

```
In [29]: import requests
import sys
import os
sys.path.append(os.path.abspath(os.path.join(os.getcwd(), '..', '..')))
from credential import FMP_API_KEY
from highlight_text import ax_text, fig_text
import pandas as pd
import matplotlib.pyplot as plt

import morethemes as mt
```

```
In [3]: url = "https://financialmodelingprep.com/api/v3/income-statement/AAPL"
params = {
    "period": "annual",
    "limit": 10,
    "apikey": FMP_API_KEY
}

r = requests.get(url, params=params, timeout=30)
data = r.json()
print(data)
```

[{'date': '2024-09-28', 'symbol': 'AAPL', 'reportedCurrency': 'USD', 'cik': '0000320193', 'fillingDate': '2024-11-01', 'acceptedDate': '2024-11-01 06:01:36', 'calendarYear': '2024', 'period': 'FY', 'revenue': 391035000000, 'costOfRevenue': 210352000000, 'grossProfit': 180683000000, 'grossProfitRatio': 0.4620634982, 'researchAndDevelopmentExpenses': 31370000000, 'generalAndAdministrativeExpenses': 0, 'sellingAndMarketingExpenses': 0, 'sellingGeneralAndAdministrativeExpenses': 26097000000, 'otherExpenses': 0, 'operatingExpenses': 57467000000, 'costAndExpenses': 267819000000, 'interestIncome': 0, 'interestExpense': 0, 'depreciationAndAmortization': 11445000000, 'ebitda': 134661000000, 'ebitdaratio': 0.3443707085, 'operatingIncome': 123216000000, 'operatingIncomeRatio': 0.3151022287, 'totalOtherIncomeExpensesNet': 269000000, 'incomeBeforeTax': 123485000000, 'incomeBeforeTaxRatio': 0.3157901467, 'incomeTaxExpense': 29749000000, 'netIncome': 93736000000, 'netIncomeRatio': 0.2397125577, 'eps': 6.11, 'epsdiluted': 6.08, 'weightedAverageShsOut': 15343783000, 'weightedAverageShsOutDil': 15408095000, 'link': 'https://www.sec.gov/Archives/edgar/data/320193/000032019324000123/0000320193-24-000123-index.htm', 'finalLink': 'https://www.sec.gov/Archives/edgar/data/320193/000032019324000123/aapl-20240928.htm'}, {'date': '2023-09-30', 'symbol': 'AAPL', 'reportedCurrency': 'USD', 'cik': '0000320193', 'fillingDate': '2023-11-03', 'acceptedDate': '2023-11-02 18:08:27', 'calendarYear': '2023', 'period': 'FY', 'revenue': 383285000000, 'costOfRevenue': 214137000000, 'grossProfit': 169148000000, 'grossProfitRatio': 0.4413112958, 'researchAndDevelopmentExpenses': 29915000000, 'generalAndAdministrativeExpenses': 0, 'sellingAndMarketingExpenses': 0, 'sellingGeneralAndAdministrativeExpenses': 24932000000, 'otherExpenses': 0, 'operatingExpenses': 54847000000, 'costAndExpenses': 268984000000, 'interestIncome': 3750000000, 'interestExpense': 3933000000, 'depreciationAndAmortization': 11519000000, 'ebitda': 125820000000, 'ebitdaratio': 0.3282674772, 'operatingIncome': 114301000000, 'operatingIncomeRatio': 0.2982141227, 'totalOtherIncomeExpensesNet': -565000000, 'incomeBeforeTax': 113736000000, 'incomeBeforeTaxRatio': 0.2967400237, 'incomeTaxExpense': 16741000000, 'netIncome': 96995000000, 'netIncomeRatio': 0.2530623426, 'eps': 6.16, 'epsdiluted': 6.13, 'weightedAverageShsOut': 15744231000, 'weightedAverageShsOutDil': 