

```
In [ ]: import os
import pandas as pd
from matplotlib import pyplot as plt
import seaborn as sns
import warnings

sns.set_theme(style="ticks")
warnings.simplefilter(action='ignore', category=FutureWarning)
```

1) Data ingestion and preparation

Steps:

- Reading data from csv into pandas dataframe
- Checking for missing values in all columns
- Convert datetime string to date
- Correct misspelled "CustomerName"

```
In [ ]: # Reading input data
data_path = os.path.abspath(os.path.join(os.path.abspath(""), '..', 'data'))
df = pd.read_csv(f'{data_path}/usageData.csv')
#display(df)
```

```
In [ ]: # Check if we have any missing data
print(df.isna().sum())
```

```
Date          0
Region        0
VMSeries       0
unit          0
ComputeUsage   0
SubscriptionID 0
CustomerName   0
dtype: int64
```

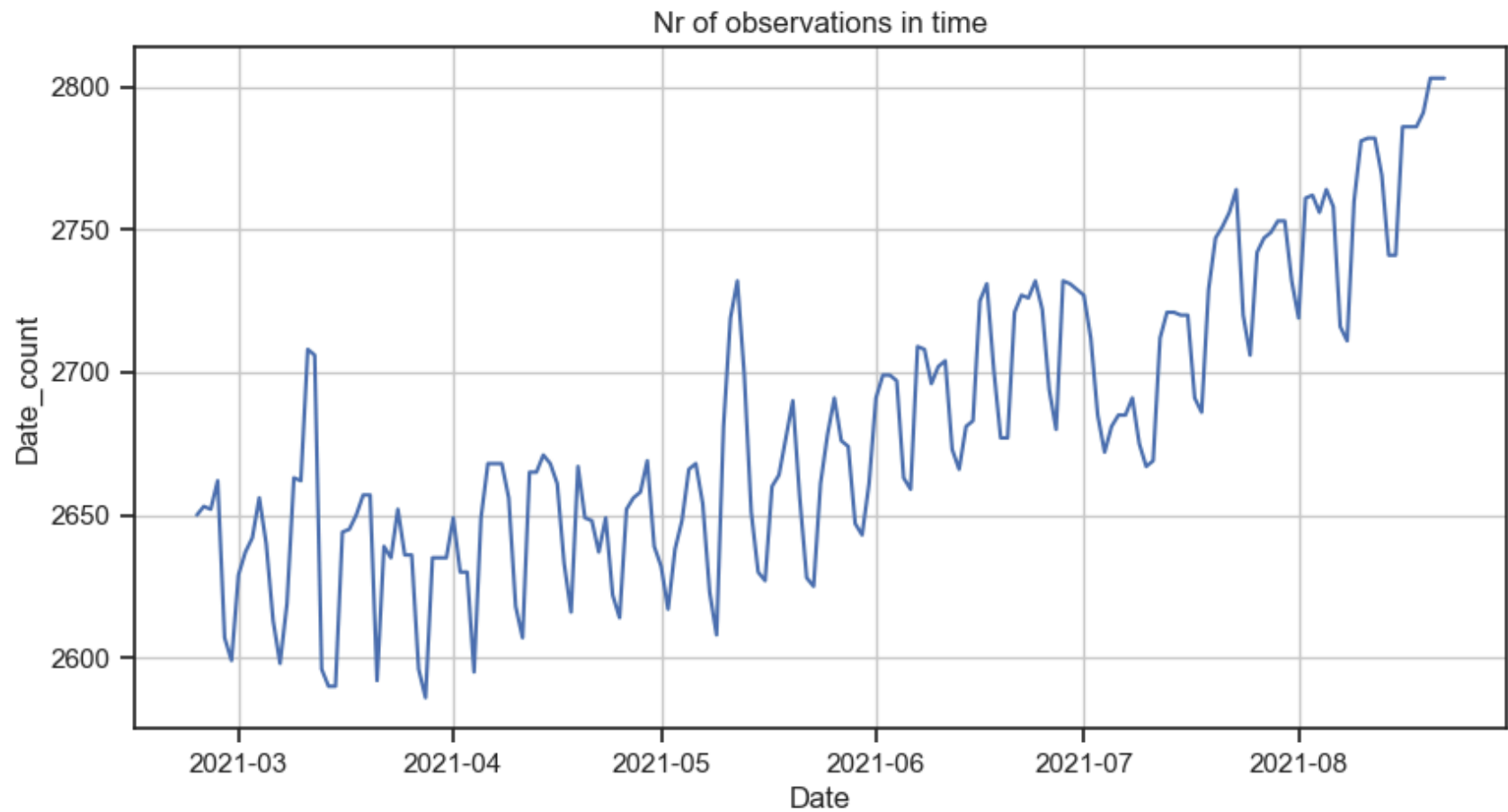
```
In [ ]: # Data preparation
df['Date'] = pd.to_datetime(df['Date']).dt.date
```

```
df['CustomerName'] = df['CustomerName'].str.replace('CustomberB', 'CustomerB')
```

