bill-vivian-wechat-analysis

April 7, 2024

1 WeChatMsgAnalysis

1.1

1.1.1

- pandas:
- matplotlib & seaborn:
- jieba:
- wordcloud:
- paddlenlp:

```
[1]: import re
     import time
     import numpy as np
     import pandas as pd
     import jieba
     import jieba.posseg as pseg
     from PIL import Image
     from wordcloud import WordCloud
     import seaborn as sns
     import matplotlib.ticker as mticker
     import matplotlib.transforms as mtransforms
     from matplotlib.colors import ListedColormap
     from matplotlib import pyplot as plt
     from matplotlib import font_manager as fm
     from tqdm import tqdm
     from paddlenlp import Taskflow
```

D:\lib\site-packages_distutils_hack__init__.py:33: UserWarning: Setuptools is replacing distutils.

warnings.warn("Setuptools is replacing distutils.")

1.1.2

• font: emoji

```
[2]: sns.set_theme(style="ticks")
font = "/usr/share/fonts/winfont/simsun.ttc"
```

```
fp = fm.FontProperties(fname=font)
plt.rcParams["axes.unicode_minus"] = False
```

1.1.3

```
[3]: labels = ["Bill", "Vivian"]
```

1.1.4

- filePath:
- dStart:
- dEnd:

```
[4]: filePath = "msg.csv"
dStart = "2023-04-07 00:00:00"
dEnd = "2024-04-05 23:59:59"
```

1.1.5

```
[6]: def textFilter(text: str):
    text = text.lower()
    # try:
    # co = re.compile("[\U00010000-\U0010ffff]")
    # except re.error:
    # co = re.compile("[\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u0000-\u00000-\u0000-\u0000-\u0000-\u0000-\u00000-\u00000-\u00000-\u00000-\u00000-\u00000-\u
```

1.1.6

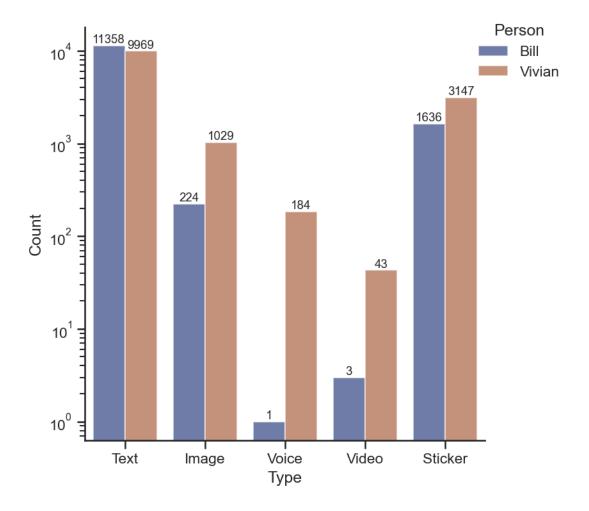
```
[7]: texts = [
        [textFilter(i) for i in dfs[0].query("Type == 1")["StrContent"].to_list()],
        [textFilter(i) for i in dfs[1].query("Type == 1")["StrContent"].to_list()],
]
```

1.2

1.2.1

* 1 = Text * 3 = Image * 34 = Voice * 43 = Video * 47 = Sticker * 48 = Location * 10000 = System

```
[8]: data = {}
     for i in range(2):
         data[labels[i]] = [
             len(dfs[i].query("Type == 1")),
             len(dfs[i].query("Type == 3")),
             len(dfs[i].query("Type == 34")),
             len(dfs[i].query("Type == 43")),
             len(dfs[i].query("Type == 47")),
         ]
     data = (
         pd.DataFrame(data, index=["Text", "Image", "Voice", "Video", "Sticker"])
         .reset_index()
         .melt("index")
         .rename(columns={"index": "Type", "variable": "Person", "value": "Count"})
     g = sns.catplot(data, kind="bar", x="Type", y="Count", hue="Person", u
      →palette="dark", alpha=0.6, height=6)
     for ax in g.axes.ravel():
         for i in range(2):
             ax.bar_label(ax.containers[i], fontsize=9)
     sns.move_legend(g, "upper right")
     plt.yscale("log")
     g.figure.set_size_inches(6, 5)
     g.figure.set_dpi(150)
     plt.show()
     plt.close()
```



• sN:

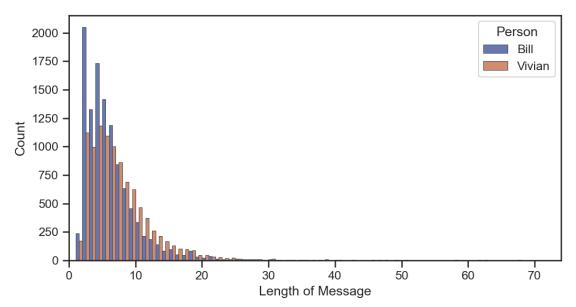
$$\mu + sN * \sigma$$

• multiple:

```
[9]: sN = 3 multiple = "dodge"
```

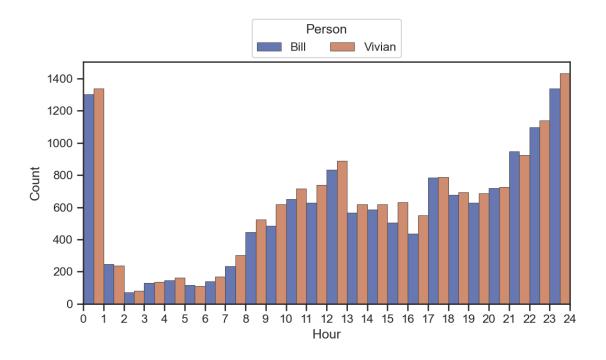
```
[10]: mu, std = 0, 0
data = {"Length": [], "Person": []}
for i in range(2):
    length = [len(textFilter(i)) for i in texts[i]]
    data["Length"] += length
    data["Person"] += [labels[i]] * len(length)
    if np.mean(length) + sN * np.std(length) > mu + std:
        mu, std = np.mean(length), np.std(length)
```

```
xlim = int(np.ceil(mu + sN * std))
data = pd.DataFrame(data)
bins = np.linspace(0, xlim, xlim + 1)
ax = sns.histplot(
    data=data,
    x="Length",
    hue="Person",
    bins=bins,
    multiple=multiple,
    edgecolor=".3",
    linewidth=0.5,
    palette="dark",
    alpha=0.6,
)
ax.set_xlim(0, xlim)
ax.set_xlabel("Length of Message")
ax.figure.set_size_inches(8, 4)
ax.figure.set_dpi(150)
plt.show()
plt.close()
```



