Qu.: 0.06
## Max.
          :11.73
## NA's
          :327452
                                          population_density
##
    continent
                        population
                                                                median age
  Length: 530292
                      Min. :5.130e+02
                                          Min. :1.365e-01
                                                             Min.
                                                                    :14.30
   Class : character
                      1st Qu.:4.554e+05
                                          1st Qu.:3.627e+01
                                                             1st Qu.:22.24
   Mode :character
                      Median :6.035e+06 Median :9.208e+01 Median :31.68
##
                      Mean
                            :1.315e+08
                                          Mean
                                                :3.805e+02
                                                             Mean
                                                                    :31.18
##
                      3rd Qu.:2.972e+07
                                          3rd Qu.:2.375e+02
                                                             3rd Qu.:39.08
##
                             :8.021e+09
                                                 :2.134e+04
                      Max.
                                          Max.
                                                             Max.
                                                                     :59.88
##
                      NA's
                             :17098
                                          NA's
                                                 :25401
                                                              NA's
                                                                     :23320
## life_expectancy gdp_per_capita
                                      extreme_poverty diabetes_prevalence
## Min.
          :18.82
                   Min.
                              708.2
                                      Min.
                                             : 0.000
                                                       Min.
                                                              : 1.100
## 1st Qu.:68.75
                   1st Qu.: 5155.6
                                      1st Qu.: 0.498
                                                       1st Qu.: 5.600
## Median :74.70
                   Median : 14740.0
                                      Median : 2.817
                                                       Median: 7.400
##
   Mean
          :73.45
                   Mean
                          : 22520.6
                                      Mean
                                           :14.425
                                                       Mean
                                                            : 9.058
```

```
3rd Qu.:78.79
                     3rd Qu.: 34663.5
                                                            3rd Qu.:11.100
##
                                          3rd Qu.:22.002
            :85.75
                             :117747.0
                                                                    :30.800
##
    Max.
                     Max.
                                          Max.
                                                 :87.740
                                                            Max.
##
    NA's
            :21246
                     NA's
                             :116142
                                          NA's
                                                 :190395
                                                            NA's
                                                                    :82901
    handwashing_facilities hospital_beds_per_thousand human_development_index
##
            : 3.44
                                                          Mode:logical
##
    Min.
                             Min.
                                    : 0.300
    1st Qu.: 26.20
                             1st Qu.: 1.320
                                                          NA's:530292
##
##
    Median: 70.15
                             Median : 2.600
##
    Mean
            : 59.25
                             Mean
                                    : 3.183
    3rd Qu.: 88.47
##
                             3rd Qu.: 4.260
##
    Max.
            :100.00
                             Max.
                                    :13.800
    NA's
##
            :290110
                             NA's
                                    :209535
```

1.6 5) Research questions

- 1. What share of days exceed a threshold (to simulated a government policy threshold to "flatten the curve") e.g 50 cases per million in each country
- 2. Which of the selected countries had the highest typical daily new cases per million in 2021
- 3. How did the monthly mean of new cases per million over 2021 for each country

1.7 6) Data clean up & Processing plan

We parsed the date field and derived a 'year' variable, then restricted the dataset to 2021 to keep figures more legible and comparable. We fixed our analysis to a small set of countries (United States, United Kingdom, China, Belgium) and then verified each has sufficient non missing values for 'new_cases_per_million' in 2021. this processing prepares the data for descriptive statistics and many visualisations.

##	United States	United Kingdom	China	Belgium
##	365	365	365	365

1.8 7) Descriptive statistics & visualisations

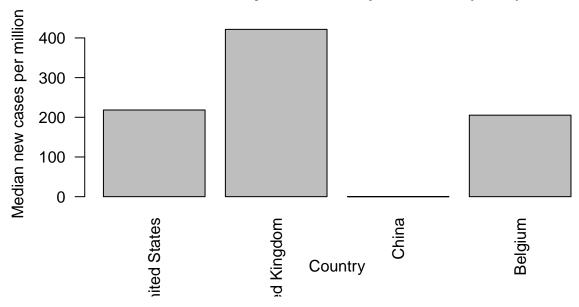
We summarise categories (counts/proportions), report center & spread for one mumeric variable and add simple plots to visualise patterns ### 7.1) One-Way frequency table (categorical) Counts and proportions for a categorical variable