2) Visialization through time

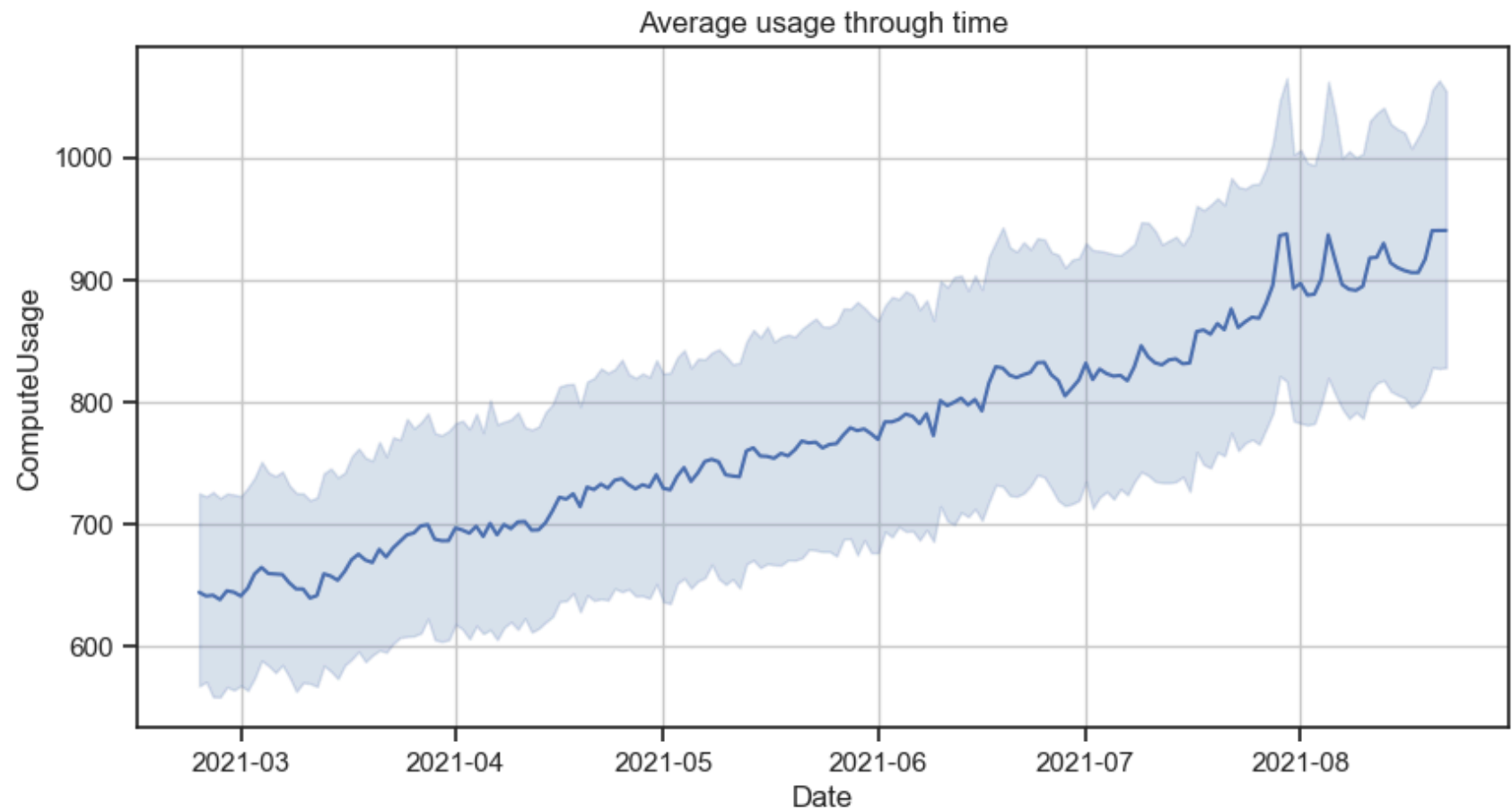
```
In [ ]: # Nr of observations through time
df_plt = df.groupby('Date').agg(Date_count=pd.NamedAgg(column="Date", aggfunc="count"),
                                ComputeUsage_avg=pd.NamedAgg(column="ComputeUsage", aggfunc="mean"),
                                ComputeUsage_min=pd.NamedAgg(column="ComputeUsage", aggfunc="min"),
                                ComputeUsage_max=pd.NamedAgg(column="ComputeUsage", aggfunc="max")
                                ) \
        .reset_index()

plt.figure(figsize=(10,5))
sns.lineplot(data=df_plt, x='Date', y='Date_count')
plt.grid()
plt.title("Nr of observations in time")
plt.show()
```

