HCC - Case Study

September 18, 2023

1 HCC - Case Study

In the bustling world of healthcare, efficient and effective communication between patients and healthcare providers is paramount. The Hospital System's Call Center (HCC) plays a crucial role in this regard, as it serves as the primary hub for handling inbound calls and managing telephonic interactions with patients. These interactions encompass a wide range of issues, from scheduling appointments to resolving queries related to patient care across various outpatient clinics.

In the following analysis, we will embark on a journey through this dataset to unearth insights and address crucial questions. Our goals are to conduct exploratory data analysis to summarize HCC's current state, identify key questions that the HCC manager can pose, define a model for productivity, and create a user-friendly dashboard to empower business leaders to make informed decisions based on this invaluable data resource. This multifaceted approach will not only enhance the efficiency of HCC operations but also elevate the quality of patient care provided by the Hospital System.

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1 - Data Prepocessing

- Load dataset
- Merging
- Check data info

```
[1]: #Import necessary libraries
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

```
import plotly.express as px
    import plotly.graph_objs as go
    from plotly.subplots import make_subplots
    import dash
    import dash_core_components as dcc
    import dash_html_components as html
    from dash.dependencies import Input, Output
    /var/folders/x8/vmspvpd557j0gjkqkwzhf08m0000gn/T/ipykernel_32397/1656482956.py:1
    2: UserWarning:
    The dash_core_components package is deprecated. Please replace
    `import dash_core_components as dcc` with `from dash import dcc`
      import dash_core_components as dcc
    /var/folders/x8/vmspvpd557j0gjkqkwzhf08m0000gn/T/ipykernel_32397/1656482956.py:1
    3: UserWarning:
    The dash_html_components package is deprecated. Please replace
    `import dash_html_components as html` with `from dash import html`
      import dash_html_components as html
[2]: # Load the dataset
    sheet1 = pd.read_excel("Case Study Data.xlsx", sheet_name="Total logged-in_u"
      ⇔time")
    sheet2 = pd.read_excel("Case Study Data.xlsx", sheet_name="Not_Ready_Time")
    sheet3 = pd.read_excel("Case Study Data.xlsx",__
      ⇔sheet_name="Handled_Calls&Handle_Time")
    sheet4 = pd.read_excel("Case Study Data.xlsx", sheet_name="Agent Team Lookup")
[3]: # Check first 5 rows to see the dataset is loaded correctly
    sheet1.head()
[3]: Agent ID Interval Start Time
                                     Interval End Time Total Logged In Time \
    0 Agent 1 2022-08-01 08:00:00 2022-08-01 08:30:00
                                                                   00:27:02
    1 Agent 1 2022-08-01 08:30:00 2022-08-01 09:00:00
                                                                   00:30:00
    2 Agent 1 2022-08-01 09:00:00 2022-08-01 09:30:00
                                                                   00:30:00
    3 Agent 1 2022-08-01 09:30:00 2022-08-01 10:00:00
                                                                   00:30:00
    4 Agent 1 2022-08-01 10:00:00 2022-08-01 10:30:00
                                                                   00:30:00
      Not Ready Time Ready Time Reserved Time Talk Time Next Call Prep Time
    0
            00:03:26
                      00:00:07
                                     00:00:22 00:21:51
                                                                   00:01:16
            00:01:33
                      00:01:52
                                     00:00:33 00:24:29
    1
                                                                   00:01:33
    2
            00:04:16 00:00:00
                                     00:00:37 00:23:01
                                                                   00:02:06
    3
            00:06:14 00:00:00
                                     00:00:15 00:22:23
                                                                   00:01:08
            00:01:49 00:00:00
                                     00:00:15 00:26:57
                                                                   00:00:59
[4]: # Check first 5 rows to see the dataset is loaded correctly
    sheet2.head()
```

```
Agent 1 2022-08-01 08:00:00 2022-08-01 08:30:00
                                                               00:27:02
     1 Agent 1 2022-08-01 08:30:00 2022-08-01 09:00:00
                                                               00:30:00
     2 Agent 1 2022-08-01 09:00:00 2022-08-01 09:30:00
                                                               00:30:00
     3 Agent 1 2022-08-01 09:30:00 2022-08-01 10:00:00
                                                               00:30:00
     4 Agent 1 2022-08-01 10:00:00 2022-08-01 10:30:00
                                                               00:30:00
       Total Not Ready
                           Break
                                     Lunch Team Support
                                                          Meeting After Call Work \
              00:03:26 00:00:00 00:00:00
                                                         00:00:00
     0
                                               00:00:00
                                                                         00:03:23
     1
              00:01:33
                       00:00:00 00:00:00
                                               00:00:00
                                                         00:00:00
                                                                         00:01:33
     2
              00:04:16
                       00:00:01
                                  00:00:00
                                               00:00:00
                                                         00:00:00
                                                                         00:04:15
     3
              00:06:14 00:06:14 00:00:00
                                                                         00:00:00
                                               00:00:00
                                                         00:00:00
     4
              00:01:49
                       00:00:00 00:00:00
                                               00:00:00
                                                         00:00:00
                                                                         00:01:49
       Special Projects Training System Issues
                                                    Other
     0
               00:00:00 00:00:00
                                       00:00:00
                                                 00:00:03
     1
               00:00:00 00:00:00
                                       00:00:00
                                                 00:00:00
     2
               00:00:00 00:00:00
                                       00:00:00
                                                 00:00:00
     3
               00:00:00 00:00:00
                                       00:00:00
                                                 00:00:00
               00:00:00 00:00:00
                                       00:00:00
                                                00:00:00
[5]: # Check first 5 rows to see the dataset is loaded correctly
     sheet3.head()
[5]:
      Agent ID
                           Number of Calls Handled Average Handle Time
                     Date
     0 Agent 1 2022-08-01
                                                 94
                                                               00:04:40
     1 Agent 1 2022-08-02
                                                 80
                                                               00:04:42
     2 Agent 1 2022-08-03
                                                 81
                                                               00:04:34
     3 Agent 1 2022-08-04
                                                 73
                                                               00:05:12
     4 Agent 1 2022-08-05
                                                 75
                                                               00:04:51
[6]: # Check first 5 rows to see the dataset is loaded correctly
     sheet4.head()
[6]:
      Agent ID Agent Team
     0 Agent 1
                    team_1
     1 Agent 2
                    team_3
     2 Agent 3
                    team_3
     3 Agent 4
                    team 4
     4 Agent 5
                    team 4
```

Interval End Time Total Logged-in \

[4]:

Agent ID Interval Start Time

Since sheet 1 and sheet 2 and sheet 4 have the common column 'Agent ID', 'Interval Start Time', 'Interval End Time', we will merge these two sheets. Sheet 3 will be left as is for further analysis (if we merge, the information will be duplicated).

```
[7]: # Merge sheet1 and sheet2 on 'Agent ID', 'Interval Start Time', and 'Interval

→End Time'
```

```
hcc_df = pd.merge(hcc_df, sheet4, on=['Agent ID'])
[8]: hcc_df.head()
[8]:
       Agent ID Interval Start Time
                                      Interval End Time Total Logged In Time \
     O Agent 1 2022-08-01 08:00:00 2022-08-01 08:30:00
                                                                    00:27:02
     1 Agent 1 2022-08-01 08:30:00 2022-08-01 09:00:00
                                                                    00:30:00
     2 Agent 1 2022-08-01 09:00:00 2022-08-01 09:30:00
                                                                    00:30:00
     3 Agent 1 2022-08-01 09:30:00 2022-08-01 10:00:00
                                                                    00:30:00
     4 Agent 1 2022-08-01 10:00:00 2022-08-01 10:30:00
                                                                    00:30:00
       Not Ready Time Ready Time Reserved Time Talk Time Next Call Prep Time \
     0
            00:03:26
                        00:00:07
                                      00:00:22 00:21:51
                                                                    00:01:16
            00:01:33
                        00:01:52
     1
                                      00:00:33 00:24:29
                                                                    00:01:33
     2
            00:04:16
                       00:00:00
                                      00:00:37 00:23:01
                                                                    00:02:06
     3
            00:06:14
                        00:00:00
                                      00:00:15 00:22:23
                                                                    00:01:08
     4
            00:01:49
                        00:00:00
                                      00:00:15 00:26:57
                                                                    00:00:59
       Total Logged-in ...
                              Break
                                        Lunch Team Support
                                                             Meeting \
     0
              00:27:02
                       ... 00:00:00
                                     00:00:00
                                                  00:00:00
                                                            00:00:00
     1
              00:30:00 ... 00:00:00 00:00:00
                                                  00:00:00
                                                            00:00:00
     2
              00:30:00 ... 00:00:01
                                     00:00:00
                                                  00:00:00
                                                            00:00:00
     3
              00:30:00 ... 00:06:14
                                     00:00:00
                                                  00:00:00
                                                            00:00:00
              00:30:00 ... 00:00:00 00:00:00
                                                  00:00:00
                                                            00:00:00
       After Call Work Special Projects Training System Issues
                                                                    Other \
     0
              00:03:23
                               00:00:00 00:00:00
                                                       00:00:00 00:00:03
     1
              00:01:33
                               00:00:00 00:00:00
                                                       00:00:00 00:00:00
     2
              00:04:15
                               00:00:00 00:00:00
                                                       00:00:00 00:00:00
     3
              00:00:00
                               00:00:00 00:00:00
                                                       00:00:00 00:00:00
     4
              00:01:49
                               00:00:00 00:00:00
                                                       00:00:00 00:00:00
       Agent Team
     0
          team_1
     1
          team 1
     2
          team_1
     3
          team_1
     4
          team_1
     [5 rows x 21 columns]
[9]: | # Split the "Interval Start Time" column into "Date" column (in case we need ...
     ⇔analysis in daily basis)
     hcc_df['Date'] = hcc_df['Interval Start Time'].dt.date
     hcc_df['Date'] = pd.to_datetime(hcc_df['Date'])
```

hcc_df = pd.merge(sheet1, sheet2, on=['Agent ID', 'Interval Start Time', _

```
# Create a list of column names in the desired order
      desired_order = ['Agent ID','Agent Team','Date'] + [col for col in hcc_df.
       ⇔columns if col not in ['Agent ID', 'Agent Team', 'Date']]
      # Reorder the columns based on the desired order, drop duplicated columns
      hcc df = hcc df[desired order]
      hcc_df = hcc_df.drop(['Total Not Ready', 'Total Logged-in'], axis =1)
      hcc_df.head()
 [9]:
       Agent ID Agent Team
                                 Date Interval Start Time
                                                             Interval End Time \
      0 Agent 1
                     team 1 2022-08-01 2022-08-01 08:00:00 2022-08-01 08:30:00
                    team_1 2022-08-01 2022-08-01 08:30:00 2022-08-01 09:00:00
      1 Agent 1
      2 Agent 1
                    team 1 2022-08-01 2022-08-01 09:00:00 2022-08-01 09:30:00
      3 Agent 1
                    team 1 2022-08-01 2022-08-01 09:30:00 2022-08-01 10:00:00
      4 Agent 1
                     team_1 2022-08-01 2022-08-01 10:00:00 2022-08-01 10:30:00
        Total Logged In Time Not Ready Time Ready Time Reserved Time Talk Time
      0
                    00:27:02
                                   00:03:26
                                             00:00:07
                                                            00:00:22 00:21:51
                    00:30:00
                                   00:01:33
                                             00:01:52
                                                                     00:24:29
      1
                                                            00:00:33
      2
                    00:30:00
                                   00:04:16
                                             00:00:00
                                                            00:00:37
                                                                     00:23:01
      3
                    00:30:00
                                   00:06:14
                                             00:00:00
                                                            00:00:15 00:22:23
                                   00:01:49
                                             00:00:00
                                                           00:00:15 00:26:57
                    00:30:00
       Next Call Prep Time
                               Break
                                         Lunch Team Support
                                                               Meeting \
                                                    00:00:00 00:00:00
                  00:01:16 00:00:00 00:00:00
      1
                  00:01:33 00:00:00 00:00:00
                                                    00:00:00 00:00:00
                  00:02:06 00:00:01 00:00:00
                                                    00:00:00 00:00:00
      2
      3
                  00:01:08 00:06:14 00:00:00
                                                    00:00:00 00:00:00
                                                   00:00:00 00:00:00
                  00:00:59 00:00:00 00:00:00
        After Call Work Special Projects Training System Issues
                                                                     Other
                                00:00:00 00:00:00
                                                        00:00:00 00:00:03
      0
              00:03:23
      1
              00:01:33
                                00:00:00 00:00:00
                                                        00:00:00 00:00:00
      2
              00:04:15
                                00:00:00 00:00:00
                                                        00:00:00 00:00:00
      3
              00:00:00
                                00:00:00 00:00:00
                                                        00:00:00 00:00:00
              00:01:49
                                00:00:00 00:00:00
                                                        00:00:00 00:00:00
[10]: hcc_df.shape
[10]: (24912, 20)
[11]: hcc_df.isnull().sum()
[11]: Agent ID
                              0
      Agent Team
                              0
```

Date 0 Interval Start Time 0 Interval End Time 0 Total Logged In Time 0 Not Ready Time 0 Ready Time 0 Reserved Time 0 Talk Time 0 Next Call Prep Time 0 Break 0 Lunch 0 Team Support 0 Meeting 0 After Call Work 0 Special Projects 0 Training 0 System Issues 0 Other 0 dtype: int64

[12]: hcc_df.info()

<class 'pandas.core.frame.DataFrame'>
Int64Index: 24912 entries, 0 to 24911
Data columns (total 20 columns):

#	Column	Non-Null Count	Dtype
0	Agent ID	24912 non-null	object
1	Agent Team	24912 non-null	object
2	Date	24912 non-null	datetime64[ns]
3	Interval Start Time	24912 non-null	datetime64[ns]
4	Interval End Time	24912 non-null	datetime64[ns]
5	Total Logged In Time	24912 non-null	object
6	Not Ready Time	24912 non-null	object
7	Ready Time	24912 non-null	object
8	Reserved Time	24912 non-null	object
9	Talk Time	24912 non-null	object
10	Next Call Prep Time	24912 non-null	object
11	Break	24912 non-null	object
12	Lunch	24912 non-null	object
13	Team Support	24912 non-null	object
14	Meeting	24912 non-null	object
15	After Call Work	24912 non-null	object
16	Special Projects	24912 non-null	object
17	Training	24912 non-null	object
18	System Issues	24912 non-null	object
19	Other	24912 non-null	object
<pre>dtypes: datetime64[ns](3),</pre>		object(17)	

memory usage: 4.0+ MB

Re-format the time-related columns for more appropriate analysis. We will change from column 'Total Logged In Time' to column 'Other' as timedelta64.

[14]: hcc_df.info()

<class 'pandas.core.frame.DataFrame'>
Int64Index: 24912 entries, 0 to 24911
Data columns (total 20 columns):

#	Column	Non-Null Count	Dtype		
0	Agent ID	24912 non-null	object		
1	Agent Team	24912 non-null	object		
2	Date	24912 non-null	datetime64[ns]		
3	Interval Start Time	24912 non-null	datetime64[ns]		
4	Interval End Time	24912 non-null	datetime64[ns]		
5	Total Logged In Time	24912 non-null	timedelta64[ns]		
6	Not Ready Time	24912 non-null	timedelta64[ns]		
7	Ready Time	24912 non-null	timedelta64[ns]		
8	Reserved Time	24912 non-null	timedelta64[ns]		
9	Talk Time	24912 non-null	timedelta64[ns]		
10	Next Call Prep Time	24912 non-null	timedelta64[ns]		
11	Break	24912 non-null	timedelta64[ns]		
12	Lunch	24912 non-null	timedelta64[ns]		
13	Team Support	24912 non-null	timedelta64[ns]		
14	Meeting	24912 non-null	timedelta64[ns]		
15	After Call Work	24912 non-null	timedelta64[ns]		
16	Special Projects	24912 non-null	timedelta64[ns]		
17	Training	24912 non-null	timedelta64[ns]		
18	System Issues	24912 non-null	timedelta64[ns]		
19	Other	24912 non-null	timedelta64[ns]		
dtyp	es: datetime64[ns](3),	object(2), time	delta64[ns](15)		
memory usage: 4.0+ MB					

[15]: hcc_df.head()

[15]: Agent ID Agent Team Date Interval Start Time Interval End Time \
0 Agent 1 team_1 2022-08-01 2022-08-01 08:00:00 2022-08-01 08:30:00