24

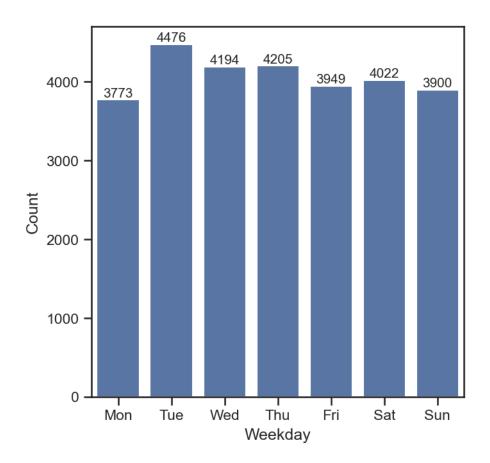
```
[11]: data = {"Time": [], "Person": []}
      for i in range(2):
          hour = dfs[i]["hour"].to_list()
          data["Time"] += hour
          data["Person"] += [labels[i]] * len(hour)
      data = pd.DataFrame(data)
      bins = np.arange(0, 25, 1)
      ax = sns.histplot(
          data=data,
          x="Time",
          hue="Person",
          bins=bins,
          multiple=multiple,
          edgecolor=".3",
          linewidth=0.5,
          palette="dark",
          alpha=0.6,
      ax.set_xticks(bins)
      ax.set_xticklabels(bins)
      ax.set_xlabel("Hour")
      ax.set_xlim(0, 24)
      sns.move_legend(ax, loc="upper center", bbox_to_anchor=(0.5, 1.2), ncol=2)
      ax.figure.set_size_inches(8, 4)
      ax.figure.set_dpi(150)
      plt.show()
      plt.close()
```



```
[12]: grouper = pd.Grouper(key="day")
  data = df.groupby(grouper)["Count"].sum()
  data = data.sort_index()
  data.index = ["Mon", "Tue", "Wed", "Thu", "Fri", "Sat", "Sun"]

ax = sns.barplot(data=data, errorbar=None)
  ax.set_xlabel("Weekday")
  ax.bar_label(ax.containers[0], fontsize=10)

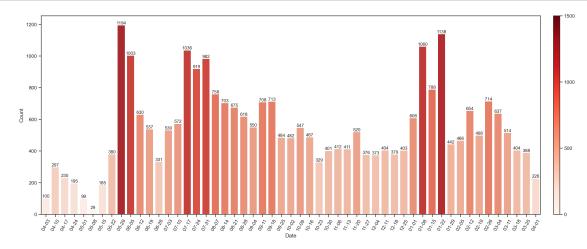
ax.figure.set_size_inches(5, 5)
  ax.figure.set_dpi(150)
  plt.show()
  plt.close()
```



```
1.2.5
```

```
7
                    * wTicks:
                                   * wStart:
                                                        * wEnd:
[13]: wTicks = 500
      wStart = "2023-04-03"
      wEnd = "2024-04-01"
[14]: grouper = pd.Grouper(key="StrTime", freq="W-MON")
      data = df.groupby(grouper)["Count"].sum().to_frame()
      data.index = pd.date_range(start=wStart, end=wEnd, freq="W-MON").
       ⇔strftime("%m-%d")
      data.columns = ["Count"]
      vM = np.ceil(data["Count"].max() / wTicks) * wTicks
      norm = plt.Normalize(0, vM)
      sm = plt.cm.ScalarMappable(cmap="Reds", norm=norm)
      ax = sns.barplot(x=data.index, y=data["Count"], hue=data["Count"],__
       ⇔hue_norm=norm, palette="Reds")
```

```
ax.set_xlabel("Date")
plt.xticks(rotation=60)
for bar in ax.containers:
    ax.bar_label(bar, fontsize=10, fmt="%.0f")
ax.get_legend().remove()
axpos = ax.get_position()
caxpos = mtransforms.Bbox.from_extents(axpos.x1 + 0.02, axpos.y0, axpos.x1 + 0.
 \rightarrow03, axpos.y1)
cax = ax.figure.add_axes(caxpos)
locator = mticker.MultipleLocator(wTicks)
formatter = mticker.StrMethodFormatter("{x:.0f}")
cax.figure.colorbar(sm, cax=cax, ticks=locator, format=formatter)
ax.figure.set_size_inches(20, 8)
ax.figure.set_dpi(150)
plt.show()
plt.close()
```



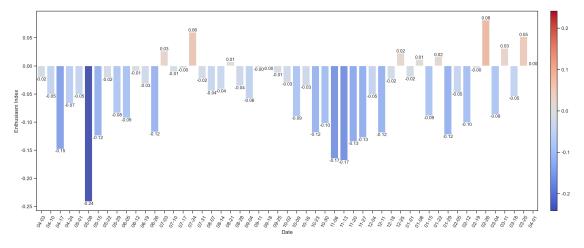
7

$$E = \frac{Q_{\rm S} - Q_{\rm R}}{Q_{\rm S} + Q_{\rm R}}$$

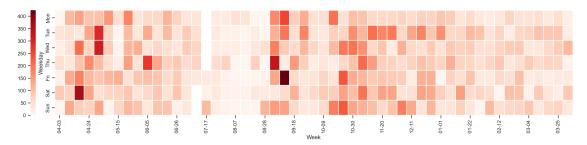
```
[15]: grouper = pd.Grouper(key="StrTime", freq="W-MON")
    df_W1 = dfs[0].groupby(grouper)["Count"].sum()
    df_W2 = dfs[1].groupby(grouper)["Count"].sum()

data = pd.DataFrame({"E": (df_W1 - df_W2) / (df_W1 + df_W2)})
```

```
data.index = pd.date_range(start=wStart, end=wEnd, freq="W-MON").
 ⇔strftime("%m-%d")
vM = data["E"].abs().max()
norm = plt.Normalize(-vM, vM)
sm = plt.cm.ScalarMappable(cmap="coolwarm", norm=norm)
ax = sns.barplot(x=data.index, y=data["E"], hue=data["E"], hue_norm=norm,_
 ⇔palette="coolwarm")
ax.set_xlabel("Date")
plt.xticks(rotation=60)
ax.set ylabel("Enthusiasm Index")
for bar in ax.containers:
   ax.bar_label(bar, fontsize=10, fmt="%.2f")
ax.get_legend().remove()
axpos = ax.get_position()
caxpos = mtransforms.Bbox.from_extents(axpos.x1 + 0.02, axpos.y0, axpos.x1 + 0.
403, axpos.y1)
cax = ax.figure.add_axes(caxpos)
locator = mticker.MultipleLocator(0.1)
formatter = mticker.StrMethodFormatter("{x:.1f}")
cax.figure.colorbar(sm, cax=cax, ticks=locator, format=formatter)
ax.figure.set_size_inches(20, 8)
ax.figure.set_dpi(150)
plt.show()
plt.close()
```



```
[16]: grouper = pd.Grouper(key="StrTime", freq="D")
      data = df.groupby(grouper)["Count"].sum()
      data = data.to_frame()
      data["date"] = data.index
      data["week"] = data["date"].dt.isocalendar()["week"]
      data["day"] = data["date"].dt.dayofweek
      data.index = range(len(data))
      for i in range(7):
          if data.loc[i, "week"] > 1:
              data.loc[i, "week"] = 0
      data = data.pivot(index="day", columns="week", values="Count")
      data.index = ["Mon", "Tue", "Wed", "Thu", "Fri", "Sat", "Sun"]
      data.columns = pd.date_range(start=wStart, end=wEnd, freq="W-MON").
       ⇔strftime("%m-%d")
      ax = sns.heatmap(
          data,
          annot=False,
          linewidths=0.5,
          cbar_kws={"orientation": "vertical", "location": "left", "pad": 0.03},
          cmap="Reds",
      )
      ax.set_xlabel("Week")
      ax.set_ylabel("Weekday")
      ax.figure.set_size_inches(24, 4)
      ax.figure.set_dpi(150)
      plt.show()
      plt.close()
```



