

基于 Covid-19 传播数据的 Spark 数据处理分析

1. 启动 hadoop 并上传数据

```
hadoop@master:~$ cd /usr/local/hadoop-3.1.3
bash: cd: /usr/local/hadoop-3.1.3: 没有那个文件或目录
hadoop@master:~$ ./sbin/start-dfs.sh
bash: ./sbin/start-dfs.sh: 没有那个文件或目录
hadoop@master:~$ cd /usr/local/hadoop
hadoop@master:/usr/local/hadoop$ ./sbin/start-dfs.sh
Starting namenodes on [localhost]
Starting datanodes
Starting secondary namenodes [master]
hadoop@master:/usr/local/hadoop$ bin/hadoop fs -mkdir -p /dbcovid/data
mkdir: Cannot create directory /dbcovid/data. Name node is in safe mode.
hadoop@master:/usr/local/hadoop$ sudo bin/hadoop fs -mkdir -p /dbcovid/data
[sudo] hadoop 的密码:
mkdir: Permission denied: user=root, access=WRITE, inode="/":hadoop:supergroup:d
rwxr-xr-x
hadoop@master:/usr/local/hadoop$ ^C
hadoop@master:/usr/local/hadoop$ bin/hadoop fs -mkdir -p /dbcovid/data
hadoop@master:/usr/local/hadoop$ bin/hadoop fs -put ~/下载/covid.csv /dbcovid/da
ta
hadoop@master:/usr/local/hadoop$ /usr/local/hadoop-3.1.3/bin/hadoop fs -ls /dbco
vid/data/covid.csv
bash: /usr/local/hadoop-3.1.3/bin/hadoop: 没有那个文件或目录
hadoop@master:/usr/local/hadoop$ /usr/local/hadoop/bin/hadoop fs -ls /dbcovid/da
ta/covid.csv
```

2. 数据预处理

```
scala> val datapath = "hdfs://localhost:9000/dbcovid/data/covid.csv"
datapath: String = hdfs://localhost:9000/dbcovid/data/covid.csv

scala> val df = spark.read.option("header", "true").option("inferSchema", "true")
.csv(datapath)
2025-05-10 12:14:45,249 INFO internal.SharedState: Setting hive.metastore.wareho
use.dir ('null') to the value of spark.sql.warehouse.dir.
2025-05-10 12:14:45,272 INFO internal.SharedState: Warehouse path is 'file:/usr/
local/hadoop/spark-warehouse'.
2025-05-10 12:14:45,301 INFO handler.ContextHandler: Started o.s.j.s.ServletCont
extHandler@734990c1{/SQL,null,AVAILABLE,@Spark}
2025-05-10 12:14:45,302 INFO handler.ContextHandler: Started o.s.j.s.ServletCont
extHandler@4f7db06c{/SQL/json,null,AVAILABLE,@Spark}
2025-05-10 12:14:45,304 INFO handler.ContextHandler: Started o.s.j.s.ServletCont
extHandler@651a3e01{/SQL/execution,null,AVAILABLE,@Spark}
2025-05-10 12:14:45,305 INFO handler.ContextHandler: Started o.s.j.s.ServletCont
extHandler@6870f52a{/SQL/execution/json,null,AVAILABLE,@Spark}
2025-05-10 12:14:45,335 INFO handler.ContextHandler: Started o.s.j.s.ServletCont
extHandler@224bff6{/static/sql,null,AVAILABLE,@Spark}
```

```
scala> df.printSchema()
root
|-- iso_code: string (nullable = true)
|-- continent: string (nullable = true)
|-- location: string (nullable = true)
|-- date: date (nullable = true)
|-- total_cases: double (nullable = true)
|-- new_cases: double (nullable = true)
|-- new_cases_smoothed: double (nullable = true)
|-- total_deaths: double (nullable = true)
|-- new_deaths: double (nullable = true)
|-- new_deaths_smoothed: double (nullable = true)
|-- total_cases_per_million: double (nullable = true)
|-- new_cases_per_million: double (nullable = true)
|-- new_cases_smoothed_per_million: double (nullable = true)
|-- total_deaths_per_million: double (nullable = true)
|-- new_deaths_per_million: double (nullable = true)
|-- new_deaths_smoothed_per_million: double (nullable = true)
|-- reproduction_rate: double (nullable = true)
|-- icu_patients: double (nullable = true)
|-- icu_patients_per_million: double (nullable = true)
|-- hosp_patients: double (nullable = true)
|-- hosp_patients_per_million: double (nullable = true)
```

3. 使用 Spark 进行数据分析

基本统计分析

```
2025-05-10 12:16:54,461 INFO codegen.CodeGenerator:
ed in 40.822258 ms
+-----+
|    continent|
+-----+
|      Europe|
|      Africa|
|         null|
|North America|
|South America|
|      Oceania|
|         Asia|
+-----+
```

统计国家数量

```
ed in 23.626134 ms
+-----+
|count(DISTINCT location)|
+-----+
|                238|
+-----+
```


统计日期总数

```
+-----+
|count(date)|
+-----+
|          774|
+-----+
```

独立指标分析

```
scala> val locs = List("China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore")
2025-05-10 12:18:37,816 INFO storage.BlockManagerInfo: Removed broadcast_13_piece0 on 192.168.128.148:39243 in memory (size: 5.9 KiB, free: 366.2 MiB)
locs: List[String] = List(China, United States, European Union, Russia, Japan, United Kingdom, Singapore)
```

(1) (重点国家) 新增病例/死亡数量

```
scala> for (loc <- locs) {
|   spark.sql(s"select new_cases from data where location='$loc']").write.json(s"/dbcovid/result/new_cases/$loc/")
|   spark.sql(s"select new_deaths from data where location='$loc']").write.json(s"/dbcovid/result/new_deaths/$loc/")
| }
2025-05-10 12:20:19,719 INFO datasources.FileSourceStrategy: Pushed Filters: IsNotNull(location),EqualTo(location,China)
2025-05-10 12:20:19,719 INFO datasources.FileSourceStrategy: Post-Scan Filters: isnotnull(location#19),(location#19 = China)
2025-05-10 12:20:19,813 INFO output.PathOutputCommitterFactory: No output committer factory defined, defaulting to FileOutputCommitter
```

(2) (重点国家) 累计病例/死亡数量

```
scala> for (loc <- locs) {
|   spark.sql(s"select total_cases from data where location='$loc']").write.json(s"/dbcovid/result/total_cases/$loc/")
|   spark.sql(s"select total_deaths from data where location='$loc']").write.json(s"/dbcovid/result/total_deaths/$loc/")
| }
```

(3) (重点国家) 疫苗接种剂次

```
scala> for (loc <- locs) {  
  |   spark.sql(s"select total_vaccinations from data where location='$loc']").write.json(s"/dbcovid/result/total_vacc/$loc/")  
  | }
```

(4) (全部国家) 每百万人累计病例/死亡数量

```
scala> spark.sql("select location,max(1000000*total_deaths/population) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths/")
```

相关性分析

(5) (重点国家) 每日新增病例数与疫苗接种剂次的关系

```
scala> for (loc <- locs) {  
  |   spark.sql(s"select new_cases,total_vaccinations from data where location='$loc']").write.json(s"/dbcovid/result/cases_with_vaccs/$loc/")  
  | }
```

(6) (所有国家) 每百万人病例/死亡数量与其他指标的关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(gdp_per_capita) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_gdp/")
```

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(median_age) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_age/")
```

(7) 每百万人病例数量与人均 GDP 关系

```
scala> spark.sql("select location,max(1000000*total_cases/population),max(gdp_per_capita) from data where continent is not null group by location").write.json("/dbcovid/result/million_cases_with_gdp/")  
2025-05-12 03:02:05,746 INFO storage.BlockManagerInfo: Removed broadcast_2_piece0 on 192.168.128.150:45327 in memory (size : 53.3 KiB, free: 366.3 MiB)  
2025-05-12 03:02:05,798 INFO storage.BlockManagerInfo: Removed broadcast_3_piece0 on 192.168.128.150:45327 in memory (size : 13.0 KiB, free: 366.3 MiB)  
2025-05-12 03:02:06,108 INFO datasources.FileSourceStrategy: Pushed Filters: IsNotNull(continent)  
2025-05-12 03:02:06,109 INFO datasources.FileSourceStrategy: Post-Scan Filters: isnotnull(continent#18)  
2025-05-12 03:02:06,627 INFO codegen.CodeGenerator: Code generated in 224.648065 ms
```


每百万人死亡数量与人均 GDP 关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(gdp_per_capita) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_gdp/")
```

(8) (所有国家) 每百万人病例数量与年龄中位数关系

```
scala> spark.sql("select location,max(1000000*total_cases/population),max(median_age) from data where continent is not null group by location").write.json("/dbcovid/result/million_cases_with_age/")
2025-05-12 03:04:58,801 INFO datasources.FileSourceStrategy: Pushed Filters: IsNotNull(continent)
2025-05-12 03:04:58,802 INFO datasources.FileSourceStrategy: Post-Scan Filters: isnotnull(continent#18)
2025-05-12 03:04:58,852 INFO memory.MemoryStore: Block broadcast_10 stored as values in memory (estimated size 487.8 KiB, free 364.2 MiB)
```

(所有国家) 每百万人死亡数量与年龄中位数关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(median_age) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_age/")
```

(9) (所有国家) 每百万人病例数量与人口密度关系

```
scala> spark.sql("select location,max(1000000*total_cases/population),max(population_density) from data where continent is not null group by location").write.json("/dbcovid/result/million_cases_with_density/")
```

(所有国家) 每百万人死亡数量与人口密度关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(population_density) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_density/")
```

(10) (所有国家) 每百万人病例数量与期望寿命关系