15812547000, 'link': 'https://www.sec.gov/Archives/edgar/data/320193/000032019323000106/0000320193-23-000106-index.htm', 'finalLink': 'https://www.sec.gov/Archives/edgar/data/320193/000032019323000106/aapl-20230930.htm'}, {'date': '2022-09-24', 'symbol': 'AAPL', 'reportedCurrency': 'USD', 'cik': '0000320193', 'fillingDate': '2022-10-28', 'acceptedDate': '2022-10-27 18:01:14', 'calendarYear': '2022', 'period': 'FY', 'revenue': 394328000000, 'costOfRevenue': 223546000000, 'grossProfit': 170782000000, 'grossProfitRatio': 0.4330963056, 'researchAndDevelopmentExpenses': 26251000000, 'generalAndAdministrativeExpenses': 0, 'sellingAndMarketingExpenses': 0, 'sellingGeneralAndAdministrativeExpenses': 25094000000, 'otherExpenses': 0, 'operatingExpenses': 51345000000, 'costAndExpenses': 274891000000, 'interestIncome': 2825000000, 'interestExpense': 2931000000, 'depreciationAndAmortization': 11104000000, 'ebitda': 133138000000, 'ebitdaratio': 0.3376326307, 'operatingIncome': 119437000000, 'operatingIncomeRatio': 0.302887444, 'totalOtherIncomeExpensesNet': -334000000, 'incomeBeforeTax': 119103000000, 'incomeBeforeTaxRatio': 0.3020404333, 'incomeTaxExpense': 19300000000, 'netIncome': 99803000000, 'netIncomeRatio': 0.2530964071, 'eps': 6.15, 'epsdiluted': 6.11, 'weightedAverageShsOut': 16215963000, 'weightedAverageShsOutDil': 16325819000, 'link': 'https://www.sec.gov/Archives/edgar/data/320193/000032019322000108/0000320193-22-000108-index.htm', 'finalLink': 'https://www.sec.gov/Archives/edgar/data/320193/000032019322000108/aapl-20220924.htm'}, {'date': '2021-09-25', 'symbol': 'AAPL', 'reportedCurrency': 'USD', 'cik': '0000320193', 'fillingDate': '2021-10-29', 'acceptedDate': '2021-10-28 18:04:28', 'calendarYear': '2021', 'period': 'FY', 'revenue': 365817000000, 'costOfRevenue': 212981000000, 'grossProfit': 152836000000, 'grossProfitRatio': 0.4177935963, 'researchAndDevelopmentExpenses': 21914000000, 'generalAndAdministrativeExpenses': 0, 'sellingAndMarketingExpenses': 0, 'sellingGeneralAndAdministrativeExpenses': 21973000000, 'otherExpenses': 0, 'operatingExpenses': 43887000000, 'costAndExpenses': 256868000000, 'interestIncome': 2843000000, 'interestExpense': 2645000000, 'depreciationAndAmortization': 11284000000, 'ebitda': 123136000000, 'ebitd

```
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-index.htm', 'finalLink': 'https://www.sec.gov/Archives/edgar/data/320193/0000320193
21000105/aapl-20210925.htm'}, {'date': '2020-09-26', 'symbol': 'AAPL', 'reportedCurr
ency': 'USD', 'cik': '0000320193', 'fillingDate': '2020-10-30', 'acceptedDate': '202
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t': 17352119000, 'weightedAverageShsOutDil': 17528214000, 'link': 'https://www.sec.g
ov/Archives/edgar/data/320193/000032019320000096/0000320193-20-000096-index.htm', 'f
inalLink': 'https://www.sec.gov/Archives/edgar/data/320193/000032019320000096/aapl-2
0200926.htm'}]}
```

```
In [4]: df = pd.DataFrame(data)
```

```
In [5]: df
```