```
1 Agent 1
               team_1 2022-08-01 2022-08-01 08:30:00 2022-08-01 09:00:00
               team_1 2022-08-01 2022-08-01 09:00:00 2022-08-01 09:30:00
2 Agent 1
3 Agent 1
               team 1 2022-08-01 2022-08-01 09:30:00 2022-08-01 10:00:00
4 Agent 1
               team_1 2022-08-01 2022-08-01 10:00:00 2022-08-01 10:30:00
  Total Logged In Time Not Ready Time
                                            Ready Time
                                                         Reserved Time
       0 days 00:27:02 0 days 00:03:26 0 days 00:00:07 0 days 00:00:22
0
       0 days 00:30:00 0 days 00:01:33 0 days 00:01:52 0 days 00:00:33
1
2
       0 days 00:30:00 0 days 00:04:16 0 days 00:00:00 0 days 00:00:37
3
       0 days 00:30:00 0 days 00:06:14 0 days 00:00:00 0 days 00:00:15
       0 days 00:30:00 0 days 00:01:49 0 days 00:00:00 0 days 00:00:15
        Talk Time Next Call Prep Time
                                                Break Lunch Team Support \
0 0 days 00:21:51
                      0 days 00:01:16 0 days 00:00:00 0 days
                                                                   0 days
1 0 days 00:24:29
                      0 days 00:01:33 0 days 00:00:00 0 days
                                                                   0 days
2 0 days 00:23:01
                     0 days 00:02:06 0 days 00:00:01 0 days
                                                                   0 days
3 0 days 00:22:23
                      0 days 00:01:08 0 days 00:06:14 0 days
                                                                   0 days
4 0 days 00:26:57
                      0 days 00:00:59 0 days 00:00:00 0 days
                                                                   0 days
 Meeting After Call Work Special Projects Training System Issues
0 0 days 0 days 00:03:23
                                    0 days
                                             0 days
                                                           0 days
1 0 days 0 days 00:01:33
                                    0 days
                                             0 days
                                                           0 days
2 0 days 0 days 00:04:15
                                    0 days
                                             0 days
                                                           0 days
3 0 days 0 days 00:00:00
                                    0 days
                                                           0 days
                                             0 days
4 0 days 0 days 00:01:49
                                    0 days
                                             0 days
                                                           0 days
            Other
0 0 days 00:00:03
1 0 days 00:00:00
2 0 days 00:00:00
3 0 days 00:00:00
4 0 days 00:00:00
```

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1.1 2 - EDA:

Conduct exploratory (descriptive) data analysis and summarize key findings pertaining to HCC's current state.

- 2a. Overall
- 2b. By team
- 2c. By Agent
- 2d. Staffing Plan

[16]: hcc_df.describe()

[16]:	Total Logged In Time 24912 0 days 00:22:47.069845857 0 days 00:12:22.696562502 0 days 00:00:00 0 days 00:21:51.750000 0 days 00:30:00 0 days 00:30:00 0 days 00:30:00	Not Ready Time 24912 0 days 00:03:37.874638728 0 days 00:06:40.461289026 0 days 00:00:00 0 days 00:00:00 0 days 00:00:11 0 days 00:04:14 0 days 00:30:00	
count mean std min 25% 50% 75% max	Ready Time 24912 0 days 00:02:14.546202633 0 days 00:04:25.724780060 0 days 00:00:00 0 days 00:00:00 0 days 00:00:05 0 days 00:02:18.250000 0 days 00:30:00	Reserved Time \ 24912 0 days 00:00:17.288334938 0 days 00:00:19.288031934 0 days 00:00:00 0 days 00:00:00 0 days 00:00:15 0 days 00:00:27 0 days 00:14:26	
count mean std min 25% 50% 75% max	Talk Time 24912 0 days 00:15:30.948859987 0 days 00:10:40.340246808 0 days 00:00:00 0 days 00:01:49.750000 0 days 00:19:09 0 days 00:24:59 0 days 00:30:00	Next Call Prep Time \ 24912 0 days 00:01:06.411809569 0 days 00:00:58.443825965 0 days 00:00:00 0 days 00:00:05 0 days 00:01:00 0 days 00:01:44 0 days 00:08:38	
count mean std min 25% 50% 75% max	Break 24912 0 days 00:00:39.447736030 0 days 00:02:32.250826455 0 days 00:00:00 0 days 00:30:00	Lunch 24912 0 days 00:01:00.675417469 0 days 00:04:46.022551244 0 days 00:00:00 0 days 00:30:00	
count mean	Team Support 24912 0 days 00:00:00.636159280	Meeting \ 24912 0 days 00:00:06.517501605	

```
0 days 00:00:00
                       0 days 00:00:00
     min
      25%
                       0 days 00:00:00
                                                   0 days 00:00:00
      50%
                       0 days 00:00:00
                                                   0 days 00:00:00
     75%
                       0 days 00:00:00
                                                   0 days 00:00:00
                       0 days 00:30:00
                                                   0 days 00:30:00
     max
                       After Call Work
                                                  Special Projects
                                  24912
                                                              24912
      count
             0 days 00:01:02.020110789
                                         0 days 00:00:06.772840398
     mean
             0 days 00:02:14.947299607
                                         0 days 00:01:15.055259239
      std
                       0 days 00:00:00
                                                   0 days 00:00:00
     min
     25%
                       0 days 00:00:00
                                                   0 days 00:00:00
     50%
                       0 days 00:00:00
                                                   0 days 00:00:00
                       0 days 00:01:00
     75%
                                                   0 days 00:00:00
     max
                       0 days 00:29:33
                                                   0 days 00:30:00
                               Training
                                                     System Issues
                                  24912
                                                              24912
     count
             0 days 00:00:30.285444765
                                         0 days 00:00:02.215237636
     mean
             0 days 00:03:23.426900289
                                         0 days 00:00:25.820708740
     std
                       0 days 00:00:00
                                                   0 days 00:00:00
     min
     25%
                       0 days 00:00:00
                                                   0 days 00:00:00
                       0 days 00:00:00
                                                   0 days 00:00:00
     50%
     75%
                       0 days 00:00:00
                                                   0 days 00:00:00
                       0 days 00:30:00
                                                   0 days 00:27:48
     max
                                 Other
      count
                                  24912
             0 days 00:00:09.304190751
     mean
             0 days 00:01:00.932564703
     std
                       0 days 00:00:00
     min
                       0 days 00:00:00
      25%
                       0 days 00:00:00
      50%
     75%
                       0 days 00:00:00
                       0 days 00:30:00
     max
[17]: #Daily average Talk Time trend
      daily_average_talk_time = hcc_df.groupby(hcc_df['Date'].dt.date)['Talk Time'].
       mean().reset_index()
      daily_average_talk_time['Talk Time'] = daily_average_talk_time['Talk Time'].dt.
       ⇔total seconds() / 60
[18]: # Rename the column
      daily_average_talk_time.rename(columns={'Talk Time': 'Talk Time (Minutes)'}, u
       →inplace=True)
```

0 days 00:01:12.196593646

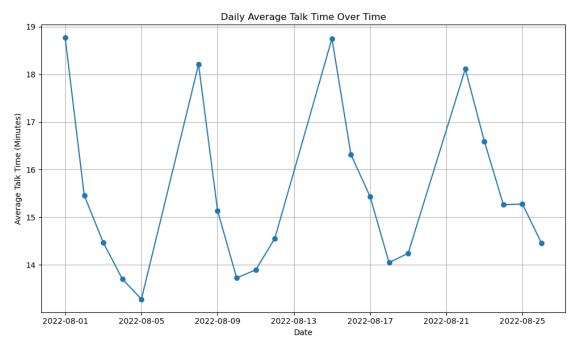
0 days 00:00:23.855751314

std

```
[19]: # Convert the 'Date' column to datetime
      daily_average_talk_time['Date'] = pd.

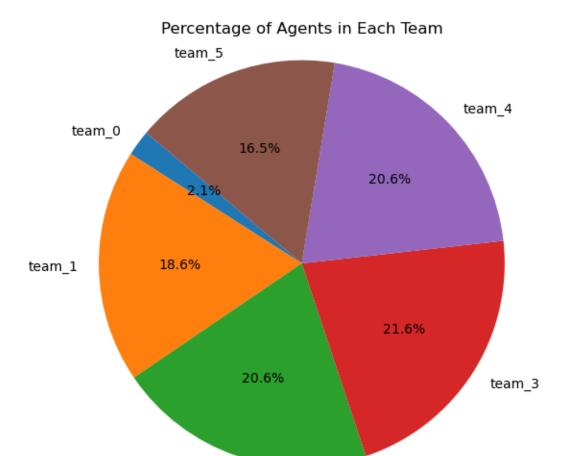
    datetime(daily_average_talk_time['Date'])

      daily_average_talk_time.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 20 entries, 0 to 19
     Data columns (total 2 columns):
          Column
                               Non-Null Count Dtype
          _____
      0
          Date
                               20 non-null
                                                datetime64[ns]
          Talk Time (Minutes) 20 non-null
                                                float64
     dtypes: datetime64[ns](1), float64(1)
     memory usage: 448.0 bytes
[20]: # Create a line plot
      plt.figure(figsize=(10, 6))
      plt.plot(daily_average_talk_time['Date'], daily_average_talk_time['Talk Time_
       →(Minutes)'], marker='o', linestyle='-')
      plt.xlabel('Date')
      plt.ylabel('Average Talk Time (Minutes)')
      plt.title('Daily Average Talk Time Over Time')
      plt.grid(True)
      plt.tight_layout()
      plt.show()
```



```
\#\#\# b) By team:
```

```
[21]: team = sheet4.groupby(['Agent Team']).count().reset_index()
      # Calculate the total count of agents in the dataset
      total_agents = team["Agent ID"].sum()
      # Calculate the percentage of each team
      team["Percentage"] = (team["Agent ID"] / total_agents) * 100
      team
[21]:
       Agent Team Agent ID Percentage
            team_0
                          2
                                2.061856
     0
      1
            team_1
                               18.556701
                          18
      2
           team_2
                          20
                              20.618557
      3
            team_3
                          21
                               21.649485
      4
           team_4
                          20
                              20.618557
     5
            team_5
                              16.494845
                          16
[22]: # Create a pie chart
      plt.figure(figsize=(6, 6))
      plt.pie(team["Percentage"], labels=team["Agent Team"], autopct="%1.1f%%", u
      ⇒startangle=140)
      plt.title("Percentage of Agents in Each Team")
      plt.axis("equal") # Equal aspect ratio ensures that pie is drawn as a circle.
      # Show the pie chart
      plt.show()
```



```
[23]: team_sorted = hcc_df.groupby(['Agent Team'])[time_related_columns].sum().
      →reset_index()
      team_sorted
[23]:
       Agent Team Total Logged In Time
                                        Not Ready Time
                                                              Ready Time \
                       3 days 16:24:03 0 days 12:57:57 0 days 22:44:08
           team 0
     0
                      75 days 04:53:42 12 days 19:19:08 5 days 19:34:04
      1
           team 1
           team 2
                      84 days 12:28:05 10 days 06:51:17 11 days 12:33:22
      3
           team_3
                      79 days 19:29:40 12 days 06:22:59 4 days 05:44:38
      4
                      81 days 12:40:30 13 days 00:49:38 8 days 05:19:06
           team_4
      5
           team_5
                      69 days 10:11:24 13 days 21:20:34 8 days 01:08:17
         Reserved Time
                              Talk Time Next Call Prep Time
                                                                       Break \
     0 0 days 00:48:24 2 days 00:13:49
                                            0 days 03:39:45 0 days 01:55:04
     1 1 days 02:31:59 51 days 14:01:33
                                            3 days 21:26:58 1 days 23:02:38
     2 1 days 00:48:21 57 days 11:53:13
                                           4 days 04:21:52 1 days 21:51:45
     3 0 days 23:58:18 58 days 04:10:55
                                            4 days 03:12:50 2 days 08:05:57
```

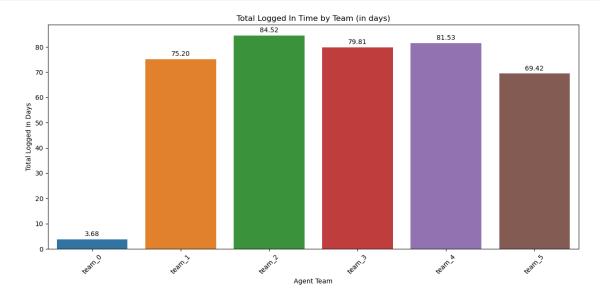
team 2

```
4 1 days 00:34:39 55 days 13:12:15 3 days 16:44:52 2 days 10:08:54
      5 0 days 18:56:26 43 days 14:38:13 3 days 02:07:54 2 days 15:54:24
                  Lunch
                           Team Support
                                                Meeting After Call Work \
     0 0 days 04:03:32 0 days 00:00:25 0 days 00:48:54 0 days 02:04:47
      1 3 days 05:50:09 0 days 02:07:37 0 days 10:11:58 4 days 02:43:24
     2 3 days 17:02:24 0 days 00:27:27 0 days 02:25:50 2 days 05:15:26
     3 3 days 11:11:05 0 days 00:38:48 0 days 05:12:53 3 days 04:32:12
      4 3 days 14:35:12 0 days 00:07:33 0 days 16:25:29 4 days 06:23:59
      5 3 days 07:10:04 0 days 01:02:18 0 days 10:01:00 4 days 00:10:57
       Special Projects
                               Training
                                           System Issues
      0 0 days 00:00:00 0 days 03:40:08 0 days 00:00:00 0 days 00:25:07
      1 0 days 15:41:54 1 days 14:41:09 0 days 01:59:19 0 days 15:01:00
      2 0 days 07:24:13 1 days 11:00:38 0 days 02:35:05 0 days 10:48:29
      3 0 days 10:52:08 1 days 20:25:28 0 days 05:54:10 0 days 11:30:18
      4 0 days 08:08:02 1 days 02:46:10 0 days 03:23:45 0 days 10:50:34
      5 0 days 04:45:48 2 days 13:00:58 0 days 01:27:27 0 days 15:47:38
[24]: time columns = ['Total Logged In Time', 'Not Ready Time', 'Ready Time', 'I
       →'Reserved Time', 'Talk Time', 'Next Call Prep Time', 'Break', 'Lunch',
                          'Team Support', 'Meeting', 'After Call Work', 'Special ⊔
       →Projects', 'Training', 'System Issues', 'Other']
[25]: #By days
      team_sorted2 = team_sorted.copy()
      for col in time_columns:
          team_sorted2[col] = team_sorted2[col].dt.days + team_sorted2[col].dt.
       \Rightarrowseconds / (3600 * 24)
[26]: # Create a bar plot of Total Logged In Time by Team in days
      plt.figure(figsize=(12, 6))
      ax = sns.barplot(x='Agent Team', y='Total Logged In Time', data=team_sorted2)
      plt.title('Total Logged In Time by Team (in days)')
      plt.xlabel('Agent Team')
      plt.ylabel('Total Logged In Days')
      plt.xticks(rotation=45)
      # Annotate each bar with its respective data
      for p in ax.patches:
          ax.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.

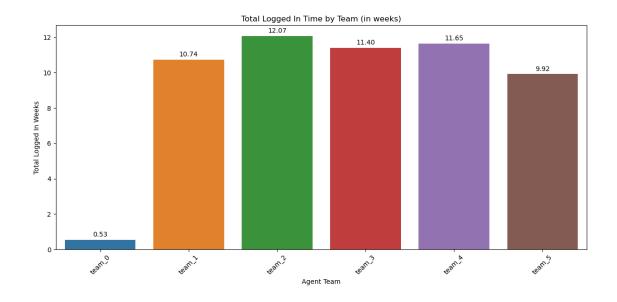
→get_height()), ha='center', va='baseline', fontsize=10, color='black',

       ⇒xytext=(0, 5), textcoords='offset points')
      plt.tight_layout()
```

plt.show()



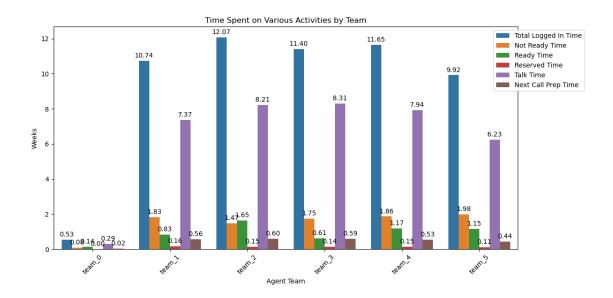
```
[27]: #By weeks
     team_sorted3 = team_sorted2.copy()
     for col in time_columns:
         team_sorted3[col] = team_sorted3[col] / 7
[28]: # Create a bar plot of Total Logged In Time by Team in weeks
     plt.figure(figsize=(12, 6))
     ax = sns.barplot(x='Agent Team', y='Total Logged In Time', data=team_sorted3)
     plt.title('Total Logged In Time by Team (in weeks)')
     plt.xlabel('Agent Team')
     plt.ylabel('Total Logged In Weeks')
     plt.xticks(rotation=45)
     # Annotate each bar with its respective data
     for p in ax.patches:
         ax.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.
      Get_height()), ha='center', va='baseline', fontsize=10, color='black', □
      plt.tight_layout()
     plt.show()
```



```
[29]: overall_activity = ['Total Logged In Time', 'Not Ready Time', 'Ready Time', L
      # Create a stacked bar plot of various activities by Team
     stacked_data = team_sorted3[['Agent Team'] + overall_activity].
      -melt(id_vars='Agent Team', var_name='Activity', value_name='Time (Days)')
     #Plotting
     plt.figure(figsize=(12, 6))
     ax = sns.barplot(x='Agent Team', y='Time (Days)', hue='Activity',

data=stacked_data)

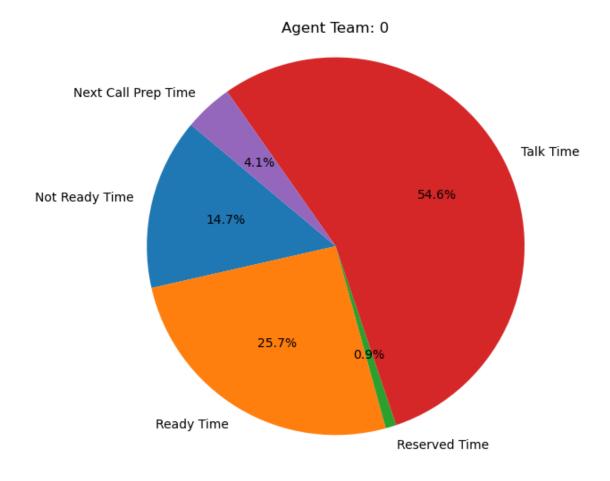
     plt.title('Time Spent on Various Activities by Team')
     plt.xlabel('Agent Team')
     plt.ylabel('Weeks')
     plt.xticks(rotation=45)
     plt.legend(loc='upper right', bbox_to_anchor=(1.15, 1))
     # Annotate each bar with its respective data
     for p in ax.patches:
         ax.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.
      Get_height()), ha='center', va='baseline', fontsize=10, color='black', ⊔
       ⇔xytext=(0, 5), textcoords='offset points')
     plt.tight_layout()
     plt.show()
```



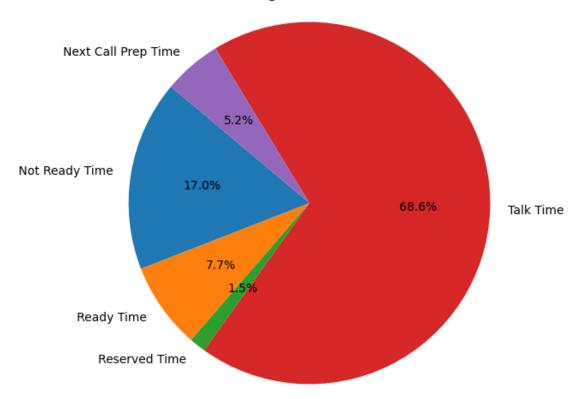
What percentage of logged-in time on average did teams spend on each task per time interval (on daily/weekly basis)?

