

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

# Load sheets
heat_df = pd.read_excel("/content/GRADE_PRODUCT_MIX.xlsx", sheet_name="HEAT_MASTER")
grade_df = pd.read_excel("/content/GRADE_PRODUCT_MIX.xlsx", sheet_name="GRADE_MASTER")

# Merge on Grade (FK → PK)
merged_df = pd.merge(heat_df, grade_df, on='GRADE', how='left')
```

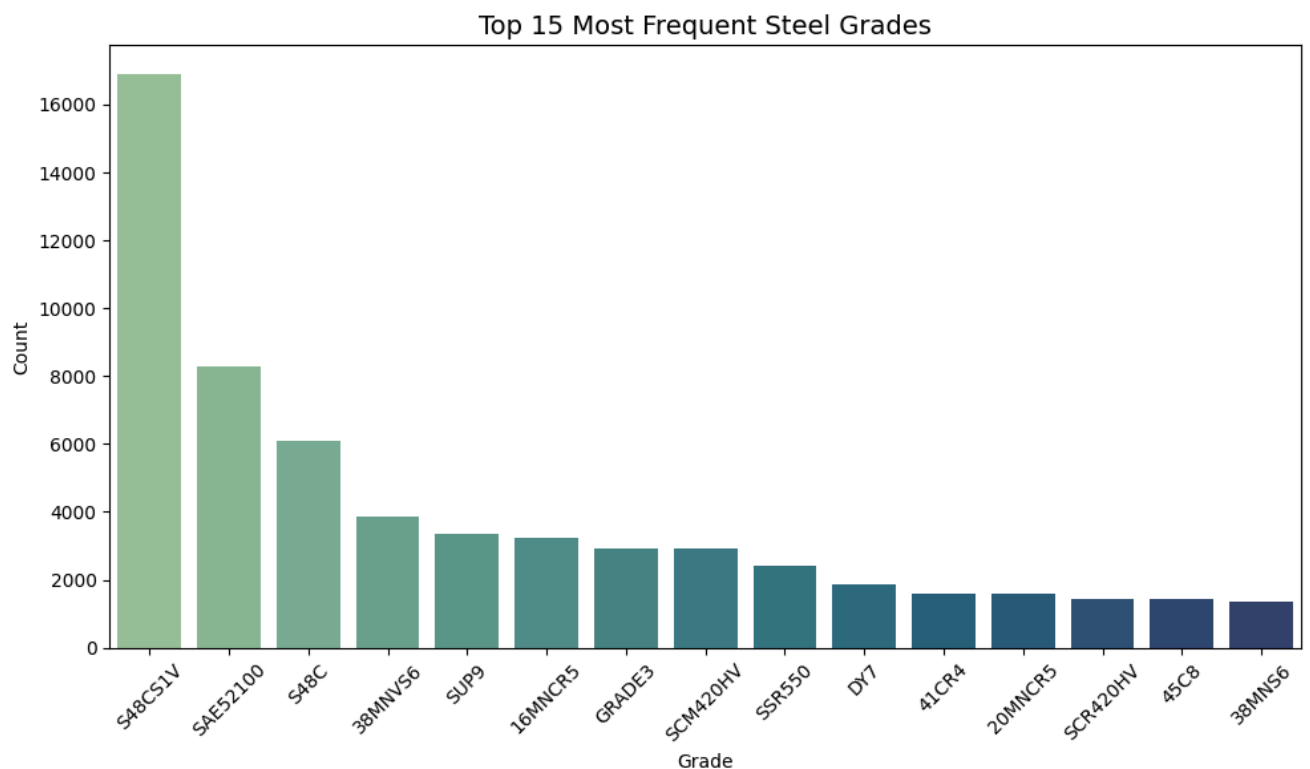
## UNIVARIANT ANALYSIS

```
# GRADE – Frequency Distribution
# Goal: See which steel grades are most common.
plt.figure(figsize=(10,6))
top_grades = merged_df['GRADE'].value_counts().head(15)
sns.barplot(x=top_grades.index, y=top_grades.values, palette='crest')
plt.title("Top 15 Most Frequent Steel Grades", fontsize=14)
plt.xlabel("Grade")
plt.ylabel("Count")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

/tmp/ipython-input-2831103479.py:5: FutureWarning:

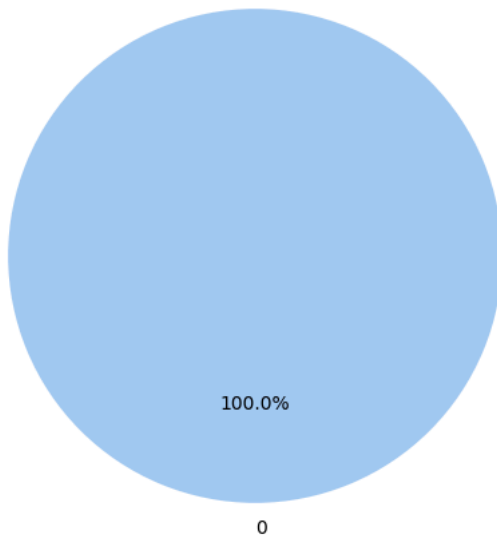
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.barplot(x=top_grades.index, y=top_grades.values, palette='crest')
```



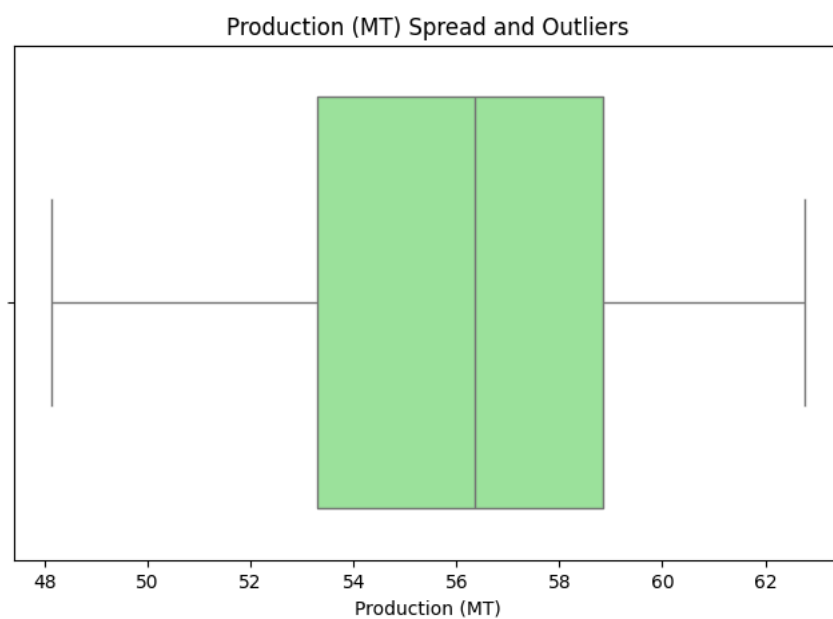
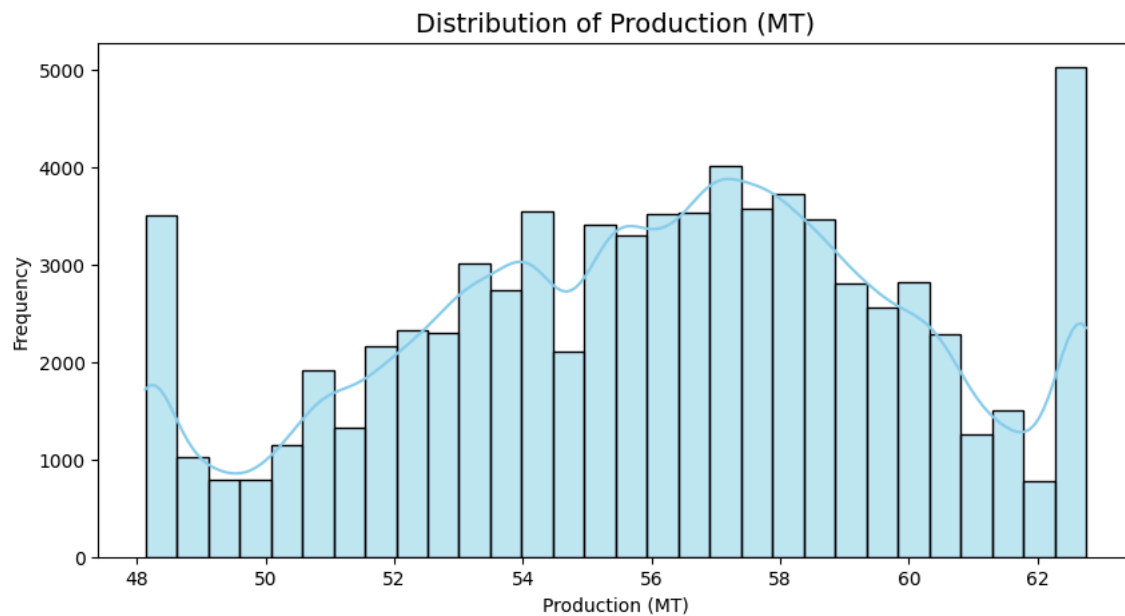
```
# HOT_COLD – Production Type Mix
# Goal: See share of hot vs cold production.
plt.figure(figsize=(6,6))
merged_df['HOT_COLD'].value_counts().plot.pie(
    autopct='%1.1f%%', colors=sns.color_palette('pastel'), startangle=90
)
plt.title("Hot vs Cold Production Share", fontsize=14)
plt.ylabel("")
plt.show()
```

### Hot vs Cold Production Share

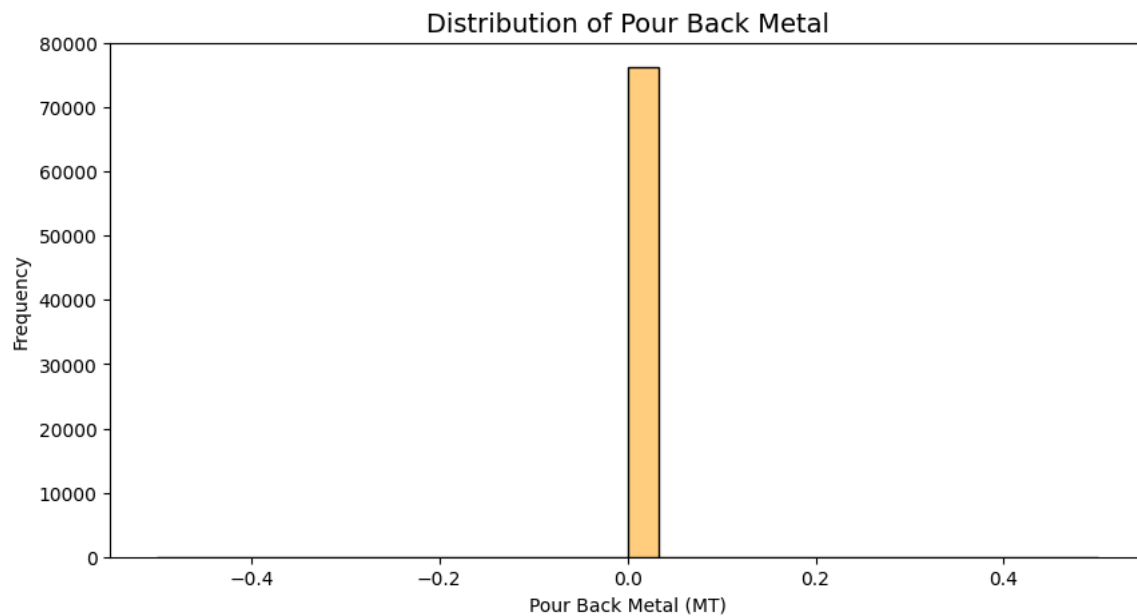