```
scala> spark.sql("select location,max(1000000*total_cases/population),max(life_expectancy) from data where continent is not null group by location").write.json("/dbcovid/result/million_cases_with_lifexp/")
```

(所有国家) 每百万人死亡数量与期望寿命关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(life_expectancy) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_lifexp/")
```

(11) (所有国家) 每百万人病例数量与 HDI 关系

```
scala> spark.sql("select location,max(1000000*total_cases/population),max(human_development_index) from data where continent is not null group by location").write.json("/dbcovid/result/million_cases_with_hdi/")
```

(所有国家) 每百万人死亡数量与 HDI 关系

```
scala> spark.sql("select location,max(1000000*total_deaths/population),max(human_development_index) from data where continent is not null group by location").write.json("/dbcovid/result/million_deaths_with_hdi/")
```

数据检查与导出

```
scala> bin/hdfs dfs -get /dbcovid/result ~/covid_data/

hadoop@master:/usr/local/hadoop$ bin/hdfs dfs -get /dbcovid/result ~/covid_data/
hadoop@master:/usr/local/hadoop$
```

4. 可视化分析

重点国家新增病例数量

```
warnings.filterwarnings("ignore")

locs = ["China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore"]

path_root = r"D:\spark\exam\covid\covid_data\result\new_cases"
all_data = []
valid_locs = []
for loc in locs:
    try:
        country_dir = os.path.join(path_root, loc)
        files = glob.glob(os.path.join(country_dir, "part-*.json"))
        if not files:
            print(f"警告: {loc} 目录下未找到part文件")
            continue

        country_df = pd.concat([pd.read_json(f, lines=True) for f in files])
        if country_df.empty:
            print(f"警告: {loc} 的数据为空")
            continue

        numeric_cols = country_df.select_dtypes(include=[np.number]).columns
        if len(numeric_cols) == 0:
            print(f"警告: {loc} 无数值列")
            continue

        tmp = country_df[numeric_cols[0]].values.astype(float) # 转换为浮点数
        all_data.append(tmp)
        valid_locs.append(loc)

    except Exception as e:
        print(f"处理 {loc} 时出错: {str(e)}")
        continue
```

```

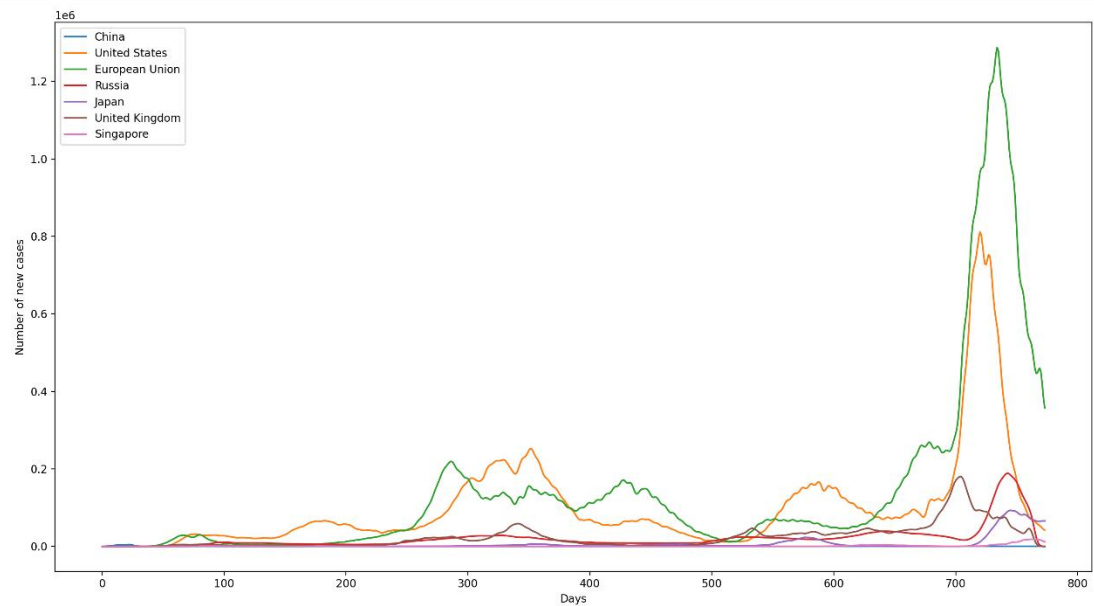
if all_data:
    max_len = max(len(x) for x in all_data)
    padded_data = [np.pad(arr, (0, max_len - len(arr)),
                          mode='constant', constant_values=np.nan)
                   for arr in all_data]

    clean_data = []
    for arr in padded_data:
        mask = np.isnan(arr)
        if np.all(mask):
            arr[:] = 0
        else:
            arr[mask] = 0
        clean_data.append(arr)

    smoothed_data = [gaussian_filter1d(arr, sigma=2.5) for arr in clean_data]
    df = pd.DataFrame(np.array(smoothed_data).T, columns=valid_locs)

    plt.figure(figsize=(12, 8))
    plt.xlabel('Days')
    plt.ylabel('Number of new cases')
    sns.lineplot(data=df, dashes=False)
    plt.tight_layout()
    plt.show()
else:
    print("错误：没有有效数据被加载")

```



重点国家新增死亡数量

```
locs = ["China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore"]

path_root = r"D:\spark\exam\covid\covid_data\result\new_deaths"
all_data = []
valid_locs = []
for loc in locs:
    try:
        country_dir = os.path.join(path_root, loc)
        files = glob.glob(os.path.join(country_dir, "part-*.json"))
        if not files:
            print(f"警告: {loc} 目录下未找到part文件")
            continue

        country_df = pd.concat([pd.read_json(f, lines=True) for f in files])
        if country_df.empty:
            print(f"警告: {loc} 的数据为空")
            continue

        numeric_cols = country_df.select_dtypes(include=[np.number]).columns
        if len(numeric_cols) == 0:
            print(f"警告: {loc} 无数值列")
            continue

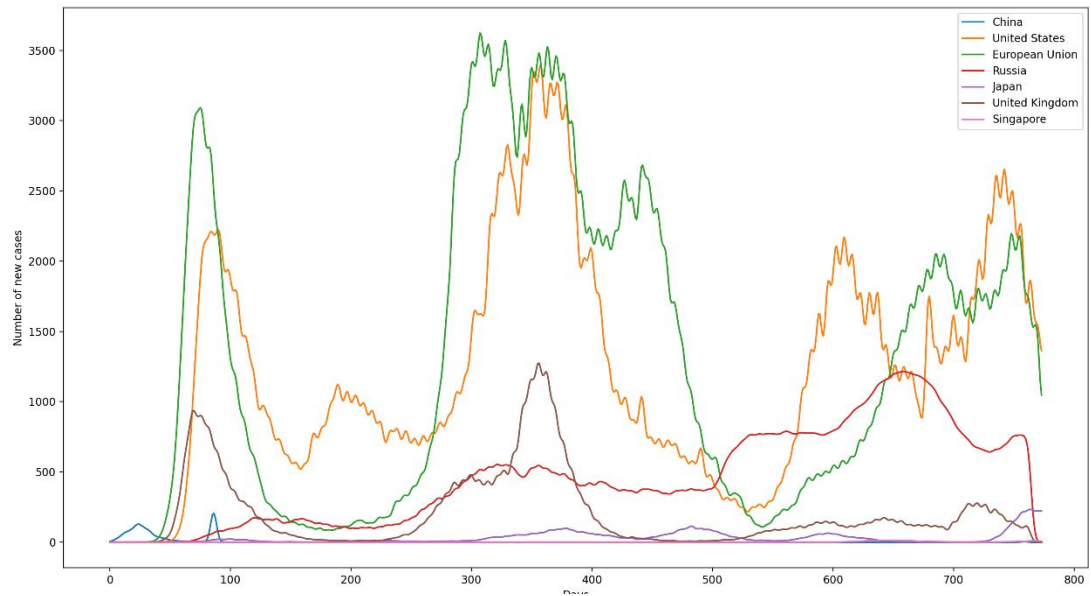
        tmp = country_df[numeric_cols[0]].values.astype(float) # 转换为浮点数
        all_data.append(tmp)
        valid_locs.append(loc)
    except Exception as e:
        print(f"处理 {loc} 时出错: {str(e)}")
```

```
if all_data:
    max_len = max(len(x) for x in all_data)
    padded_data = [np.pad(arr, (0, max_len - len(arr)),
                          mode='constant', constant_values=np.nan)
                   for arr in all_data]

    clean_data = []
    for arr in padded_data:
        mask = np.isnan(arr)
        if np.all(mask):
            arr[:] = 0
        else:
            arr[mask] = 0
        clean_data.append(arr)

    smoothed_data = [gaussian_filter1d(arr, sigma=2.5) for arr in clean_data]
    df = pd.DataFrame(np.array(smoothed_data).T, columns=valid_locs)

    plt.figure(figsize=(12, 8))
    plt.xlabel('Days')
    plt.ylabel('Number of new cases')
    sns.lineplot(data=df, dashes=False)
    plt.tight_layout()
    plt.show()
else:
    print("错误: 没有有效数据被加载")
```