```
[30]:
         index Agent Team
                            Not Ready Time
                                            Ready Time
                                                                         Talk Time
                                                         Reserved Time
                                 14.667094
      0
             0
                   team_0
                                              25.718712
                                                               0.912510
                                                                         54.558623
                   team_1
                                 17.026968
                                               7.732737
                                                               1.470061
                                                                         68.592679
      1
             1
      2
             2
                   team_2
                                 12.169515
                                              13.633742
                                                               1.222885
                                                                         68.026062
      3
                   team 3
             3
                                 15.368515
                                               5.311625
                                                               1.251461
                                                                         72.888854
      4
             4
                   team_4
                                 15.987695
                                              10.084369
                                                               1.256085
                                                                         68.136209
      5
                   team 5
                                                               1.136758 62.816182
             5
                                 20.006288
                                              11.591599
         Next Call Prep Time
      0
                     4.143060
      1
                     5.177556
```

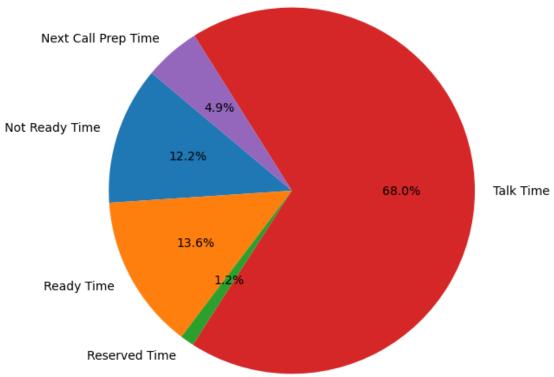
```
2
                    4.947795
      3
                    5.179545
                    4.535642
      4
      5
                    4.449172
[31]: team_sorted22.columns
[31]: Index(['Agent Team', 'Not Ready Time', 'Ready Time', 'Reserved Time',
             'Talk Time', 'Next Call Prep Time'],
            dtype='object')
[32]: # Group the data by 'Agent Team' and sum the time spent in each activity
      team_activity_totals = team_sorted22.groupby('Agent Team').sum().reset_index()
      # List of activities (excluding 'Agent Team' column)
      activities = team_activity_totals.columns[1:]
      # Create a pie chart for each agent team
      for team in team_activity_totals.index:
          team_data = team_activity_totals.loc[team, activities]
          plt.figure(figsize=(6, 6))
          plt.pie(team_data, labels=activities, autopct='%1.1f%%', startangle=140)
          plt.title(f'Agent Team: {team}')
          plt.axis('equal')
          plt.show()
```

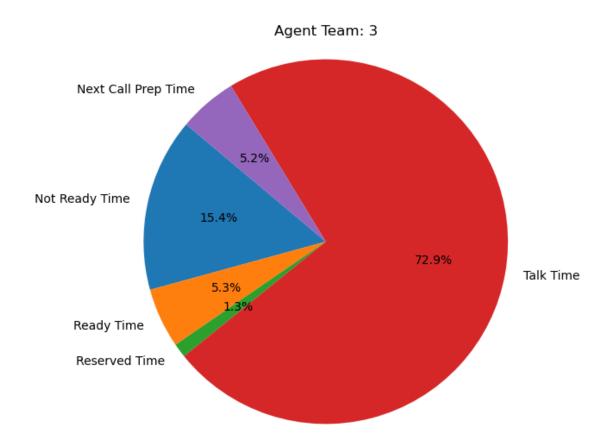




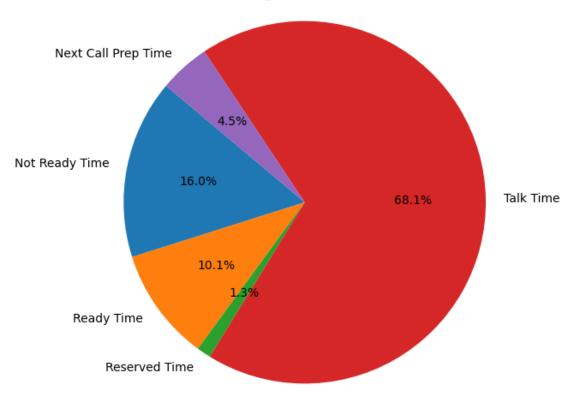




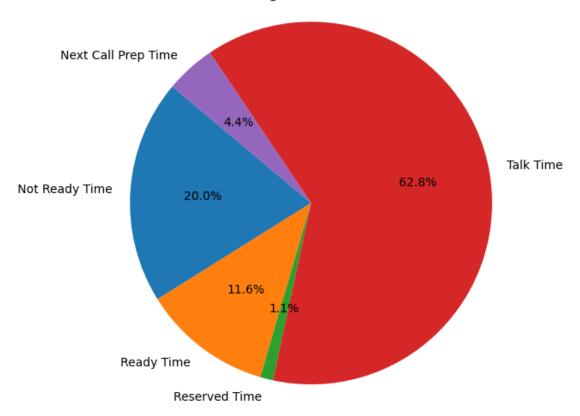












```
[33]: # Create a bar chart for each agent team with customizations
for team in team_activity_totals.index:
    team_data = team_activity_totals.loc[team, activities]
    plt.figure(figsize=(8, 6))

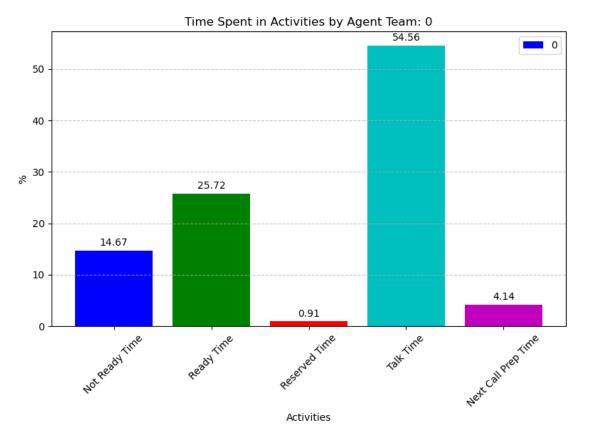
# Set custom colors for bars
    colors = ['b', 'g', 'r', 'c', 'm', 'y', 'k', 'purple', 'orange']

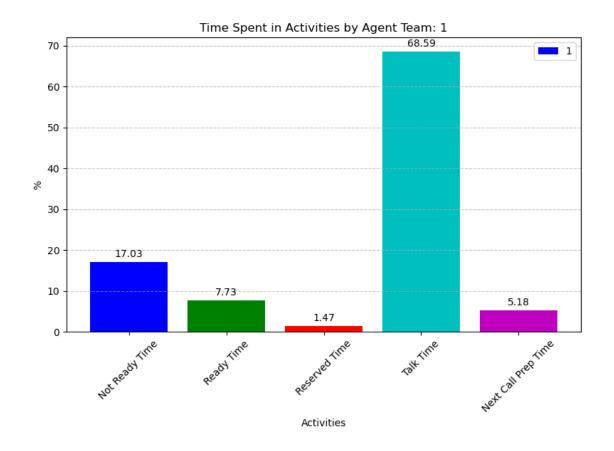
ax = plt.bar(activities, team_data, label=team, color=colors)
    plt.title(f'Time Spent in Activities by Agent Team: {team}')
    plt.xlabel('Activities')
    plt.ylabel('%')
    plt.legend()

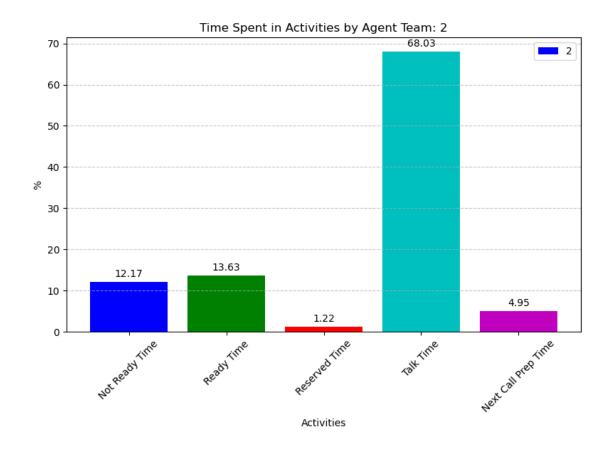
# Customize gridlines
    plt.grid(axis='y', linestyle='--', alpha=0.7)

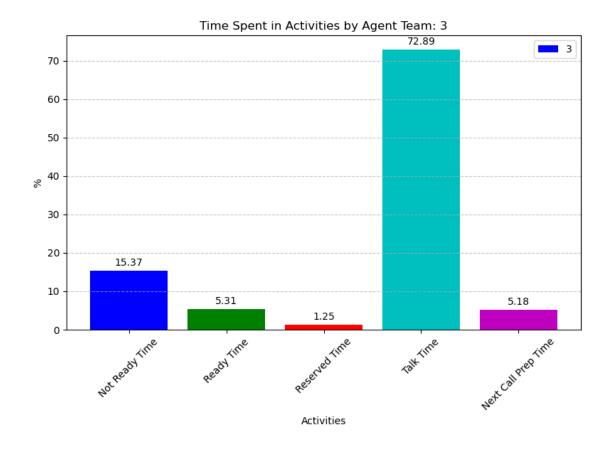
plt.xticks(rotation=45)

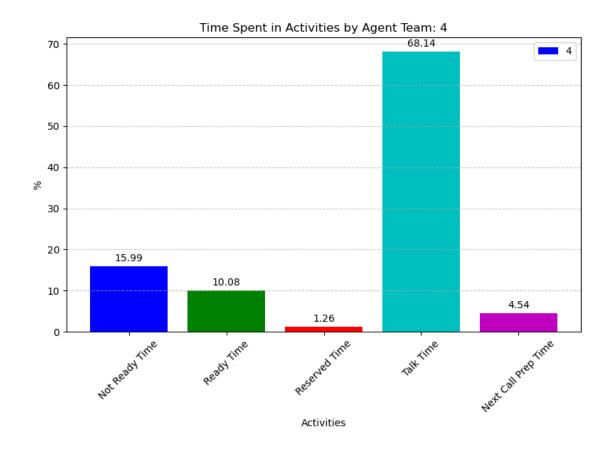
# Annotate each bar with its respective data
```

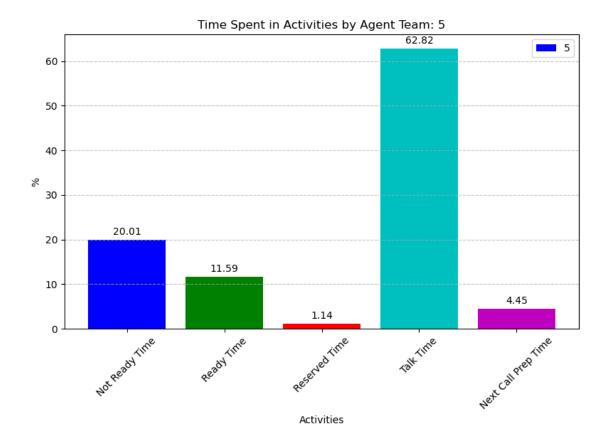






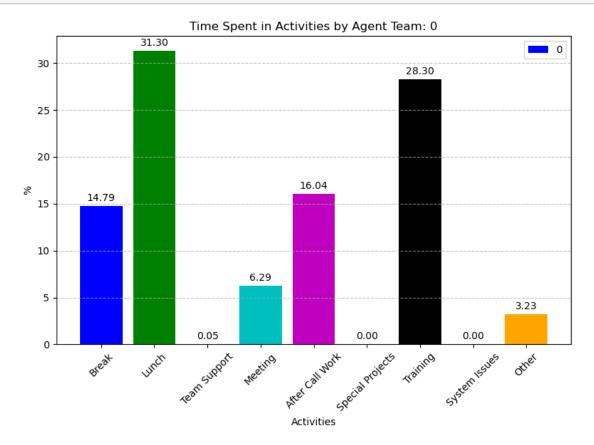


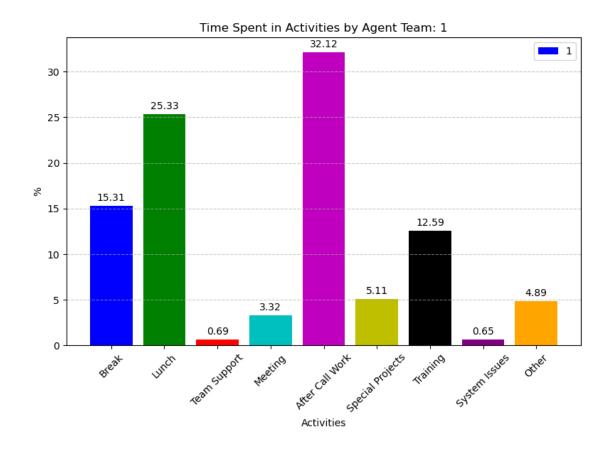


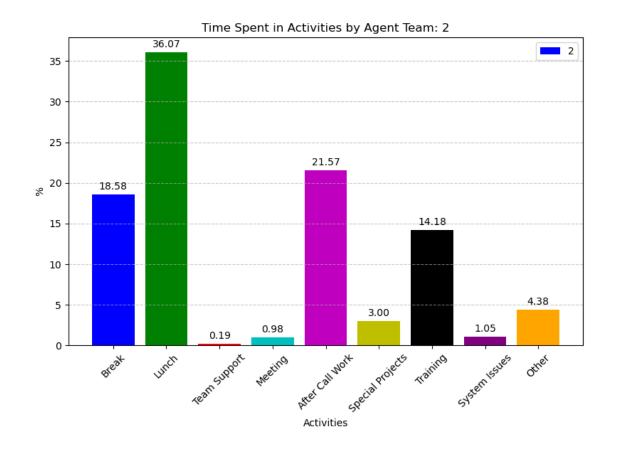


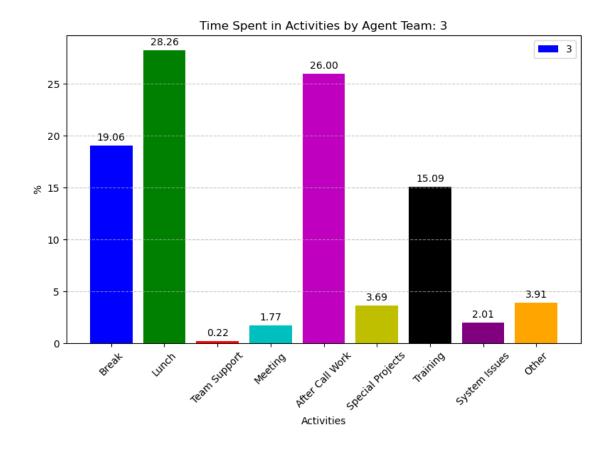
```
[34]:
        index Agent Team
                              Break
                                         Lunch Team Support
                                                              Meeting \
                                                    0.053560 6.285751
     0
            0
                  team_0 14.791011 31.304497
     1
            1
                  team 1 15.307842 25.327383
                                                    0.692097 3.318847
     2
            2
                  team 2 18.578741 36.069798
                                                    0.185332 0.984610
     3
            3
                  team 3 19.056520 28.257306
                                                    0.219668 1.771407
     4
                  team 4 18.588003 27.678751
                                                    0.040225 5.250413
     5
                  team 5 19.171457 23.749660
                                                    0.311491 3.004915
        After Call Work Special Projects
                                            Training System Issues
                                                                        Other
                                 0.000000
     0
              16.040020
                                           28.296591
                                                           0.000000
                                                                     3.228571
              32.124069
                                 5.108158 12.588173
                                                           0.647084
     1
                                                                     4.886347
     2
              21.574318
                                 2.999177 14.182656
                                                           1.047062 4.378306
     3
              25.999005
                                 3.692091 15.090693
                                                           2.005135 3.908173
     4
              32.733635
                                 2.600122
                                           8.557262
                                                           1.085530 3.466060
     5
              28.853932
                                 1.428960 18.304315
                                                           0.437238 4.738032
[35]: # Group the data by 'Agent Team' and sum the time spent in each activity
     team_activity_totals2 = team_sorted23.groupby('Agent Team').sum().reset_index()
      # List of activities (excluding 'Agent Team' column)
     activities2 = team_activity_totals2.columns[1:]
      # Create a bar chart for each agent team with customizations
     for team in team_activity_totals2.index:
         team_data2 = team_activity_totals2.loc[team, activities2]
         plt.figure(figsize=(8, 6))
          # Set custom colors for bars
         colors = ['b', 'g', 'r', 'c', 'm', 'y', 'k', 'purple', 'orange']
         ax = plt.bar(activities2, team data2, label=team, color=colors)
         plt.title(f'Time Spent in Activities by Agent Team: {team}')
         plt.xlabel('Activities')
         plt.ylabel('%')
         plt.legend()
         # Customize gridlines
         plt.grid(axis='y', linestyle='--', alpha=0.7)
         plt.xticks(rotation=45)
          # Annotate each bar with its respective data
         for p in ax:
             plt.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2.,__
       op.get_height()), ha='center', va='baseline', fontsize=10, color='black',⊔
       ⇒xytext=(0, 5), textcoords='offset points')
```

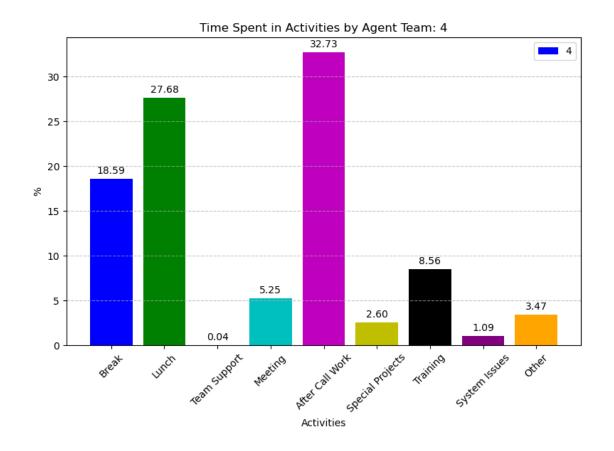
plt.tight_layout()
plt.show()

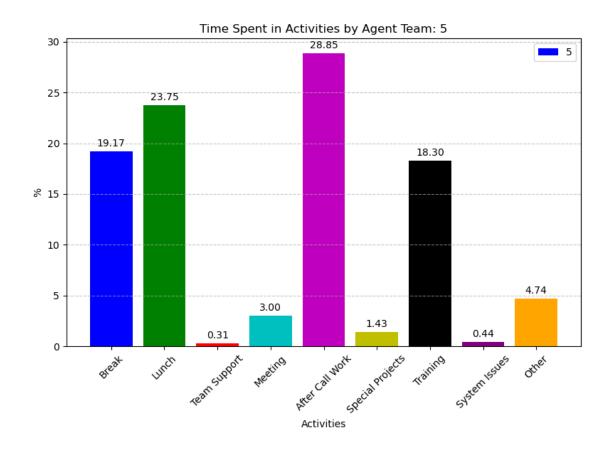












What is agents/teams utilization rate (on daily basis)? How about non-utilized time?