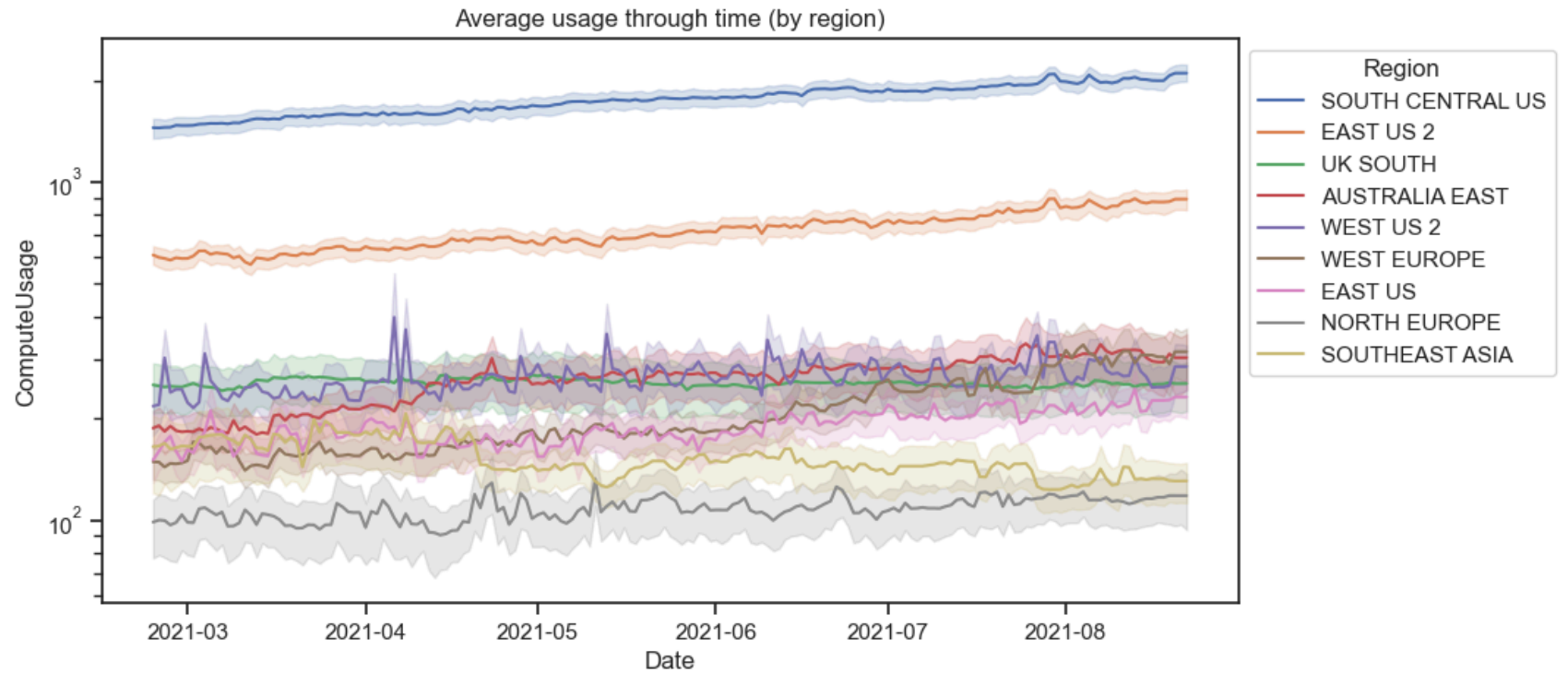


- The number of observations are increasing with time

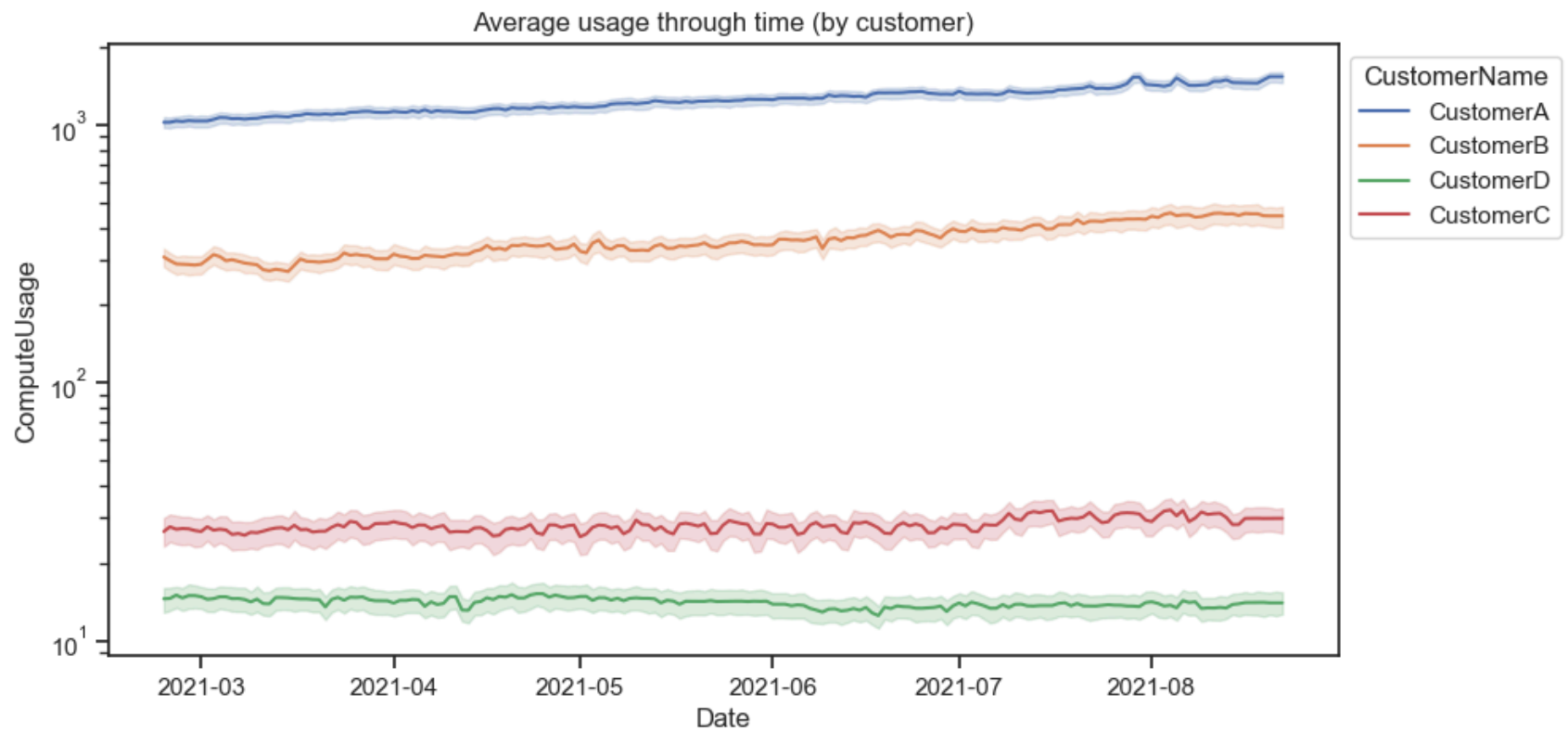
```
In [ ]: plt.figure(figsize=(10,5))
sns.lineplot(data=df, x='Date', y='ComputeUsage', estimator='mean', errorbar=('ci', 95))
plt.grid()
plt.title("Average usage through time")
plt.show()
```