```
# Production (MT) – Distribution
# Goal: Understand average production and outliers.
plt.figure(figsize=(10,5))
sns.histplot(merged_df['Production (MT)'], kde=True, color='skyblue', bins=30)
plt.title("Distribution of Production (MT)", fontsize=14)
plt.xlabel("Production (MT)")
plt.ylabel("Frequency")
plt.show()

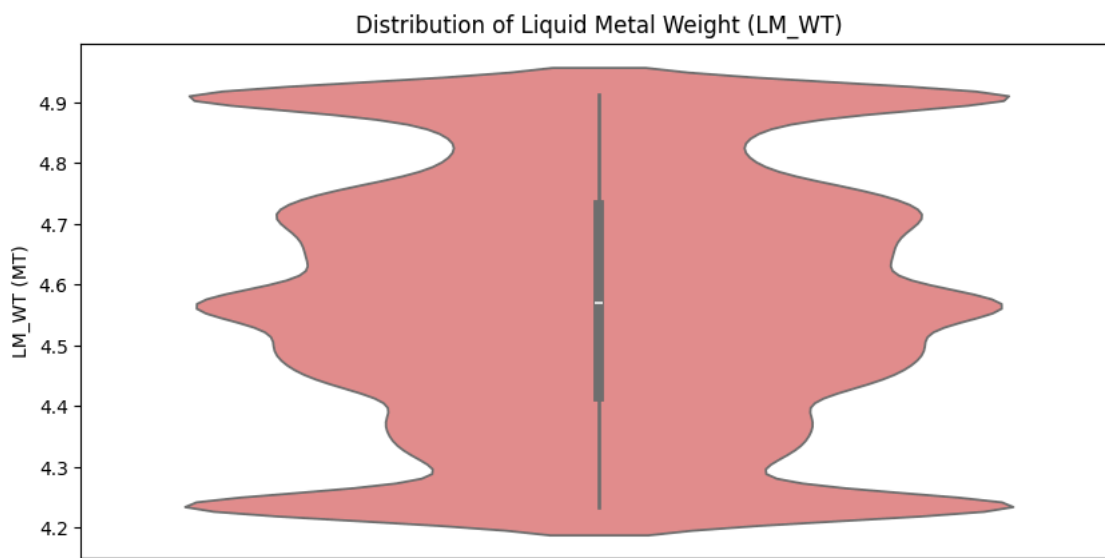
plt.figure(figsize=(8,5))
sns.boxplot(x=merged_df['Production (MT)'], color='lightgreen')
plt.title("Production (MT) Spread and Outliers")
plt.xlabel("Production (MT)")
plt.show()
```



```
# Pour_Back_Metal - Process Recovery
# Goal: See how much metal is poured back on average.
plt.figure(figsize=(10,5))
sns.histplot(merged_df['Pour_Back_Metal'], kde=True, bins=30, color='orange')
plt.title("Distribution of Pour Back Metal", fontsize=14)
plt.xlabel("Pour Back Metal (MT)")
plt.ylabel("Frequency")
plt.show()
```