##						
##	United	States	${\tt United}$	Kingdom	China	Belgium
##		365		365	365	365
##						
##	United	States	United	Kingdom	China	Belgium
	onrood		omrood	_		•
##		0.25		0.25	0.25	0.25

1.8.1 7.2) Bar Chart of Disease.Category (counts)

Bar chart / Bar plot of disease category by count

Median daily new cases per million (2021)



1.8.2 7.3) Two way table (category by category)

```
##
##
                     FALSE TRUE
     United States
                        37
                             328
##
##
     United Kingdom
                        55
                             310
##
     China
                       365
                               0
##
     Belgium
                        20
                             345
##
                     FALSE
##
                            TRUE
##
                     0.101 0.899
     United States
##
     United Kingdom 0.151 0.849
##
     China
                     1.000 0.000
##
     Belgium
                     0.055 0.945
##
##
                     FALSE
                            TRUE
##
     United States 0.078 0.334
##
     United Kingdom 0.115 0.315
##
     China
                     0.765 0.000
##
     Belgium
                     0.042 0.351
```

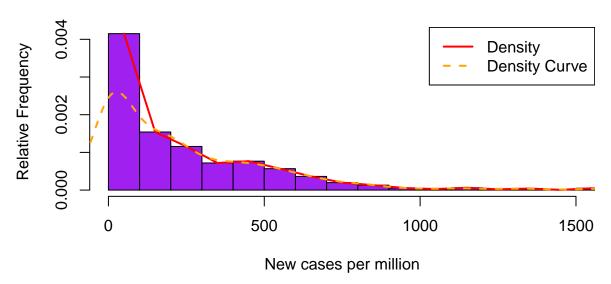
```
##
##
                      FALSE TRUE
                                   Sum
##
                             328
                                   365
     United States
                         37
##
     United Kingdom
                         55
                             310
                                   365
##
     China
                        365
                                   365
                                0
##
     Belgium
                         20
                             345
                                   365
##
     Sum
                        477
                             983 1460
    United States United Kingdom
                                              China
                                                            Belgium
##
             0.899
                                                              0.945
##
                             0.849
                                              0.000
```

1.8.3 7.4) Center & Spread (overall, selected countries, 2021)

```
## median
             IQR
                     sd
   162.9
          379.7
                  357.4
##
            country median
                              IQR
     United States
                     218.4 240.7 201.6
## 2 United Kingdom
                     421.6 491.1 456.4
## 3
              China
                        0.0
                              0.1
                                    0.1
## 4
                     205.4 235.4 396.2
            Belgium
```

1.8.4 7.5) Histogram (shape of the distrubution)

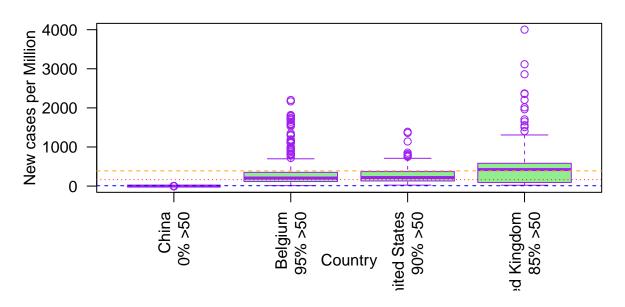
Daily new cases per million



1.8.5 7.6) Boxplot (numeric by category)

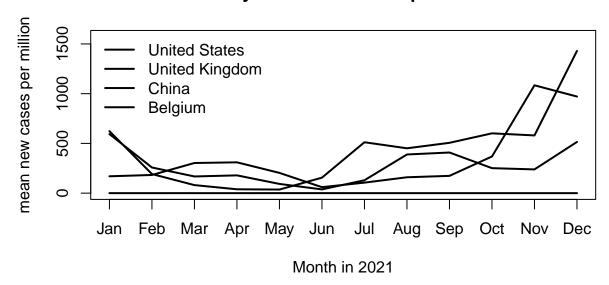
Boxplot (Mortality rate by category)

Daily new cases per million, by country in 2021



1.8.6 7.7) Simple time trend (average by year)

Monthly mean new cases per million



1.9 8) Planned statistical methods

We will compare 2021 distrubutions of 'new_cases_per_million' across the four countries using....

1.10 9) Limitations

- Measurement differences countries have different reporting rules, testing cadence & breadth.
- Scope Only 2021 was analysed. Other years or waves of the disease may show other patterns.
- per million rates do not adjust for demographics of each country, which may show other patterns.
- China has several near zero analysis This may reflect reporting practices of this specific country

2 Project Idea Two - Covid 19 Hospitalizations in France

3 Link to the dataset

Kaggle - Coronavirusdataset France (file: chiffres-cles.csv)
Actual URL: https://www.kaggle.com/datasets/mclikmb4/coronavirusdataset-france?select= chiffres-cles.csv Google drive URL: https://drive.google.com/file/d/1rXHdGEDWFAMaitmkNSgehAt_e2FaC PZ/view?usp=sharing

4 Introduction to the dataset

This dataset provides daily COVID-19 surveillance indicators for France at multiple geographic granularities (country, region, department, overseas collectivities). Each record includes a calendar date, a location code, and a location name, enabling comparisons across space and time. Indicators cover hospitalized patients, ICU occupancy, cumulative deaths, cumulative recoveries, and daily flows of new admissions (hospital and ICU). Source/provenance fields support auditability. The structure suits descriptive analyses and visualizations, with optional regional comparisons to highlight spatial heterogeneity. These indicators and their definitions are documented on the Kaggle dataset page (mclikmb4, 2020-2021).

5 Dataset justification

Relevance: Directly biomedical/public-health, reflecting real-world hospital and ICU loads during COVID-19.

Size/structure: The file far exceeds the minimum requirements (well over 100 rows and more than 20 columns) and includes both categorical (granularity, location IDs, sources) and continuous (counts) variables.

Accessibility/ethics: Publicly accessible aggregated, de-identified counts suitable for academic use.

Analytical potential: Enables trend estimation, wave identification, geographic comparison, and lead-lag analysis between admissions ("flow") and occupancy ("stock").

Ethical use. The dataset consists of aggregated, de-identified counts without PII; no patient-level identifiers are present, aligning with course requirements for ethical, public data.

6 Variables description

Key columns:

date (daily), granularity (country, region, department), location_code (location code), location name (location name).