重点国家累计病例数量

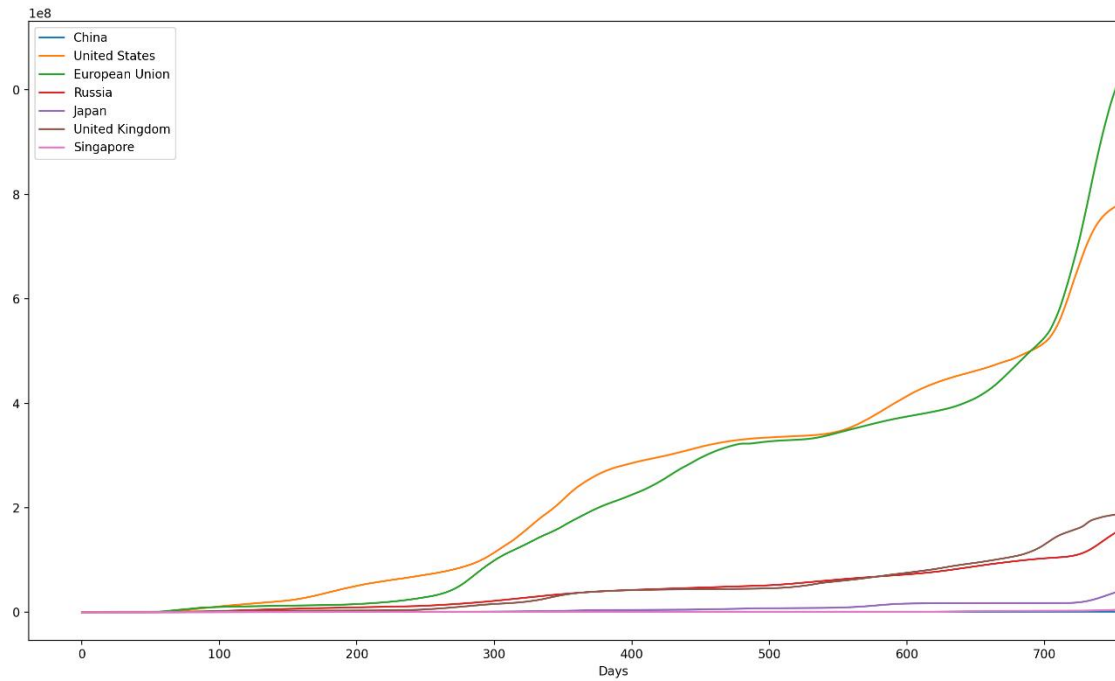
```
locs = ["China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore"]

path_root = r"D:\spark\exam\covid\covid_data\result\total_cases"
all_data = []
valid_locs = []
for loc in locs:
    try:
        country_dir = os.path.join(path_root, loc)
        files = glob.glob(os.path.join(country_dir, "part-*.json"))
        if not files:
            print(f"警告: {loc} 目录下未找到part文件")
            continue

        country_df = pd.concat([pd.read_json(f, lines=True) for f in files])
        if country_df.empty:
            print(f"警告: {loc} 的数据为空")
            continue
        numeric_cols = country_df.select_dtypes(include=[np.number]).columns
        if len(numeric_cols) == 0:
            print(f"警告: {loc} 无数值列")
            continue

        tmp = country_df[numeric_cols[0]].values.astype(float) # 转换为浮点数
        all_data.append(tmp)
        valid_locs.append(loc)

    except Exception as e:
        print(f"处理 {loc} 时出错: {str(e)}")
        continue
```



重点国家累计死亡数量

```

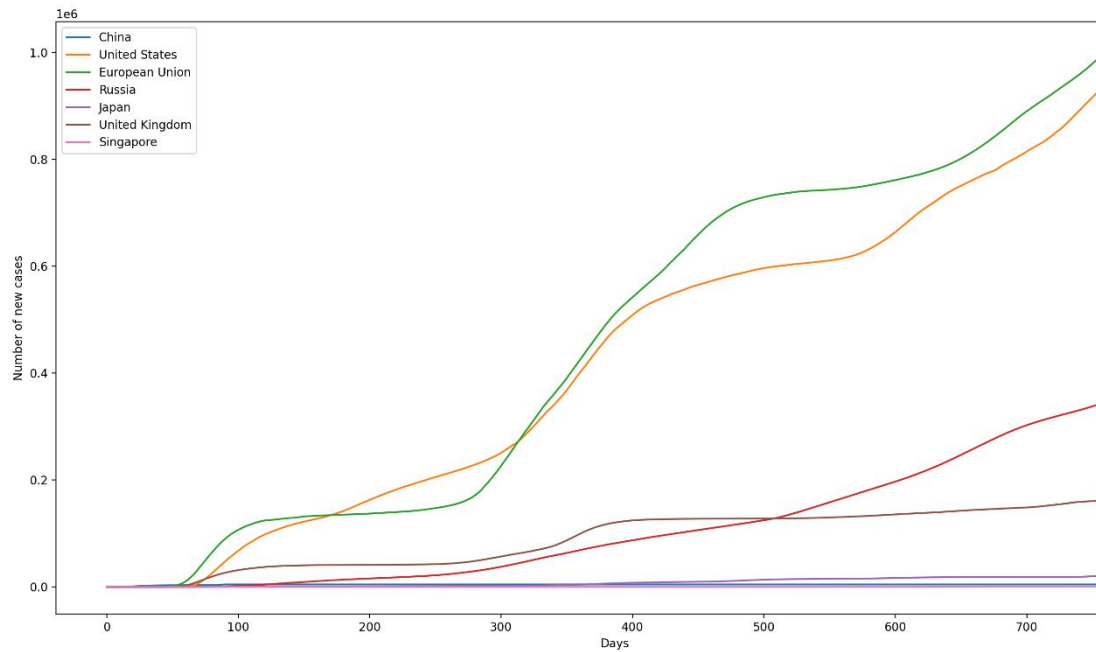
locs = ["China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore"]

path_root = r"D:\spark\exam\covid\covid_data\result\total_deaths"
all_data = []
valid_locs = []
for loc in locs:
    try:
        country_dir = os.path.join(path_root, loc)
        files = glob.glob(os.path.join(country_dir, "part-*.json"))
        if not files:
            print(f"警告: {loc} 目录下未找到part文件")
            continue

        country_df = pd.concat([pd.read_json(f, lines=True) for f in files])
        if country_df.empty:
            print(f"警告: {loc} 的数据为空")
            continue
        numeric_cols = country_df.select_dtypes(include=[np.number]).columns
        if len(numeric_cols) == 0:
            print(f"警告: {loc} 无数值列")
            continue

        tmp = country_df[numeric_cols[0]].values.astype(float) # 转换为浮点数
        all_data.append(tmp)
        valid_locs.append(loc)
    except:
        print(f"警告: {loc} 数据加载失败")

```



重点国家累计疫苗接种剂次

```
warnings.filterwarnings("ignore")

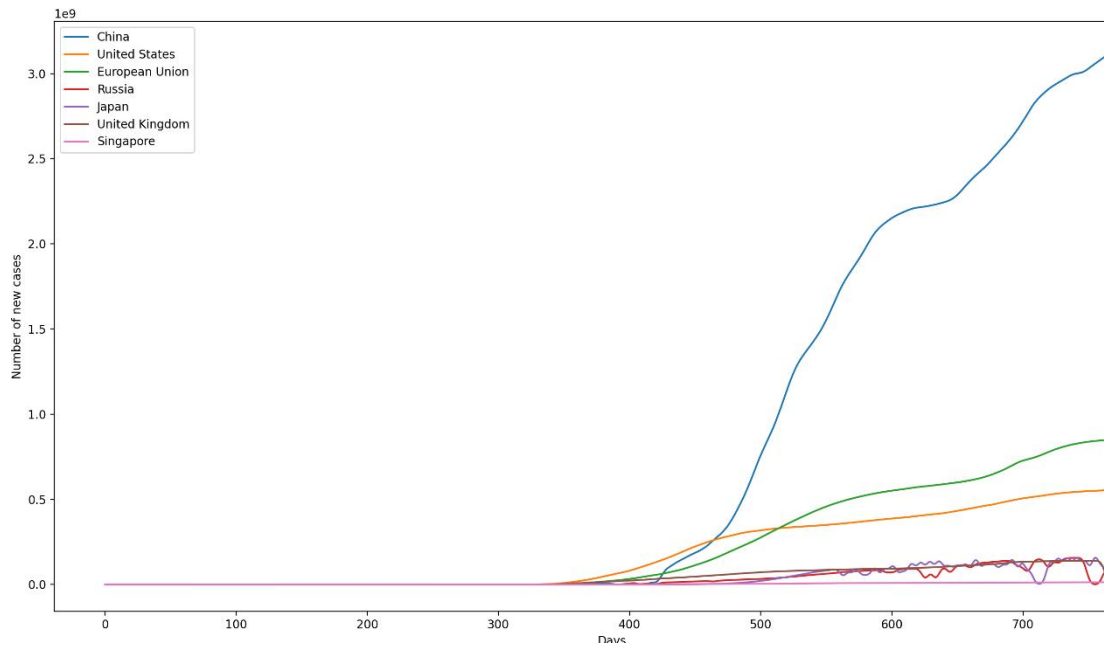
locs = ["China", "United States", "European Union", "Russia", "Japan", "United Kingdom", "Singapore"]

path_root = r"D:\spark\exam\covid\covid_data\result\total_vacc"
all_data = []
valid_locs = []
for loc in locs:
    try:
        country_dir = os.path.join(path_root, loc)
        files = glob.glob(os.path.join(country_dir, "part-*.json"))
        if not files:
            print(f"警告: {loc} 目录下未找到part文件")
            continue

        country_df = pd.concat([pd.read_json(f, lines=True) for f in files])
        if country_df.empty:
            print(f"警告: {loc} 的数据为空")
            continue

        numeric_cols = country_df.select_dtypes(include=[np.number]).columns
        if len(numeric_cols) == 0:
            print(f"警告: {loc} 无数值列")
            continue

        tmp = country_df[numeric_cols[0]].values.astype(float) # 转换为浮点数
        all_data.append(tmp)
```