```
# LM_WT – Liquid Metal Weight Distribution
# Goal: Variation in metal weight per heat.
plt.figure(figsize=(10,5))
sns.violinplot(y='LM_WT', data=merged_df, color='lightcoral')
plt.title("Distribution of Liquid Metal Weight (LM_WT)")
plt.ylabel("LM_WT (MT)")
plt.show()
```

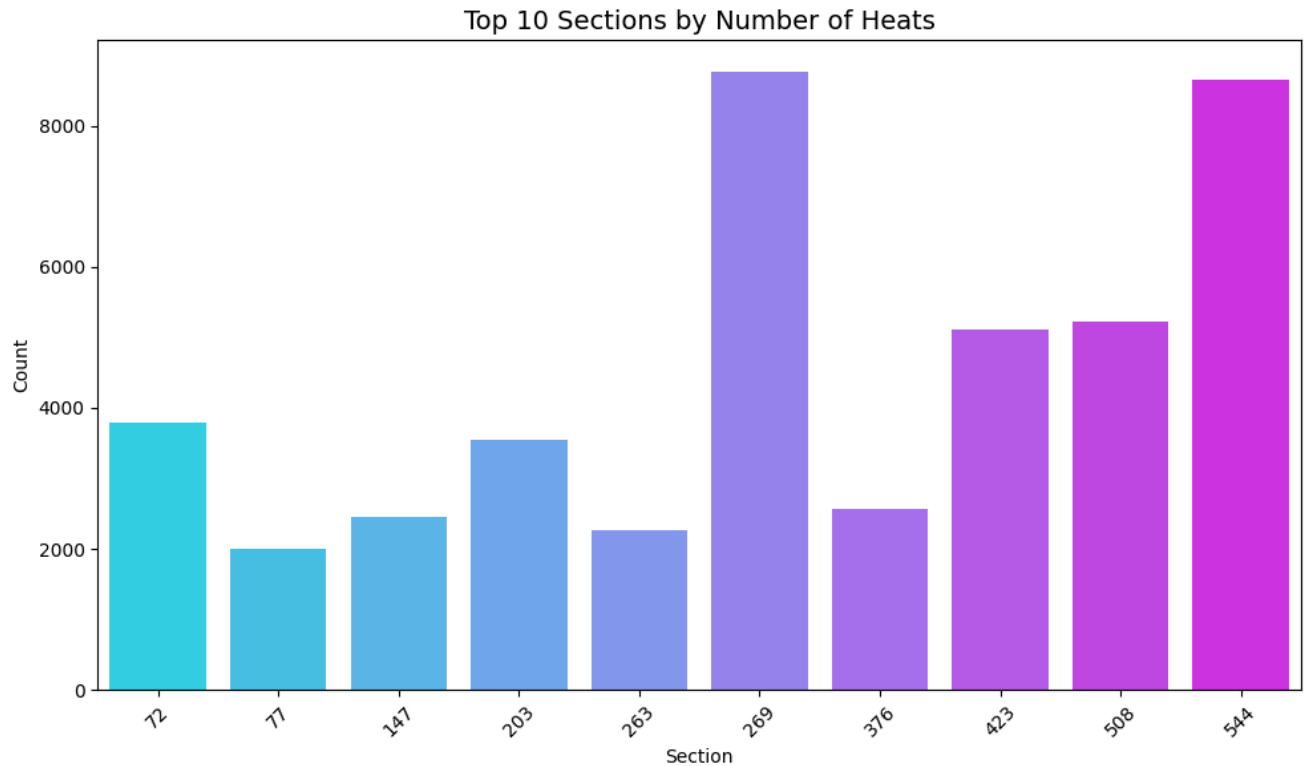


```
# SECTION – Production by Section
# Goal: Identify which section contributes most.
plt.figure(figsize=(10,6))
section_counts = merged_df['SECTION'].value_counts().head(10)
sns.barplot(x=section_counts.index, y=section_counts.values, palette='cool')
plt.title("Top 10 Sections by Number of Heats", fontsize=14)
plt.xlabel("Section")
plt.ylabel("Count")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

```
/tmp/ipython-input-3652185239.py:5: FutureWarning:
```

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.barplot(x=section_counts.index, y=section_counts.values, palette='cool')
```

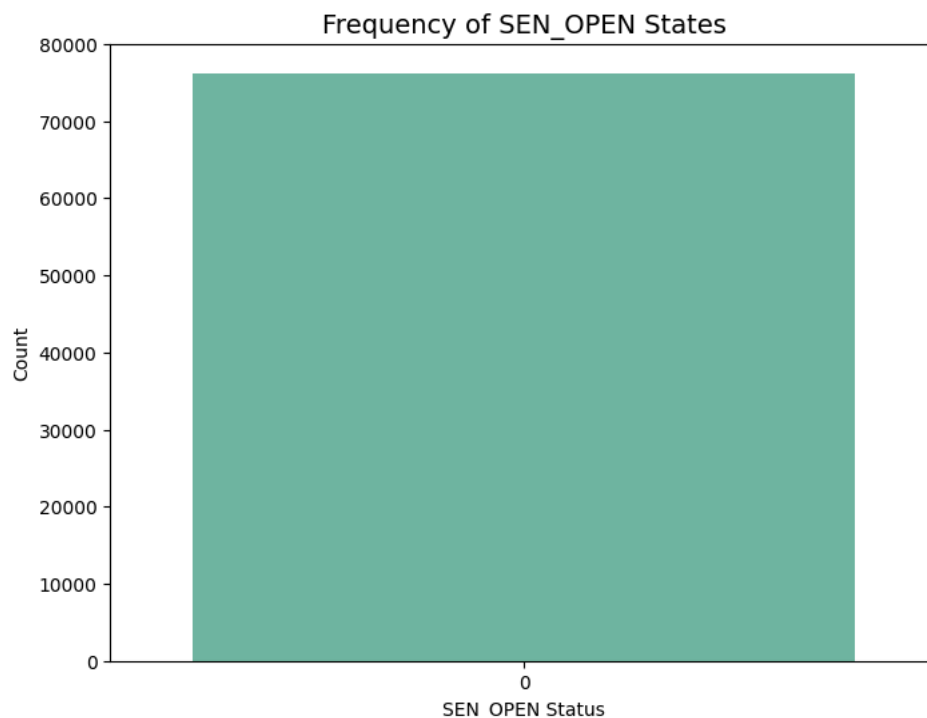


```
# SEN_OPEN - Operational Frequency  
# Goal: Check if SEN openings are consistent.  
plt.figure(figsize=(8,6))  
sns.countplot(x='SEN_OPEN', data=merged_df, palette='Set2')  
plt.title("Frequency of SEN_OPEN States", fontsize=14)  
plt.xlabel("SEN_OPEN Status")  
plt.ylabel("Count")  
plt.show()
```

```
/tmp/ipython-input-1748194203.py:4: FutureWarning:
```

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.countplot(x='SEN_OPEN', data=merged_df, palette='Set2')
```



```
# SECTION_IC - Frequency Distribution

# Goal: Understand variation in internal code or section index.
plt.figure(figsize=(10,6))
sns.countplot(x='SECTION_IC', data=merged_df, palette='viridis')
plt.title("Distribution of SECTION_IC Values", fontsize=14)
plt.xlabel("SECTION_IC")
plt.ylabel("Count")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

/tmp/ipython-input-3989999945.py:5: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

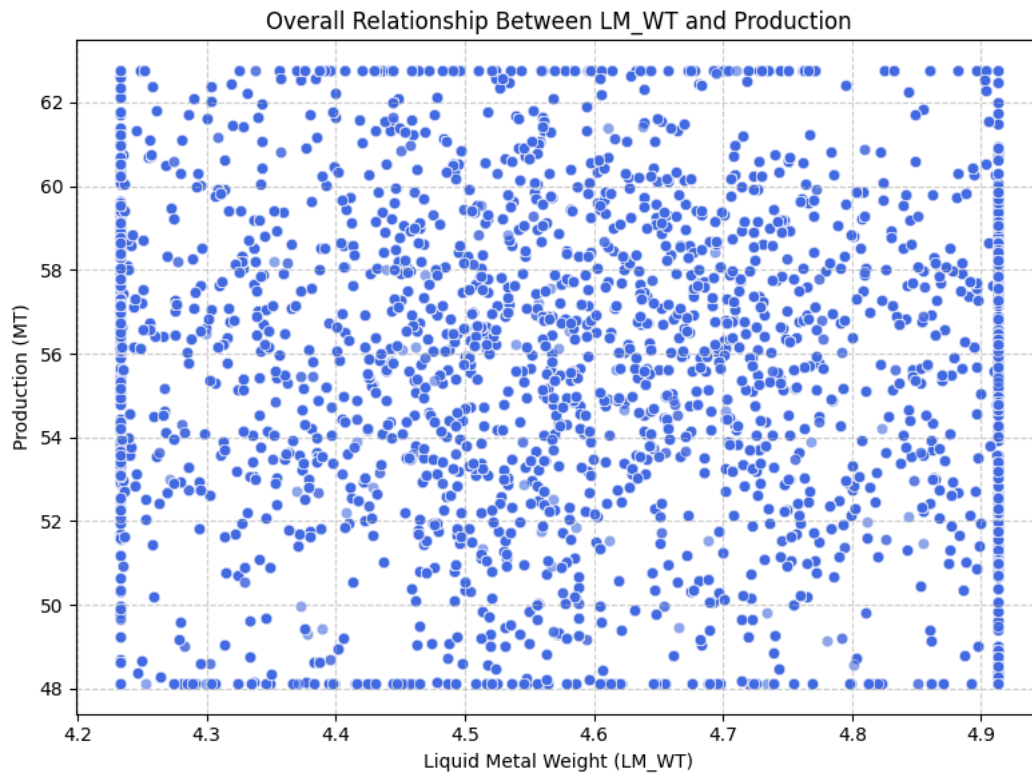
```
sns.countplot(x='SECTION_IC', data=merged_df, palette='viridis')
```



## ~ **Bivariate Analysis**

#LM\_WT vs Production (MT)