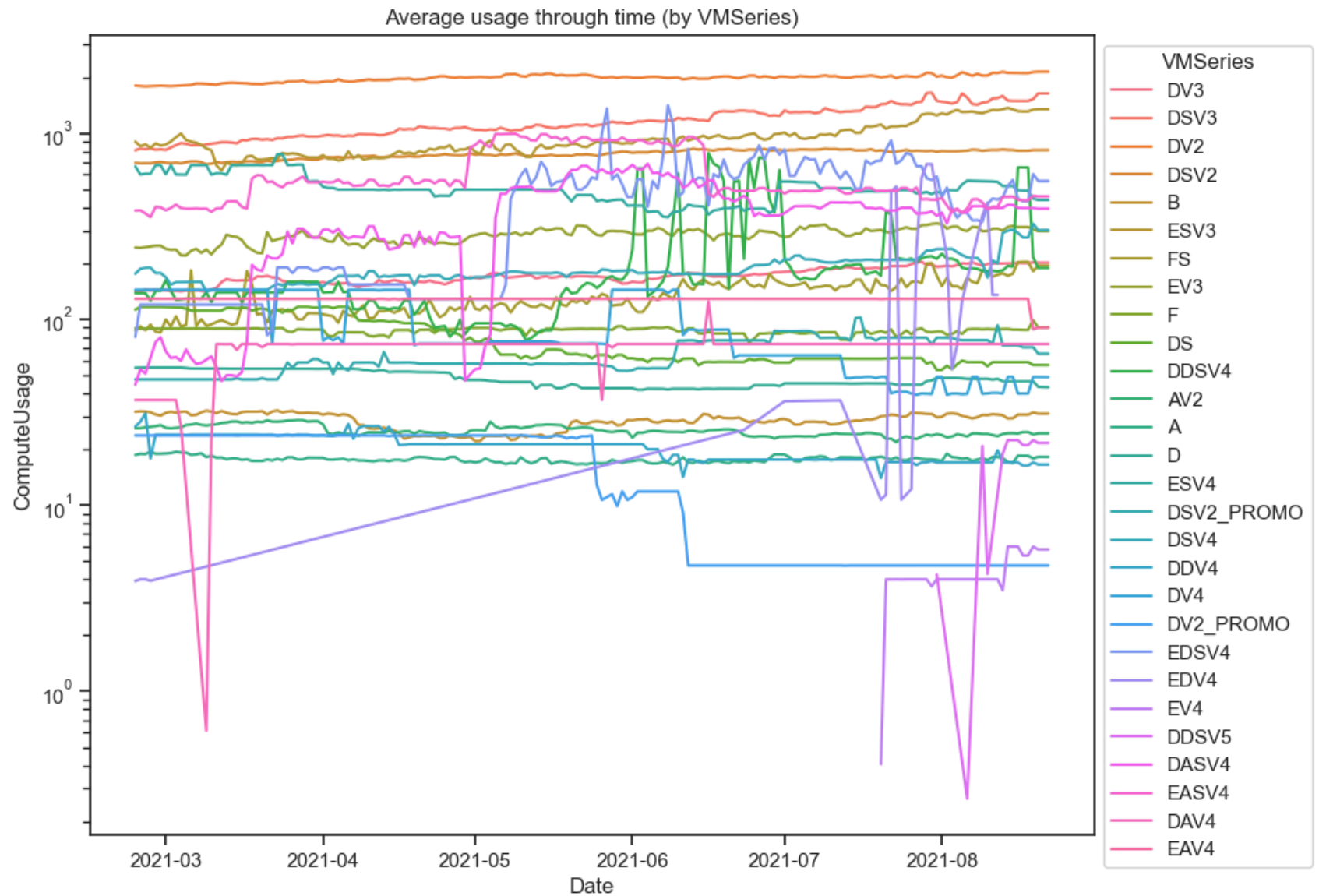
```
In [ ]: plt.figure(figsize=(10,5))
ax = sns.lineplot(data=df, x='Date', y='ComputeUsage', estimator='mean', errorbar=('ci', 50), hue='Region')
sns.move_legend(ax, "upper left", bbox_to_anchor=(1, 1))
ax.set(yscale='log')
plt.title("Average usage through time (by region)")
plt.show()
```



```
In [ ]: plt.figure(figsize=(10,5))
ax = sns.lineplot(data=df, x='Date', y='ComputeUsage', estimator='mean', errorbar=('ci', 50), hue='CustomerName')
sns.move_legend(ax, "upper left", bbox_to_anchor=(1, 1))
ax.set(yscale='log')
plt.title("Average usage through time (by customer)")
plt.show()
```



```
In [ ]: plt.figure(figsize=(10,8))
ax = sns.lineplot(data=df, x='Date', y='ComputeUsage', estimator='mean', errorbar=None, hue='VMSeries')
sns.move_legend(ax, "upper left", bbox_to_anchor=(1, 1))
ax.set(yscale='log')
plt.title("Average usage through time (by VMSeries)")
plt.show()
```