```
[36]: copied_df = hcc_df.copy()

for col in time_related_columns:
      copied_df[col] = copied_df[col].dt.total_seconds() / (3600 * 24)

copied_df
```

```
[36]:
             Agent ID Agent Team
                                       Date Interval Start Time
                                                                   Interval End Time
              Agent 1
      0
                          team_1 2022-08-01 2022-08-01 08:00:00 2022-08-01 08:30:00
              Agent 1
                          team_1 2022-08-01 2022-08-01 08:30:00 2022-08-01 09:00:00
      1
      2
                          team_1 2022-08-01 2022-08-01 09:00:00 2022-08-01 09:30:00
              Agent 1
      3
              Agent 1
                          team_1 2022-08-01 2022-08-01 09:30:00 2022-08-01 10:00:00
      4
                          team_1 2022-08-01 2022-08-01 10:00:00 2022-08-01 10:30:00
              Agent 1
      24907
             Agent 97
                          team_3 2022-08-26 2022-08-26 14:30:00 2022-08-26 15:00:00
                          team 3 2022-08-26 2022-08-26 15:00:00 2022-08-26 15:30:00
      24908
             Agent 97
      24909
             Agent 97
                          team 3 2022-08-26 2022-08-26 15:30:00 2022-08-26 16:00:00
      24910
             Agent 97
                          team 3 2022-08-26 2022-08-26 16:00:00 2022-08-26 16:30:00
      24911
             Agent 97
                          team_3 2022-08-26 2022-08-26 16:30:00 2022-08-26 17:00:00
```

```
Total Logged In Time Not Ready Time
                                                      Ready Time
                                                                   Reserved Time
      0
                          0.018773
                                           0.002384
                                                        0.000081
                                                                        0.000255
      1
                          0.020833
                                           0.001076
                                                        0.001296
                                                                        0.000382
      2
                          0.020833
                                           0.002963
                                                        0.000000
                                                                        0.000428
      3
                          0.020833
                                           0.004329
                                                        0.000000
                                                                        0.000174
      4
                                                                        0.000174
                          0.020833
                                           0.001262
                                                        0.000000
                             •••
                          0.020833
      24907
                                           0.000000
                                                        0.002859
                                                                        0.000255
      24908
                                                                        0.000231
                          0.020833
                                           0.000000
                                                        0.010127
      24909
                          0.020833
                                           0.003113
                                                        0.013252
                                                                        0.000104
      24910
                          0.020833
                                           0.000000
                                                        0.004641
                                                                        0.000150
      24911
                          0.001366
                                           0.000127
                                                        0.000000
                                                                        0.000000
             Talk Time
                         Next Call Prep Time
                                                                  Team Support
                                                                                 Meeting
                                                   Break
                                                         Lunch
      0
              0.015174
                                     0.000880
                                               0.000000
                                                            0.0
                                                                           0.0
                                                                                     0.0
      1
                                                            0.0
                                                                           0.0
                                                                                     0.0
              0.017002
                                     0.001076
                                                0.00000
      2
                                                            0.0
                                                                           0.0
                                                                                     0.0
              0.015984
                                     0.001458
                                                0.000012
      3
              0.015544
                                     0.000787
                                                0.004329
                                                            0.0
                                                                           0.0
                                                                                     0.0
      4
                                                0.000000
                                                            0.0
                                                                           0.0
                                                                                     0.0
              0.018715
                                     0.000683
      24907
              0.016563
                                               0.000000
                                                                                     0.0
                                     0.001157
                                                            0.0
                                                                           0.0
      24908
              0.009780
                                               0.000000
                                                            0.0
                                                                           0.0
                                                                                     0.0
                                     0.000694
      24909
              0.003669
                                                                           0.0
                                                                                     0.0
                                     0.000694
                                               0.003113
                                                            0.0
      24910
                                                0.000000
                                                            0.0
                                                                           0.0
                                                                                     0.0
              0.015579
                                     0.000463
      24911
              0.001157
                                     0.000081
                                               0.000000
                                                            0.0
                                                                           0.0
                                                                                     0.0
             After Call Work Special Projects
                                                             System Issues
                                                                                 Other
                                                  Training
      0
                     0.002350
                                              0.0
                                                   0.000000
                                                                        0.0
                                                                             0.000035
      1
                                              0.0
                                                  0.000000
                                                                        0.0
                                                                             0.000000
                     0.001076
      2
                                              0.0
                                                   0.000000
                                                                        0.0
                     0.002951
                                                                              0.000000
      3
                                              0.0
                                                   0.000000
                                                                        0.0
                                                                              0.000000
                     0.000000
      4
                                                   0.00000
                                                                              0.000000
                     0.001262
                                              0.0
                                                                        0.0
      24907
                     0.00000
                                              0.0 0.000000
                                                                        0.0
                                                                              0.000000
      24908
                     0.000000
                                              0.0 0.000000
                                                                        0.0
                                                                              0.000000
      24909
                                              0.0
                                                  0.000000
                                                                        0.0
                                                                             0.000000
                     0.000000
      24910
                     0.00000
                                              0.0
                                                  0.000000
                                                                        0.0
                                                                              0.000000
      24911
                     0.000000
                                              0.0 0.000127
                                                                        0.0
                                                                             0.000000
      [24912 rows x 20 columns]
[37]: # Group data by day and calculate metrics
      daily_metrics = copied_df.resample('D', on='Date').agg({
           'Agent ID': 'nunique',
           'Agent Team': 'nunique',
           'Total Logged In Time': 'sum',
```

```
'Talk Time': 'sum',
    'Reserved Time': 'sum',
    'Ready Time': 'sum',
    'Not Ready Time': 'sum'
    # Count unique agents per day
}).reset_index()
[38]: daily_metrics
```

[38]:	Date	Agent ID A	gent Team	Total Logged In Time	Talk Time	\
(2022-08-01	72	6	22.497778	16.891944	
	1 2022-08-02	70	6	18.478287	13.524988	
2	2 2022-08-03	76	6	21.292801	13.740868	
3	3 2022-08-04	73	6	19.299444	12.501030	
4	1 2022-08-05	65	6	17.548275	10.786806	
į	5 2022-08-06	0	0	0.000000	0.00000	
(3 2022-08-07	0	0	0.000000	0.00000	
-	7 2022-08-08	76	6	25.178576	17.300139	
8	3 2022-08-09	74	6	21.129942	13.998750	
Ş	9 2022-08-10	74	6	20.431238	12.692361	
	10 2022-08-11	70	6	18.688819	12.156539	
-	11 2022-08-12	60	5	16.096632	10.913530	
	12 2022-08-13	0	0	0.000000	0.000000	
-	13 2022-08-14	0	0	0.000000	0.000000	
-	14 2022-08-15	66	6	20.715914	15.470359	
-	15 2022-08-16	67	6	19.318831	13.662639	
-	16 2022-08-17	67	6	18.630799	12.926655	
-	17 2022-08-18	71	6	19.512106	12.465220	
-	18 2022-08-19	63	6	17.587118	11.214699	
-	19 2022-08-20	0	0	0.000000	0.000000	
2	20 2022-08-21	0	0	0.000000	0.000000	
2	21 2022-08-22	77	5	25.329861	17.434664	
2	22 2022-08-23	70	5	20.517870	14.519931	
2	23 2022-08-24	69	5	18.978657	13.161956	
2	24 2022-08-25	64	5	17.072141	12.220648	
2	25 2022-08-26	60	5	15.866713	10.839861	
	Reserved 7	Time Ready T	Time Not R	eady Time		
(0.266	•		3.631736		
	0.259			2.724259		
-						

	Reserved Time	Ready Time	Not Ready Time
0	0.266319	0.638623	3.631736
1	0.259549	1.044062	2.724259
2	0.276806	2.852882	3.432037
3	0.248403	2.086516	3.550139
4	0.211725	2.886794	2.861366
5	0.000000	0.000000	0.000000
6	0.000000	0.000000	0.000000
7	0.302558	2.840532	3.557419
8	0.270428	2.601551	3.217431

```
10
               0.224375
                           2.393310
                                            3.045046
      11
               0.200440
                           1.614734
                                            2.574722
      12
               0.000000
                           0.000000
                                            0.000000
      13
               0.000000
                           0.000000
                                            0.000000
      14
               0.254618
                           0.877454
                                            3.094780
      15
               0.255833
                           1.322859
                                            3.104005
      16
               0.244352
                           1.701910
                                            2.826736
      17
               0.239815
                           2.568322
                                            3.325787
      18
               0.218519
                           2.565370
                                            2.779502
      19
               0.000000
                           0.000000
                                            0.000000
      20
               0.000000
                           0.000000
                                            0.000000
      21
               0.336597
                           2.388032
                                            3.897743
      22
               0.263889
                           1.293368
                                            3.374757
      23
               0.247176
                           1.527650
                                            3.043877
      24
               0.209502
                           1.155058
                                            2.637894
      25
               0.191030
                           1.555475
                                            2.507731
[39]: # Define a function to calculate utilization rate
      def calculate utilization rate(copied df):
          utilization_time = copied_df['Ready Time'] + copied_df['Talk Time'] +
       ⇔copied df['Reserved Time']
          utilization_rate = utilization_time / copied_df['Total Logged In Time']
          return utilization_rate
      # Define a function to calculate non-utilized time
      def calculate non utilized rate(copied df):
          non_utilized_rate = copied_df['Not Ready Time'] / copied_df['Total Loggedu

→In Time'

          return non utilized rate
      # Calculate utilization rate and non-utilized time
      daily metrics['Utilization Rate'] = calculate utilization rate(daily metrics)
      daily metrics['Non-Utilized Rate'] = calculate non_utilized_rate(daily_metrics)
```

3.633553

9

0.262870

Print the weekly metrics
daily_metrics.reset_index()

2.879653

```
[39]:
                                                   Total Logged In Time
          index
                           Agent ID
                                      Agent Team
                                                                         Talk Time
      0
              0 2022-08-01
                                  72
                                                6
                                                              22.497778
                                                                         16.891944
      1
              1 2022-08-02
                                  70
                                                6
                                                              18.478287
                                                                         13.524988
      2
              2 2022-08-03
                                  76
                                                6
                                                              21.292801 13.740868
      3
                                  73
              3 2022-08-04
                                                6
                                                              19.299444 12.501030
      4
              4 2022-08-05
                                  65
                                                6
                                                              17.548275 10.786806
      5
              5 2022-08-06
                                   0
                                                               0.000000
                                                0
                                                                           0.000000
      6
              6 2022-08-07
                                   0
                                                0
                                                               0.000000
                                                                           0.000000
      7
              7 2022-08-08
                                  76
                                                6
                                                              25.178576 17.300139
```

8	8 2022-08-09	74		6	21.129942	13.998750
9	9 2022-08-10	74		6	20.431238	12.692361
10	10 2022-08-11	70		6	18.688819	12.156539
11	11 2022-08-12	60		5	16.096632	10.913530
12	12 2022-08-13	0		0	0.000000	0.000000
13	13 2022-08-14	0		0	0.000000	0.000000
14	14 2022-08-15	66		6	20.715914	15.470359
15	15 2022-08-16	67		6	19.318831	13.662639
16	16 2022-08-17	67		6	18.630799	12.926655
17	17 2022-08-18	71		6	19.512106	12.465220
18	18 2022-08-19	63		6	17.587118	11.214699
19	19 2022-08-20	0		0	0.000000	0.000000
20	20 2022-08-21	0		0	0.000000	0.000000
21	21 2022-08-22	77		5	25.329861	17.434664
22	22 2022-08-23	70		5	20.517870	14.519931
23	23 2022-08-24	69		5	18.978657	13.161956
24	24 2022-08-25	64		5	17.072141	12.220648
25	25 2022-08-26	60		5	15.866713	10.839861
	Reserved Time R	eady Time	Not	Ready Time	Utilization Rate	\
0	0.266319	0.638623		3.631736	0.791051	
1	0.259549	1.044062		2.724259	0.802488	
2	0.276806	2.852882		3.432037	0.792313	
3	0.248403	2.086516		3.550139	0.768724	
4	0.211725	2.886794		2.861366	0.791264	
5	0.00000	0.000000		0.000000	NaN	
6	0.00000	0.000000		0.000000	NaN	
7	0.302558	2.840532		3.557419	0.811930	
8	0.270428	2.601551		3.217431	0.798428	
9	0.262870	2.879653		3.633553	0.775033	
10	0.224375	2.393310		3.045046	0.790538	
11	0.200440	1.614734		2.574722	0.790768	
12	0.00000	0.000000		0.000000	NaN	
13	0.00000	0.000000		0.000000	NaN	
14	0.254618	0.877454		3.094780	0.801434	
15	0.255833	1.322859		3.104005	0.788937	
16	0.244352	1.701910		2.826736	0.798297	
17	0.239815	2.568322		3.325787	0.782763	
18	0.218519	2.565370		2.779502	0.795957	
19	0.00000	0.000000		0.000000	NaN	
20	0.000000	0.000000		0.000000	NaN	
21	0.336597	2.388032		3.897743	0.795871	
22	0.263889	1.293368		3.374757	0.783570	
23	0.247176	1.527650		3.043877	0.787031	
24	0.209502	1.155058		2.637894	0.795753	
25	0.191030	1.555475		2.507731	0.793256	

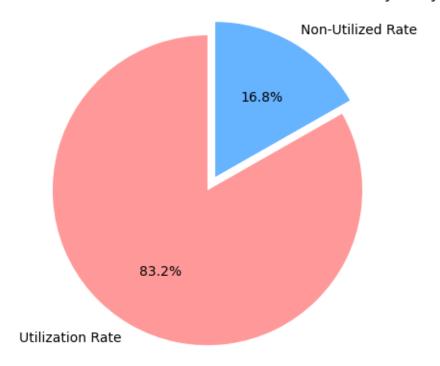
```
0.147430
      1
      2
                   0.161183
      3
                   0.183950
                   0.163057
      4
      5
                        NaN
      6
                        NaN
      7
                   0.141288
      8
                   0.152269
                   0.177843
      9
      10
                   0.162934
      11
                   0.159954
      12
                        NaN
      13
                        NaN
      14
                   0.149391
      15
                   0.160672
      16
                   0.151724
      17
                   0.170447
      18
                   0.158042
      19
                        NaN
      20
                        NaN
      21
                   0.153879
      22
                   0.164479
      23
                   0.160384
      24
                   0.154515
      25
                   0.158050
[40]: # Calculate the mean utilization rate and non-utilization rate
      mean_utilization_rate = daily_metrics['Utilization Rate'].mean()
      mean_non_utilization_rate = daily_metrics['Non-Utilized Rate'].mean()
      # Create a pie chart
      labels = ['Utilization Rate', 'Non-Utilized Rate']
      sizes = [mean_utilization_rate, mean_non_utilization_rate]
      colors = ['#ff9999', '#66b3ff']
      explode = (0.1, 0)
      plt.pie(sizes, labels=labels, colors=colors, autopct='%1.1f%%', startangle=90, __
       ⇔explode=explode)
      plt.axis('equal') # Equal aspect ratio ensures that pie is drawn as a circle.
      # Display the pie chart
      plt.title('Mean Utilization Rate vs. Mean Non-Utilized Rate by Daily')
      plt.show()
```

Non-Utilized Rate

0.161426

0

Mean Utilization Rate vs. Mean Non-Utilized Rate by Daily



What is agents/teams utilization rate (on weekly basis)? How about non-utilized time?