```
plt.figure(figsize=(8,6))
sns.scatterplot(data=merged_df, x='LM_WT', y='Production (MT)', color='royalblue', alpha=0.6)
plt.title("Overall Relationship Between LM_WT and Production")
plt.xlabel("Liquid Metal Weight (LM_WT)")
plt.ylabel("Production (MT)")
plt.grid(True, linestyle='--', alpha=0.6)
plt.tight_layout()
plt.show()
```



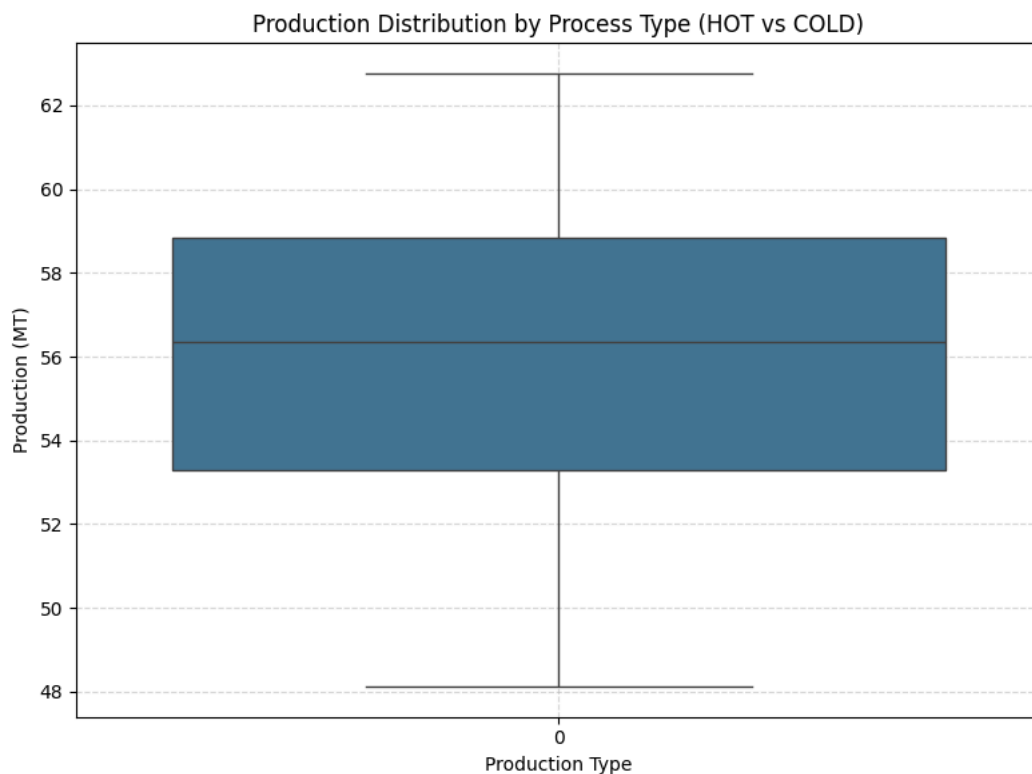
```
# HOT_COLD vs Production (MT)
```

```
plt.figure(figsize=(8,6))
sns.boxplot(data=merged_df, x='HOT_COLD', y='Production (MT)', palette='mako')
plt.title("Production Distribution by Process Type (HOT vs COLD)")
plt.xlabel("Production Type")
plt.ylabel("Production (MT)")
plt.grid(True, linestyle='--', alpha=0.5)
plt.tight_layout()
plt.show()
```

/tmp/ipython-input-939156510.py:5: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.boxplot(data=merged_df, x='HOT_COLD', y='Production (MT)', palette='mako')
```



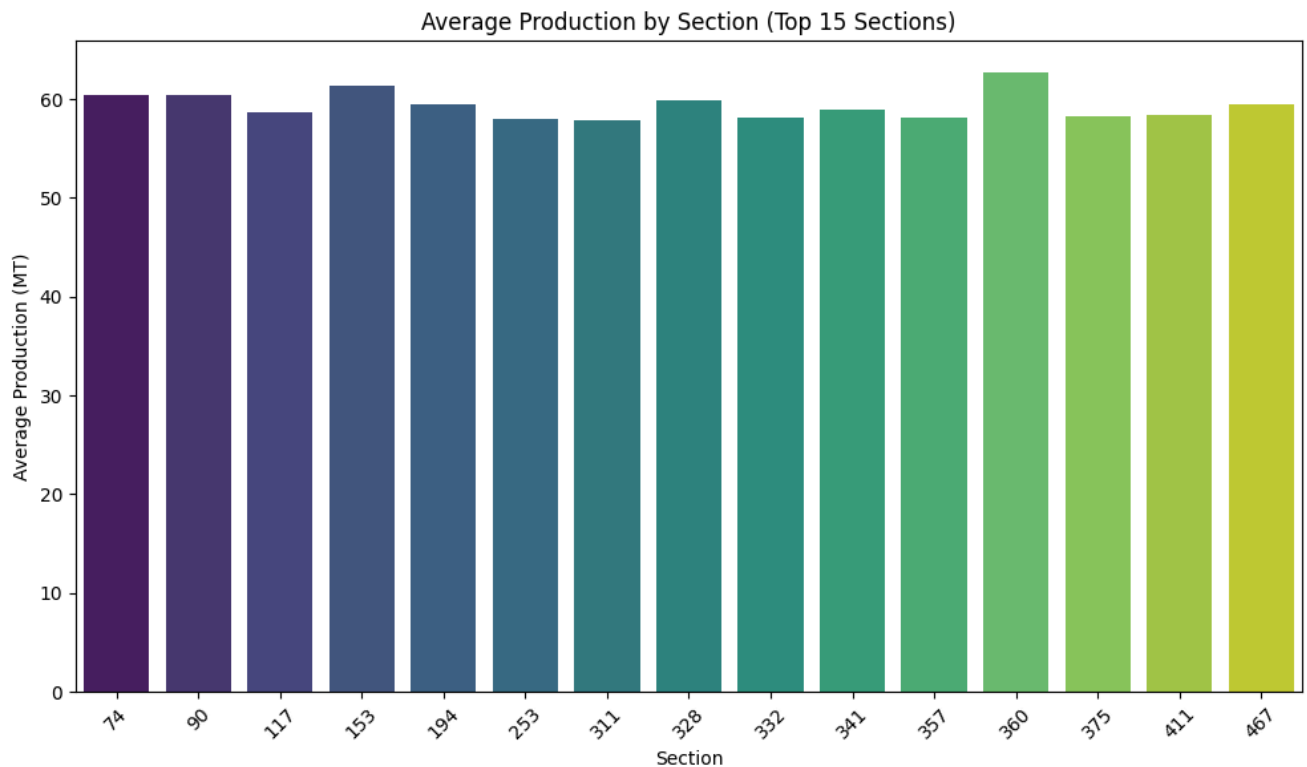
```
# SECTION vs Production (MT)
```

```
section_prod = merged_df.groupby('SECTION')['Production (MT)'].mean().sort_values(ascending=False).head(15)
plt.figure(figsize=(10,6))
sns.barplot(x=section_prod.index, y=section_prod.values, palette='viridis')
plt.title("Average Production by Section (Top 15 Sections)")
plt.xlabel("Section")
plt.ylabel("Average Production (MT)")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

/tmp/ipython-input-3719066492.py:6: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

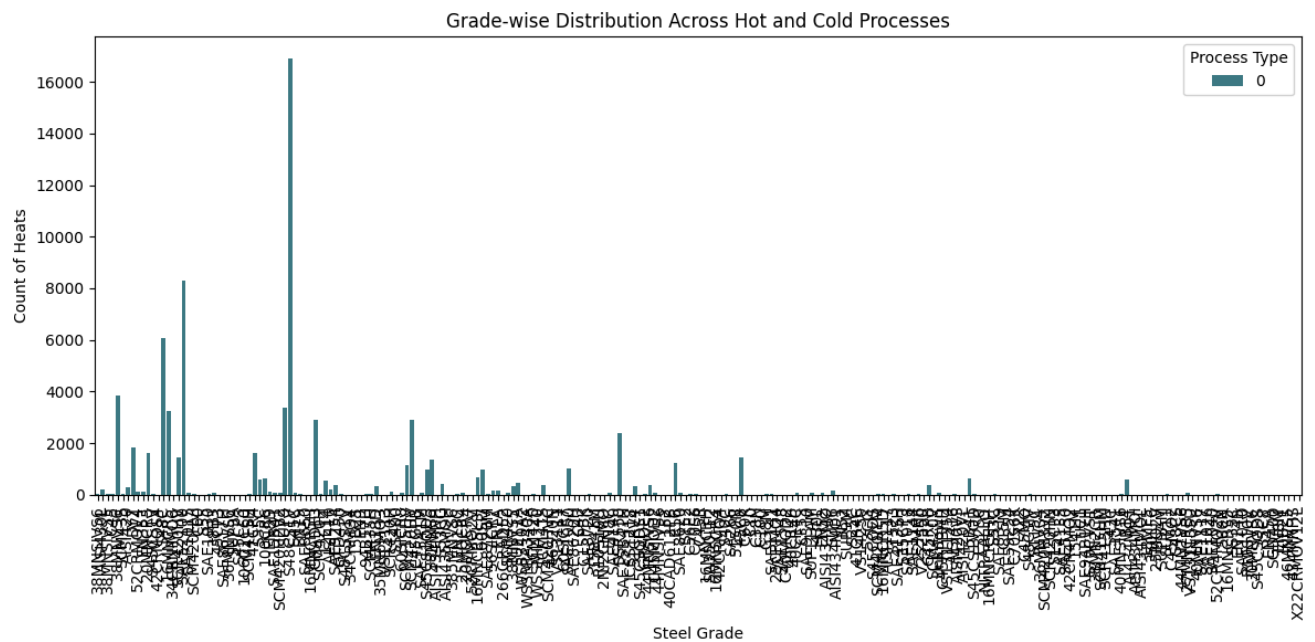
```
sns.barplot(x=section_prod.index, y=section_prod.values, palette='viridis')
```