Indicators:

- hospitalized current hospitalized patients
- icu_patients current ICU patients
- deaths cumulative deaths
- recovered cumulative recoveries
- new_hospitalizations new daily hospital admissions
- new_icu_admissions new daily ICU admissions

Additional fields:

confirmed_cases and tested may be present with different levels of completeness.

Note: Due to several missing/invalid values (NaN/Inf), the tested column is largely unusable for analysis and is excluded from primary summaries and plots.

Source metadata:

source_name, source_url, source_archive, source_type.

Table 1: Row counts by geographic granularity

granularity	n
department	40715
region	7708
country	817
overseas_collectivity	131
world	83

Table 2: Summary statistics for key numeric indicators

variable	n	mean	sd	median	min	max
confirmed_cases	3081	121010.685	508142.429	27.0	0	3560764
deaths	47928	920.086	4150.452	135.0	0	70574
hospitalized	46826	578.225	2597.057	91.0	0	33497
icu_patients	46743	80.489	387.667	10.0	0	7148
$new_hospitalizations$	46095	32.664	166.648	4.0	0	4281
$new_icu_admissions$	46095	5.421	28.033	0.0	0	771
recovered	46712	3949.800	17835.138	645.5	0	299624

variable	n	mean	sd	median	min	max
tested	0	NaN	NA	NA	Inf	-Inf

7 Research question(s)

- 1. **National waves:** How did France's national hospitalization and ICU occupancy evolve across early pandemic waves (2020-2021)?
- 2. **Flow-stock timing:** Do peaks in new hospital admissions precede peaks in current hospitalizations, and by roughly how many days?

8 Data cleanup and processing plan

- Parsing and types: Ensure the date field is properly parsed as a date variable and convert indicator fields into numeric types for consistency.
- Subsetting: For national trends, include only rows classified as country with location_code = "FRA". For geographic comparisons, restrict the dataset to rows where granularity is region.
- Missingness: Quantify missing values for each column and handle them transparently by applying listwise deletion for plotted series (no imputation).
- **Duplicates:** Identify and remove duplicate entries defined by the combination of date and location_code.
- **Provenance:** Retain all source metadata fields, and include them in the appendix when relevant for transparency.

9 Descriptive statistics (figures in Appendix)

France's national indicators exhibit multi-wave patterns during 2020-2021. Hospital occupancy and ICU burden rise and fall in tandem with case surges, while cumulative deaths increase monotonically. The timing relationship between new admissions (flow) and current occupancy (stock) suggests admissions lead occupancy by several days. For visuals supporting these statements, see Appendix Figures A1-A3. Tables above summarize structure and central tendencies.

Across all rows, the median current hospitalizations was 91, with an IQR of 25-285; ICU occupancy had a much lower median, which is expected since ICU is a subset of the total hospital (median 10), consistent with ICU being a subset of total hospital burden.

10 Planned statistical methods

- Lagged cross-correlation between new_hospitalizations (flow) and hospitalized (stock) to estimate lead time from admissions to occupancy.
- Regional comparison of ICU vs hospital burden by wave period (medians, IQRs).
- **Simple time-series decomposition** on national hospitalizations to separate trend/seasonal/residual components (if applicable).

11 Limitations

Several fields like tested and early confirmed_cases have bad coverage over time, and indicators are hospital-centric rather than community-representative. Counts are aggregated and de-identified, so patient-level cannot be controlled. Because the dataset mixes granularities (national, regional, departmental), comparing across levels requires careful subsetting (granularity == "country" for national trends). These constraints limit causal interpretation, so we have to focus more on descriptive trends and clearly labeled comparisons.

12 Appendix

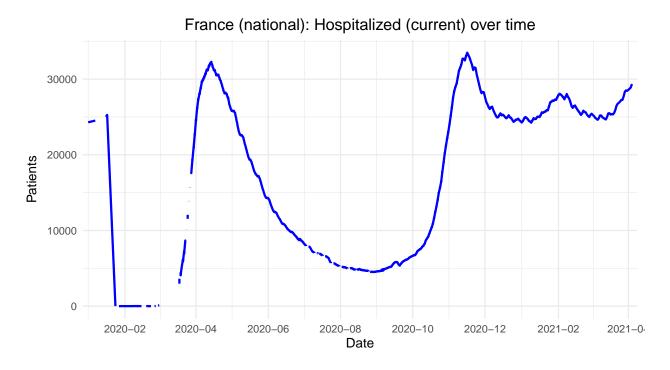


Figure 1: France (national): Hospitalized (current) over time.

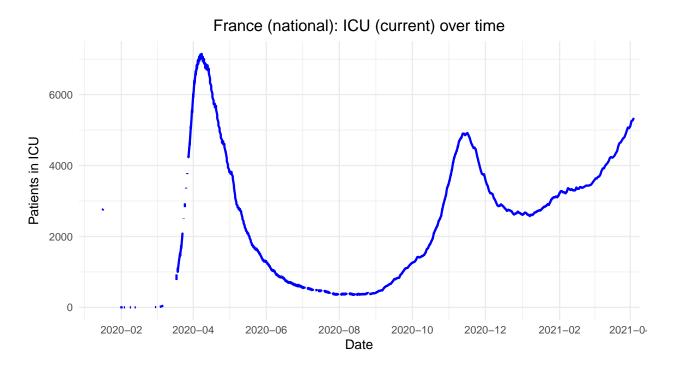


Figure 2: France (national): ICU (current) over time.