```
[41]: # Group data by week and calculate metrics
weekly_metrics = copied_df.resample('W', on='Date').agg({
        'Agent ID': 'nunique',
        'Agent Team': 'nunique',
        'Total Logged In Time': 'sum',
        'Talk Time': 'sum',
        'Reserved Time': 'sum',
        'Ready Time': 'sum',
        'Not Ready Time': 'sum'
        # Count unique agents per week
}).reset_index()
```

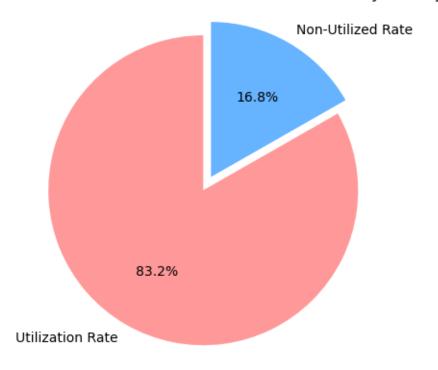
```
[42]: # Calculate utilization rate and non-utilized time
weekly_metrics['Utilization Rate'] = calculate_utilization_rate(weekly_metrics)
weekly_metrics['Non-Utilized Rate'] = □
→calculate_non_utilized_rate(weekly_metrics)

weekly_metrics.rename(columns={'Date': 'Week'}, inplace=True)
```

```
weekly_metrics.reset_index()
[42]:
         index
                     Week Agent ID Agent Team Total Logged In Time Talk Time \
            0 2022-08-07
                                 90
                                                            99.116586 67.445637
     0
                                              6
      1
             1 2022-08-14
                                 87
                                              6
                                                           101.525208 67.061319
      2
             2 2022-08-21
                                 89
                                              6
                                                            95.764769 65.739572
             3 2022-08-28
                                 88
                                              5
                                                            97.765243 68.177060
        Reserved Time Ready Time Not Ready Time Utilization Rate \
      0
              1.262801
                          9.508877
                                         16.199537
                                                            0.789145
              1.260671
                       12.329780
                                         16.028171
                                                            0.794401
      1
      2
              1.213137
                          9.035914
                                         15.130810
                                                            0.793492
      3
              1.248194
                         7.919583
                                         15.462002
                                                            0.791128
        Non-Utilized Rate
      0
                  0.163439
                  0.157874
      1
      2
                  0.158000
      3
                  0.158154
[43]: # Calculate the mean utilization rate and non-utilization rate
      mean_utilization_rate2 = weekly_metrics['Utilization_Rate'].mean()
      mean_non_utilization_rate2 = weekly_metrics['Non-Utilized Rate'].mean()
      # Create a pie chart
      labels = ['Utilization Rate', 'Non-Utilized Rate']
      sizes = [mean_utilization_rate2, mean_non_utilization_rate2]
      colors = ['#ff9999', '#66b3ff']
      explode = (0.1, 0)
      plt.pie(sizes, labels=labels, colors=colors, autopct='%1.1f\%', startangle=90, __
       ⇔explode=explode)
      plt.axis('equal') # Equal aspect ratio ensures that pie is drawn as a circle.
      # Display the pie chart
      plt.title('Mean Utilization Rate vs. Mean Non-Utilized Rate by Weekly')
      plt.show()
```

Print the weekly metrics

Mean Utilization Rate vs. Mean Non-Utilized Rate by Weekly



[44]: weekly_metrics.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4 entries, 0 to 3

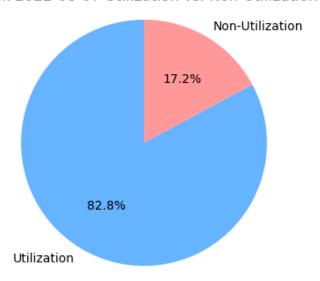
Data columns (total 10 columns):

#	Column	Non-Null Count	Dtype
0	Week	4 non-null	datetime64[ns]
1	Agent ID	4 non-null	int64
2	Agent Team	4 non-null	int64
3	Total Logged In Time	4 non-null	float64
4	Talk Time	4 non-null	float64
5	Reserved Time	4 non-null	float64
6	Ready Time	4 non-null	float64
7	Not Ready Time	4 non-null	float64
8	Utilization Rate	4 non-null	float64
9	Non-Utilized Rate	4 non-null	float64
<pre>dtypes: datetime64[ns](1),</pre>		float64(7), int	64(2)
memo	ry usage: 448.0 bytes		

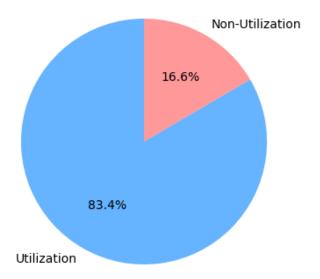
```
[45]: # Extract the relevant data for visualization weeks = weekly_metrics['Week'].tolist()
```

```
utilization_rates = weekly_metrics['Utilization Rate'].tolist()
non_utilization_rates = weekly metrics['Non-Utilized Rate'].tolist()
# Create pie charts for each week
for week, utilization_rate, non_utilization_rate in zip(weeks, u
 outilization_rates, non_utilization_rates):
    plt.figure(figsize=(8, 4))
    labels = ['Utilization', 'Non-Utilization']
    sizes = [utilization_rate, non_utilization_rate]
    colors = ['#66b3ff', '#ff9999'] # Blue for utilization, red for
 \rightarrownon-utilization
    plt.pie(sizes, labels=labels, colors=colors, autopct='%1.1f%%',__
 ⇔startangle=90)
    plt.title(f'Week {week.strftime("%Y-%m-%d")} Utilization vs.__
 ⇔Non-Utilization')
    plt.axis('equal') # Equal aspect ratio ensures that pie is drawn as a
 \hookrightarrow circle
    plt.show()
```

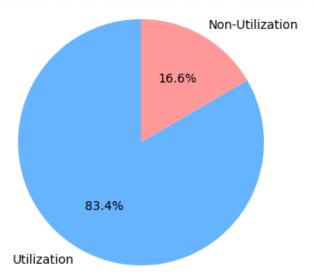
Week 2022-08-07 Utilization vs. Non-Utilization



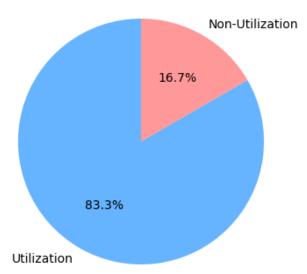
Week 2022-08-14 Utilization vs. Non-Utilization



Week 2022-08-21 Utilization vs. Non-Utilization



Week 2022-08-28 Utilization vs. Non-Utilization



```
[46]: weekly_metrics2 = weekly_metrics.copy()

# Initialize a counter
counter = 1

# Create a dictionary to store the mapping of old values to new values
week_mapping = {}

# Iterate through the unique values in the 'Week' column
for week in weekly_metrics2['Week'].unique():
    week_mapping[week] = str(counter)
    counter += 1

# Replace the values in the 'Week' column using the mapping
weekly_metrics2['Week'] = weekly_metrics2['Week'].map(week_mapping)
```

```
import matplotlib.ticker as mtick # Import the necessary module for formatting
y-axis as percentages

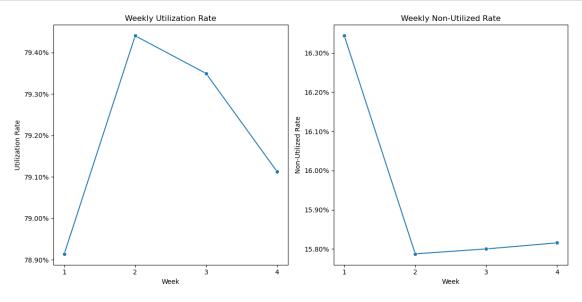
plt.figure(figsize=(12, 6))

plt.subplot(1, 2, 1)
sns.lineplot(x='Week', y='Utilization Rate', data=weekly_metrics2, marker='o')
plt.title("Weekly Utilization Rate")
plt.xlabel("Week")
plt.ylabel("Utilization Rate")
```

```
plt.gca().yaxis.set_major_formatter(mtick.PercentFormatter(1.0)) # Format_\( \text{y-axis as percentages} \)

plt.subplot(1, 2, 2)
sns.lineplot(x='Week', y='Non-Utilized Rate', data=weekly_metrics2, marker='o')
plt.title("Weekly Non-Utilized Rate")
plt.xlabel("Week")
plt.ylabel("Non-Utilized Rate")
plt.gca().yaxis.set_major_formatter(mtick.PercentFormatter(1.0)) # Format_\( \text{y-axis as percentages} \)

plt.tight_layout()
plt.show()
```



```
[48]: # Calculate the number of FTEs (assuming a 40-hour workweek)
weekly_metrics2['FTEs'] = (weekly_metrics2['Utilization Rate'] * 40) / (60 * 5)

→ # 60 minutes per hour, 5 workdays per week

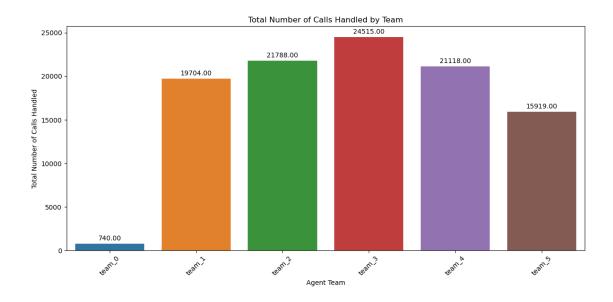
# Print the weekly metrics
weekly_metrics2.reset_index()
```

```
[48]:
         index Week Agent ID Agent Team Total Logged In Time Talk Time \
             0
                  1
                           90
                                                      99.116586 67.445637
      0
                                        6
      1
             1
                  2
                           87
                                        6
                                                     101.525208 67.061319
      2
             2
                  3
                           89
                                        6
                                                      95.764769 65.739572
      3
             3
                  4
                           88
                                        5
                                                      97.765243 68.177060
```

Reserved Time Ready Time Not Ready Time Utilization Rate \

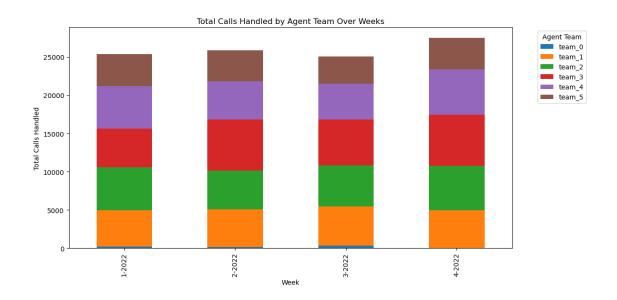
```
0
              1.262801
                          9.508877
                                          16.199537
                                                             0.789145
      1
              1.260671
                         12.329780
                                          16.028171
                                                             0.794401
      2
              1.213137
                          9.035914
                                          15.130810
                                                             0.793492
      3
                                                             0.791128
              1.248194
                          7.919583
                                          15.462002
         Non-Utilized Rate
                                FTEs
      0
                  0.163439 0.105219
      1
                  0.157874 0.105920
      2
                  0.158000 0.105799
      3
                  0.158154 0.105484
[49]: # Group data by team and calculate average talk time per call
      team_avg_talk_time = hcc_df.groupby('Agent Team')['Talk Time'].mean()
      highest_avg_talk_time_team = team_avg_talk_time.idxmax()
      lowest_avg_talk_time_team = team_avg_talk_time.idxmin()
[50]: highest_avg_talk_time_team
[50]: 'team_3'
[51]: |lowest_avg_talk_time_team
[51]: 'team_0'
     How does the number of handled calls vary by specialty (Agent Team) on a weekly
     basis?
[52]: # Merge sheet3 with merged_df on 'Agent ID' and 'Date'
      hcc_df2 = pd.merge(sheet3, sheet4, on=['Agent ID'])
      hcc_df2
[52]:
                                 Number of Calls Handled Average Handle Time
            Agent ID
                           Date
      0
             Agent 1 2022-08-01
                                                       94
                                                                     00:04:40
      1
             Agent 1 2022-08-02
                                                       80
                                                                      00:04:42
      2
             Agent 1 2022-08-03
                                                       81
                                                                      00:04:34
      3
             Agent 1 2022-08-04
                                                       73
                                                                      00:05:12
      4
             Agent 1 2022-08-05
                                                                      00:04:51
                                                       75
      1914 Agent 72 2022-08-22
                                                        0
                                                                     00:00:00
      1915 Agent 72 2022-08-23
                                                        0
                                                                      00:00:00
      1916 Agent 72 2022-08-24
                                                        0
                                                                      00:00:00
      1917 Agent 72 2022-08-25
                                                        0
                                                                     00:00:00
                                                        0
      1918 Agent 72 2022-08-26
                                                                     00:00:00
           Agent Team
      0
               team_1
      1
               team_1
      2
               team_1
```

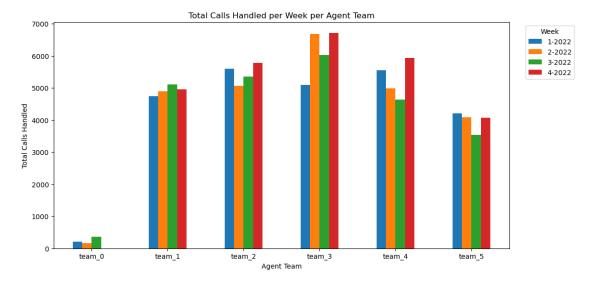
```
3
              team_1
     4
              team_1
               •••
     1914
              team_5
     1915
              team_5
     1916
              team_5
     1917
              team_5
     1918
              team_5
     [1919 rows x 5 columns]
[53]: # Group data by team and date, then calculate the number of handled calls
     team_handled_calls = hcc_df2.groupby(['Agent Team'])['Number of Calls Handled'].
      ⇒sum().reset_index()
     team handled calls
[53]:
       Agent Team Number of Calls Handled
           team_0
                                       740
     1
           team_1
                                     19704
     2
           team 2
                                     21788
     3
           team 3
                                     24515
     4
           team 4
                                     21118
     5
           team_5
                                     15919
[54]: # Create a bar plot of Total Logged In Time by Team in days
     plt.figure(figsize=(12, 6))
     ax = sns.barplot(x='Agent Team', y='Number of Calls Handled', u
       →data=team_handled_calls)
     plt.title('Total Number of Calls Handled by Team')
     plt.xlabel('Agent Team')
     plt.ylabel('Total Number of Calls Handled')
     plt.xticks(rotation=45)
     # Annotate each bar with its respective data
     for p in ax.patches:
         plt.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.
       Get_height()), ha='center', va='baseline', fontsize=10, color='black',
       plt.tight_layout()
     plt.show()
```



[55]:	index	Agent Team	Week	Total Calls Handled
0	0	team_0	1-2022	217
1	1	team_0	2-2022	168
2	2	team_0	3-2022	355
3	3	team_0	4-2022	0
4	4	${\tt team_1}$	1-2022	4742
5	5	${\tt team_1}$	2-2022	4889
6	6	${\tt team_1}$	3-2022	5113
7	7	${\tt team_1}$	4-2022	4960
8	8	team_2	1-2022	5592
9	9	team_2	2-2022	5064

```
10
             10
                    team_2 3-2022
                                                   5356
                                                   5776
      11
             11
                    team 2 4-2022
      12
             12
                    team_3 1-2022
                                                   5091
      13
             13
                   team_3 2-2022
                                                   6687
      14
             14
                   team_3 3-2022
                                                   6021
      15
             15
                    team_3 4-2022
                                                   6716
      16
                   team 4 1-2022
             16
                                                   5549
      17
            17
                   team_4 2-2022
                                                   4989
                    team 4 3-2022
      18
             18
                                                   4642
      19
             19
                    team 4 4-2022
                                                   5938
      20
                   team 5 1-2022
             20
                                                   4212
      21
            21
                   team_5 2-2022
                                                   4088
      22
             22
                    team_5 3-2022
                                                   3544
      23
             23
                    team_5 4-2022
                                                   4075
[56]: team_weekly_handled_calls.info()
     <class 'pandas.core.frame.DataFrame'>
     Int64Index: 24 entries, 0 to 23
     Data columns (total 3 columns):
      #
                               Non-Null Count Dtype
          Column
          _____
                               _____
      0
          Agent Team
                               24 non-null
                                               object
          Week
                               24 non-null
                                               object
      1
          Total Calls Handled 24 non-null
                                               int64
     dtypes: int64(1), object(2)
     memory usage: 768.0+ bytes
[57]: # Pivot the DataFrame to prepare it for a stacked bar chart
      pivot_df = team_weekly_handled_calls.pivot(index='Week', columns='Agent Team',_
       →values='Total Calls Handled')
      # Create a stacked bar chart
      ax = pivot_df.plot(kind='bar', stacked=True, figsize=(12, 6))
      # Add labels and title
      plt.xlabel('Week')
      plt.ylabel('Total Calls Handled')
      plt.title('Total Calls Handled by Agent Team Over Weeks')
      # Show the legend
      plt.legend(title='Agent Team', bbox_to_anchor=(1.05, 1), loc='upper left')
      # Show the chart
      plt.show()
```





1.1.1 c) By Agent:

```
[59]: | agent_sorted = hcc_df.groupby(['Agent ID'])[time_related_columns].sum().
       →reset_index()
      agent_sorted
[59]:
          Agent ID Total Logged In Time Not Ready Time
                                                             Ready Time
                        6 days 15:33:03 0 days 23:27:09 0 days 11:27:15
          Agent 1
                        3 days 10:20:55 0 days 07:05:56 1 days 11:21:54
      1
          Agent 10
                        3 days 12:03:39 0 days 17:56:24 0 days 05:30:23
          Agent 11
                        3 days 21:27:28 0 days 06:01:56 0 days 06:46:27
      3
          Agent 12
                        3 days 14:33:26 0 days 12:52:46 0 days 21:41:38
      4
          Agent 13
         Agent 93
                        0 days 16:19:24 0 days 03:32:43 0 days 02:21:59
     92
     93
         Agent 94
                        0 days 14:20:04 0 days 01:26:29 0 days 06:17:13
                        2 days 10:31:16 0 days 09:37:32 0 days 20:53:14
     94
         Agent 95
         Agent 96
                        1 days 04:51:38 0 days 04:05:40 0 days 13:07:34
     96
         Agent 97
                        1 days 16:57:17 0 days 06:48:41 0 days 16:50:43
                               Talk Time Next Call Prep Time
          Reserved Time
                                                                       Break \
     0 0 days 01:58:01 4 days 19:53:35
                                             0 days 06:47:03 0 days 04:16:51
     1 0 days 01:19:18 1 days 10:15:09
                                             0 days 04:18:38 0 days 02:56:14
     2 0 days 00:42:36 2 days 09:35:14
                                             0 days 02:19:02 0 days 02:05:22
        0 days 01:19:14 3 days 02:36:32
                                             0 days 04:43:19 0 days 02:04:31
     4 0 days 00:46:19 1 days 23:39:18
                                             0 days 03:33:25 0 days 01:50:43
     92 0 days 00:07:22 0 days 09:40:56
                                             0 days 00:36:24 0 days 00:15:16
     93 0 days 00:17:45 0 days 05:45:26
                                             0 days 00:33:11 0 days 00:21:09
     94 0 days 00:37:54 1 days 01:26:33
                                             0 days 01:56:03 0 days 01:53:09
     95 0 days 00:26:25 0 days 10:20:09
                                             0 days 00:51:50 0 days 00:43:20
     96 0 days 00:41:40 0 days 14:58:08
                                             0 days 01:38:05 0 days 02:14:12
                   Lunch
                            Team Support
                                                 Meeting After Call Work
     0 0 days 09:00:44 0 days 00:00:00 0 days 00:28:08 0 days 06:40:34
     1 0 days 04:01:06 0 days 00:00:00 0 days 00:00:00 0 days 00:00:26
     2 0 days 04:00:52 0 days 00:00:00 0 days 02:22:34 0 days 09:00:47
     3 0 days 00:29:05 0 days 00:17:33 0 days 00:03:10 0 days 02:01:24
     4 0 days 04:03:32 0 days 00:00:25 0 days 00:48:54 0 days 02:04:34
     92 0 days 00:30:57 0 days 00:00:00 0 days 00:00:00 0 days 01:51:44
     93 0 days 00:34:18 0 days 00:00:00 0 days 00:00:00 0 days 00:00:00
     94 0 days 03:23:03 0 days 00:01:08 0 days 00:01:01 0 days 00:00:00
     95 0 days 00:59:13 0 days 00:00:00 0 days 00:00:00 0 days 00:00:00
     96 0 days 01:28:30 0 days 00:00:00 0 days 00:00:00 0 days 00:00:00
```

```
        Special Projects
        Training
        System Issues
        Other

        0 days
        01:30:26 0 days
        01:09:44 0 days
        00:13:20 0 days
        00:07:22

        1 0 days
        00:00:00 0 days
        00:00:00 0 days
        00:02:53 0 days
        00:05:17

        2 0 days
        00:00:00 0 days
        00:22:24 0 days
        00:00:00 0 days
        00:04:25

        3 0 days
        00:43:13 0 days
        00:06:55 0 days
        00:00:00 0 days
        00:16:05

        4 0 days
        00:00:00 0 days
        03:40:08 0 days
        00:00:00 0 days
        00:00:00:00 0 days
        00:00:00 0 days
```

[97 rows x 16 columns]

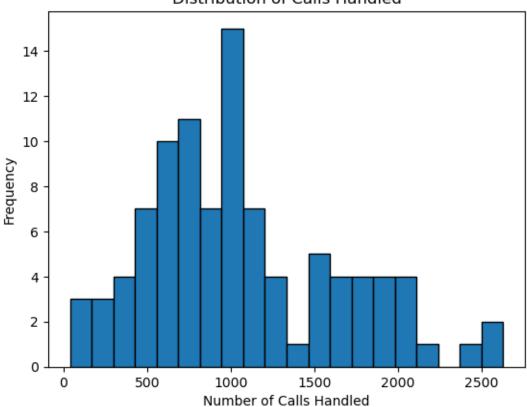
[60]: agent_sorted.describe()

[60]: comment stoming 255 500 755 max	unt an 4 days d 1 days n %	Total Logged In Time 97 8 01:31:37.360824742 8 18:10:18.923891820 0 days 01:50:37 3 days 01:20:07 3 days 21:27:28 5 days 13:54:33 7 days 02:55:44	Not Ready Time 97 0 days 15:32:35.597938144 0 days 09:13:50.914340245 0 days 00:05:11 0 days 08:52:32 0 days 14:48:45 0 days 19:59:59 2 days 00:44:19	\
comme sto mi 25 50 75 ma	d 0 days n % %	Ready Time 97 3 09:35:54.793814432 5 10:01:11.383552252 0 days 00:21:53 0 days 03:08:47 0 days 06:17:13 0 days 12:17:01 2 days 10:07:26	Reserved Time 97 0 days 01:14:00.072164948 0 days 00:39:56.581829082 0 days 00:02:05 0 days 00:44:23 0 days 01:09:36 0 days 01:37:22 0 days 02:54:20	\
comments stored min 25, 50° 75° max	d 1 days n % %	Talk Time 97 s 18:24:50.701030927 s 07:54:36.092407044 0 days 00:34:31 1 days 22:39:40 2 days 17:52:03 3 days 17:22:45 5 days 10:53:50	Next Call Prep Time 97 0 days 04:44:16.195876288 0 days 02:51:00.754656334 0 days 00:06:20 0 days 02:46:49 0 days 04:11:59 0 days 06:04:05 0 days 12:35:03	\

```
Break
                                                        Lunch \
count
                               97
                                                            97
       0 days 02:48:51.154639175
                                   0 days 04:19:42.948453608
mean
       0 days 02:05:54.771206744
                                   0 days 03:13:09.557273657
std
                 0 days 00:00:00
                                              0 days 00:00:00
min
25%
                 0 days 01:29:00
                                              0 days 01:28:30
50%
                 0 days 02:28:51
                                              0 days 04:01:05
75%
                 0 days 03:50:19
                                              0 days 07:06:24
                                              0 days 09:54:22
max
                 0 days 14:10:11
                     Team Support
                                                      Meeting
count
                               97
                                                            97
       0 days 00:02:43.381443298
                                   0 days 00:27:53.855670103
mean
       0 days 00:11:19.561262312
                                   0 days 00:42:57.453066941
std
min
                 0 days 00:00:00
                                              0 days 00:00:00
25%
                 0 days 00:00:00
                                              0 days 00:00:00
                 0 days 00:00:00
50%
                                              0 days 00:10:22
75%
                 0 days 00:00:03
                                              0 days 00:35:05
                 0 days 01:43:11
max
                                              0 days 03:22:35
                 After Call Work
                                             Special Projects
                               97
                                                            97
count
mean
       0 days 04:25:28.298969072
                                   0 days 00:28:59.432989690
       0 days 04:27:08.830119613
                                   0 days 01:00:13.213648965
std
                 0 days 00:00:00
                                              0 days 00:00:00
min
                                              0 days 00:00:00
25%
                 0 days 01:31:39
50%
                 0 days 03:00:45
                                              0 days 00:00:00
75%
                 0 days 06:18:16
                                              0 days 00:16:48
                  1 days 02:17:17
                                              0 days 04:41:22
max
                         Training
                                                System Issues
                               97
                                                            97
count
mean
       0 days 02:09:38.051546391
                                   0 days 00:09:28.927835051
       0 days 02:46:17.749854228
                                   0 days 00:22:02.217867254
std
                 0 days 00:00:00
                                              0 days 00:00:00
min
                                              0 days 00:00:00
25%
                 0 days 00:16:07
50%
                 0 days 01:09:07
                                              0 days 00:02:49
75%
                 0 days 02:51:24
                                              0 days 00:12:16
                                              0 days 03:09:09
                 0 days 16:48:18
max
                            Other
count
                               97
       0 days 00:39:49.546391752
mean
       0 days 00:49:37.711219140
std
min
                 0 days 00:00:37
25%
                 0 days 00:08:40
```

```
50%
                       0 days 00:22:26
      75%
                       0 days 00:50:43
                       0 days 05:41:26
     max
[61]: total_performance = sheet3.groupby(['Agent ID']).sum(numeric_only=True)
      total_performance.reset_index(inplace=True)
      total performance
[61]:
          Agent ID
                    Number of Calls Handled
          Agent 1
                                       1696
      1 Agent 10
                                       1547
      2 Agent 11
                                        608
      3
         Agent 12
                                       1209
         Agent 13
                                        702
      92 Agent 93
                                        126
      93 Agent 94
                                        201
      94 Agent 95
                                        520
      95 Agent 96
                                        284
     96 Agent 97
                                        525
      [97 rows x 2 columns]
[62]: # Assuming your data is in a DataFrame called df
      mean calls = total performance['Number of Calls Handled'].mean()
      median_calls = total_performance['Number of Calls Handled'].median()
      min_calls = total_performance['Number of Calls Handled'].min()
      max_calls = total_performance['Number of Calls Handled'].max()
      print(f"Mean Calls Handled: {mean_calls}")
      print(f"Median Calls Handled: {median_calls}")
      print(f"Minimum Calls Handled: {min_calls}")
      print(f"Maximum Calls Handled: {max_calls}")
     Mean Calls Handled: 1069.9381443298969
     Median Calls Handled: 968.0
     Minimum Calls Handled: 38
     Maximum Calls Handled: 2632
[63]: # Create a histogram
      plt.hist(total_performance['Number of Calls Handled'], bins=20, edgecolor='k')
      plt.xlabel('Number of Calls Handled')
      plt.ylabel('Frequency')
      plt.title('Distribution of Calls Handled')
      plt.show()
```

Distribution of Calls Handled



```
[64]: top_agents = total_performance.nlargest(5, 'Number of Calls Handled')
top_agents.reset_index()

[64]: index Agent ID Number of Calls Handled
```

```
Agent 31
0
      24
                                          2632
          Agent 55
                                          2594
1
      50
2
          Agent 20
                                          2409
      12
3
      29
          Agent 36
                                          2167
           Agent 2
                                          2069
      11
```

[65]: bottom_agents = total_performance.nsmallest(5, 'Number of Calls Handled') bottom_agents.reset_index()

[65]:		index	Agent	ID	Number	of	${\tt Calls}$	Handled
	0	79	Agent	81				38
	1	37	Agent	43				102
	2	92	Agent	93				126
	3	6	Agent	15				189
	4	93	Agent	94				201

1.1.2 d) Staffing Plan:

4

0.211725

2.886794

```
[66]: daily_metrics2 = daily_metrics.copy()
      daily_metrics2['Day of Week'] = daily_metrics2['Date'].dt.strftime('%A')
      # Calculate the number of FTEs (assuming a 40-hour workweek)
      daily_metrics2['FTEs'] = (daily_metrics2['Utilization Rate'] * 40) / 60
       ⇔minutes per hour
      # Print the weekly metrics
      daily_metrics2.reset_index()
      daily_metrics2
[66]:
                                Agent Team
               Date
                     Agent ID
                                             Total Logged In Time Talk Time
         2022-08-01
                            72
                                                        22.497778
                                                                    16.891944
         2022-08-02
                            70
                                          6
                                                         18.478287
                                                                    13.524988
         2022-08-03
                            76
                                          6
                                                                    13.740868
      2
                                                        21.292801
                            73
         2022-08-04
                                          6
                                                         19.299444
                                                                    12.501030
        2022-08-05
                            65
                                          6
                                                         17.548275
                                                                   10.786806
                                                                     0.00000
      5
         2022-08-06
                             0
                                          0
                                                         0.000000
                                          0
      6 2022-08-07
                             0
                                                         0.000000
                                                                     0.00000
      7
         2022-08-08
                            76
                                          6
                                                                   17.300139
                                                         25.178576
                            74
                                          6
      8 2022-08-09
                                                        21.129942
                                                                    13.998750
                                                        20.431238
         2022-08-10
                            74
                                          6
                                                                    12.692361
      10 2022-08-11
                            70
                                          6
                                                         18.688819
                                                                    12.156539
      11 2022-08-12
                            60
                                          5
                                                         16.096632
                                                                   10.913530
      12 2022-08-13
                             0
                                          0
                                                         0.000000
                                                                     0.00000
      13 2022-08-14
                                          0
                             0
                                                         0.000000
                                                                     0.000000
      14 2022-08-15
                            66
                                          6
                                                        20.715914
                                                                   15.470359
      15 2022-08-16
                            67
                                          6
                                                         19.318831
                                                                    13.662639
      16 2022-08-17
                            67
                                          6
                                                                    12.926655
                                                         18.630799
      17 2022-08-18
                            71
                                          6
                                                                   12.465220
                                                         19.512106
      18 2022-08-19
                            63
                                          6
                                                         17.587118
                                                                   11.214699
      19 2022-08-20
                             0
                                          0
                                                         0.000000
                                                                     0.000000
      20 2022-08-21
                                          0
                                                         0.000000
                             0
                                                                     0.000000
                                          5
      21 2022-08-22
                            77
                                                         25.329861
                                                                   17.434664
      22 2022-08-23
                            70
                                          5
                                                        20.517870
                                                                   14.519931
                                          5
      23 2022-08-24
                            69
                                                         18.978657
                                                                    13.161956
                                          5
      24 2022-08-25
                            64
                                                         17.072141
                                                                    12.220648
                                          5
                                                                    10.839861
      25 2022-08-26
                            60
                                                         15.866713
          Reserved Time
                         Ready Time
                                      Not Ready Time
                                                       Utilization Rate
      0
               0.266319
                            0.638623
                                             3.631736
                                                                0.791051
      1
               0.259549
                            1.044062
                                             2.724259
                                                                0.802488
      2
               0.276806
                            2.852882
                                             3.432037
                                                                0.792313
      3
               0.248403
                            2.086516
                                             3.550139
                                                                0.768724
```

2.861366

0.791264

5	0.000000	0.000000	0.000000	NaN
6	0.000000	0.000000	0.000000	NaN
7	0.302558	2.840532	3.557419	0.811930
8	0.270428	2.601551	3.217431	0.798428
9	0.262870	2.879653	3.633553	0.775033
10	0.224375	2.393310	3.045046	0.790538
11	0.200440	1.614734	2.574722	0.790768
12	0.000000	0.000000	0.000000	NaN
13	0.000000	0.000000	0.000000	NaN
14	0.254618	0.877454	3.094780	0.801434
15	0.255833	1.322859	3.104005	0.788937
16	0.244352	1.701910	2.826736	0.798297
17	0.239815	2.568322	3.325787	0.782763
18	0.218519	2.565370	2.779502	0.795957
19	0.000000	0.000000	0.000000	NaN
20	0.000000	0.000000	0.000000	NaN
21	0.336597	2.388032	3.897743	0.795871
22	0.263889	1.293368	3.374757	0.783570
23	0.247176	1.527650	3.043877	0.787031
24	0.209502	1.155058	2.637894	0.795753
25	0.191030	1.555475	2.507731	0.793256

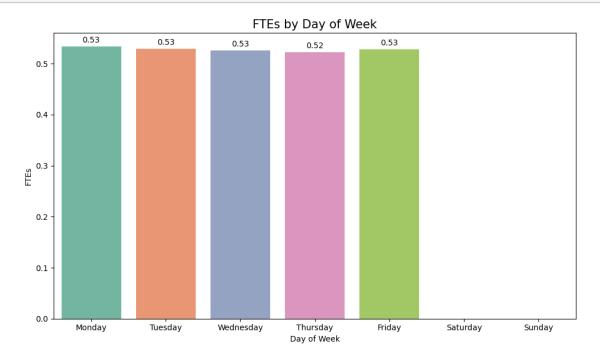
	Non-Utilized Rate	Day of Week	FTEs
0	0.161426	Monday	0.527367
1	0.147430	Tuesday	0.534992
2	0.161183	Wednesday	0.528208
3	0.183950	Thursday	0.512483
4	0.163057	Friday	0.527510
5	NaN	Saturday	NaN
6	NaN	Sunday	NaN
7	0.141288	Monday	0.541286
8	0.152269	Tuesday	0.532285
9	0.177843	Wednesday	0.516689
10	0.162934	Thursday	0.527025
11	0.159954	Friday	0.527179
12	NaN	Saturday	NaN
13	NaN	Sunday	NaN
14	0.149391	Monday	0.534289
15	0.160672	Tuesday	0.525958
16	0.151724	Wednesday	0.532198
17	0.170447	Thursday	0.521842
18	0.158042	Friday	0.530638
19	NaN	Saturday	NaN
20	NaN	Sunday	NaN
21	0.153879	Monday	0.530580
22	0.164479	Tuesday	0.522380
23	0.160384	Wednesday	0.524687

```
24
                  0.154515
                              Thursday 0.530502
     25
                  0.158050
                                Friday 0.528837
[67]: fte_mean_by_day = daily_metrics2.groupby('Day of Week')['FTEs'].mean().
      →reset index()
      # Create a custom sorting order for the days of the week
     custom_order = ["Monday", "Tuesday", "Wednesday", "Thursday", "Friday", "

¬"Saturday", "Sunday"]

     # Convert the "Day of Week" column to a categorical data type with the custom
      ⇔sorting order
     fte mean by day ["Day of Week"] = pd. Categorical (fte mean by day ["Day of Week"], __
      →categories=custom_order, ordered=True)
      # Sort the DataFrame by the custom order
     fte_mean_by_day = fte_mean_by_day.sort_values(by="Day of Week")
      # Reset the index if needed
     fte_mean_by_day.reset_index(drop=True, inplace=True)
     fte_mean_by_day
[67]: Day of Week
                        FTEs
            Monday 0.533381
     0
           Tuesday 0.528904
     1
     2
        Wednesday 0.525446
          Thursday 0.522963
     3
     4
            Friday 0.528541
     5
          Saturday
                         NaN
            Sunday
                         NaN
[68]: # Create a bar chart
     plt.figure(figsize=(10, 6))
     ax = sns.barplot(x='Day of Week', y='FTEs', data=fte_mean_by_day,palette='Set2')
     plt.title('FTEs by Day of Week',fontsize=15)
     plt.xlabel('Day of Week')
     plt.ylabel('FTEs')
      # Annotate each bar with its respective productivity score
     for p in ax.patches:
         ax.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.
       Get_height()), ha='center', va='baseline', fontsize=10, color='black', □
       plt.tight_layout()
```

plt.show()



Jump to Table of Contents

Jump to Section 1: Data Preprocessing

Jump to Section 3: Productivity Model

Jump to Section 4: Productivity Dashboard

3 - Define a model for productivity using the provided variables:

Defining a model for productivity in a call center context typically involves using key performance metrics to assess how efficiently agents and teams are handling calls. In this case, you can consider a simple model for productivity by combining metrics like utilization rate, efficiency (average handle time), and the number of handled calls.

Model for Productivity:

Utilization Rate (UR): This measures the percentage of time agents are actively engaged in productive tasks (e.g., taking calls). Higher utilization rates generally indicate better productivity.

Efficiency (EFF): Efficiency is often measured by the average handle time (AHT) per call. Lower AHT suggests more efficient call handling.

Number of Handled Calls (NHC): The total number of calls handled by an agent or team can also be an indicator of productivity.

To create a composite productivity score, we can use a weighted combination of these metrics based on their relative importance to the call center's goals. For example:

```
Productivity Score (PS) = w1 * UR + w2 * (1 - EFF) + w3 * NHC
```

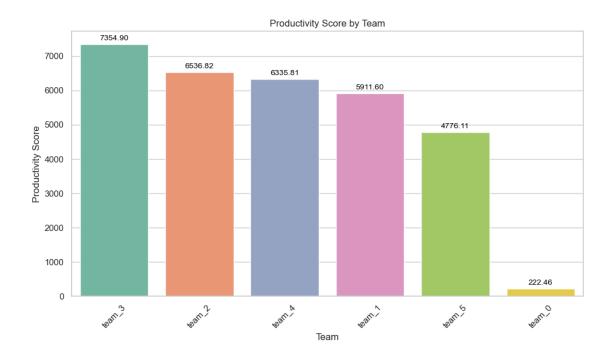
Where:

w1, w2, w3 are weights assigned to each metric, reflecting their importance. These weights can be adjusted based on the call center's priorities.