```
# GRADE vs HOT_COLD (Categorical Relationship)
```

```
plt.figure(figsize=(12,6))
sns.countplot(data=merged_df, x='GRADE', hue='HOT_COLD', palette='crest')
plt.title("Grade-wise Distribution Across Hot and Cold Processes")
plt.xlabel("Steel Grade")
plt.ylabel("Count of Heats")
plt.xticks(rotation=90)
plt.legend(title='Process Type')
plt.tight_layout()
plt.show()
```





```
# SEN_OPEN vs Production (MT)
```

```
plt.figure(figsize=(8,6))
sns.barplot(data=merged_df, x='SEN_OPEN', y='Production (MT)', palette='coolwarm')
plt.title("Impact of SEN Opening on Production")
plt.xlabel("SEN Opening Count")
plt.ylabel("Average Production (MT)")
plt.grid(True, linestyle='--', alpha=0.5)
plt.tight_layout()
plt.show()
```

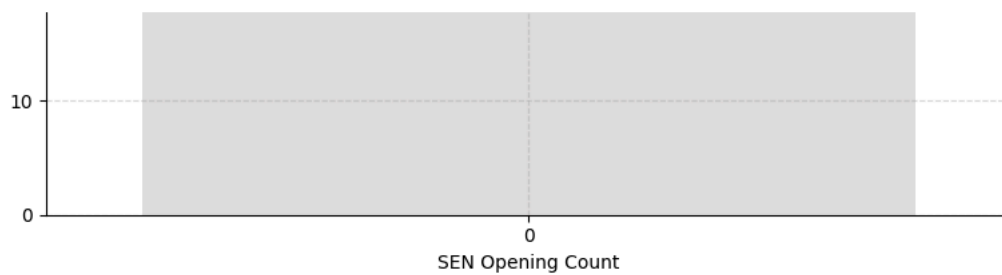
```
/tmp/ipython-input-3578697660.py:5: FutureWarning:
```

```
#SECTION_IC vs Production (MT)
```

```
plt.figure(figsize=(10,6))
sns.boxplot(data=merged_df, x='SECTION_IC', y='Production (MT)', palette='crest')
plt.title("Production Distribution by Internal Section")
plt.xlabel("Internal Section (IC)")
plt.ylabel("Production (MT)")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

```
plt.figure(figsize=(10,6))
avg_prod = merged_df.groupby('SECTION_IC')['Production (MT)'].mean().reset_index()
```

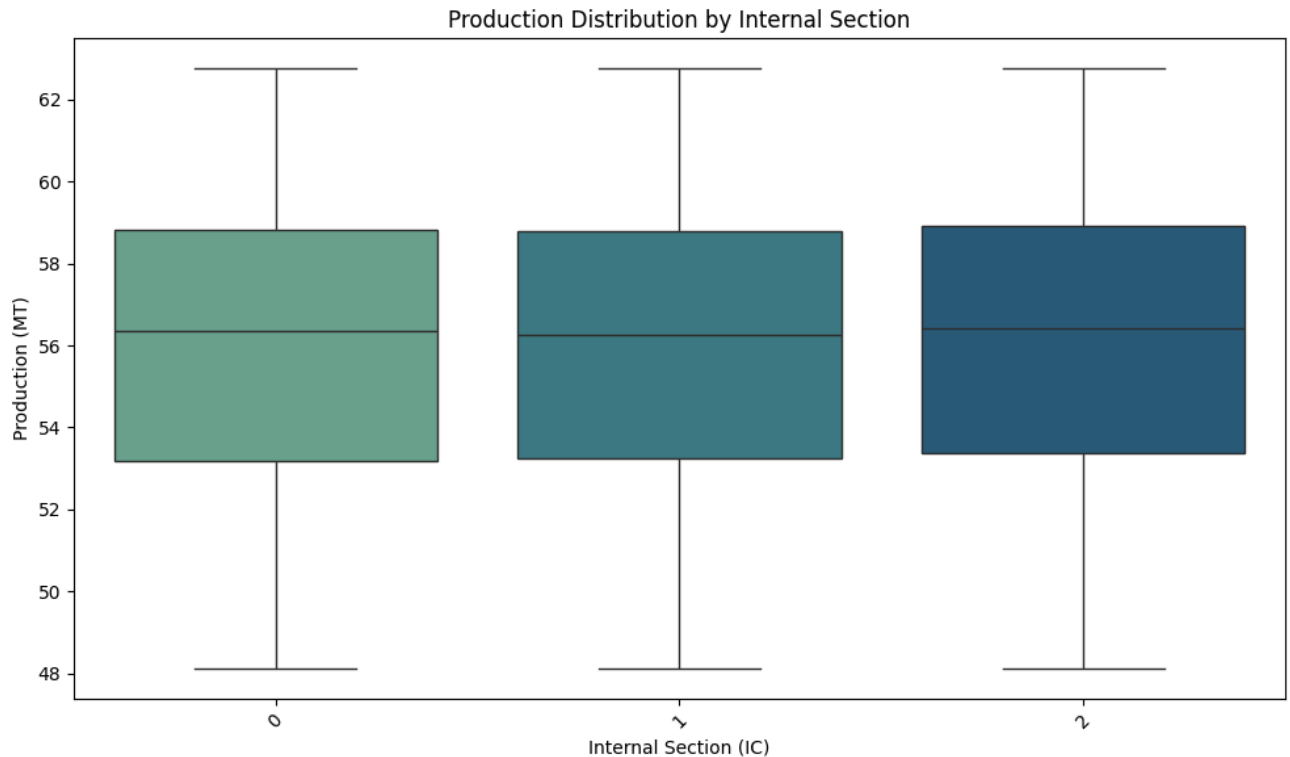
```
sns.barplot(data=avg_prod, x='SECTION_IC', y='Production (MT)', palette='crest')
plt.title("Average Production by Internal Section")
plt.xlabel("Internal Section (IC)")
plt.ylabel("Average Production (MT)")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```