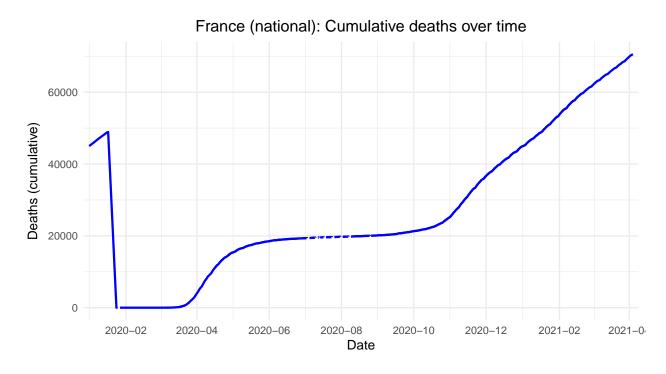


Figure 3: France (national): Cumulative deaths over time.

13 Project Idea Three - Heart attack

14 1.Link to the dataset

https://www.kaggle.com/datasets/iamsouravbanerjee/heart-attack-prediction-dataset

15 2. Introduction to dataset

The Heart Attack Prediction Dataset, available on Kaggle, is a comprehensive resource for studying the clinical, lifestyle, and demographic factors associated with cardiovascular risk. It consists of 8,763 de-identified patient records, including continuous variables such as age, cholesterol, blood pressure, and heart rate, as well as categorical features like sex, chest pain type, smoking habits, diabetes status, and dietary patterns. Socioeconomic and geographic attributes, including income and region, further enrich the dataset by adding broader context to heart health predictors. The primary outcome variable indicates whether a patient is at risk of a heart attack, making the dataset well-suited for statistical analysis, visualization, and classification tasks. Its diverse mix of variables supports exploration of correlations, risk factors, and group comparisons, while also providing an ethical and accessible foundation for predictive modeling in cardiovascular health research.

16 3. Dataset justification

I chose the Heart Attack Prediction Dataset because it directly addresses a critical biomedical challenge cardiovascular disease which remains one of the leading causes of mortality worldwide. The dataset integrates clinical, lifestyle, and demographic variables, making it highly relevant for exploring the multifactorial nature of heart health. With its balanced mix of categorical and continuous features, it offers strong potential for applying a variety of statistical methods, visualizations, and predictive modeling techniques. Its size and diversity of attributes make it complex enough to yield meaningful insights, yet still manageable for academic analysis. Overall, this dataset provides both real-world relevance and analytical richness, making it an excellent candidate for this project.

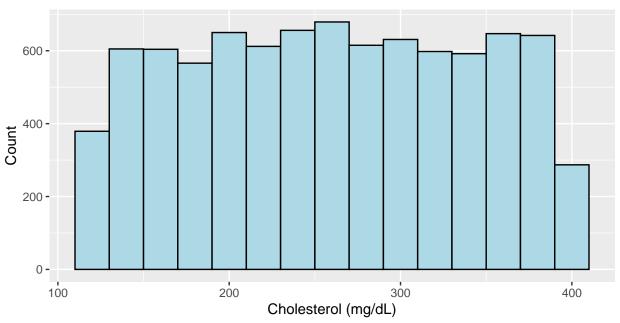
17 4. Variables description

Key columns include Patient ID (unique identifier for each record), Age (in years), Sex (male or female), Cholesterol (cholesterol levels in mg/dL), Blood Pressure (systolic/diastolic in mmHg), Heart Rate (beats per minute), and BMI (body mass index, kg/m^2). Clinical indicators capture Diabetes status (Yes/No), Family History of heart problems (1 = Yes, 0 = No), Previous Heart Problems (1 = Yes, 0 = No), Medication Use (1 = Yes, 0 = No), and Triglyceride levels (mg/dL). Lifestyle-related attributes include Smoking (1 = Smoker, 0 = Non-smoker), Obesity (1 = Obese, 0 = Not obese), Alcohol Consumption (None, Light, Moderate, Heavy), Diet (Healthy, Average, Unhealthy), Exercise Hours Per Week, Physical Activity Days Per Week, Stress Level (1–10 scale), Sedentary Hours Per Day, and Sleep Hours Per Day. Socioeconomic and demographic fields consist of Income, Country, Continent, and Hemisphere. The target variable, Heart Attack Risk, is a binary indicator (1 = Yes, 0 = No) denoting whether the patient is at risk of a heart attack.

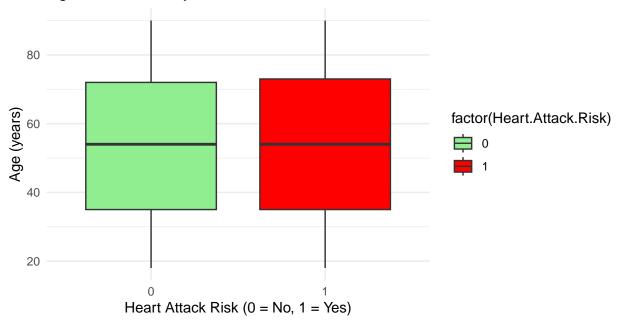
```
8763 obs. of 26 variables:
## 'data.frame':
                                             "BMW7812" "CZE1114" "BNI9906" "JLN3497" ...