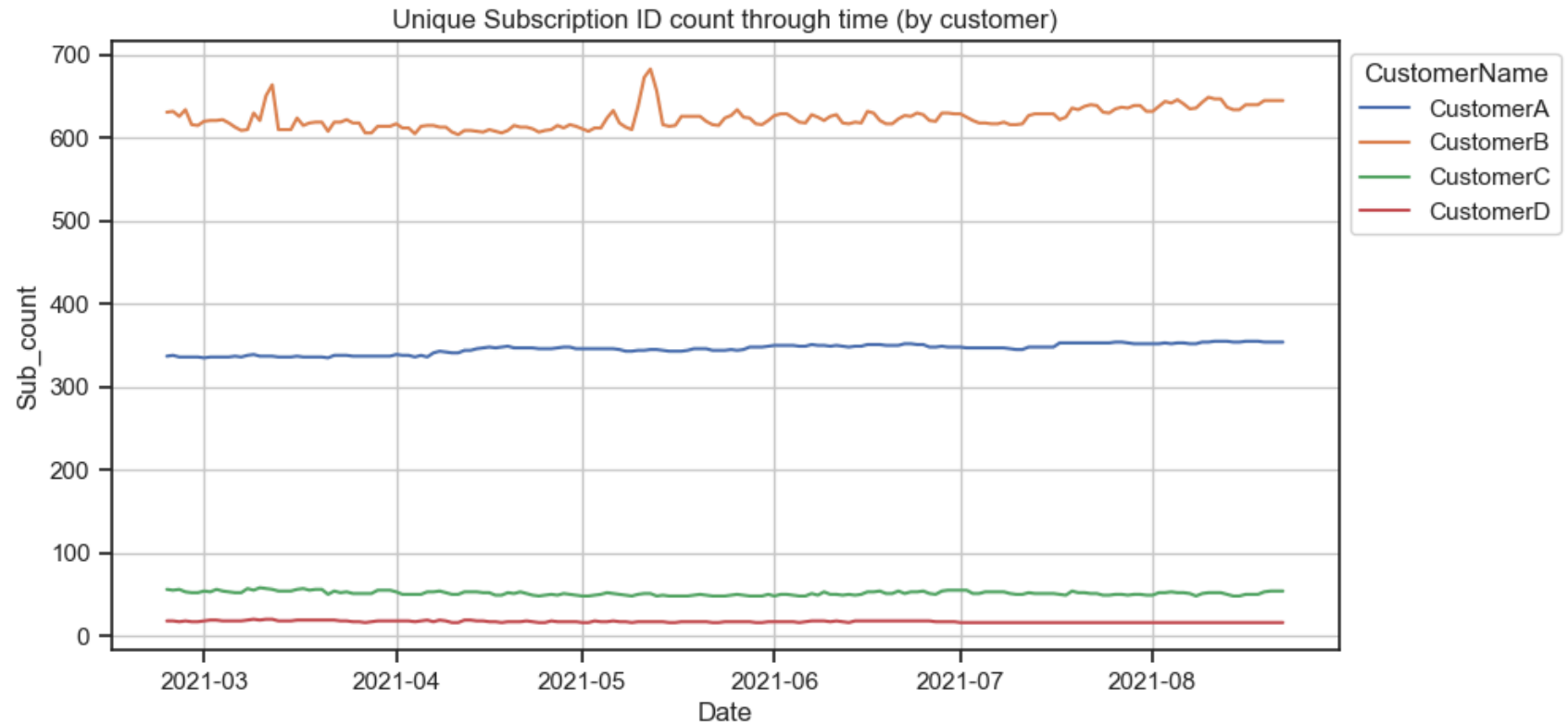
3) Visualization by customer

```
In [ ]: # Number of subscription IDs by customer
display(df.groupby('CustomerName')['SubscriptionID'].nunique())
```

```
CustomerName
CustomerA    393
CustomerB    902
CustomerC     74
CustomerD     22
Name: SubscriptionID, dtype: int64
```