Out[5]:

	date	symbol	reportedCurrency	cik	fillingDate	acceptedDate	calendarYear
0	2024-09-28	AAPL	USD	0000320193	2024-11-01	2024-11-01 06:01:36	2024
1	2023-09-30	AAPL	USD	0000320193	2023-11-03	2023-11-02 18:08:27	2023
2	2022-09-24	AAPL	USD	0000320193	2022-10-28	2022-10-27 18:01:14	2022
3	2021-09-25	AAPL	USD	0000320193	2021-10-29	2021-10-28 18:04:28	2021
4	2020-09-26	AAPL	USD	0000320193	2020-10-30	2020-10-29 18:06:25	2020

5 rows × 8 columns



# Data cleaning

- ☒ remove unnecessary columns: fillingDate , acceptedDate , period , date , symbol , reportedCurrency , cik , link , fina - done
- ☒ display value in as proper format - done

- ☒ tranform the data from width to height - done

```
In [6]: df.drop(columns=['fillingDate', 'acceptedDate', 'period', 'date', 'symbol', 'report
```

```
In [7]: df
```

```
Out[7]:
```

	calendarYear	revenue	costOfRevenue	grossProfit	grossProfitRatio	researchAn
--	--------------	---------	---------------	-------------	------------------	------------

0	2024	391035000000	210352000000	180683000000	0.462063	
1	2023	383285000000	214137000000	169148000000	0.441311	
2	2022	394328000000	223546000000	170782000000	0.433096	
3	2021	365817000000	212981000000	152836000000	0.417794	
4	2020	274515000000	169559000000	104956000000	0.382332	

5 rows × 29 columns



```
In [8]: df_format = df.melt(  
    id_vars=["calendarYear"],           # keep the year fixed  
    var_name="Metric",                 # new column for metric names  
    value_name="Value"                 # new column for metric values  
)
```

```
In [9]: df_format
```

```
Out[9]:
```

	calendarYear	Metric	Value
--	--------------	--------	-------

0	2024	revenue	3.910350e+11
1	2023	revenue	3.832850e+11
2	2022	revenue	3.943280e+11
3	2021	revenue	3.658170e+11
4	2020	revenue	2.745150e+11
...	...	...	...
135	2024	weightedAverageShsOutDil	1.540810e+10
136	2023	weightedAverageShsOutDil	1.581255e+10
137	2022	weightedAverageShsOutDil	1.632582e+10
138	2021	weightedAverageShsOutDil	1.686492e+10
139	2020	weightedAverageShsOutDil	1.752821e+10

140 rows × 3 columns

```
In [10]: df_revenue = df_format[df_format['Metric'] == 'revenue']
df_revenue
```

```
Out[10]:
```

	calendarYear	Metric	Value
0	2024	revenue	3.910350e+11
1	2023	revenue	3.832850e+11
2	2022	revenue	3.943280e+11
3	2021	revenue	3.658170e+11
4	2020	revenue	2.745150e+11

```
In [11]: df_revenue['value_billion'] = df_revenue['Value']/100_000_000
df_revenue['value_billion'] = df_revenue['value_billion'].map("{:,.2f}".format)
df_revenue
```

C:\Users\dqthi\AppData\Local\Temp\ipykernel\_3576\4090961083.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
df_revenue['value_billion'] = df_revenue['Value']/100_000_000
```

C:\Users\dqthi\AppData\Local\Temp\ipykernel\_3576\4090961083.py:2: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
df_revenue['value_billion'] = df_revenue['value_billion'].map("{:,.2f}".format)
```

```
Out[11]:
```

	calendarYear	Metric	Value	value_billion
0	2024	revenue	3.910350e+11	3,910.35
1	2023	revenue	3.832850e+11	3,832.85
2	2022	revenue	3.943280e+11	3,943.28
3	2021	revenue	3.658170e+11	3,658.17
4	2020	revenue	2.745150e+11	2,745.15

```
In [12]: df_revenue["calendarYear"] = (
df_revenue["calendarYear"]
    .astype(str)                # make sure everything is string
    .str.strip()                # remove leading/trailing spaces
    .str.replace(r"\.0$", "", regex=True) # drop '.0' if present
```

```
.astype("Int32")          # finally cast to int
)
```