   $ Patient.ID
                                      : chr
##
                                             67 21 21 84 66 54 90 84 20 43 ...
   $ Age
                                      : int
                                             "Male" "Male" "Female" "Male" ...
##
   $ Sex
                                      : chr
##
   $ Cholesterol
                                        int
                                             208 389 324 383 318 297 358 220 145 248 ...
                                             "158/88" "165/93" "174/99" "163/100" ...
##
   $ Blood.Pressure
                                        chr
##
   $ Heart.Rate
                                             72 98 72 73 93 48 84 107 68 55 ...
    $ Diabetes
                                      : int
                                             0 1 1 1 1 1 0 0 1 0 ...
   $ Family.History
                                      : int
                                             0 1 0 1 1 1 0 0 0 1 ...
##
   $ Smoking
                                      : int
                                             1 1 0 1 1 1 1 1 1 1 ...
                                             0 1 0 0 1 0 0 1 1 1 ...
##
   $ Obesity
                                      : int
                                             0 1 0 1 0 1 1 1 0 1 ...
##
   $ Alcohol.Consumption
                                      : int
   $ Exercise.Hours.Per.Week
                                             4.17 1.81 2.08 9.83 5.8 ...
                                        num
                                             "Average" "Unhealthy" "Healthy" "Average" ...
##
                                       chr
##
   $ Previous.Heart.Problems
                                      : int
                                             0 1 1 1 1 1 0 0 0 0 ...
   $ Medication.Use
                                             0 0 1 0 0 1 0 1 0 0 ...
                                      : int
##
   $ Stress.Level
                                       int
                                             9 1 9 9 6 2 7 4 5 4 ...
                                             6.62 4.96 9.46 7.65 1.51 ...
##
   $ Sedentary.Hours.Per.Day
                                      : num
   $ Income
                                             261404 285768 235282 125640 160555 241339 190450 1
##
                                      : int
##
   $ BMI
                                             31.3 27.2 28.2 36.5 21.8 ...
                                        num
                                             286 235 587 378 231 795 284 370 790 232 ...
##
   $ Triglycerides
                                      : int
   $ Physical.Activity.Days.Per.Week: int
                                             0 1 4 3 1 5 4 6 7 7 ...
   $ Sleep.Hours.Per.Day
                                      : int
                                             6 7 4 4 5 10 10 7 4 7 ...
                                             "Argentina" "Canada" "France" "Canada" ...
##
   $ Country
                                      : chr
## $ Continent
                                             "South America" "North America" "Europe" "North America"
                                      : chr
                                             "Southern Hemisphere" "Northern Hemisphere" "Northern
   $ Hemisphere
##
                                      : chr
## $ Heart.Attack.Risk
                                             0 0 0 0 0 1 1 1 0 0 ...
                                      : int
##
     Patient.ID
                                                             Cholesterol
                             Age
                                            Sex
  Length:8763
##
                       Min.
                              :18.00
                                        Length:8763
                                                           Min.
                                                                 :120.0
                       1st Qu.:35.00
   Class : character
                                        Class : character
                                                            1st Qu.:192.0
   Mode :character
                       Median :54.00
                                                           Median :259.0
##
                                        Mode :character
##
                       Mean
                              :53.71
                                                           Mean
                                                                   :259.9
##
                       3rd Qu.:72.00
                                                            3rd Qu.:330.0
##
                       Max.
                              :90.00
                                                            Max.
                                                                   :400.0
##
   Blood.Pressure
                         Heart.Rate
                                            Diabetes
                                                           Family. History
   Length:8763
                              : 40.00
                                                :0.0000
##
                       Min.
                                         Min.
                                                           Min.
                                                                  :0.000
                       1st Qu.: 57.00
                                                           1st Qu.:0.000
##
   Class : character
                                         1st Qu.:0.0000
##
   Mode :character
                       Median : 75.00
                                         Median :1.0000
                                                           Median :0.000
##
                              : 75.02
                       Mean
                                         Mean
                                                :0.6523
                                                           Mean
                                                                  :0.493
##
                       3rd Qu.: 93.00
                                         3rd Qu.:1.0000
                                                           3rd Qu.:1.000
##
                               :110.00
                                                :1.0000
                                                           Max.
                                                                  :1.000
                       Max.
                                         Max.
##
       Smoking
                        Obesity
                                       Alcohol.Consumption Exercise.Hours.Per.Week
   Min.
           :0.0000
                     Min.
                             :0.0000
                                              :0.0000
                                                            Min. : 0.002442
   1st Qu.:1.0000
                     1st Qu.:0.0000
                                       1st Qu.:0.0000
                                                            1st Qu.: 4.981579
##
   Median :1.0000
                     Median :1.0000
                                       Median :1.0000
                                                           Median: 10.069559
##
   Mean
           :0.8968
                             :0.5014
                                              :0.5981
                                                           Mean :10.014284
                     Mean
                                       Mean
   3rd Qu.:1.0000
                     3rd Qu.:1.0000
                                       3rd Qu.:1.0000
                                                            3rd Qu.:15.050018
```

```
:1.0000
                                              :1.0000
##
   Max.
                     Max.
                             :1.0000
                                       Max.
                                                           Max.