1.3

1.3.1

```
[17]: jieba.load_userdict("thuocl.txt")
      jieba.load userdict("userdict.txt")
      stopwords = [line.strip() for line in open("stopwords.txt", "r", u
       ⇔encoding="utf-8").readlines()] + [" ", "\n", "\r\n"]
      wordclass = ["v", "u", "vd", "r", "p", "w"]
     Building prefix dict from the default dictionary ...
     [2024-04-08 02:07:50,808] [
                                   DEBUG] __init__.py:113 - Building prefix dict from
     the default dictionary ...
     Loading model from cache C:\Users\VIVIAN~1\AppData\Local\Temp\jieba.cache
     [2024-04-08 02:07:50,814] [
                                  DEBUG] __init__.py:132 - Loading model from cache
     C:\Users\VIVIAN~1\AppData\Local\Temp\jieba.cache
     Loading model cost 1.636 seconds.
     [2024-04-08 02:07:52,450] [
                                  DEBUG] __init__.py:164 - Loading model cost 1.636
     seconds.
     Prefix dict has been built successfully.
     [2024-04-08 02:07:52,455] [
                                   DEBUG] __init__.py:166 - Prefix dict has been
     built successfully.
```

1.3.2

```
[18]: def wordSplit(texts, wordclass):
    words = []
    pbar = tqdm(total=len(texts))
    for i in range(len(texts)):
        res = pseg.lcut(texts[i])
        for pair in res:
            if pair.word in stopwords:
                continue
            if pair.flag in wordclass:
                      continue
                      words.append(pair.word)
        if i % 1000 == 0:
                      pbar.update(1000)
        pbar.close()
        return words
```

```
[19]: words = [wordSplit(texts[i], wordclass) for i in range(2)]
```

```
12000it [00:12, 972.15it/s]
10000it [00:12, 789.21it/s]
```

1.3.3

• mask:

• cmap:

```
[20]: mask = np.array(Image.open("mask.png"))
      masks = [np.array(Image.open("mask_L.jpg")), np.array(Image.open("mask_F.jpg"))]
      cmap = ListedColormap(
          "#fac1cf",
              "#a9d7ba",
              "#58b1db",
              "#f296ab",
              "#5dab81",
              "#3d9ec4",
              "#e16a8d",
              "#237b50",
              "#1e8299",
              "#8d3549",
              "#35563b",
              "#2d5d73",
          ]
      )
[21]: def wordCloud(text, font, mask, cmap):
          wc = WordCloud(
              background_color="white",
              scale=5,
              font_path=font,
              mask=mask,
              colormap=cmap,
              collocations=False,
          ).generate(text)
          plt.imshow(wc)
          plt.axis("off")
          plt.show()
[22]: wordCloud(" ".join(words[0]), font, masks[1], cmap)
```



[23]: wordCloud(" ".join(words[1]), font, masks[0], cmap)



```
[24]: wordCloud(" ".join(words[0] + words[1]), font, mask, cmap)
```