C:\Users\dqthi\AppData\Local\Temp\ipykernel\_3576\1750495670.py:1: SettingWithCopyWarning:  
A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)  
df\_revenue["calendarYear"] = (

```
In [13]: print(df_revenue['calendarYear'].unique())
```

```
<IntegerArray>
[2024, 2023, 2022, 2021, 2020]
Length: 5, dtype: Int32
```

```
In [14]: type(df_revenue.loc[0, "calendarYear"]), df_revenue["calendarYear"].unique()
```

```
Out[14]: (numpy.int32,
<IntegerArray>
[2024, 2023, 2022, 2021, 2020]
Length: 5, dtype: Int32)
```

```
In [15]: df_revenue["value_billion"] = (
    df_revenue["value_billion"].astype(str).str.replace(",", "", regex=False)
    .pipe(pd.to_numeric, errors="coerce")
)
```

C:\Users\dqthi\AppData\Local\Temp\ipykernel\_3576\3641463991.py:1: SettingWithCopyWarning:  
A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)  
df\_revenue["value\_billion"] = (

```
In [16]: df_revenue.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Index: 5 entries, 0 to 4
Data columns (total 4 columns):
#   Column          Non-Null Count  Dtype
---  -
0   calendarYear    5 non-null     Int32
1   Metric          5 non-null     object
2   Value           5 non-null     float64
3   value_billion   5 non-null     float64
dtypes: Int32(1), float64(2), object(1)
memory usage: 357.0+ bytes
```

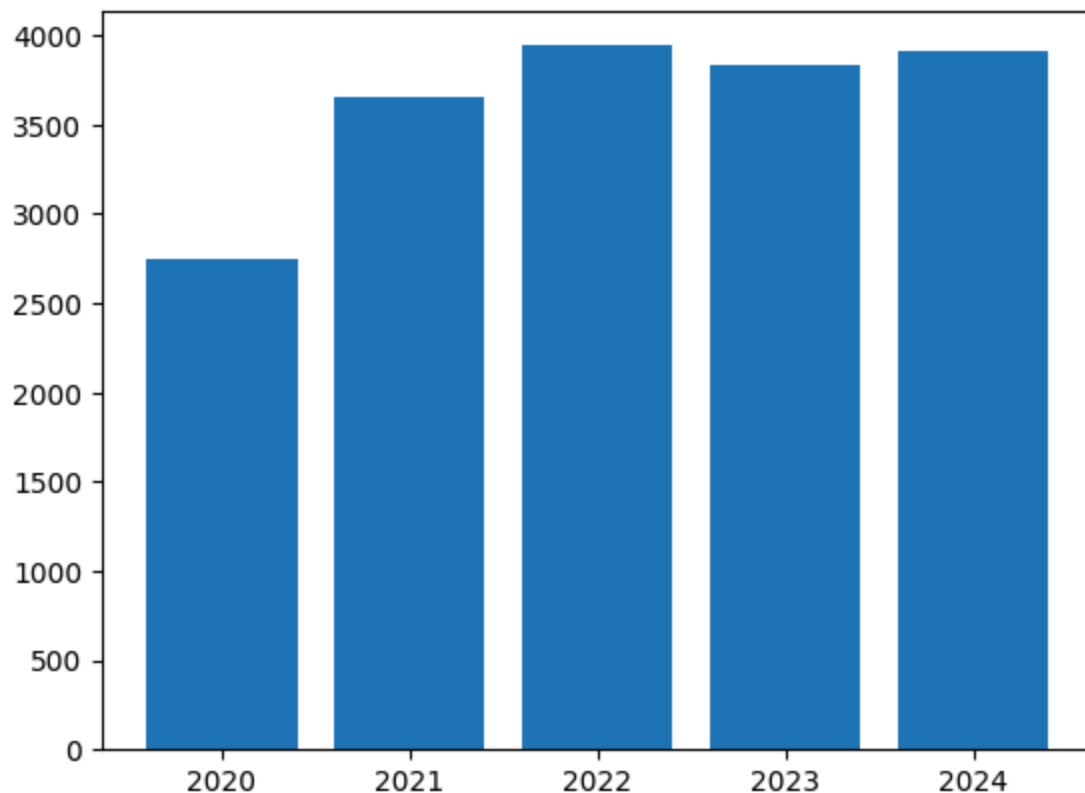
## To follow up:

- try writing a function that apply value formatting (e.i add comma between thousand) to the select list of columns

In [17]: *# step 1, populate the draft chart to visualize*

```
fig, ax = plt.subplots()
x = df_revenue['calendarYear']
y = df_revenue['value_billion']
ax.bar(
    x,y
)
ax = ax

plt.show()
```

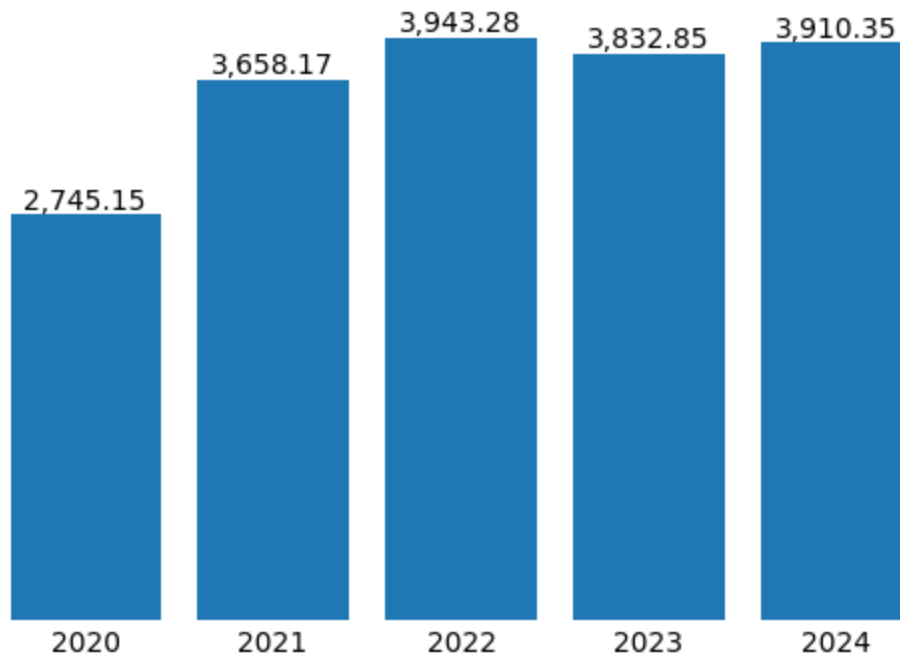


In [18]: *# step 2:*  
*# remove the border line*  
*# remove y value*  
*# starting number of y value to be 0, while the max value is 5000*

```
fig, ax = plt.subplots()
x = df_revenue['calendarYear']
y = df_revenue['value_billion']
bar_container = ax.bar(x,y)
for spine in ['top','right','bottom','left']:
    ax.spines[spine].set_visible(False),
# ax.set_xticks([])
ax.set_yticks([]) # to remove border line,
ax.tick_params(length=0), # to remove x - ticks,
plt.ylim(0,5000), # starting number of y value to be 0, while the max value is 5000
```

```
ax.bar_label(bar_container, label_type='edge', fmt=lambda x: f'{x:,.2f}')
ax = bar_container

plt.show()
```



```
In [19]: # step 2:
# remove the border line
# remove y value
# starting number of y value to be 0, while the max value is 5000

# step 3:
# apply formatting
# setting color for 2024, prior year to grey

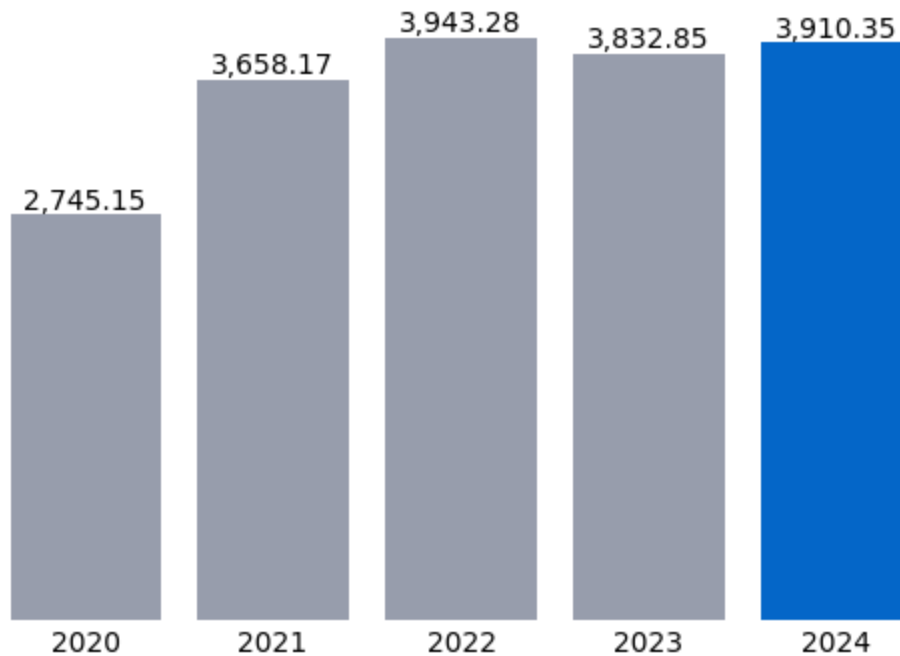
blue = '#0466c8'
grey = '#979dac'
colors = [
    blue if year == 2024 else grey
    for year in df_revenue["calendarYear"]
]

fig, ax = plt.subplots()
x = df_revenue['calendarYear']
y = df_revenue['value_billion']
bar_container = ax.bar(x,y,color = colors)
for spine in ['top','right','bottom','left']:
    ax.spines[spine].set_visible(False),