全部国家每百万人累计病例

```
plt.rcParams['axes.unicode_minus'] = False

def read_json_lines(file_path): 1 usage
    with open(file_path, 'r', encoding='utf-8') as f:
        data = [json.loads(line) for line in f]
    return pd.DataFrame(data)

def process_million_cases(): 1 usage

    df = read_json_lines('D:/spark/exam/covid/covid_data/result/million_cases/million_cases.json')

    df.columns = ['location', 'cases_per_million']

    df = df.dropna()

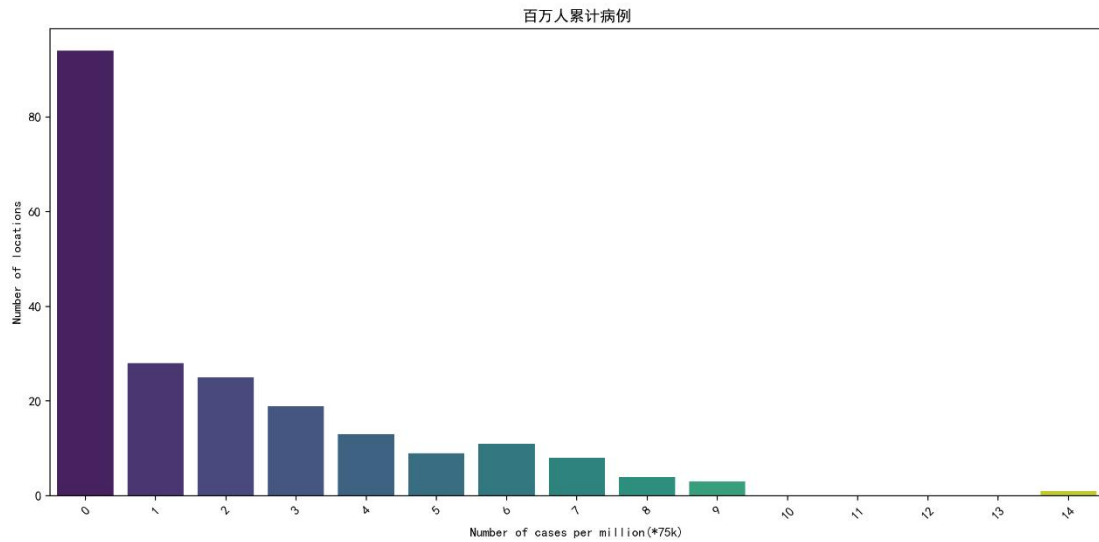
    df = df.sort_values(by='cases_per_million', ascending=False)

    bins = [0, 50000, 100000, 150000, 200000, 250000, 300000, 350000, 400000, 450000, 500000, 550000, 600000, 650000,
            700000, float('inf')]
    labels = ['0', '1', '2', '3', '4', '5',
             '6', '7', '8', '9', '10', '11',
             '12', '13', '14']

    df['cases_group'] = pd.cut(df['cases_per_million'], bins=bins, labels=labels, right=False)

    count_data = df['cases_group'].value_counts().sort_index()

    plt.figure(figsize=(12, 6))
    sns.barplot(x=count_data.index, y=count_data.values, palette='viridis')
    plt.title('百万人累计病例')
```



全部国家每百万人累计死亡

```
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import json

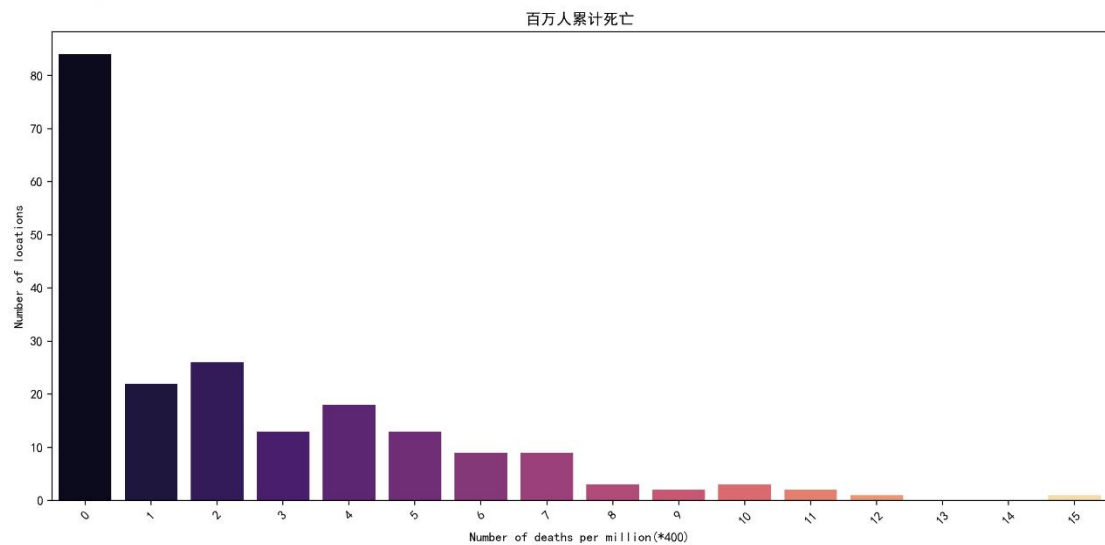
plt.rcParams['font.sans-serif'] = ['SimHei']
plt.rcParams['axes.unicode_minus'] = False

def read_json_lines(file_path): 1 usage
    with open(file_path, 'r', encoding='utf-8') as f:
        data = [json.loads(line) for line in f]
    return pd.DataFrame(data)

def process_million_deaths(): 1 usage
    df = read_json_lines('D:/spark/exam/covid/covid_data/result/million_deaths/million_deaths.json')
    df.columns = ['location', 'deaths_per_million']
    df = df.dropna()
    df = df.sort_values(by='deaths_per_million', ascending=False)

    bins = [0, 400, 800, 1200, 1600, 2000, 2400, 2800, 3200, 3600, 4000, 4400, 4800, 5200, 5600, 6000, float('inf')]
    labels = ['0', '1', '2', '3', '4', '5', '6',
              '7', '8', '9', '10', '11',
              '12', '13', '14', '15']








    df['deaths_group'] = pd.cut(df['deaths_per_million'], bins=bins, labels=labels, right=False)
    count_data = df['deaths_group'].value_counts().sort_index()
    plt.figure(figsize=(12, 6))
    sns.barplot(x=count_data.index, y=count_data.values, palette='magma')
    plt.title('百万人累计死亡')
    plt.xlabel('Number of deaths per million(*400)')
    plt.ylabel('Number of locations')
    plt.xticks(rotation=45)
    plt.tight_layout()
    plt.show()
```