1.3.4

N * wN: 50

```
[25]: wN = 50
```

```
[27]: # emoji
tmp = data.index.to_list()
for i in range(wN):
    if tmp[i] == "":
```

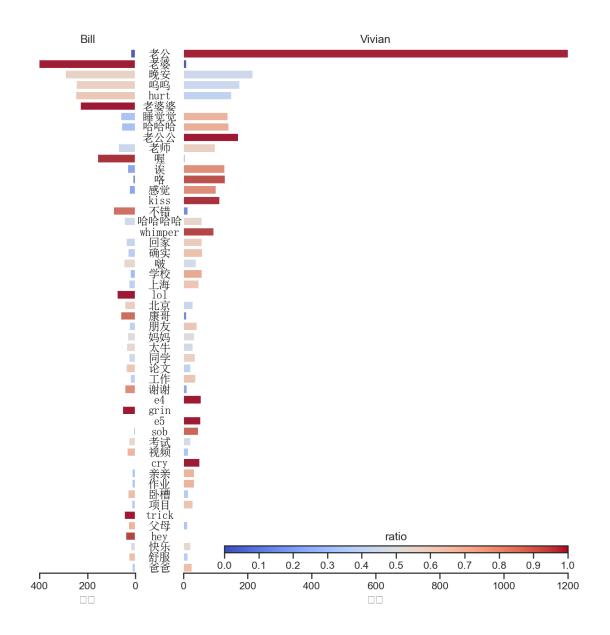
```
tmp[i] = "[]"
elif tmp[i] == " ":
    tmp[i] = "[]"
elif tmp[i] == " ":
    tmp[i] = "[]"
elif tmp[i] == " ":
    tmp[i] = "[]"
data.index = tmp
```

```
[28]: ratio = data["L"] / data["S"]
      norm = plt.Normalize(0, 1)
      sm = plt.cm.ScalarMappable(cmap="coolwarm", norm=norm)
      fig = plt.figure(figsize=(10, 10), dpi=300)
      grid = plt.GridSpec(1, 4, wspace=0.5)
      ax0 = fig.add subplot(grid[0, 0])
      sns.barplot(x=-data["L"], y=data.index, ax=ax0, hue=ratio, hue_norm=norm,_
       ⇔palette="coolwarm")
      ax1 = fig.add_subplot(grid[0, 1:])
      sns.barplot(x=data["F"], y=data.index, ax=ax1, hue=(1 - ratio), hue_norm=norm,__
       →palette="coolwarm")
      ax0.set_xlabel(" ")
      ax0.set ylabel("")
      ax0.set_xticks(range(-400, 1, 200))
      ax0.set xticklabels([400, 200, 0])
      ax0.set_xlim(-400, 0)
      ax0.set_yticks([])
      ax0.spines["left"].set_visible(False)
      ax0.spines["top"].set_visible(False)
      ax0.spines["right"].set_visible(False)
      ax0.set_title("Bill")
      ax0.get_legend().remove()
      ax1.set_xlabel(" ")
      ax1.set_ylabel("")
      ax1.set_xticks(range(0, 1201, 200))
      ax1.set_xticklabels([0, 200, 400, 600, 800, 1000, 1200])
      ax1.set xlim(0, 1200)
      ax1.set_yticks([])
      ax1.spines["left"].set_visible(False)
      ax1.spines["top"].set_visible(False)
      ax1.spines["right"].set_visible(False)
      ax1.set_title("Vivian")
      ax1.get_legend().remove()
```

```
axpos = ax1.get_position()
caxpos = mtransforms.Bbox.from_extents(axpos.x0 + 0.06, axpos.y0 + 0.03, axpos.
 \rightarrowx1, axpos.y0 + 0.04)
cax = ax1.figure.add_axes(caxpos)
locator = mticker.MultipleLocator(0.1)
formatter = mticker.StrMethodFormatter("{x:.1f}")
cax.figure.colorbar(sm, cax=cax, orientation="horizontal", ticks=locator, ___
 cax.set_title("ratio")
x0 = ax0.get position().x1
x1 = ax1.get_position().x0
xm = (x0 + x1) / 2
y0 = ax0.get_position().y0
y1 = ax0.get_position().y1
for i in range(wN):
    fig.text(
        xm, y0 + (y1 - y0) * (wN - i - 0.5) / wN, data.index[i],
        color="black", ha="center", va="center", fontproperties=fp
    )
fig.set_dpi(150)
plt.show()
plt.close()
D:\lib\site-packages\IPython\core\pylabtools.py:152: UserWarning: Glyph 35789
  fig.canvas.print_figure(bytes_io, **kw)
```