```
/tmp/ipython-input-3155063354.py:5: FutureWarning:
```

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

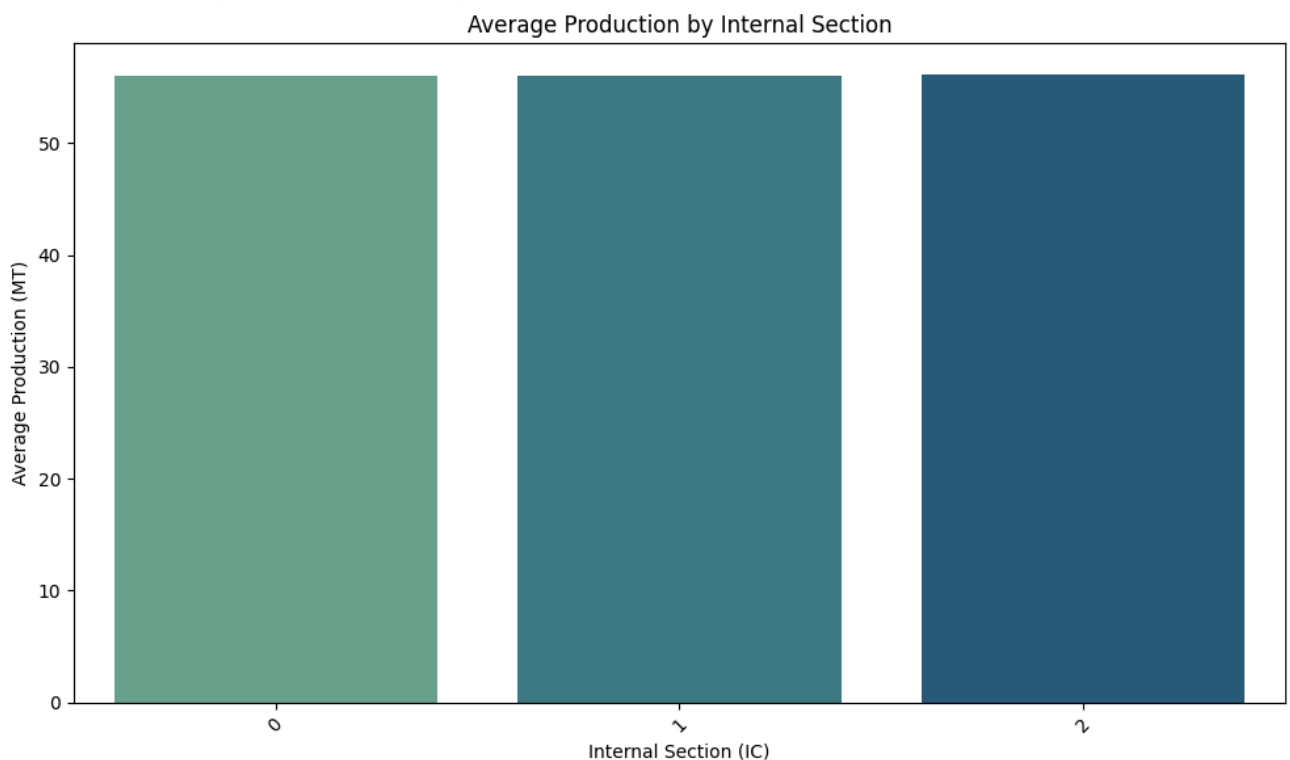
```
sns.boxplot(data=merged_df, x='SECTION_IC', y='Production (MT)', palette='crest')
```



```
/tmp/ipython-input-3155063354.py:16: FutureWarning:
```

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.barplot(data=avg_prod, x='SECTION_IC', y='Production (MT)', palette='crest')
```



```
# Pour_Back_Metal vs Production (MT)
```

```
plt.figure(figsize=(8,6))
sns.scatterplot(
    data=merged_df,
    x='Pour_Back_Metal',
    y='Production (MT)',
```

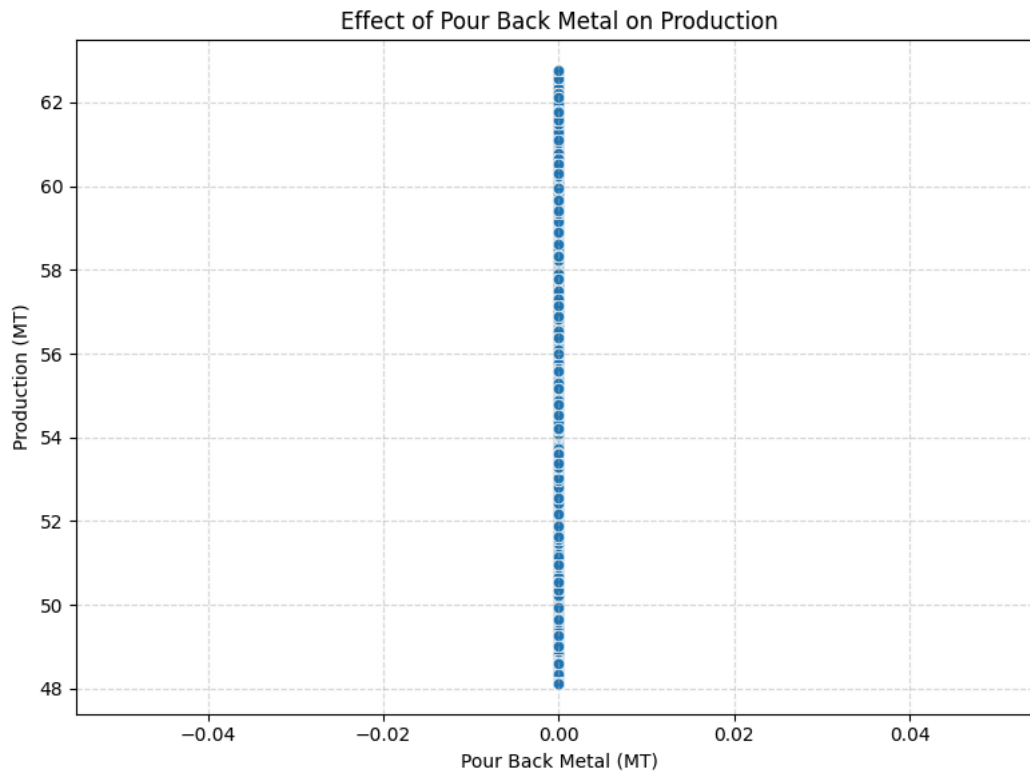
```

    palette='magma',
    alpha=0.7
)

plt.title("Effect of Pour Back Metal on Production")
plt.xlabel("Pour Back Metal (MT)")
plt.ylabel("Production (MT)")
plt.grid(True, linestyle='--', alpha=0.5)
plt.tight_layout()
plt.show()