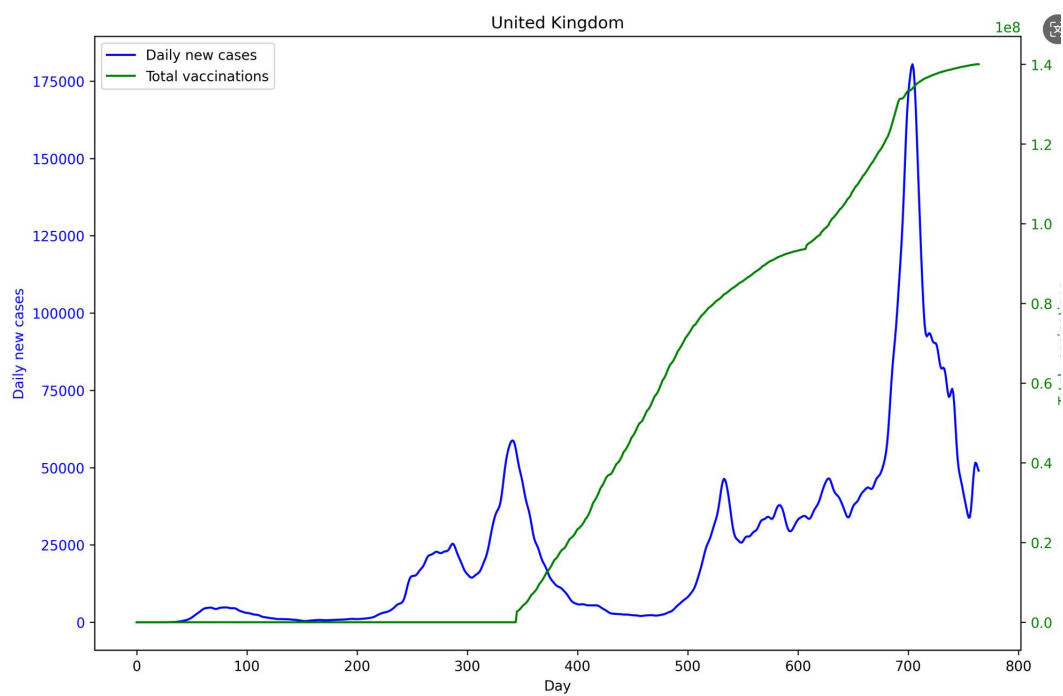


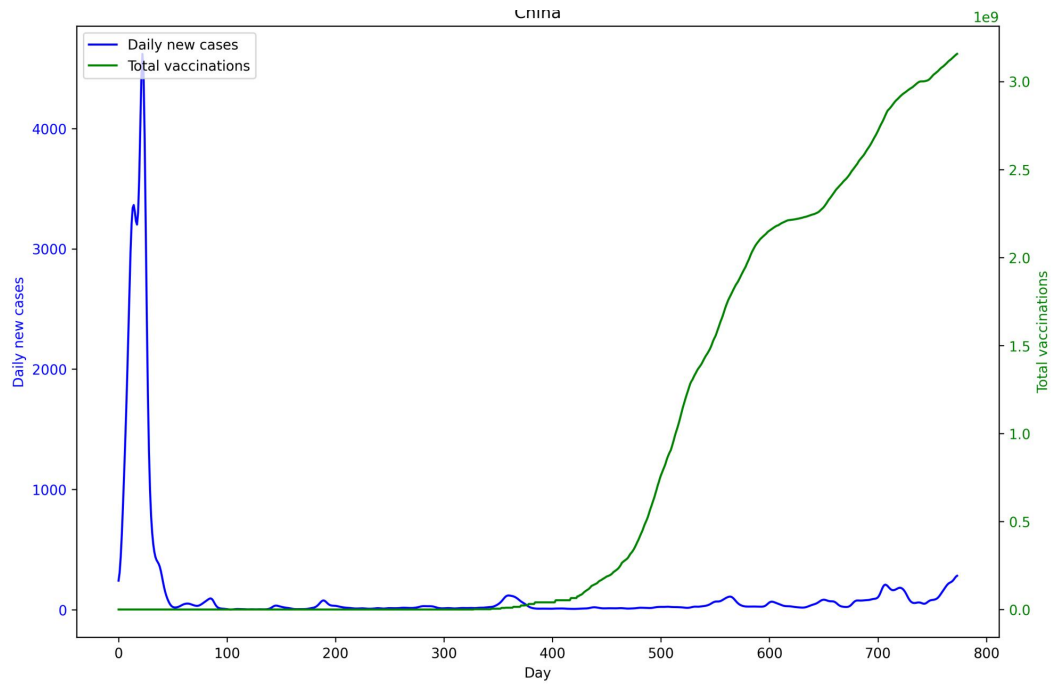
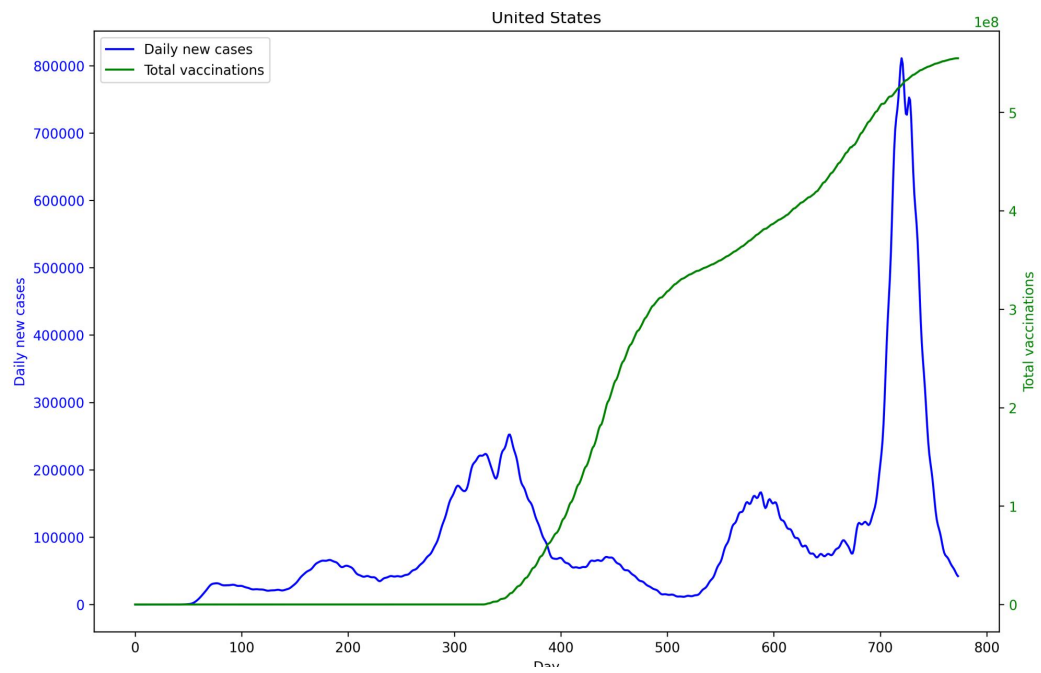
相关性分析

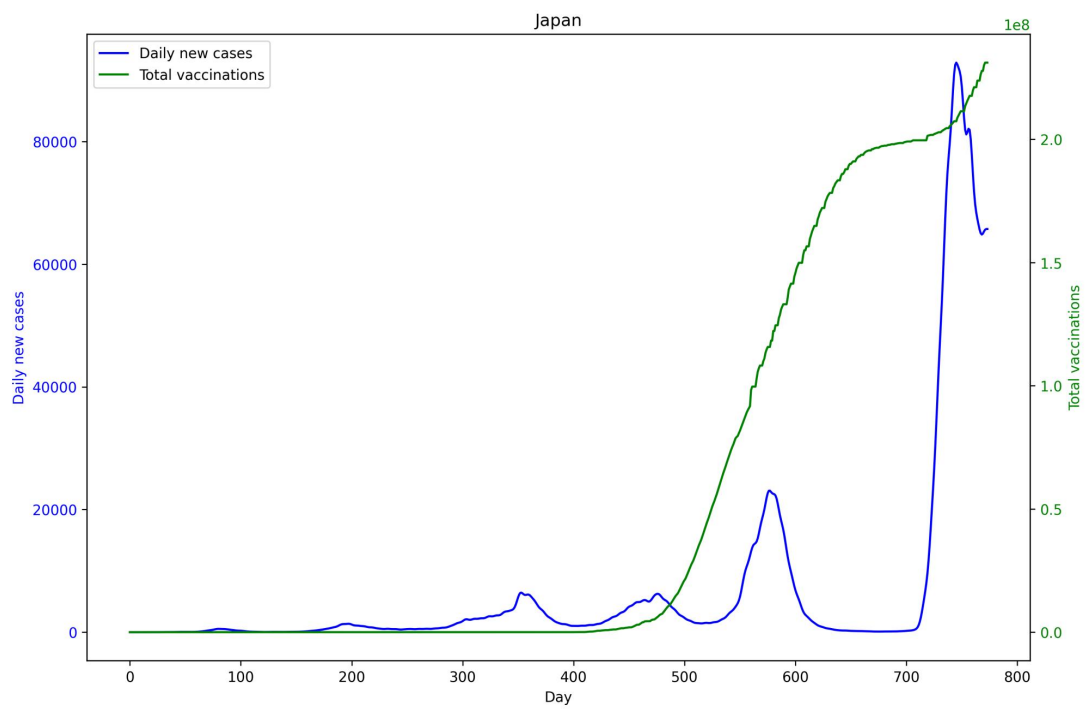
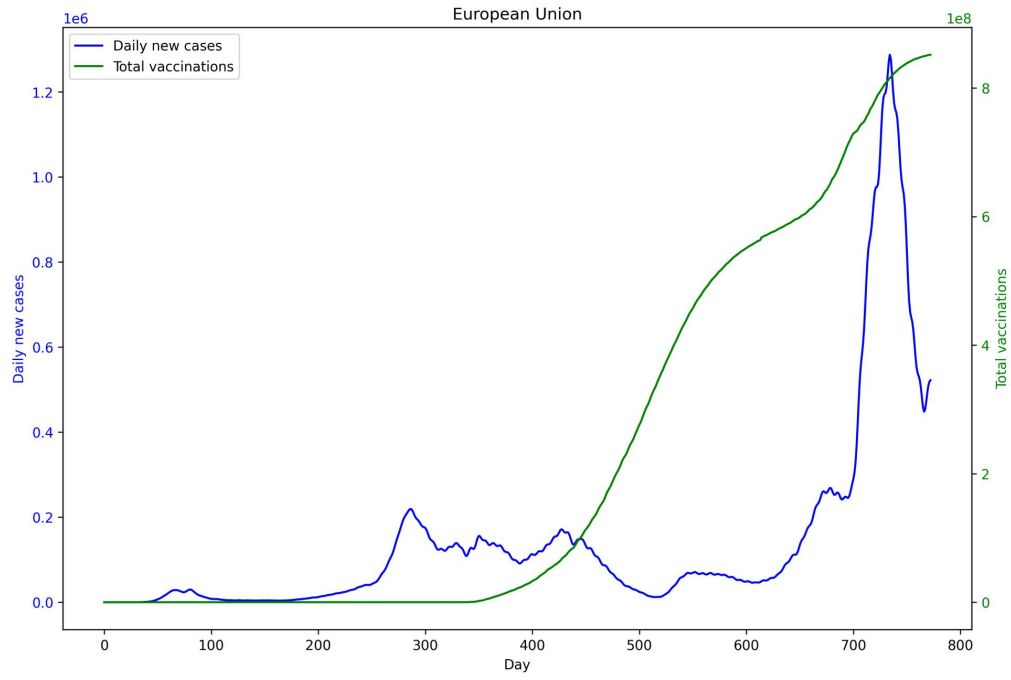
重点国家新增病例数量与疫苗剂次关系