```
[69]: # Define a function to calculate efficiency
      def calculate_efficiency(copied_df2):
          efficiency = copied_df2['Talk Time'] / copied_df2['Total Logged In Time']
          return efficiency
[70]: copied_df2 = copied_df.copy()
[71]: # Calculate utilization rate and non-utilized time
      copied_df2['Utilization Rate'] = calculate utilization rate(copied_df2)
      copied df2['Non-Utilized Rate'] = calculate non utilized rate(copied df2)
      copied_df2['Efficiency'] = calculate_efficiency(copied_df2)
[72]: copied_df2.head()
[72]:
                                                              Interval End Time \
        Agent ID Agent Team
                                  Date Interval Start Time
      0 Agent 1
                     team 1 2022-08-01 2022-08-01 08:00:00 2022-08-01 08:30:00
      1 Agent 1
                     team 1 2022-08-01 2022-08-01 08:30:00 2022-08-01 09:00:00
      2 Agent 1
                     team_1 2022-08-01 2022-08-01 09:00:00 2022-08-01 09:30:00
      3 Agent 1
                     team_1 2022-08-01 2022-08-01 09:30:00 2022-08-01 10:00:00
                     team_1 2022-08-01 2022-08-01 10:00:00 2022-08-01 10:30:00
      4 Agent 1
         Total Logged In Time
                              Not Ready Time
                                               Ready Time
                                                            Reserved Time
                                                                           Talk Time
      0
                     0.018773
                                     0.002384
                                                  0.000081
                                                                 0.000255
                                                                            0.015174
      1
                     0.020833
                                     0.001076
                                                  0.001296
                                                                 0.000382
                                                                            0.017002
      2
                     0.020833
                                     0.002963
                                                  0.000000
                                                                 0.000428
                                                                            0.015984
      3
                     0.020833
                                     0.004329
                                                  0.000000
                                                                 0.000174
                                                                            0.015544
      4
                     0.020833
                                     0.001262
                                                  0.000000
                                                                 0.000174
                                                                            0.018715
            Team Support
                          Meeting After Call Work Special Projects
                                                                       Training \
                     0.0
                              0.0
                                          0.002350
                                                                  0.0
                                                                            0.0
      0
                     0.0
                              0.0
                                                                  0.0
                                                                            0.0
      1
                                          0.001076
      2
                              0.0
                                                                  0.0
                     0.0
                                          0.002951
                                                                            0.0
        ...
      3
                     0.0
                              0.0
                                          0.000000
                                                                  0.0
                                                                            0.0
      4
                     0.0
                              0.0
                                          0.001262
                                                                  0.0
                                                                            0.0
                                  Utilization Rate Non-Utilized Rate
         System Issues
                           Other
                                                                        Efficiency
      0
                   0.0
                        0.000035
                                          0.826141
                                                              0.127004
                                                                          0.808261
                        0.000000
      1
                   0.0
                                          0.896667
                                                              0.051667
                                                                          0.816111
      2
                   0.0
                        0.000000
                                                                          0.767222
                                          0.787778
                                                              0.142222
      3
                   0.0
                        0.000000
                                          0.754444
                                                              0.207778
                                                                          0.746111
                   0.0 0.000000
                                          0.906667
                                                              0.060556
                                                                          0.898333
```

```
[5 rows x 23 columns]
     \#\#\# a) Productivity by team:
[73]: # Calculate team-level productivity
     team_productivity = copied_df2.groupby('Agent Team')[['Efficiency',_
      # Display the team-level productivity metrics
     team_productivity.reset_index()
       Agent Team Efficiency Utilization Rate Non-Utilized Rate
[73]:
     0
           team_0
                     0.541065
                                       0.795201
                                                          0.163201
                                                          0.188256
     1
           team_1
                     0.669305
                                       0.760131
     2
           team_2
                     0.657391
                                       0.804826
                                                          0.146117
     3
           team_3
                     0.714895
                                       0.779054
                                                          0.167481
     4
                     0.660812
                                       0.772761
                                                          0.181879
           team_4
     5
                                       0.740468
           team_5
                     0.614152
                                                          0.215216
[74]: | # Merge team_productivity with team_handled_calls on 'Agent Team'
     team model = pd.merge(team productivity, team handled calls, on=['Agent Team'])
     team model
[74]:
       Agent Team Efficiency Utilization Rate Non-Utilized Rate \
           team 0
     0
                     0.541065
                                       0.795201
                                                          0.163201
     1
                     0.669305
                                       0.760131
                                                          0.188256
           team 1
     2
           team 2
                     0.657391
                                       0.804826
                                                          0.146117
     3
           team 3
                     0.714895
                                       0.779054
                                                          0.167481
     4
           team 4
                     0.660812
                                       0.772761
                                                          0.181879
     5
           team 5
                     0.614152
                                       0.740468
                                                          0.215216
        Number of Calls Handled
     0
                            740
     1
                          19704
     2
                          21788
     3
                          24515
     4
                          21118
     5
                          15919
[75]: # Define weights for each metric (you can adjust these)
     w1 = 0.4
     w2 = 0.3
     w3 = 0.3
      # Calculate the productivity score (PS)
```

```
# Sort the data by productivity score to identify top-performing and_
       ⇒ low-performing agents/teams
      team_sorted_data = team_model.sort_values(by='Productivity Score',_
       ⇔ascending=False)
      team_sorted_data
[75]:
       Agent Team Efficiency Utilization Rate Non-Utilized Rate \
            team 3
                      0.714895
                                        0.779054
                                                           0.167481
      2
            team_2
                      0.657391
                                        0.804826
                                                           0.146117
      4
           team 4
                     0.660812
                                        0.772761
                                                           0.181879
      1
            team_1
                     0.669305
                                        0.760131
                                                           0.188256
      5
                                        0.740468
                                                           0.215216
            team 5
                     0.614152
      0
            team_0
                      0.541065
                                        0.795201
                                                           0.163201
         Number of Calls Handled Productivity Score
      3
                           24515
                                         7354.897153
      2
                           21788
                                         6536.824713
      4
                           21118
                                         6335.810861
                           19704
                                         5911.603261
      1
      5
                                         4776.111942
                           15919
      0
                             740
                                          222.455761
[76]: # Set Seaborn style and color palette
      sns.set(style="whitegrid")
      sns.set_palette("pastel")
      plt.figure(figsize=(10, 6))
      ax = sns.barplot(x='Agent Team', y='Productivity Score', data=team_sorted_data,__
       →palette="Set2")
      plt.xlabel('Team')
      plt.ylabel('Productivity Score')
      plt.title('Productivity Score by Team')
      plt.xticks(rotation=45)
      # Annotate each bar with its respective productivity score
      for p in ax.patches:
          ax.annotate(f'{p.get_height():.2f}', (p.get_x() + p.get_width() / 2., p.
       Get_height()), ha='center', va='baseline', fontsize=10, color='black', □
       ⇒xytext=(0, 5), textcoords='offset points')
      plt.tight_layout()
      plt.show()
```



a1) Productivity by team dashboard:

```
[77]: # Create a figure for the dashboard
      fig = go.Figure()
      # Add a bar chart for Efficiency
      fig.add_trace(go.Bar(
          x=team_model['Agent Team'],
          y=team_model['Efficiency'],
          name='Efficiency',
          marker_color='royalblue'
      ))
      # Add a bar chart for Utilization Rate
      fig.add_trace(go.Bar(
          x=team_model['Agent Team'],
          y=team_model['Utilization Rate'],
          name='Utilization Rate',
          marker_color='limegreen'
      ))
      # Add a bar chart for Non-Utilization Rate
      fig.add_trace(go.Bar(
          x=team_model['Agent Team'],
          y=team_model['Non-Utilized Rate'],
          name='Non-Utilization Rate',
```

```
marker_color='tomato'
))
# Add a line chart for Number of Calls Handled
fig.add_trace(go.Scatter(
   x=team_model['Agent Team'],
   y=team model['Number of Calls Handled'],
   name='Number of Calls Handled',
   mode='lines+markers',
   yaxis='y2', # Use a secondary y-axis for this
   line=dict(color='purple', width=2)
))
# Define layout for the dashboard
fig.update_layout(
   title='Call Center Productivity Dashboard',
   xaxis=dict(title='Agent Team'),
   yaxis=dict(title='Metrics', titlefont=dict(color='black')),
   yaxis2=dict(title='Number of Calls Handled', titlefont=dict(color='black'), u
 ⇔overlaying='y', side='right'),
   barmode='group', # Group bars for efficiency, utilization rate, and
 ⇔non-utilization rate
   legend=dict(x=0.7, y=1),
   height=600
)
# Add interactive capabilities like hovering over data points
fig.update traces(hoverinfo='x+y')
# Show the dashboard
fig.show()
```

a2) Productivity by team dashboard by Week:

```
[78]:
          index Agent Team
                               Week Efficiency
                                                Utilization Rate Non-Utilized Rate
      0
              0
                     team_0
                            1-2022
                                        0.507913
                                                          0.741335
                                                                              0.221776
      1
              1
                             2-2022
                                        0.443652
                                                          0.757487
                                                                              0.207552
                     team 0
      2
              2
                    team_0
                             3-2022
                                        0.631269
                                                          0.860384
                                                                              0.090065
      3
              3
                            1-2022
                     team 1
                                        0.678400
                                                          0.754960
                                                                              0.194882
      4
              4
                             2-2022
                                        0.626941
                                                          0.758971
                     team 1
                                                                              0.190856
      5
              5
                     team 1
                             3-2022
                                        0.681052
                                                          0.773890
                                                                              0.172329
      6
              6
                     team_1 4-2022
                                        0.691941
                                                          0.752789
                                                                              0.194813
      7
              7
                     team_2 1-2022
                                        0.663027
                                                          0.818042
                                                                              0.131895
      8
              8
                     team_2 2-2022
                                        0.624935
                                                          0.805327
                                                                              0.148386
      9
              9
                     team_2 3-2022
                                        0.645016
                                                          0.790971
                                                                              0.161665
      10
             10
                     team_2 4-2022
                                        0.697684
                                                          0.804525
                                                                              0.142879
      11
             11
                     team_3
                            1-2022
                                        0.732942
                                                          0.772688
                                                                              0.173584
      12
             12
                     team_3 2-2022
                                        0.733684
                                                          0.787440
                                                                              0.154493
      13
             13
                     team_3
                             3-2022
                                        0.716085
                                                          0.780422
                                                                              0.166203
      14
             14
                     team_3 4-2022
                                        0.682137
                                                          0.775098
                                                                              0.175847
      15
             15
                     team_4 1-2022
                                        0.640802
                                                          0.755209
                                                                              0.202320
      16
             16
                     team 4 2-2022
                                        0.650691
                                                          0.784647
                                                                              0.170366
      17
             17
                     team_4 3-2022
                                        0.671755
                                                          0.766459
                                                                              0.189110
      18
             18
                     team 4 4-2022
                                        0.683204
                                                          0.786106
                                                                              0.164049
                            1-2022
      19
             19
                     team 5
                                        0.611765
                                                          0.735289
                                                                              0.221305
      20
             20
                     team 5 2-2022
                                        0.577980
                                                          0.731382
                                                                              0.228279
      21
             21
                     team 5 3-2022
                                        0.629172
                                                          0.752116
                                                                              0.203249
      22
             22
                                                          0.746068
                     team_5 4-2022
                                        0.645941
                                                                              0.204088
```

b) Productivity by agent:

```
[79]:
          Agent ID Agent Team Efficiency
                                             Utilization Rate Non-Utilized Rate
      0
           Agent 1
                        team 1
                                   0.723987
                                                      0.808010
                                                                          0.148564
      1
          Agent 10
                        team_4
                                   0.401055
                                                      0.826329
                                                                          0.122138
      2
          Agent 11
                        team_4
                                   0.687236
                                                      0.759750
                                                                          0.211629
      3
          Agent 12
                        team_2
                                   0.751821
                                                      0.829167
                                                                          0.120584
      4
          Agent 13
                                   0.548810
                                                      0.793844
                                                                          0.164659
                        team_0
      . .
      92
          Agent 93
                        team_4
                                   0.584128
                                                      0.736218
                                                                          0.225475
      93
          Agent 94
                        team_3
                                   0.391485
                                                      0.854785
                                                                          0.105329
          Agent 95
      94
                        team_3
                                   0.432688
                                                      0.793343
                                                                          0.173640
      95
          Agent 96
                        team_2
                                   0.332503
                                                      0.774287
                                                                          0.197326
      96
          Agent 97
                        team 3
                                   0.376880
                                                      0.795153
                                                                          0.163986
```

[97 rows x 5 columns]

```
[80]: # Merge agent_productivity with total_performance on 'Agent ID'
      agent_model = pd.merge(agent_productivity, total_performance, on=['Agent ID'])
      agent model
[80]:
          Agent ID Agent Team Efficiency Utilization Rate Non-Utilized Rate
          Agent 1
                       team_1
                                 0.723987
                                                    0.808010
                                                                       0.148564
      0
         Agent 10
      1
                       team_4
                                 0.401055
                                                    0.826329
                                                                       0.122138
         Agent 11
                       team 4
                                 0.687236
                                                    0.759750
                                                                       0.211629
      3
         Agent 12
                       team_2
                                 0.751821
                                                    0.829167
                                                                       0.120584
          Agent 13
                                 0.548810
                                                    0.793844
                                                                       0.164659
      4
                       team 0
      92 Agent 93
                       team 4
                                 0.584128
                                                    0.736218
                                                                       0.225475
      93 Agent 94
                       team_3
                                 0.391485
                                                    0.854785
                                                                       0.105329
      94 Agent 95
                       team 3
                                                                       0.173640
                                 0.432688
                                                    0.793343
      95 Agent 96
                       team 2
                                 0.332503
                                                    0.774287
                                                                       0.197326
      96 Agent 97
                       team_3
                                 0.376880
                                                    0.795153
                                                                       0.163986
          Number of Calls Handled
      0
                             1696
      1
                             1547
      2
                              608
      3
                             1209
                              702
      4
      . .
      92
                              126
      93
                              201
      94
                              520
      95
                              284
      96
                              525
      [97 rows x 6 columns]
[81]: # Define weights for each metric (you can adjust these)
      w1 = 0.4
      w2 = 0.3
      w3 = 0.3
      # Calculate the productivity score (PS)
      agent_model['Productivity Score'] = w1 * agent_model['Utilization Rate'] + w2 *__
       →(1 - agent_model['Efficiency']) + w3 * agent_model['Number of Calls Handled']
      # Sort the data by productivity score to identify top-performing and
       → low-performing agents/teams
      agent_sorted_data = agent_model.sort_values(by='Productivity Score', __
       →ascending=False)
```

agent_sorted_data [81]: Agent ID Agent Team Efficiency Utilization Rate Non-Utilized Rate \ Agent 31 team 2 0.701059 0.792421 0.145182 24 50 Agent 55 team 3 0.730204 0.750964 0.176208 12 Agent 20 team 2 0.673734 0.771363 0.160972 29 Agent 36 $team_4$ 0.620405 0.812553 0.125120 0.287839 11 Agent 2 $team_3$ 0.632228 0.657759 . . 93 Agent 94 0.391485 $team_3$ 0.854785 0.105329 6 Agent 15 $team_3$ 0.708972 0.752618 0.181351 92 Agent 93 $team_4$ 0.584128 0.736218 0.225475 37 Agent 43 $team_4$ 0.587481 0.623204 0.363461 Agent 81 79 $team_0$ 0.249877 0.846207 0.108362 Number of Calls Handled Productivity Score 24 2632 790.006651 50 2594 778.581324 12 2409 723.106425 29 2167 650.538900 11 2069 621.073435 . . 60.824469 93 201 6 189 57.088355 92 126 38.219249 37 102 30.973037 79 38 11.963520 [97 rows x 7 columns] [82]: #Top 5 agents have highest PS agent_sorted_data.nlargest(5, 'Productivity Score') [82]: Agent ID Agent Team Efficiency Utilization Rate Non-Utilized Rate 24 Agent 31 team 2 0.701059 0.792421 0.145182 Agent 55 50 team 3 0.730204 0.750964 0.176208 12 Agent 20 team 2 0.673734 0.771363 0.160972 29 Agent 36 $team_4$ 0.620405 0.812553 0.125120 11 Agent 2 team_3 0.632228 0.657759 0.287839 Number of Calls Handled Productivity Score 24 2632 790.006651 50 2594 778.581324 12 2409 723.106425 29 2167 650.538900

621.073435

2069

11