```

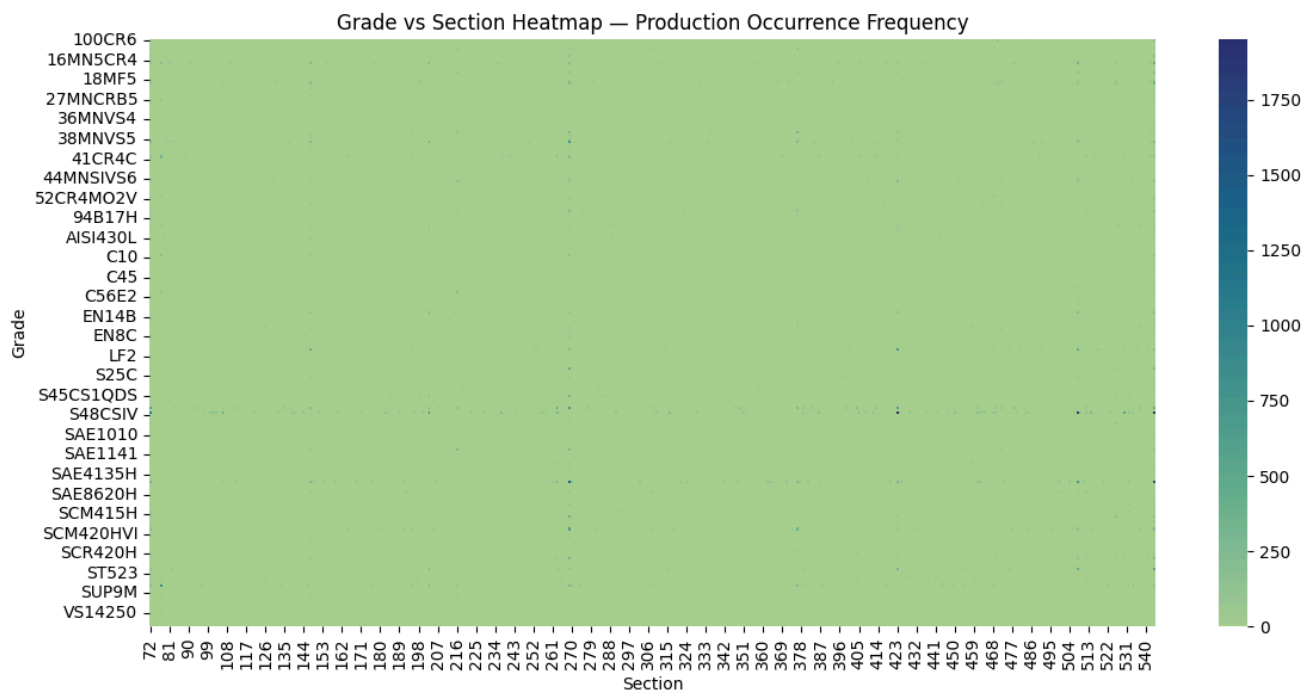
/tmp/ipython-input-3286894681.py:9: UserWarning: Ignoring `palette` because no `hue` variable has been assigned.  
 sns.scatterplot(



```

# GRADE vs SECTION (Heatmap)
grade_section = pd.crosstab(merged_df['GRADE'], merged_df['SECTION'])
plt.figure(figsize=(12,6))
sns.heatmap(grade_section, cmap='crest', cbar=True)
plt.title("Grade vs Section Heatmap - Production Occurrence Frequency")
plt.xlabel("Section")
plt.ylabel("Grade")
plt.tight_layout()
plt.show()

```



Double-click (or enter) to edit

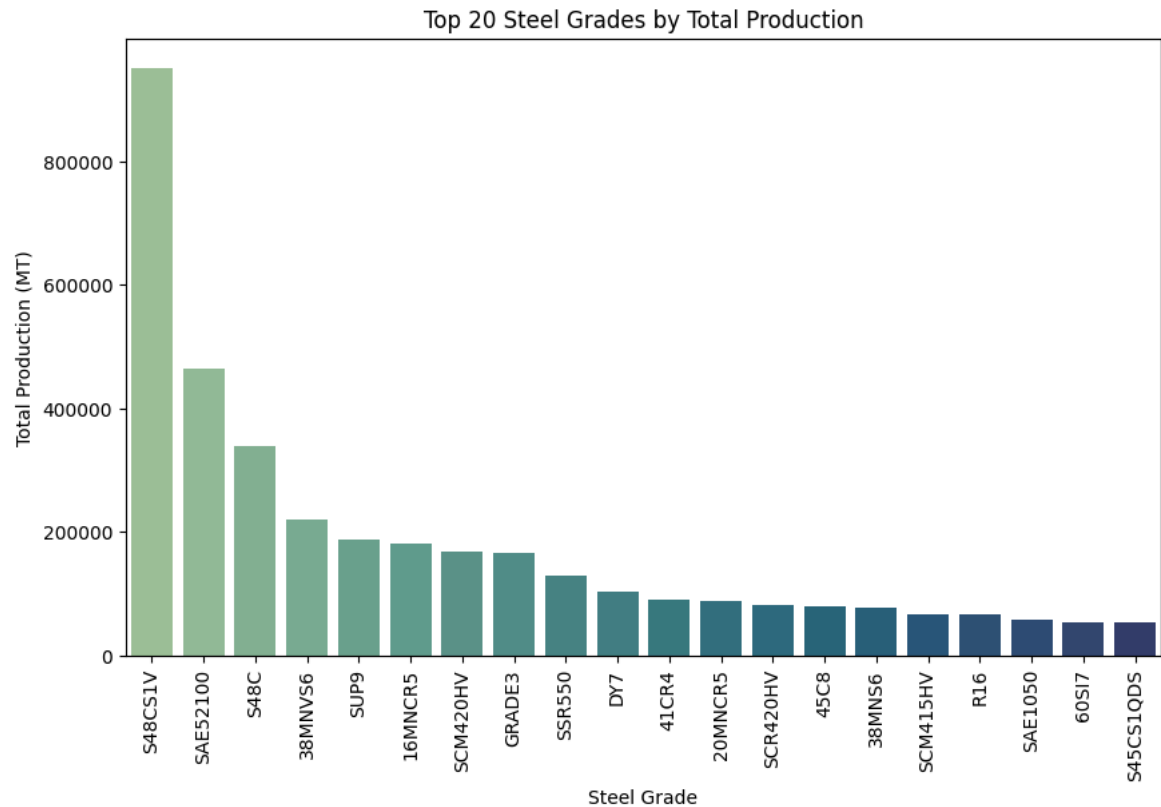
```
# Grade-wise Production Analysis
top_grades = merged_df.groupby('GRADE')['Production (MT)'].sum().nlargest(20).reset_index()

plt.figure(figsize=(10,6))
sns.barplot(data=top_grades, x='GRADE', y='Production (MT)', palette='crest')
plt.title("Top 20 Steel Grades by Total Production")
plt.xlabel("Steel Grade")
plt.ylabel("Total Production (MT)")
plt.xticks(rotation=90)
plt.show()
```

/tmp/ipython-input-881170174.py:4: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.barplot(data=top_grades, x='GRADE', y='Production (MT)', palette='crest')
```



```
import matplotlib.pyplot as plt

# Replace column name if necessary
grade_totals = merged_df.groupby('GRADE')['Production (MT)'].sum().sort_values(ascending=False)

# Top 10 grades
top10 = grade_totals.head(10)

# Combine the rest as "OTHERS"
others = grade_totals[10:].sum()

# Use concat instead of append
grade_summary = pd.concat([top10, pd.Series({'OTHERS': others})]).reset_index()

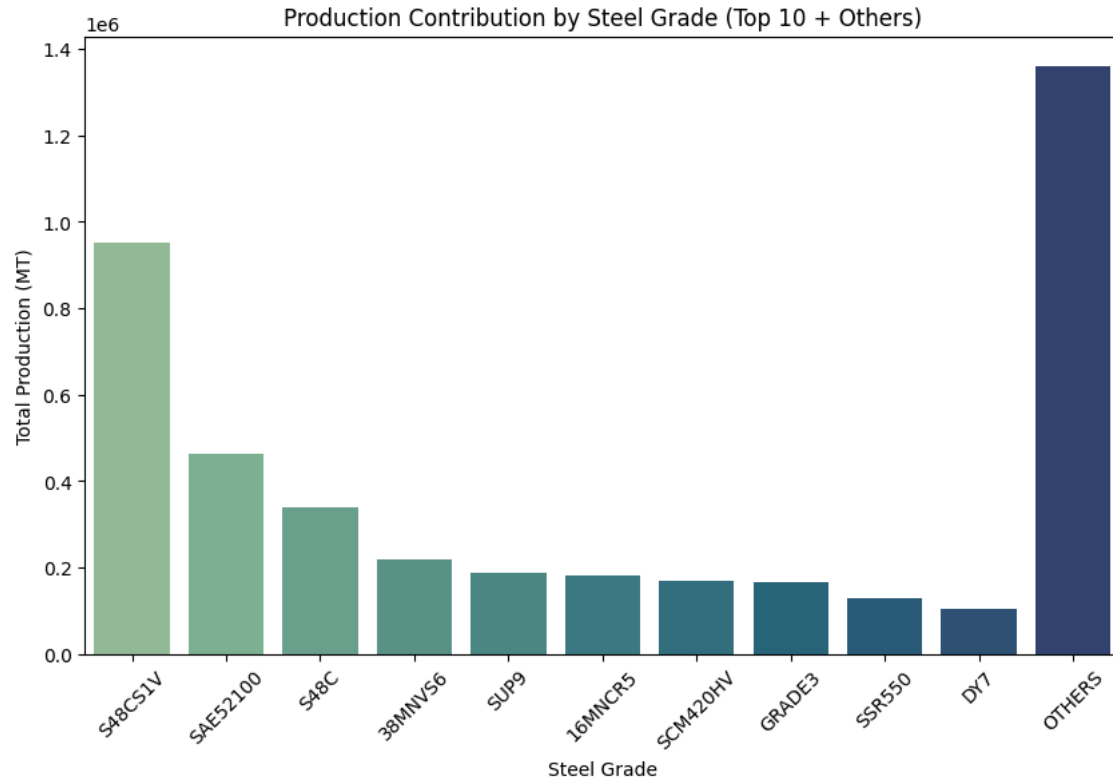
# Rename columns for plotting clarity
grade_summary.columns = ['GRADE', 'Production (MT)']