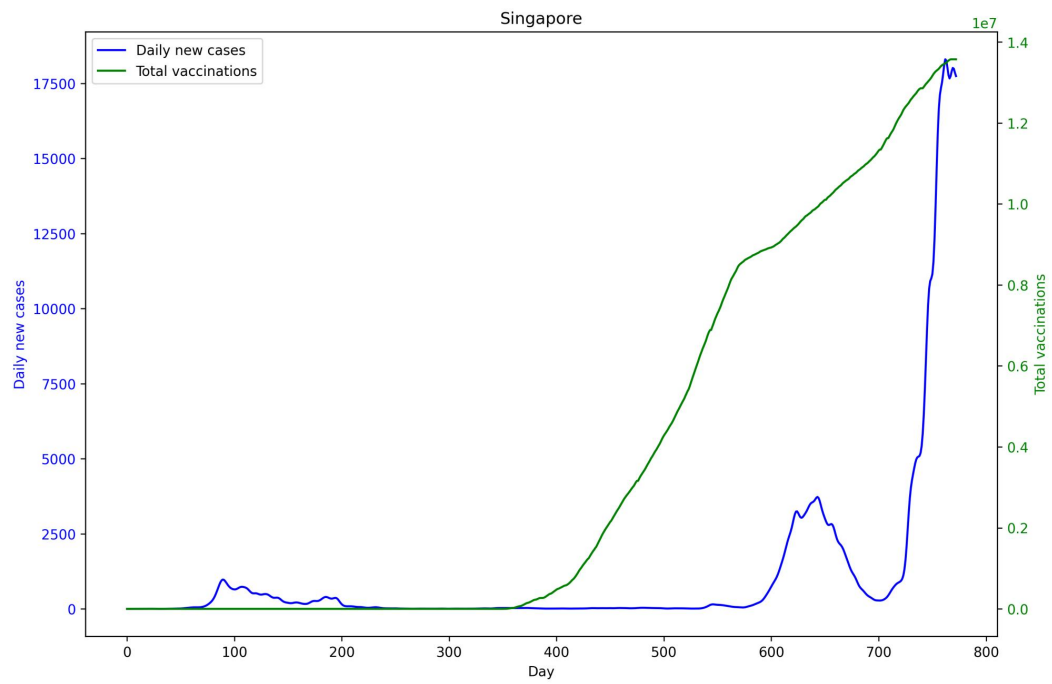
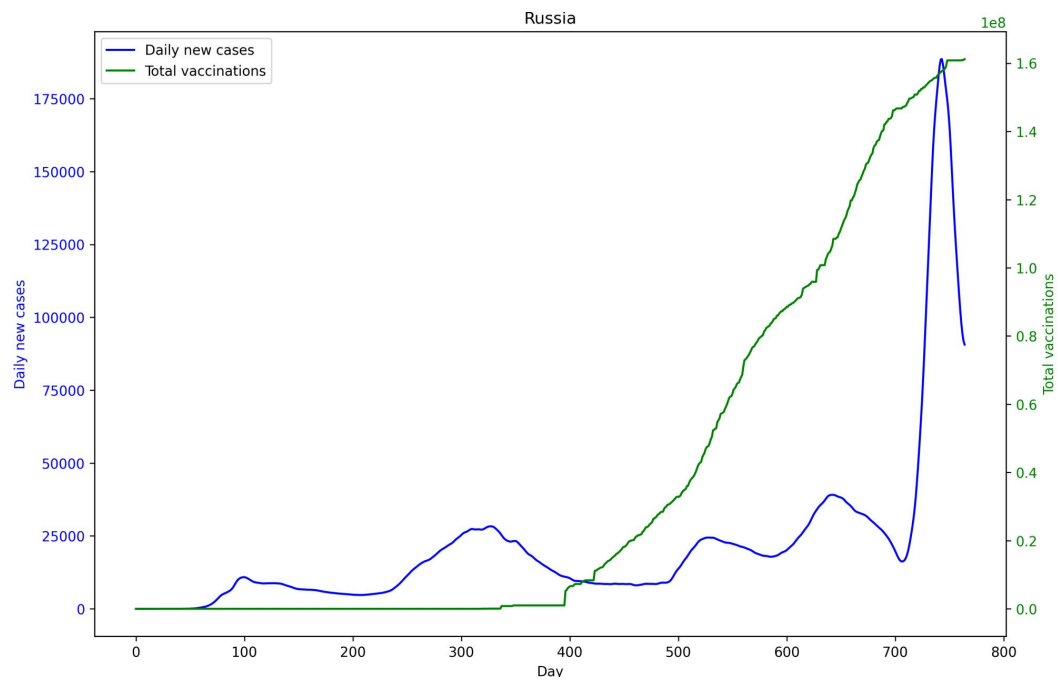
```
print(f"警告: {loc} 数据列不足2列")
continue
data = country_df[numeric_cols[:2]].values.T # 只取前两列
for col in data:
    if np.isnan(col[0]):
        col[0] = 0
    for i in range(len(col) - 1):
        if np.isnan(col[i + 1]):
            col[i + 1] = col[i]
data[0] = gaussian_filter1d(data[0], sigma=2.5)
plt.figure(figsize=(12, 8))
plt.title(loc)
ax1 = plt.gca()
ax1.plot(*args: data[0], 'b-', label='Daily new cases')
ax1.set_xlabel('Day')
ax1.set_ylabel('Daily new cases', color='b')
ax1.tick_params(axis='y', labelcolor='b')
ax2 = ax1.twinx()
ax2.plot(data[1], 'g-', label='Total vaccinations')
ax2.set_ylabel('Total vaccinations', color='g')
ax2.tick_params(axis='y', labelcolor='g')
lines1, labels1 = ax1.get_legend_handles_labels()
lines2, labels2 = ax2.get_legend_handles_labels()
ax1.legend(lines1 + lines2, labels1 + labels2, loc='upper left')
plt.savefig(*args: f'新增与疫苗关系_{loc}.png', bbox_inches='tight', dpi=300)
plt.close()
except Exception as e:
    print(f"处理 {loc} 时出错: {str(e)}")
    continue
print("处理完成")
```


| | | |
|--|-----------------|-------|
|  新增与疫苗关系_China.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_European Union.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_Japan.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_Russia.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_Singapore.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_United Kingdom.png | 2025/5/11 17:25 | PNG 图 |
|  新增与疫苗关系_United States.png | 2025/5/11 17:25 | PNG 图 |