ax.set_yticks([]) # to remove border line,
ax.tick_params(length=0), # to remove x - ticks,
plt.ylim(0,5000), # starting number of y value to be 0, while the max value is 500
ax.bar_label(bar_container, label_type='edge', fmt=lambda x: f'{x:,.2f}')
```



```
ax = bar_container
```

```
plt.show()
```



```
In [20]: def cagr(begin_value, end_value, periods):  
         return (end_value / begin_value) ** (1/periods) - 1
```

```
In [21]: start_year = df_revenue['calendarYear'].min()  
         end_year = df_revenue['calendarYear'].max()  
  
         begin_value = df_revenue.loc[df_revenue['calendarYear'] == start_year, 'value_billio  
         end_value = df_revenue.loc[df_revenue['calendarYear'] == end_year, 'value_billion'].  
         periods = end_year - start_year
```

```
In [22]: apple_cagr = cagr(begin_value, end_value, periods )  
         apple_cagr
```

```
Out[22]: np.float64(0.09247721446491397)
```

```
In [34]: # step 2:  
         ## remove the border line  
         ## remove y value  
         ## starting number of y value to be 0, while the max value is 5000  
  
         # step 3:  
         ## apply formating  
         ## setting color for 2024, prior year to grey
```

```

# step 4:
## add chart title
## add chart sub title

blue = '#0466c8'
grey = '#979dac'
colors = [
    blue if year == 2024 else grey
    for year in df_revenue["calendarYear"]
]

fig, ax = plt.subplots()

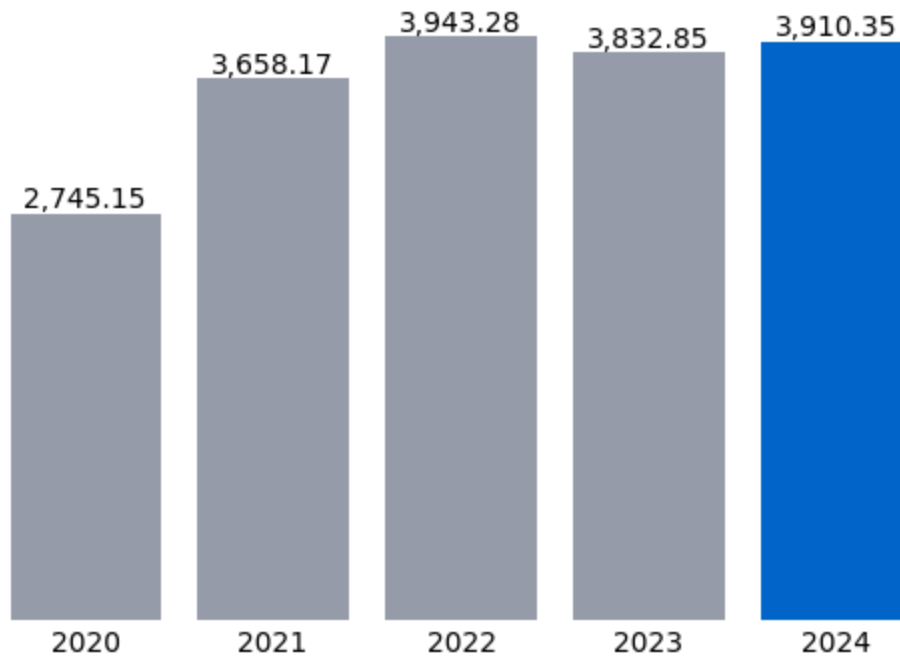
x = df_revenue['calendarYear']
y = df_revenue['value_billion']
bar_container = ax.bar(x,y,color = colors)
for spine in ['top','right','bottom','left']:
    ax.spines[spine].set_visible(False),
ax.set_yticks([]) # to remove border line,
ax.tick_params(length=0), # to remove x - ticks,
plt.ylim(0,5000), # starting number of y value to be 0, while the max value is 5000
ax.bar_label(bar_container, label_type='edge', fmt=lambda x: f'{x:,.2f}')
ax = bar_container

# add title
fig.text(x = .17, y = .9 ,s='Apple Revenue, 2020 - 2024 (in millions)',color=blue,fontweight='bold')
# add sub title
fig.text(x = .17, y = .87 ,s=f"Apple's revenues increased steadily over 5 years,\nwith a significant jump in 2024.",color=grey,fontweight='normal')
# add credit
fig.text(x = .17, y = 0, s = 'By: Thinh Doan | Data source: financialmodelingprep.com',color=grey,fontweight='normal')
plt.show()

```

## Apple Revenue, 2020 - 2024 (in millions)

Apple's revenues increased steadily over 5 years, with a **CAGR** of **9.25** % per year.



By: Thinh Doan | Data source: financialmodelingprep.com

## Data Visualization

What are the steps:

- Draft visual
  - Chart title: Apple 5 Year Revenue Performance (2020 - 2025)
  - Chart subtitle: Apple revenues show steady increase over 5 year with xx% a year
  - Chart credit: viz by: ThinhD, data source: FMP,
    - ☒ to calculate for CARG ratio
  - Chart type - Chart color - Color pallets
    - ☒ use [https://y-sunflower.github.io/morethemes/#\\_\\_tabbed\\_1\\_6](https://y-sunflower.github.io/morethemes/#__tabbed_1_6)
    - => Decided to not use theme as I want to make more control of the chart

Make chart showing cartoon style -

<https://matplotlib.org/stable/gallery/showcase/xkcd.html#sphx-glr-gallery-showcase-xkcd-py>