```
[83]: #Top 5 agents have lowest PS
      agent_sorted_data.nsmallest(5, 'Productivity Score')
[83]:
          Agent ID Agent Team Efficiency Utilization Rate Non-Utilized Rate \
          Agent 81
                       team 0
                                  0.249877
                                                    0.846207
                                                                        0.108362
      79
         Agent 43
                                                    0.623204
      37
                       team_4
                                  0.587481
                                                                        0.363461
      92 Agent 93
                                                                        0.225475
                       team_4
                                 0.584128
                                                    0.736218
          Agent 15
                       team 3
                                 0.708972
                                                    0.752618
                                                                        0.181351
      93 Agent 94
                       team_3
                                  0.391485
                                                    0.854785
                                                                        0.105329
          Number of Calls Handled Productivity Score
      79
                               38
                                             11.963520
      37
                              102
                                             30.973037
      92
                              126
                                             38.219249
      6
                              189
                                             57.088355
      93
                              201
                                             60.824469
     ### b1) Productivity by agent dashboard:
[84]: # Extract the numerical part of 'Agent ID' and convert it to integers
      agent_model['Agent ID Numeric'] = agent_model['Agent ID'].str.extract('(\d+)').
       →astype(int)
      # Sort the DataFrame by 'Agent ID Numeric' and 'Week'
      df_sorted1 = agent_model.sort_values(by=['Agent ID Numeric'])
      # Drop the 'Agent ID Numeric' column if you don't need it anymore
      df_sorted1 = df_sorted1.drop(columns=['Agent ID Numeric'])
      # Reset the index after sorting
      df_sorted1.reset_index(drop=True)
[84]:
          Agent ID Agent Team Efficiency Utilization Rate Non-Utilized Rate \
           Agent 1
                                 0.723987
                                                    0.808010
                                                                        0.148564
                       team 1
           Agent 2
      1
                       team 3
                                 0.632228
                                                    0.657759
                                                                        0.287839
      2
           Agent 3
                       team_3
                                 0.771184
                                                    0.796351
                                                                        0.187739
           Agent 4
      3
                       team_4
                                 0.653282
                                                    0.747824
                                                                        0.196428
      4
           Agent 5
                                                                        0.123427
                       team_4
                                  0.791097
                                                    0.835344
      . .
      92
         Agent 93
                       team_4
                                  0.584128
                                                    0.736218
                                                                        0.225475
      93
          Agent 94
                       team_3
                                                    0.854785
                                                                        0.105329
                                  0.391485
      94
         Agent 95
                       team_3
                                  0.432688
                                                    0.793343
                                                                        0.173640
      95
          Agent 96
                       team_2
                                  0.332503
                                                    0.774287
                                                                        0.197326
      96
         Agent 97
                       team_3
                                 0.376880
                                                    0.795153
                                                                        0.163986
          Number of Calls Handled Productivity Score
      0
                                            509.206008
                              1696
      1
                              2069
                                            621.073435
```

```
2
                         1591
                                        477.687185
3
                         1987
                                        596.503145
4
                         1469
                                        441.096808
. .
92
                                         38.219249
                          126
93
                          201
                                         60.824469
94
                          520
                                        156.487531
95
                          284
                                         85.709964
96
                          525
                                        158.004997
```

[97 rows x 7 columns]

```
[85]: # Create a figure for the dashboard
      fig = go.Figure()
      # Add a bar chart for Efficiency
      fig.add_trace(go.Bar(
          x=df_sorted1['Agent ID'],
          y=df_sorted1['Efficiency'],
          name='Efficiency',
          marker_color='royalblue'
      ))
      # Add a bar chart for Utilization Rate
      fig.add_trace(go.Bar(
          x=df_sorted1['Agent ID'],
          y=df_sorted1['Utilization Rate'],
          name='Utilization Rate',
          marker_color='limegreen'
      ))
      # Add a bar chart for Non-Utilization Rate
      fig.add_trace(go.Bar(
          x=df_sorted1['Agent ID'],
          y=df sorted1['Non-Utilized Rate'],
          name='Non-Utilization Rate',
          marker color='tomato'
      ))
      # Add a line chart for Number of Calls Handled
      fig.add_trace(go.Scatter(
          x=df_sorted1['Agent ID'],
          y=df_sorted1['Number of Calls Handled'],
          name='Number of Calls Handled',
          mode='lines+markers',
          yaxis='y2', # Use a secondary y-axis for this
          line=dict(color='purple', width=2)
```

```
))
# Define layout for the dashboard
fig.update_layout(
    title='Call Center Productivity Dashboard',
    xaxis=dict(title='Agent ID'),
    yaxis=dict(title='Metrics', titlefont=dict(color='black')),
    yaxis2=dict(title='Number of Calls Handled', titlefont=dict(color='black'),
 ⇔overlaying='y', side='right'),
    barmode='group', # Group bars for efficiency, utilization rate, and
 \rightarrownon-utilization rate
    legend=dict(x=0.7, y=1),
    height=600
)
# Add interactive capabilities like hovering over data points
fig.update_traces(hoverinfo='x+y')
# Show the dashboard
fig.show()
```

b2) Productivity by agent by Week dashboard:

```
[86]:
          Agent ID
                       Date Efficiency Utilization Rate Non-Utilized Rate
           Agent 1 31-2022
                               0.749320
                                                 0.806607
                                                                   0.156315
           Agent 1 32-2022
                               0.684445
                                                                   0.156787
     1
                                                 0.792085
     2
           Agent 1 33-2022
                               0.715627
                                                 0.831178
                                                                   0.123587
     3
           Agent 1 34-2022
                               0.745317
                                                 0.806940
                                                                   0.152490
     4
          Agent 10 31-2022
                               0.437121
                                                 0.791412
                                                                   0.153175
      . .
                     •••
               •••
                               •••
                                                 0.783322
                                                                   0.183379
     349 Agent 95 33-2022
                               0.277538
     350 Agent 95 34-2022
                               0.498399
                                                 0.797587
                                                                   0.169515
                                                 0.750255
     351 Agent 96 33-2022
                               0.219706
                                                                   0.229811
     352 Agent 96 34-2022
                               0.370855
                                                 0.782458
                                                                   0.186281
     353 Agent 97 34-2022
                                                 0.795153
                                                                   0.163986
                               0.376880
```

[354 rows x 5 columns]

```
[87]: | agent_productivity2 = agent_productivity2.rename(columns={'Date': 'Week'})
      # Remove the first character from the 'Week' column
      agent_productivity2['Week'] = agent_productivity2['Week'].str[1:]
      # Display the agent-level productivity metrics
      agent_productivity2.reset_index()
[87]:
           index Agent ID
                             Week Efficiency Utilization Rate Non-Utilized Rate
                  Agent 1 1-2022
                                     0.749320
                                                       0.806607
      0
                                                                          0.156315
      1
              1
                  Agent 1 2-2022
                                     0.684445
                                                       0.792085
                                                                          0.156787
      2
              2
                  Agent 1 3-2022
                                     0.715627
                                                       0.831178
                                                                          0.123587
      3
              3
                  Agent 1 4-2022
                                     0.745317
                                                       0.806940
                                                                          0.152490
      4
              4 Agent 10 1-2022
                                                       0.791412
                                     0.437121
                                                                          0.153175
      349
            349 Agent 95 3-2022
                                     0.277538
                                                       0.783322
                                                                          0.183379
      350
             350 Agent 95 4-2022
                                     0.498399
                                                       0.797587
                                                                          0.169515
                                                       0.750255
                                                                          0.229811
      351
             351 Agent 96 3-2022
                                     0.219706
      352
             352 Agent 96 4-2022
                                     0.370855
                                                       0.782458
                                                                          0.186281
      353
            353 Agent 97 4-2022
                                                       0.795153
                                                                          0.163986
                                     0.376880
      [354 rows x 6 columns]
[88]: # Extract the numerical part of 'Agent ID' and convert it to integers
      agent_productivity2['Agent ID Numeric'] = agent_productivity2['Agent ID'].str.
       →extract('(\d+)').astype(int)
      # Sort the DataFrame by 'Agent ID Numeric' and 'Week'
      df_sorted2 = agent_productivity2.sort_values(by=['Agent ID Numeric', 'Week'])
      # Drop the 'Agent ID Numeric' column if you don't need it anymore
      df_sorted2 = df_sorted2.drop(columns=['Agent ID Numeric'])
      # Reset the index after sorting
      df_sorted2.reset_index(drop=True)
[88]:
           Agent ID
                      Week Efficiency Utilization Rate Non-Utilized Rate
      0
           Agent 1 1-2022
                              0.749320
                                                0.806607
                                                                   0.156315
      1
           Agent 1 2-2022
                              0.684445
                                                0.792085
                                                                   0.156787
      2
           Agent 1 3-2022
                                                0.831178
                                                                   0.123587
                              0.715627
           Agent 1 4-2022
                              0.745317
      3
                                                0.806940
                                                                   0.152490
      4
           Agent 2 1-2022
                              0.632997
                                                0.653751
                                                                   0.290204
               ...
      349 Agent 95 3-2022
                              0.277538
                                                0.783322
                                                                   0.183379
                                                                   0.169515
      350
          Agent 95 4-2022
                              0.498399
                                                0.797587
```

```
351 Agent 96 3-2022
                              0.219706
                                                 0.750255
                                                                    0.229811
      352 Agent 96 4-2022
                                                                    0.186281
                               0.370855
                                                 0.782458
                                                 0.795153
      353 Agent 97 4-2022
                               0.376880
                                                                    0.163986
      [354 rows x 5 columns]
     Jump to Table of Contents
     Jump to Section 1: Data Preprocessing
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     ## 4 - Productivity Dashboard:
[89]: # Import necessary libraries
      from plotly.subplots import make subplots
      import plotly.graph_objs as go
      # Create a Dash app
      app = dash.Dash(__name__)
      # Assuming you have a DataFrame called team_productivity2
      # Initialize the layout of the combined dashboard
      app.layout = html.Div([
          html.H1("Call Center Performance Dashboard by Team"),
          # Dropdown to select team for the first dashboard
          dcc.Dropdown(
              id='team-dropdown',
              options=[{'label': team, 'value': team} for team in_
       ⇔team_productivity2['Agent Team'].unique()],
              value=team_productivity2['Agent Team'].iloc[0], # Set the initial value
              multi=False
          ),
          # Line chart for Efficiency and Utilization Rate for the first dashboard
          dcc.Graph(id='efficiency-utilization-line-chart'),
          # Pie chart for Time-Utilization Rate for the first dashboard
          dcc.Graph(id='time-utilization-pie-chart'),
          html.H2("Call Center Performance Dashboard by Agent"),
          # Dropdown to select agent for the second dashboard
          dcc.Dropdown(
              id='agent-dropdown',
```

```
options=[{'label': agent, 'value': agent} for agent in_

→df_sorted2['Agent ID'].unique()],
        value=df_sorted2['Agent ID'].iloc[0], # Set the initial value
        multi=False
    ),
    # Line chart for weekly utilization rate for the second dashboard
    dcc.Graph(id='utilization-line-chart'),
    # Pie chart for weekly non-utilization rate for the second dashboard
    dcc.Graph(id='time-utilization-pie-chart-2'),
])
# Define callback functions to update charts based on user input for the first \Box
 \rightarrow dashboard
@app.callback(
    [Output('efficiency-utilization-line-chart', 'figure'),
    Output('time-utilization-pie-chart', 'figure')],
    [Input('team-dropdown', 'value')]
def update_charts(selected_team):
    filtered_data = team_productivity2[team_productivity2['Agent Team'] ==_u
 ⇔selected_team]
    # Create a subplot with two line charts (Efficiency and Utilization Rate)
    fig = make_subplots(rows=1, cols=2, subplot_titles=("Efficiency", __

¬"Utilization Rate"))
    # Line chart for Efficiency
    efficiency_trace = go.Scatter(
        x=filtered_data['Week'],
        y=filtered_data['Efficiency'],
        mode='lines',
        name='Efficiency'
    fig.add_trace(efficiency_trace, row=1, col=1)
    # Line chart for Utilization Rate
    utilization_trace = go.Scatter(
        x=filtered_data['Week'],
        y=filtered_data['Utilization Rate'],
        mode='lines',
        name='Utilization Rate'
    fig.add_trace(utilization_trace, row=1, col=2)
    # Update layout for the subplot
```

```
fig.update_layout(title=f'Efficiency and Utilization Rate for_

√{selected_team}')
    # Pie chart for Time-Utilization Rate
    time_utilization_fig = px.pie(
        names=['Utilization', 'Non-Utilization'],
        values=[filtered data['Utilization Rate'].mean(),

¬filtered_data['Non-Utilized Rate'].mean()],
        title=f'Time-Utilization Breakdown for {selected_team}'
    )
    return fig, time_utilization_fig
# Define callback functions to update charts based on user input for the second
 \hookrightarrow dashboard
@app.callback(
    [Output('utilization-line-chart', 'figure'),
    Output('time-utilization-pie-chart-2', 'figure')],
    [Input('agent-dropdown', 'value')]
def update_charts(selected_agent):
    filtered_data2 = df_sorted2[df_sorted2['Agent ID'] == selected_agent]
    # Line chart for weekly utilization rate
    utilization_fig2 = px.line(
        filtered_data2,
        x='Week',
        y='Utilization Rate',
        title=f'Weekly Utilization Rate for {selected_agent}'
    )
    # Pie chart for weekly non-utilization rate
    time_utilization_fig2 = px.pie(
        names=['Utilization', 'Non-Utilization'],
        values=[filtered_data2['Utilization Rate'].mean(),__

¬filtered_data2['Non-Utilized Rate'].mean()],
        title=f'Time-Utilization Breakdown for {selected_agent}'
    )
    return utilization_fig2, time_utilization_fig2
# Run the combined app
if __name__ == '__main__':
    app.run_server(debug=True)
```

```
OSError Traceback (most recent call last)
```

```
Cell In[89], line 114
     112 # Run the combined app
     113 if __name__ == '__main__':
--> 114
              app.run_server(debug=True)
File ~/opt/anaconda3/lib/python3.9/site-packages/dash/dash.py:2155, in Dash.
 →run server(self, *args, **kwargs)
   2149 def run_server(self, *args, **kwargs):
   2150
              """`run server` is a deprecated alias of `run` and may be removed i:
 \Boxa
   2151
              future version. We recommend using `app.run` instead.
   2152
   2153
              See `app.run` for usage information.
   2154
-> 2155
              self.run(*args, **kwargs)
File ~/opt/anaconda3/lib/python3.9/site-packages/dash/dash.py:2053, in Dash.
 run(self, host, port, proxy, debug, jupyter_mode, jupyter_width, 

→jupyter_height, jupyter_server_url, dev_tools_ui, dev_tools_props_check, 

→dev_tools_serve_dev_bundles, dev_tools_hot_reload, 

→dev_tools_hot_reload_interval, dev_tools_hot_reload_watch_interval, 

→dev_tools_hot_reload_max_retry, dev_tools_silence_routes_logging, 
 →dev tools prune errors, **flask run options)
   2050
                        extra_files.append(path)
   2052 if jupyter_dash.active:
-> 2053
              jupyter_dash.run_app(
   2054
                   self.
   2055
                   mode=jupyter_mode,
   2056
                   width=jupyter_width,
   2057
                   height=jupyter_height,
   2058
                   host=host,
   2059
                   port=port,
   2060
                   server url=jupyter server url,
   2061
   2062 else:
   2063
              self.server.run(host=host, port=port, debug=debug,
 →**flask_run_options)
File ~/opt/anaconda3/lib/python3.9/site-packages/dash/_jupyter.py:329, in_
 JupyterDash.run app(self, app, mode, width, height, host, port, server url)
     325
              pass
     327 err_q = queue.Queue()
--> 329 server = make_server(host, port, app server, threaded=True, processes=0
     330 logging.getLogger("werkzeug").setLevel(logging.ERROR)
     332 @retry(
     333
              stop_max_attempt_number=15,
              wait exponential multiplier=100,
     334
     335
              wait exponential max=1000,
     336 )
```

```
337 def run():
File ~/opt/anaconda3/lib/python3.9/site-packages/werkzeug/serving.py:852, in_
 →make server(host, port, app, threaded, processes, request handler, ____
 →passthrough_errors, ssl_context, fd)
    849
            raise ValueError("Cannot have a multi-thread and multi-process_
 ⇔server.")
    851 if threaded:
--> 852
            return ThreadedWSGIServer(
    853
          host, port, app, request handler, passthrough errors, ssl_context, fd fd
    854
    856 if processes > 1:
    857
            return ForkingWSGIServer(
    858
                host,
    859
                port,
   (...)
    865
                fd=fd,
    866
            )
File ~/opt/anaconda3/lib/python3.9/site-packages/werkzeug/serving.py:711, in_u
 BaseWSGIServer. init (self, host, port, app, handler, passthrough errors, u
 ⇔ssl_context, fd)
    708 if fd is None:
            # No existing socket descriptor, do bind and activate=True.
    709
    710
                self.server_bind()
--> 711
    712
                self.server activate()
    713
            except BaseException:
File ~/opt/anaconda3/lib/python3.9/http/server.py:136, in HTTPServer.
 ⇔server_bind(self)
    134 def server_bind(self):
            """Override server bind to store the server name."""
    135
            socketserver.TCPServer.server_bind(self)
--> 136
    137
            host, port = self.server_address[:2]
            self.server_name = socket.getfqdn(host)
    138
File ~/opt/anaconda3/lib/python3.9/socketserver.py:466, in TCPServer.
 ⇔server bind(self)
    464 if self.allow reuse address:
            self.socket.setsockopt(socket.SOL_SOCKET, socket.SO_REUSEADDR, 1)
--> 466 self.socket.bind(self.server address)
    467 self.server_address = self.socket.getsockname()
OSError: [Errno 48] Address already in use
```

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