                                                                   :19.998709
##
        Diet
                       Previous.Heart.Problems Medication.Use
                                                                   Stress.Level
   Length:8763
                               :0.0000
                                                       :0.0000
                                                                         : 1.00
##
                       Min.
                                                Min.
                                                                  Min.
##
   Class : character
                       1st Qu.:0.0000
                                                1st Qu.:0.0000
                                                                  1st Qu.: 3.00
    Mode : character
                       Median :0.0000
                                                Median :0.0000
                                                                  Median: 5.00
##
##
                       Mean
                               :0.4958
                                                Mean
                                                       :0.4983
                                                                  Mean
                                                                        : 5.47
##
                                                                  3rd Qu.: 8.00
                       3rd Qu.:1.0000
                                                3rd Qu.:1.0000
##
                       Max.
                                                Max.
                                                       :1.0000
                                                                  Max.
                                                                         :10.00
                               :1.0000
    Sedentary.Hours.Per.Day
                                 Income
                                                   BMI
                                                               Triglycerides
                                              Min.
   Min.
           : 0.001263
                            Min.
                                    : 20062
                                                     :18.00
                                                               Min. : 30.0
##
    1st Qu.: 2.998794
                                              1st Qu.:23.42
                                                               1st Qu.:225.5
##
                             1st Qu.: 88310
##
   Median: 5.933622
                            Median :157866
                                              Median :28.77
                                                               Median :417.0
                                                     :28.89
   Mean
           : 5.993690
                            Mean
                                    :158263
                                              Mean
                                                                      :417.7
##
                                                               Mean
    3rd Qu.: 9.019125
                             3rd Qu.:227749
                                              3rd Qu.:34.32
                                                               3rd Qu.:612.0
##
    Max.
           :11.999313
                                    :299954
                                              Max.
                                                      :40.00
                                                               Max.
                                                                      :800.0
##
                            Max.
   Physical.Activity.Days.Per.Week Sleep.Hours.Per.Day
                                                            Country
##
   Min.
           :0.00
                                     Min.
                                            : 4.000
                                                         Length:8763
    1st Qu.:2.00
                                     1st Qu.: 5.000
##
                                                         Class :character
##
   Median:3.00
                                     Median : 7.000
                                                         Mode :character
           :3.49
##
   Mean
                                     Mean
                                            : 7.024
    3rd Qu.:5.00
                                     3rd Qu.: 9.000
##
##
   Max.
           :7.00
                                     Max.
                                            :10.000
     Continent
##
                        Hemisphere
                                           Heart.Attack.Risk
##
   Length:8763
                       Length:8763
                                           Min.
                                                  :0.0000
   Class : character
                       Class : character
                                           1st Qu.:0.0000
##
   Mode :character
                       Mode :character
                                           Median :0.0000
##
                                                  :0.3582
                                           Mean
##
                                           3rd Qu.:1.0000
                                                  :1.0000
##
                                           Max.
```

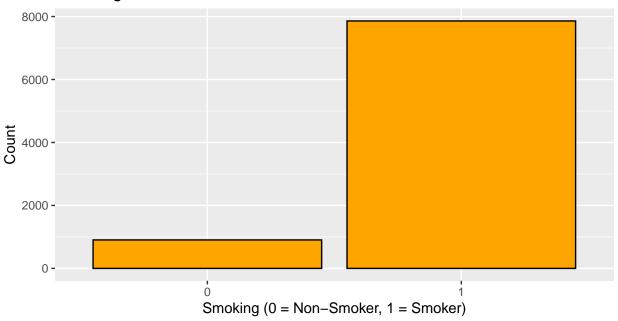
Distribution of Cholesterol Levels



Age Distribution by Heart Attack Risk



Smoking Status of Patients



18 5. Research questions

- 1. Which clinical, lifestyle, and demographic factors are most strongly associated with the risk of heart attack in patients?
- 2. Which features contribute most to a machine learning model's decision boundary for predicting heart attack risk?

19 6. Data cleanup and processing plan

- Check for missing values: Identify NAs using colSums(is.na(hd)); if very few, remove those rows; if moderate, impute using mean/median for continuous variables (e.g., Cholesterol, BMI) and mode for categorical variables (e.g., Diet, Alcohol Consumption).
- Remove duplicate entries: Drop exact duplicates or repeated Patient IDs to avoid over-representation using hd <- hd[!duplicated(hd),].
- Fix inconsistent formats: Split Blood Pressure into two numeric columns (Systolic and Diastolic) and convert binary indicators (0/1) like Diabetes, Smoking, and Heart Attack Risk into categorical factors.
- Validate ranges & handle outliers: Review continuous variables (e.g., Cholesterol, Triglyc-erides, BMI, Sleep Hours) for biologically implausible values; correct, cap, or remove extreme outliers as appropriate.
- Standardize categorical variables: Ensure consistent levels for Sex (Male/Female), Diet (Healthy/Average/Unhealthy), and Alcohol Consumption (None/Light/Moderate/Heavy).

• Create derived variables: Add new groupings such as Age Groups (e.g., 18–30, 31–50, 51–70, 71–90) and BMI Categories (Underweight, Normal, Overweight, Obese) to facilitate group comparisons in descriptive statistics and visualization.