(\N{CJK UNIFIED IDEOGRAPH-8BCD}) missing from current font. D:\lib\site-packages\IPython\core\pylabtools.py:152: UserWarning: Glyph 39057 (\N{CJK UNIFIED IDEOGRAPH-9891}) missing from current font.

fig.canvas.print_figure(bytes_io, **kw)



1.4 paddlenlp [-1, 1] [29]: dfE = df.query("Type == 1")[["IsSender", "StrContent", "StrTime", "hour"]] dfE.index = range(len(dfE)) [30]: senta = Taskflow("sentiment_analysis")

[31]:

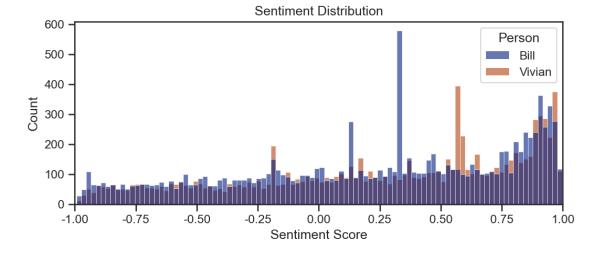
```
[32]: dfE["score"] = scores["score"]
dfE["score"] = 2 * dfE["score"] - 1
dfE["Person"] = dfE.apply(lambda x: labels[x["IsSender"]], axis=1)

dfEs = [dfE.query("IsSender == 0"), dfE.query("IsSender == 1")]
```

```
[33]: ax = sns.histplot(data=dfE, x="score", hue="Person", palette="dark", alpha=0.6, ubins=100)

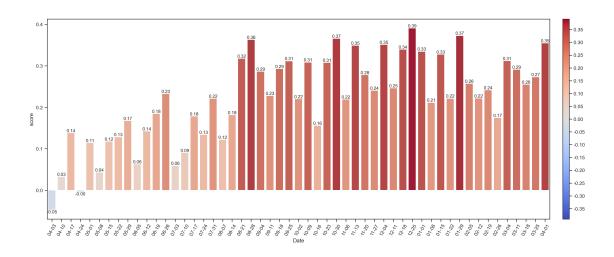
ax.set_xlabel("Sentiment Score")
ax.set_ylabel("Count")
ax.set_title("Sentiment Distribution")
ax.set_xlim(-1, 1)

ax.figure.set_size_inches(8, 3)
ax.figure.set_dpi(150)
plt.show()
```

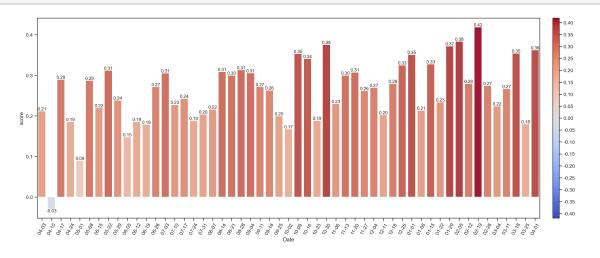


```
[47]: def weekAvgSenScore(df):
          grouper = pd.Grouper(key="StrTime", freq="W-MON")
          data = df.groupby(grouper)["score"].mean().to_frame()
          data.index = pd.date_range(start=wStart, end=wEnd, freq="W-MON").
       ⇔strftime("%m-%d")
          data.columns = ["score"]
          vM = data["score"].abs().max()
          norm = plt.Normalize(-vM, vM)
          sm = plt.cm.ScalarMappable(cmap="coolwarm", norm=norm)
          ax = sns.barplot(x=data.index, y=data["score"], hue=data["score"],
       →hue_norm=norm, palette="coolwarm")
          ax.set_xlabel("Date")
          plt.xticks(rotation=60)
          for bar in ax.containers:
              ax.bar_label(bar, fontsize=10, fmt="%.2f")
          ax.get_legend().remove()
          axpos = ax.get_position()
          caxpos = mtransforms.Bbox.from_extents(axpos.x1 + 0.02, axpos.y0, axpos.x1_
       \hookrightarrow+ 0.03, axpos.y1)
          cax = ax.figure.add_axes(caxpos)
          locator = mticker.MultipleLocator(0.05)
          formatter = mticker.StrMethodFormatter("{x:.2f}")
          cax.figure.colorbar(sm, cax=cax, ticks=locator, format=formatter)
          ax.figure.set_size_inches(20, 8)
          ax.figure.set_dpi(150)
          plt.show()
          plt.close()
          return data["score"]
```