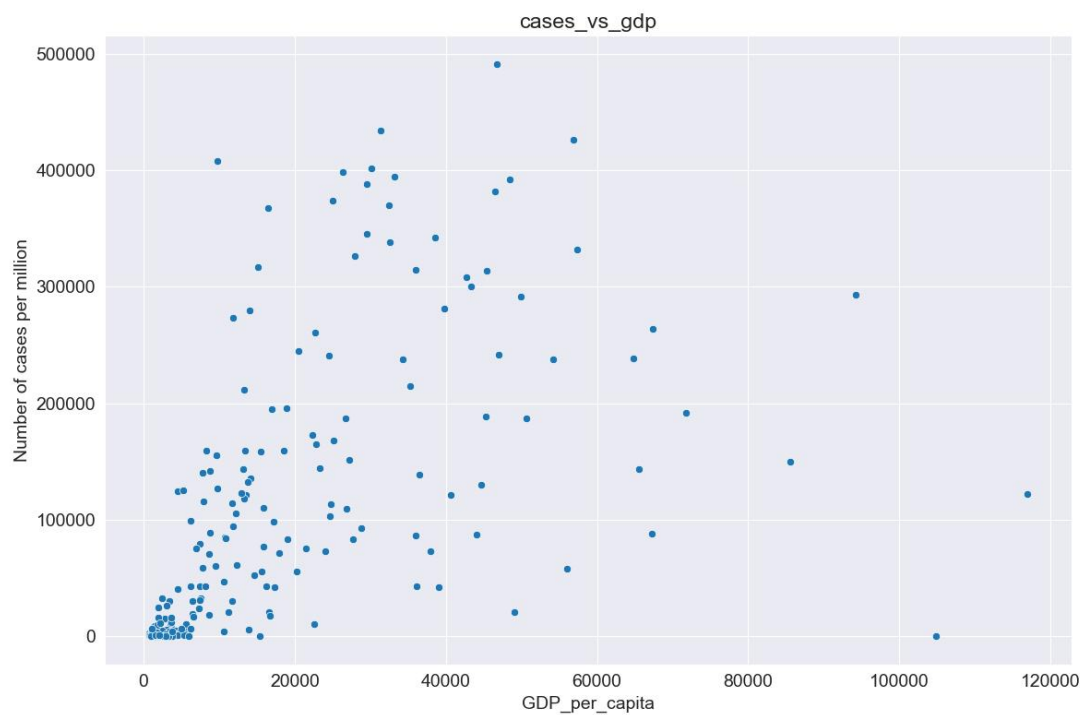




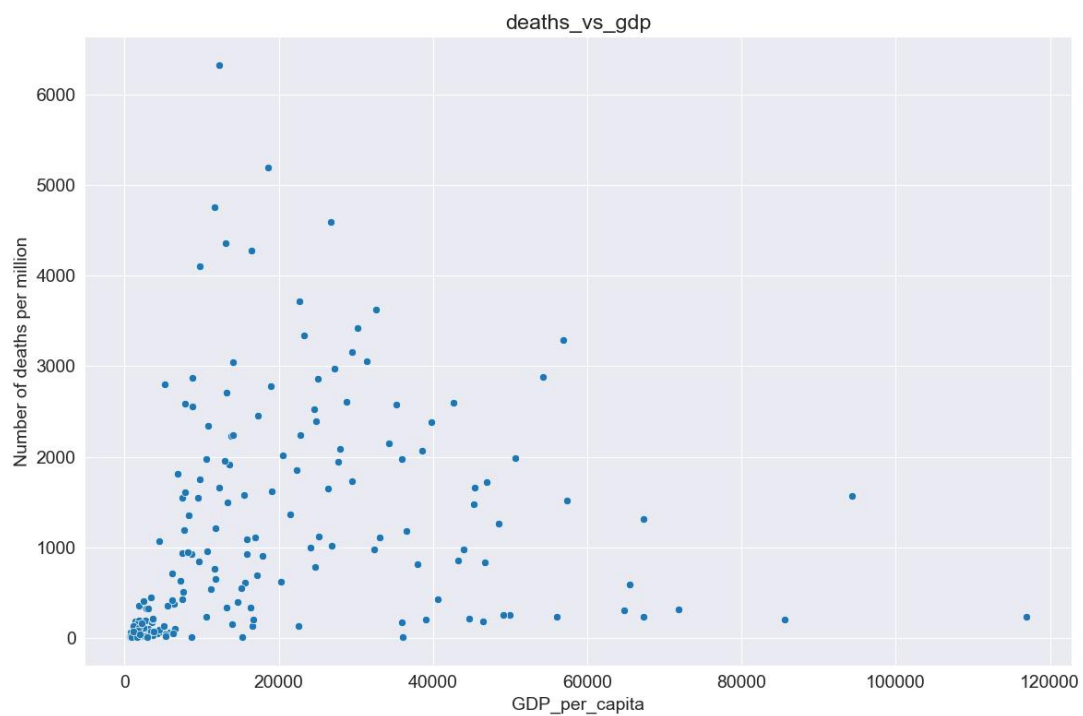




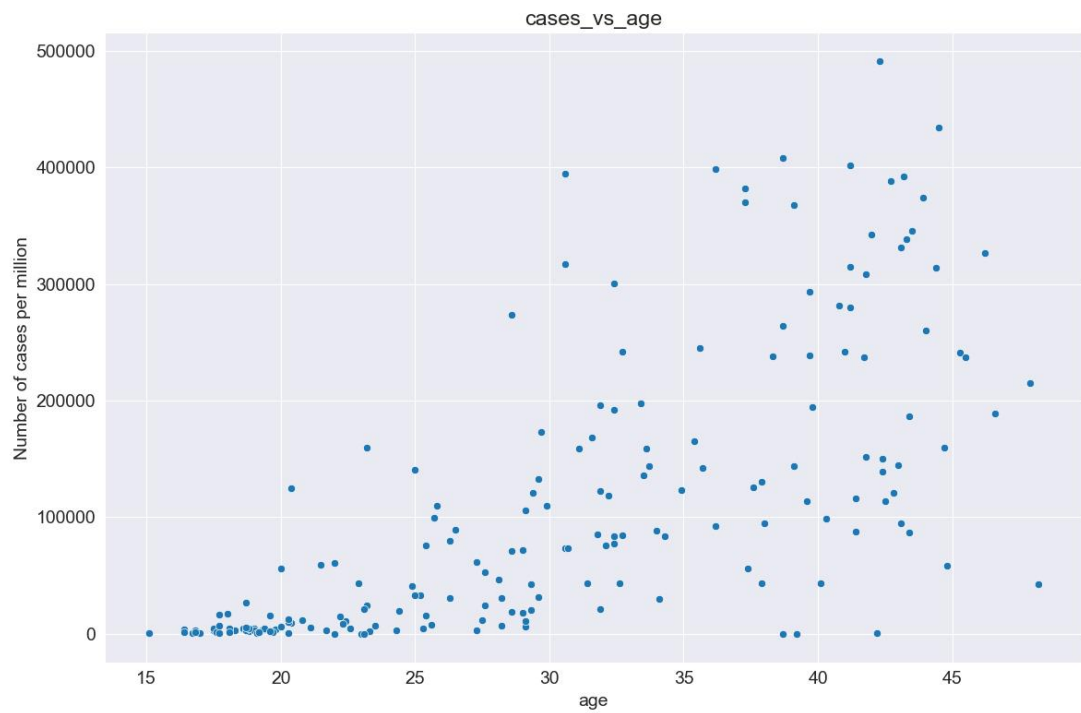
全部国家每百万人累计病例与人均 GDP 关系



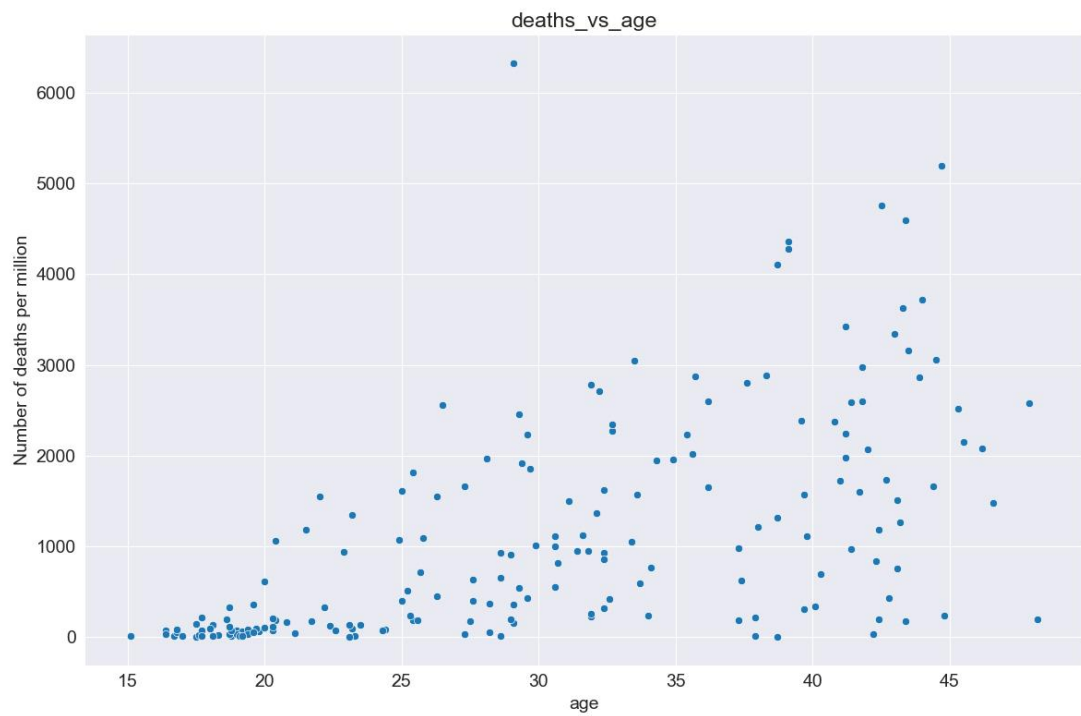
全部国家每百万人累计死亡与人均 GDP 关系



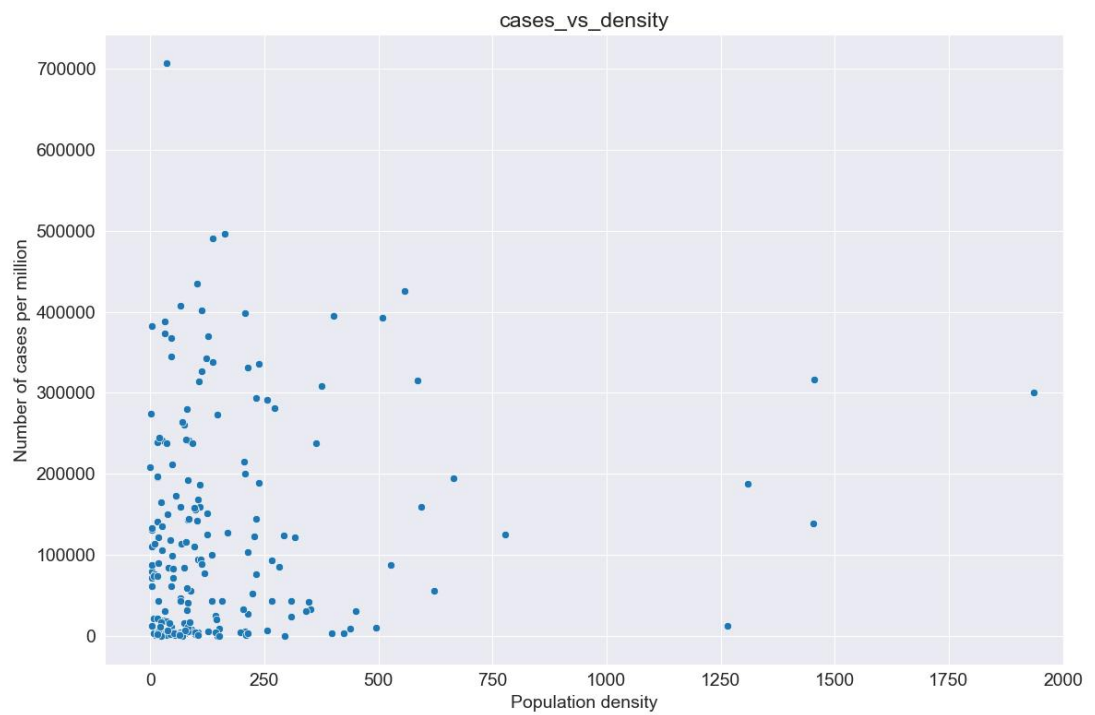
全部国家每百万人累计病例与年龄中位数关系