20 7. Descriptive statistics and data visualizations

```
##
## Variable: Age
## Mean: 53.70798
## Median: 54
## Range: 72
## Standard Deviation: 21.24951
##
## Variable: Cholesterol
## Mean: 259.8772
## Median: 259
## Range: 280
## Standard Deviation: 80.86328
## Variable: Heart.Rate
## Mean: 75.02168
## Median: 75
## Range: 70
## Standard Deviation: 20.55095
##
## Variable: BMI
## Mean: 28.89145
## Median: 28.769
## Range: 21.99487
## Standard Deviation: 6.319181
##
## Variable: Triglycerides
## Mean: 417.6771
## Median: 417
## Range: 770
## Standard Deviation: 223.7481
## Variable: Exercise.Hours.Per.Week
## Mean: 10.01428
## Median: 10.06956
## Range: 19.99627
## Standard Deviation: 5.783745
##
## Variable: Stress.Level
## Mean: 5.469702
## Median: 5
## Range: 9
```

```
## Standard Deviation: 2.859622
##
## Variable: Sedentary.Hours.Per.Day
## Mean: 5.99369
## Median: 5.933622
## Range: 11.99805
## Standard Deviation: 3.466359
## Variable: Income
## Mean: 158263.2
## Median: 157866
## Range: 279892
## Standard Deviation: 80575.19
## Variable: Physical.Activity.Days.Per.Week
## Mean: 3.489672
## Median: 3
## Range: 7
## Standard Deviation: 2.282687
## Variable: Sleep.Hours.Per.Day
## Mean: 7.023508
## Median: 7
## Range: 6
## Standard Deviation: 1.988473
##
## Variable: Sex
## Female Male
##
     2652
          6111
##
## Variable: Diabetes
##
##
      0
## 3047 5716
## Variable: Family.History
##
##
      0
## 4443 4320
##
## Variable: Smoking
##
      0
## 904 7859
##
```

Variable: Obesity

```
##
##
      0
           1
## 4369 4394
## Variable: Alcohol.Consumption
##
##
      0
           1
## 3522 5241
## Variable: Diet
##
##
                Healthy Unhealthy
     Average
        2912
                   2960
                              2891
##
##
## Variable: Previous.Heart.Problems
##
##
## 4418 4345
##
## Variable: Medication.Use
##
##
      0
## 4396 4367
## Variable: Country
##
##
                                           Brazil
                                                            Canada
        Argentina
                        Australia
                                                                             China
##
               471
                               449
                                               462
                                                               440
                                                                               436
         Colombia
##
                           France
                                          Germany
                                                             India
                                                                             Italy
##
               429
                               446
                                               477
                                                               412
                                                                               431
##
             Japan
                      New Zealand
                                          Nigeria
                                                     South Africa
                                                                      South Korea
##
               433
                                               448
                                                               425
                                                                               409
##
            Spain
                         Thailand United Kingdom
                                                    United States
                                                                           Vietnam
##
              430
                               428
                                               457
                                                               420
                                                                               425
##
## Variable: Continent
##
##
          Africa
                           Asia
                                     Australia
                                                       Europe North America
              873
                           2543
                                           884
                                                          2241
                                                                          860
## South America
##
            1362
##
## Variable: Hemisphere
##
## Northern Hemisphere Southern Hemisphere
                   5660
##
                                        3103
##
## Variable: Heart.Attack.Risk
```

```
##
      0
           1
## 5624 3139
## Categorical Columns:
  [1] "Patient.ID"
                         "Sex"
                                           "Blood.Pressure" "Diet"
## [5] "Country"
                         "Continent"
                                           "Hemisphere"
##
## Numerical Columns:
##
    [1] "Age"
                                            "Cholesterol"
##
    [3] "Heart.Rate"
                                            "Diabetes"
    [5] "Family.History"
##
                                            "Smoking"
##
   [7] "Obesity"
                                            "Alcohol.Consumption"
##
   [9] "Exercise.Hours.Per.Week"
                                            "Previous.Heart.Problems"
## [11] "Medication.Use"
                                            "Stress.Level"
## [13] "Sedentary.Hours.Per.Day"
                                            "Income"
## [15] "BMI"
                                            "Triglycerides"
## [17] "Physical.Activity.Days.Per.Week"
                                            "Sleep.Hours.Per.Day"
## [19] "Heart.Attack.Risk"
##
                                                             variable