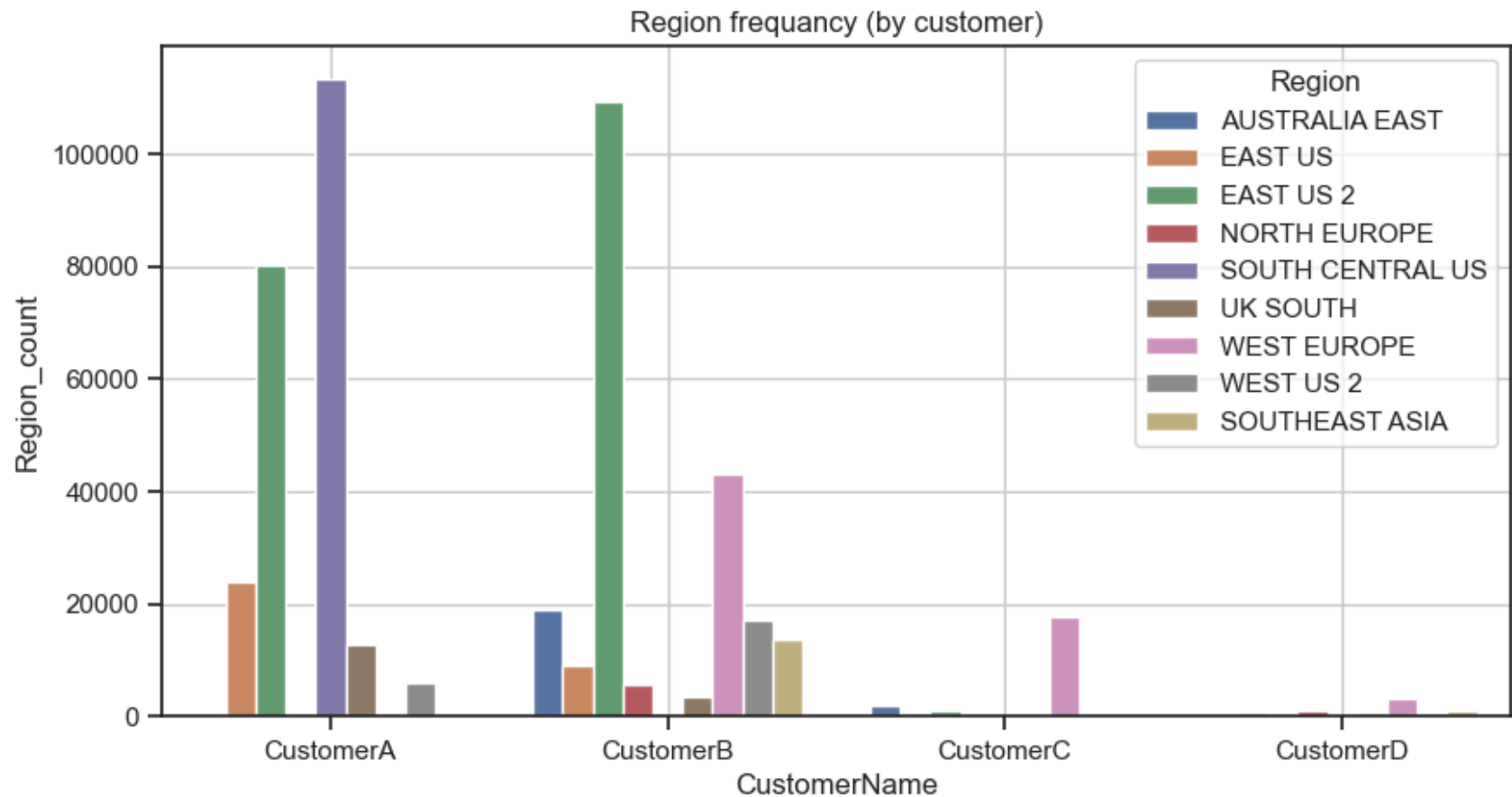
```
In [ ]: df_plt = df.groupby(['CustomerName', 'Date']).agg(Sub_count=pd.NamedAgg(column="SubscriptionID", aggfunc="nunique"))

plt.figure(figsize=(10,5))
ax = sns.lineplot(data=df_plt, x='Date', y='Sub_count', hue='CustomerName')
sns.move_legend(ax, "upper left", bbox_to_anchor=(1, 1))
plt.grid()
plt.title("Unique Subscription ID count through time (by customer)")
plt.show()
```




```
In [ ]: df_plt = df.groupby(['CustomerName', 'Region']).agg(Region_count=pd.NamedAgg(column="Region", aggfunc="count")).reset_index()

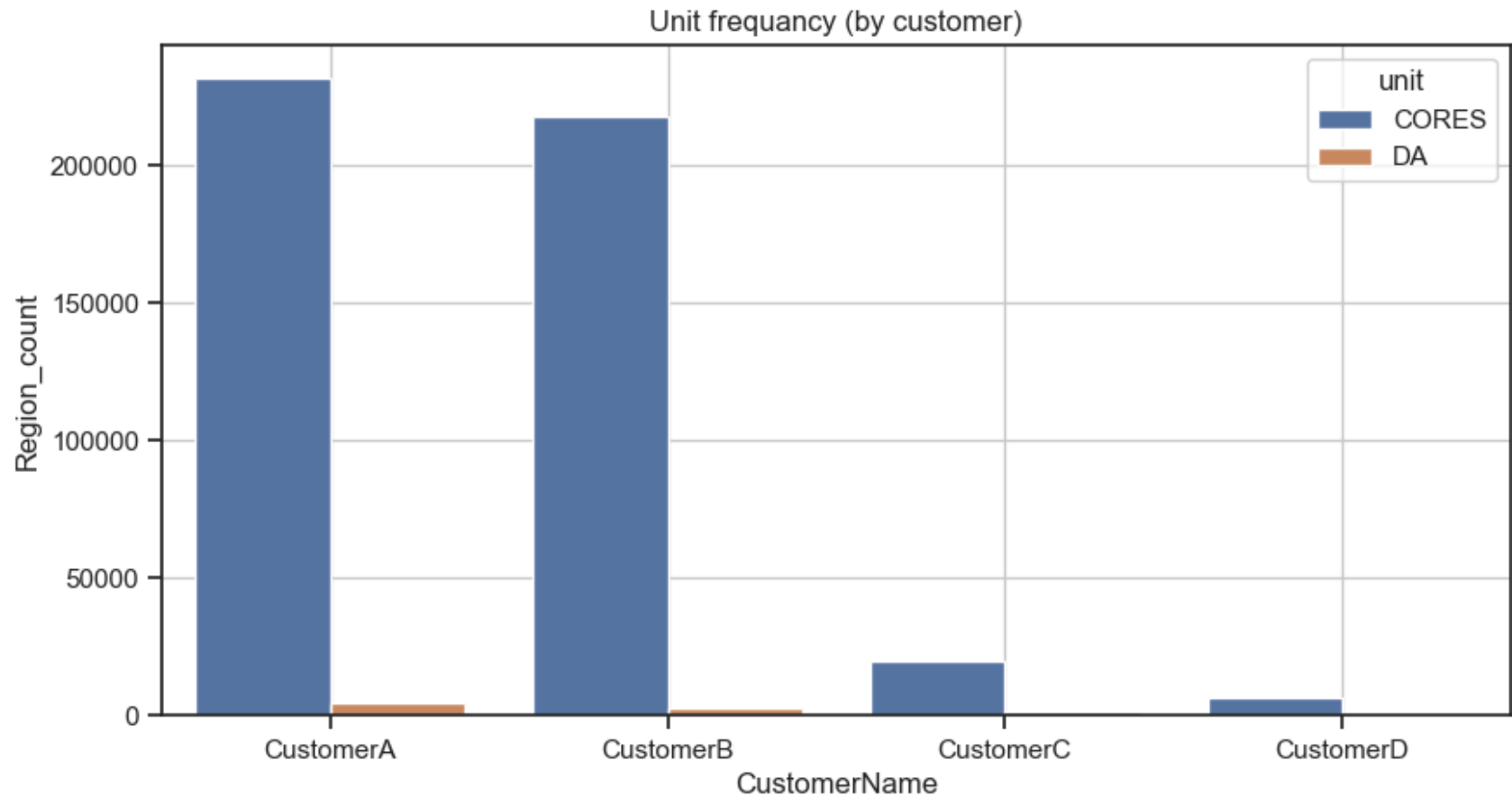
plt.figure(figsize=(10,5))
sns.barplot(data = df_plt, x="CustomerName", y="Region_count", hue="Region")
plt.grid()
plt.title("Region frequency (by customer)")
plt.show()
```



```
In [ ]: df_plt = df.groupby(['CustomerName', 'unit']).agg(Region_count=pd.NamedAgg(column="unit", aggfunc="count")).reset_index()

plt.figure(figsize=(10,5))
sns.barplot(data = df_plt, x="CustomerName", y="Region_count", hue="unit")
plt.grid()
```

```
plt.title("Unit frequency (by customer)")  
plt.show()
```



4) Conclusions

- The number of observations in the dataset is increasing with time
- Average ComputeUsage has a positive trend
- Most of the ComputeUsage comes from "South Central US" and "East US2" regions
- Customers A, B and C are the customers with the highest usage
- Customers A and B also have the highest number of subscriptions
- Customer A has half the number of subscriptions of customer B, but has significantly higher ComputeUsage

- Customers A and B use mostly resources from US region (South Central and East 2)
- Customers C and D use mostly resources from West Europe region