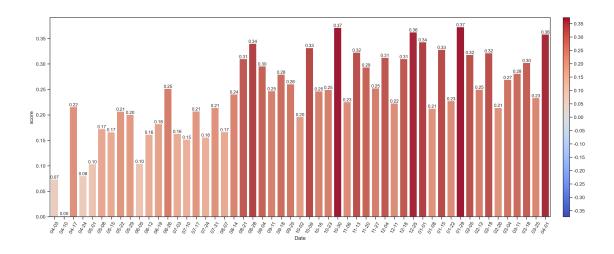
```
[35]: avgSenScore0 = weekAvgSenScore(dfEs[0])
```

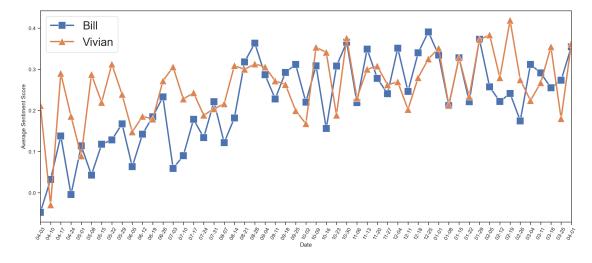


[36]: avgSenScore1 = weekAvgSenScore(dfEs[1])



[37]: _ = weekAvgSenScore(dfE)

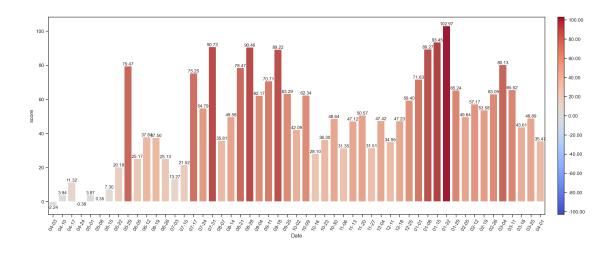




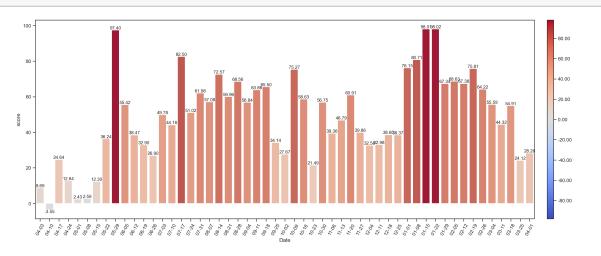
```
[39]: def weekTotSenScore(df):
          grouper = pd.Grouper(key="StrTime", freq="W-MON")
          data = df.groupby(grouper)["score"].sum().to_frame()
          data.index = pd.date_range(start=wStart, end=wEnd, freq="W-MON").

strftime("%m-%d")
          data.columns = ["score"]
          vM = data["score"].abs().max()
          norm = plt.Normalize(-vM, vM)
          sm = plt.cm.ScalarMappable(cmap="coolwarm", norm=norm)
          ax = sns.barplot(x=data.index, y=data["score"], hue=data["score"],__
       ⇔hue norm=norm, palette="coolwarm")
          ax.set_xlabel("Date")
          plt.xticks(rotation=60)
          for bar in ax.containers:
              ax.bar_label(bar, fontsize=10, fmt="%.2f")
          ax.get_legend().remove()
          axpos = ax.get_position()
          caxpos = mtransforms.Bbox.from_extents(axpos.x1 + 0.02, axpos.y0, axpos.x1_
       \rightarrow+ 0.03, axpos.y1)
          cax = ax.figure.add_axes(caxpos)
          locator = mticker.MultipleLocator(20)
          formatter = mticker.StrMethodFormatter("{x:.2f}")
          cax.figure.colorbar(sm, cax=cax, ticks=locator, format=formatter)
          ax.figure.set_size_inches(20, 8)
          ax.figure.set_dpi(150)
          plt.show()
          plt.close()
          return data["score"]
```