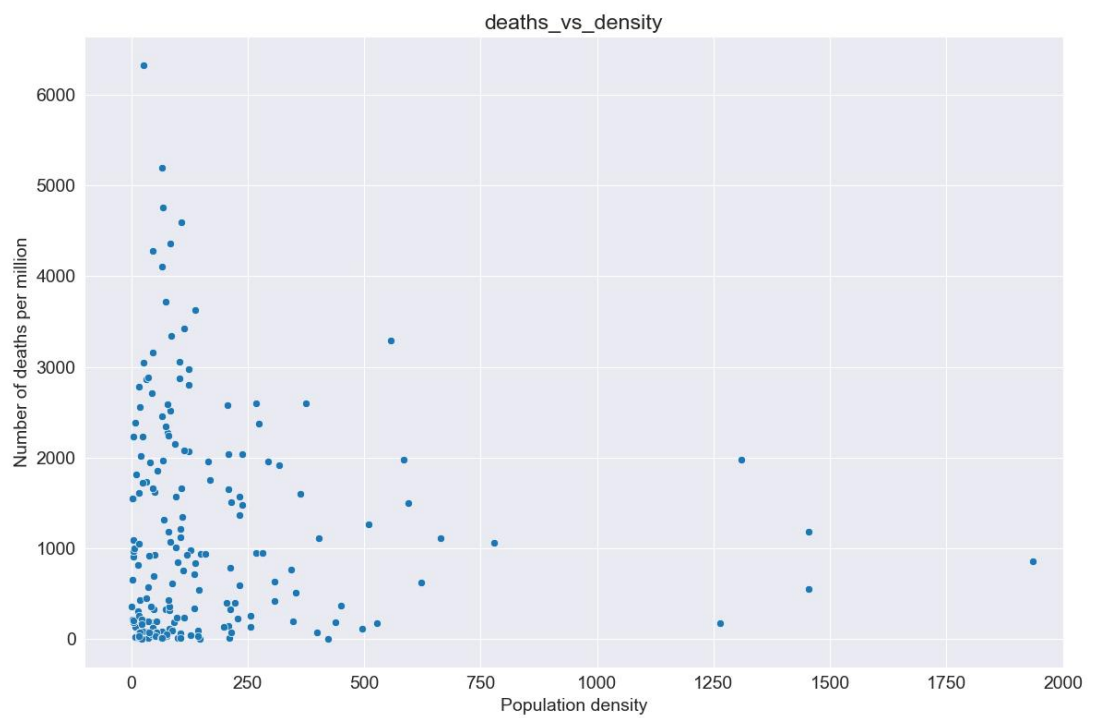
全部国家每百万人累计死亡与年龄中位数关系



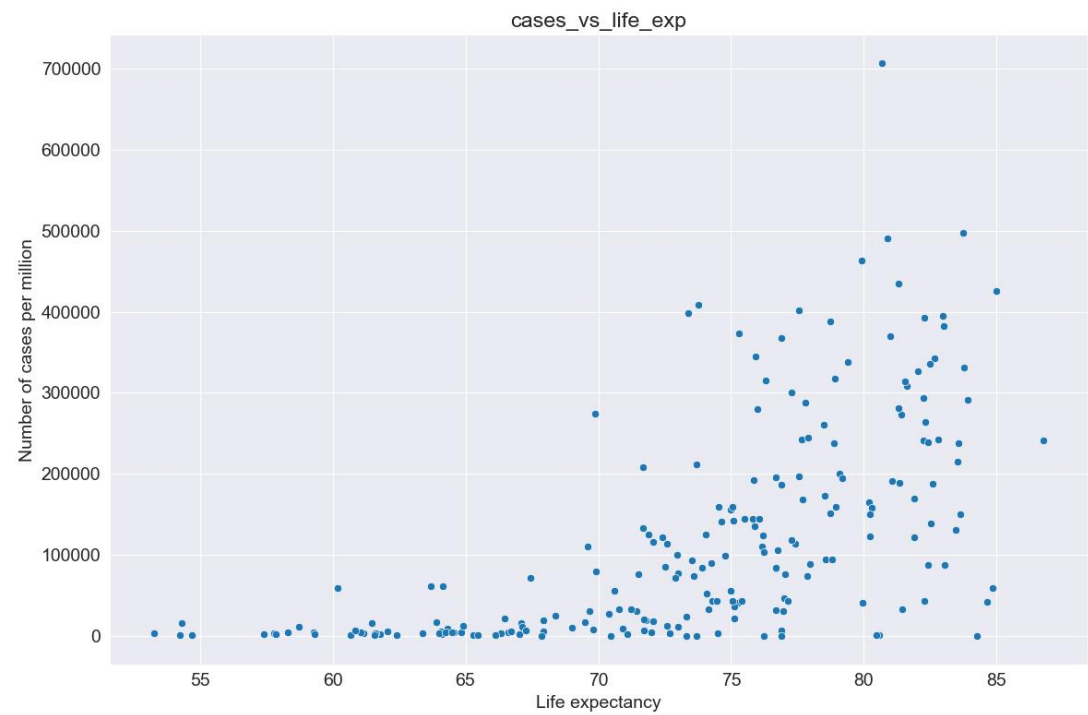
全部国家每百万人累计病例与人口密度关系



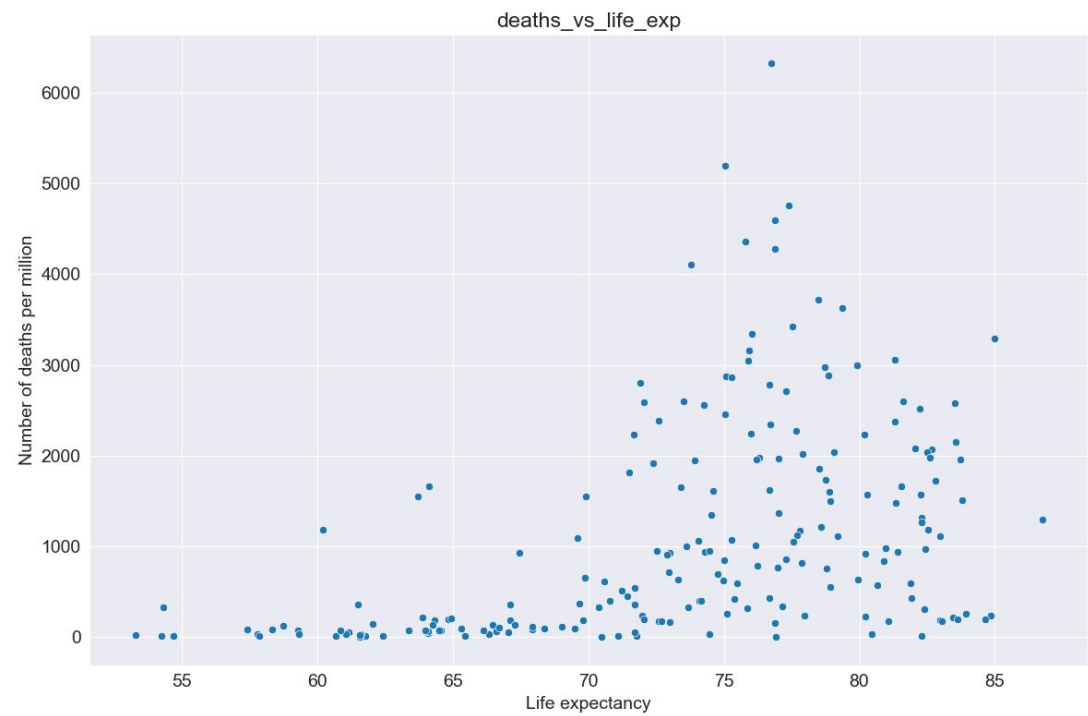
全部国家每百万人累计死亡与人口密度关系



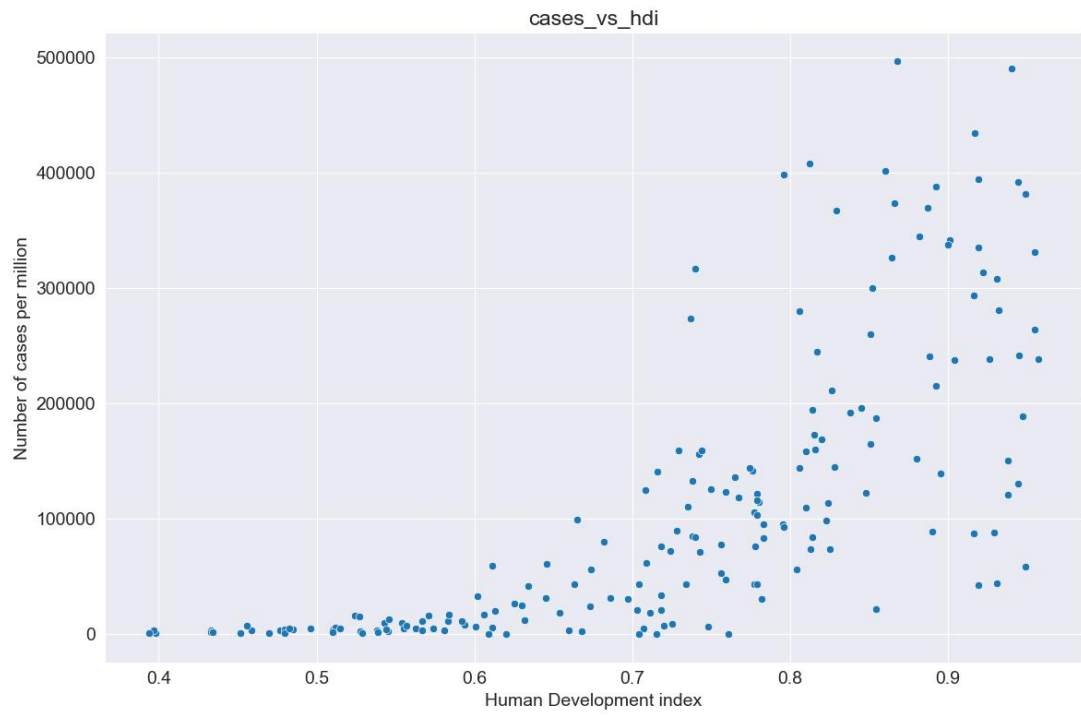
全部国家每百万人累计病例与期望寿命关系



全部国家每百万人累计死亡与期望寿命关系



全部国家每百万人累计病例与 HDI 关系



全部国家每百万人累计死亡与 HDI 关系