                                                                                 mean
                                                                         n
## Age
                                                                  Age 8763
                                                                                53.71
## Cholesterol
                                                          Cholesterol 8763
                                                                               259.88
## Heart.Rate
                                                          Heart.Rate 8763
                                                                                75.02
## Diabetes
                                                             Diabetes 8763
                                                                                 0.65
## Family.History
                                                      Family. History 8763
                                                                                 0.49
## Smoking
                                                              Smoking 8763
                                                                                 0.90
## Obesity
                                                              Obesity 8763
                                                                                 0.50
## Alcohol.Consumption
                                                 Alcohol.Consumption 8763
                                                                                 0.60
## Exercise.Hours.Per.Week
                                             Exercise. Hours. Per. Week 8763
                                                                                10.01
## Previous.Heart.Problems
                                             Previous.Heart.Problems 8763
                                                                                 0.50
## Medication.Use
                                                      Medication. Use 8763
                                                                                 0.50
## Stress.Level
                                                         Stress.Level 8763
                                                                                 5.47
## Sedentary.Hours.Per.Day
                                             Sedentary. Hours. Per. Day 8763
                                                                                 5.99
## Income
                                                               Income 8763 158263.18
## BMI
                                                                  BMI 8763
                                                                                28.89
## Triglycerides
                                                       Triglycerides 8763
                                                                               417.68
## Physical.Activity.Days.Per.Week Physical.Activity.Days.Per.Week 8763
                                                                                 3.49
## Sleep.Hours.Per.Day
                                                 Sleep.Hours.Per.Day 8763
                                                                                 7.02
## Heart.Attack.Risk
                                                   Heart.Attack.Risk 8763
                                                                                 0.36
##
                                       median
                                                   range
## Age
                                        54.00
                                                   72.00
## Cholesterol
                                        259.00
                                                  280.00
## Heart.Rate
                                        75.00
                                                   70.00
```

##

##	Diabetes	1.00	1.00
##	Family.History	0.00	1.00
##	Smoking	1.00	1.00
##	Obesity	1.00	1.00
##	Alcohol.Consumption	1.00	1.00
##	Exercise.Hours.Per.Week	10.07	20.00
##	Previous.Heart.Problems	0.00	1.00
##	Medication.Use	0.00	1.00
##	Stress.Level	5.00	9.00
##	Sedentary.Hours.Per.Day	5.93	12.00
##	Income	157866.00	279892.00
##	BMI	28.77	21.99
##	Triglycerides	417.00	770.00
##	${\tt Physical.Activity.Days.Per.Week}$	3.00	7.00
##	Sleep.Hours.Per.Day	7.00	6.00
##	Heart.Attack.Risk	0.00	1.00

21 8. Planned statistical methods

As the project progresses, I plan to use chi-square tests to assess associations between categorical factors (e.g., smoking, diabetes) and heart attack risk, and t-tests/ANOVA to compare continuous measures (e.g., cholesterol, BMI) across groups. To build predictive insight, I will apply logistic regression and may explore machine learning models such as decision trees or random forests. These methods will help identify key risk factors and evaluate their predictive power.

22) JOINT PROJECTS - References

Project 1 - Our World in Data. "Coronvirus Pandemic (COVID-19) dataset." source location - Source: URL: https://docs.owid.io/projects/covid/en/latest/dataset.html Project 2 - mclikmb4, (2021, April 4), Coronavirus-dataset France, Kaggle, https://www.kaggle.com/datasets/mclikmb4/coronavirusdataset-france?select=chiffres-cles.csv

Project 3 - Banerjee, S. (2021). Heart Attack Prediction Dataset. Kaggle. https://www.kaggle.com/datasets/iamsouravbanerjee/heart-attack-prediction-dataset

23) PROJECTS - Appendix

- 23.1 Project 1
- 23.2 Project 2

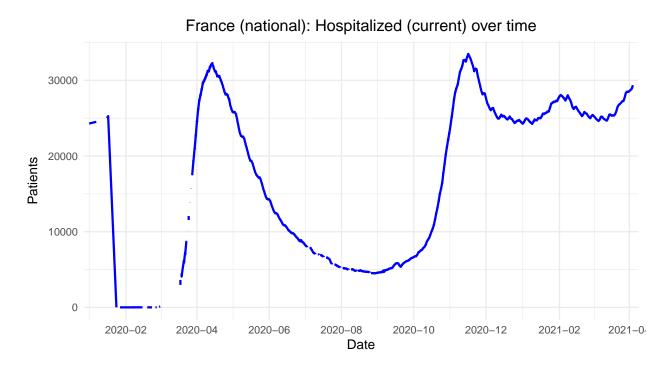


Figure 4: France (national): Hospitalized (current) over time.

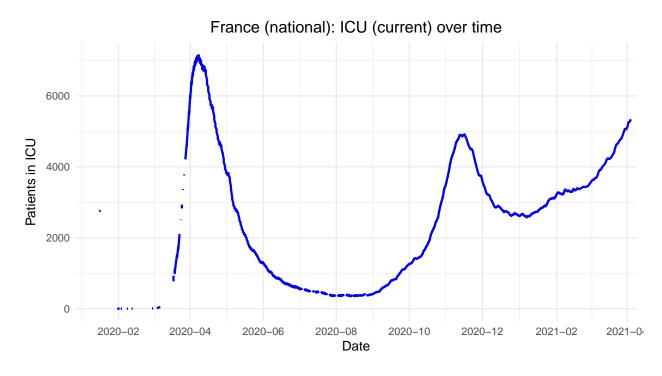


Figure 5: France (national): ICU (current) over time.

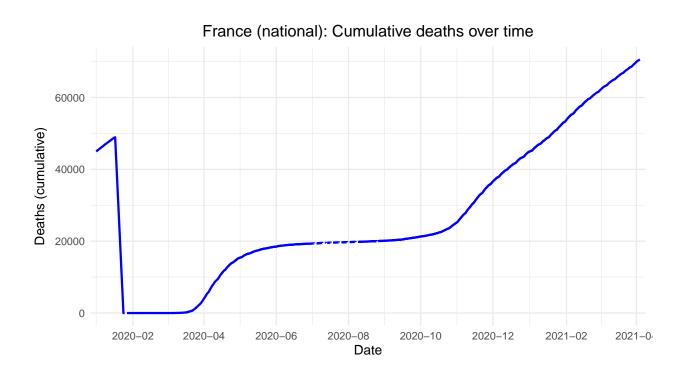


Figure 6: France (national): Cumulative deaths over time.