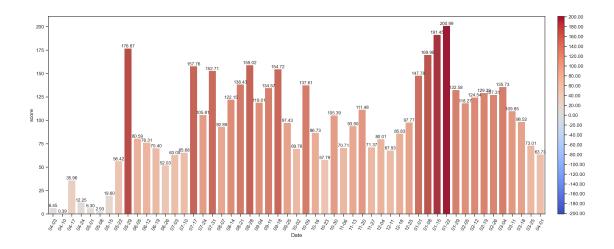
```
[40]: totSenScore0 = weekTotSenScore(dfEs[0])
```

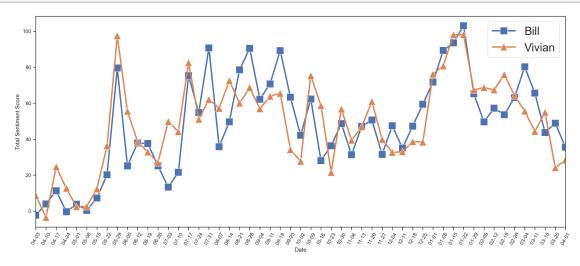


[41]: totSenScore1 = weekTotSenScore(dfEs[1])

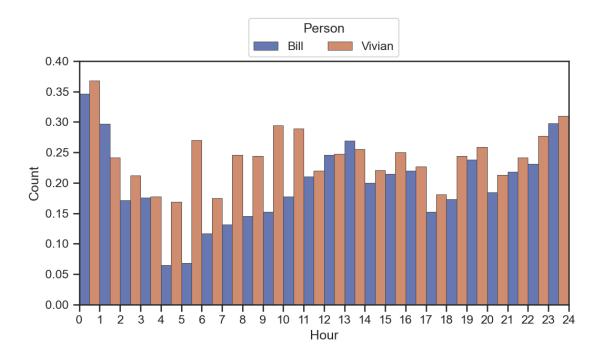


[42]: _ = weekTotSenScore(dfE)





```
[44]: grouper = pd.Grouper(key="hour")
     data = []
     for k in range(2):
         tmp = dfEs[k].groupby(grouper)["score"].mean().sort_index()
         for i in range(24):
             if i in tmp.index:
                 data.append(tmp[i])
                 data.append(0)
         data.append(0)
     data = pd.DataFrame(
         {
             "Score": data,
             "Person": [labels[0]] * 25 + [labels[1]] * 25,
         }
     xBins = [i for i in range(25)]
     ax = sns.histplot(
         data=data,
         x=xBins * 2,
         bins=xBins,
         weights="Score",
         hue="Person",
         multiple=multiple,
         edgecolor=".3",
         linewidth=0.5,
         palette="dark",
         alpha=0.6,
     )
     ax.set_xticks(range(25))
     ax.set_xticklabels(range(25))
     ax.set_xlabel("Hour")
     ax.set_xlim(0, 24)
     ax.set_ylim(np.min([0, np.floor(data["Score"].min() / 0.05) * 0.05]), np.
       sns.move_legend(ax, loc="upper center", bbox_to_anchor=(0.5, 1.2), ncol=2)
     ax.figure.set_size_inches(8, 4)
     ax.figure.set_dpi(150)
     plt.show()
     plt.close()
```



```
[45]: grouper = pd.Grouper(key="hour")
      data = []
      for k in range(2):
          tmp = dfEs[k].groupby(grouper)["score"].sum().sort_index()
          for i in range(24):
              if i in tmp.index:
                  data.append(tmp[i])
              else:
                  data.append(0)
          data.append(0)
      data = pd.DataFrame(
          {
              "Score": data,
              "Person": [labels[0]] * 25 + [labels[1]] * 25,
          }
      )
      xBins = [i for i in range(25)]
      ax = sns.histplot(
          data=data,
          x=xBins * 2,
          bins=xBins,
```

```
weights="Score",
   hue="Person",
   multiple=multiple,
   edgecolor=".3",
   linewidth=0.5,
   palette="dark",
   alpha=0.6,
)
ax.set_xticks(range(25))
ax.set_xticklabels(range(25))
ax.set_xlabel("Hour")
ax.set_xlim(0, 24)
ax.set_ylim(np.min([0, np.floor(data["Score"].min() / 0.05) * 0.05]), np.
 sns.move_legend(ax, loc="upper center", bbox_to_anchor=(0.5, 1.2), ncol=2)
ax.figure.set_size_inches(8, 4)
ax.figure.set_dpi(150)
plt.show()
plt.close()
```