# Plot
plt.figure(figsize=(10,6))
sns.barplot(data=grade_summary, x='GRADE', y='Production (MT)', palette='crest')
plt.title("Production Contribution by Steel Grade (Top 10 + Others)")
plt.xlabel("Steel Grade")
plt.ylabel("Total Production (MT)")
plt.xticks(rotation=45)
plt.show()
```

/tmp/ipython-input-292851819.py:20: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.barplot(data=grade_summary, x='GRADE', y='Production (MT)', palette='crest')
```



# Product Mix Contribution

```
grade_share = merged_df.groupby('GRADE')['Production (MT)'].sum().nlargest(8)
```

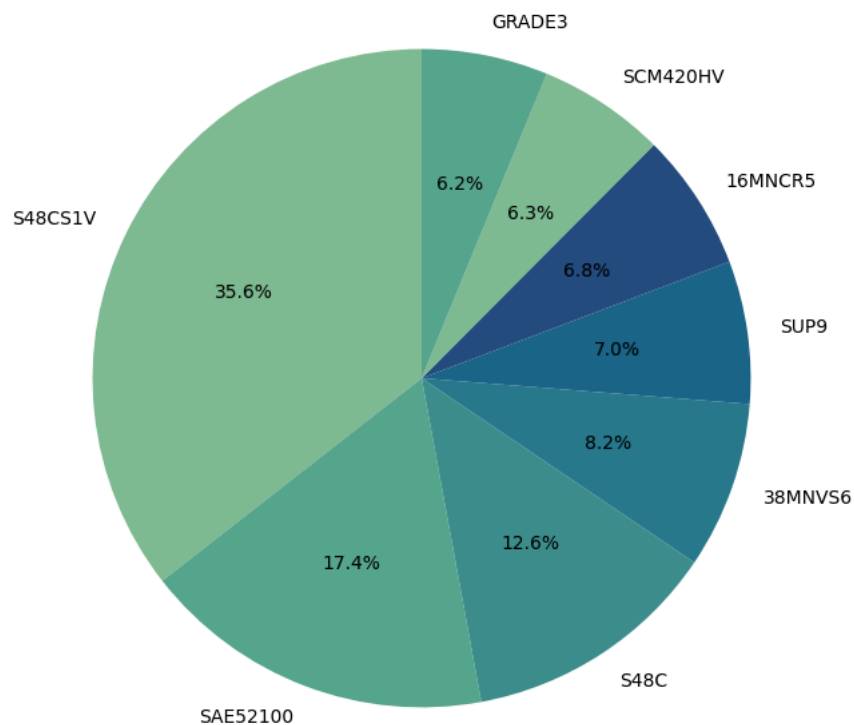
```
plt.figure(figsize=(8,8))
```

```
plt.pie(grade_share, labels=grade_share.index, autopct='%1.1f%%', startangle=90, colors=sns.color_palette('crest'))
```

```
plt.title("Production Share by Steel Grade (Top 8)")
```

```
plt.show()
```

**Production Share by Steel Grade (Top 8)**



```
# Grade vs LM_WT (Liquid Metal Weight)
# Step 1: Find top 10 grades by total production
top_grades = (
    merged_df.groupby('GRADE')['Production (MT)']
    .sum()
    .sort_values(ascending=False)
    .head(10)
    .index
)

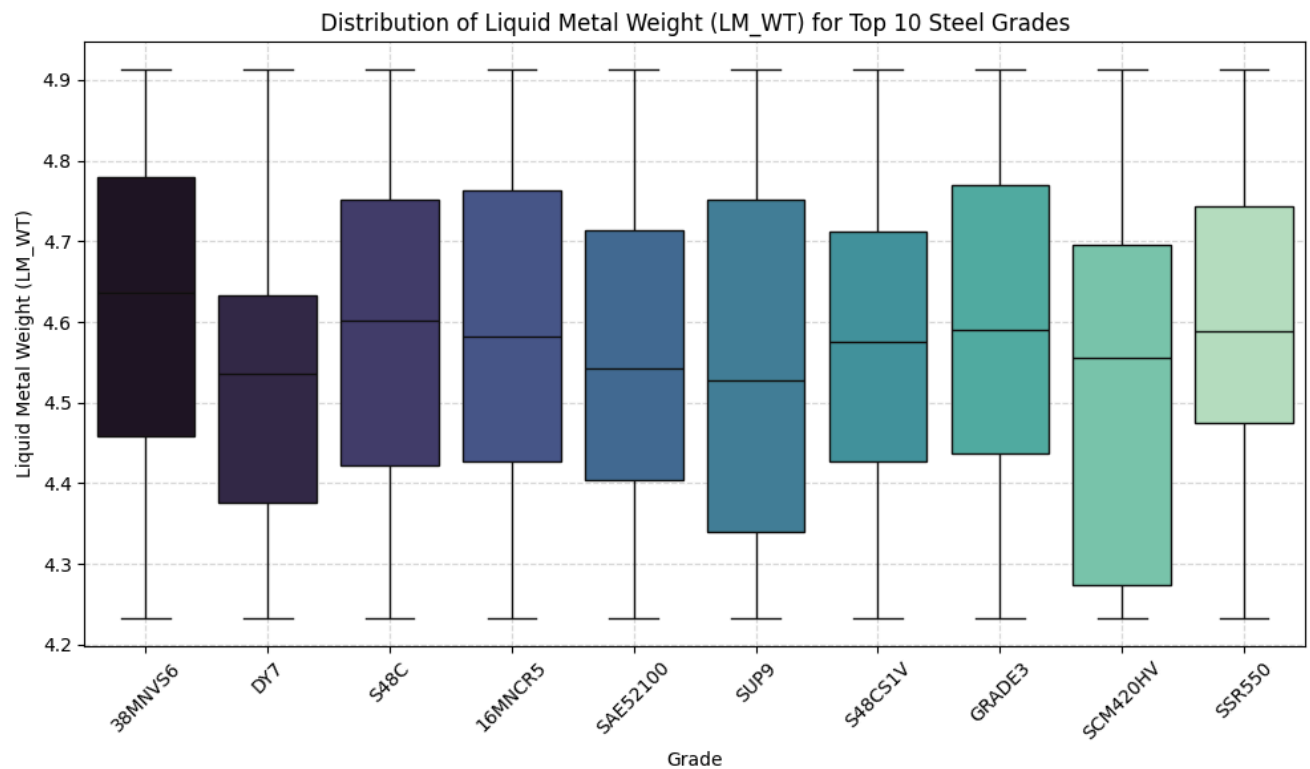
# Step 2: Filter dataset
filtered_df = merged_df[merged_df['GRADE'].isin(top_grades)]

# Step 3: Plot boxplot for only top 10 grades
plt.figure(figsize=(10,6))
sns.boxplot(data=filtered_df, x='GRADE', y='LM_WT', palette='mako')
plt.title("Distribution of Liquid Metal Weight (LM_WT) for Top 10 Steel Grades")
plt.xlabel("Grade")
plt.ylabel("Liquid Metal Weight (LM_WT)")
plt.xticks(rotation=45)
plt.grid(True, linestyle='--', alpha=0.5)
plt.tight_layout()
plt.show()
```

/tmp/ipython-input-3146541654.py:15: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.boxplot(data=filtered_df, x='GRADE', y='LM_WT', palette='mako')
```



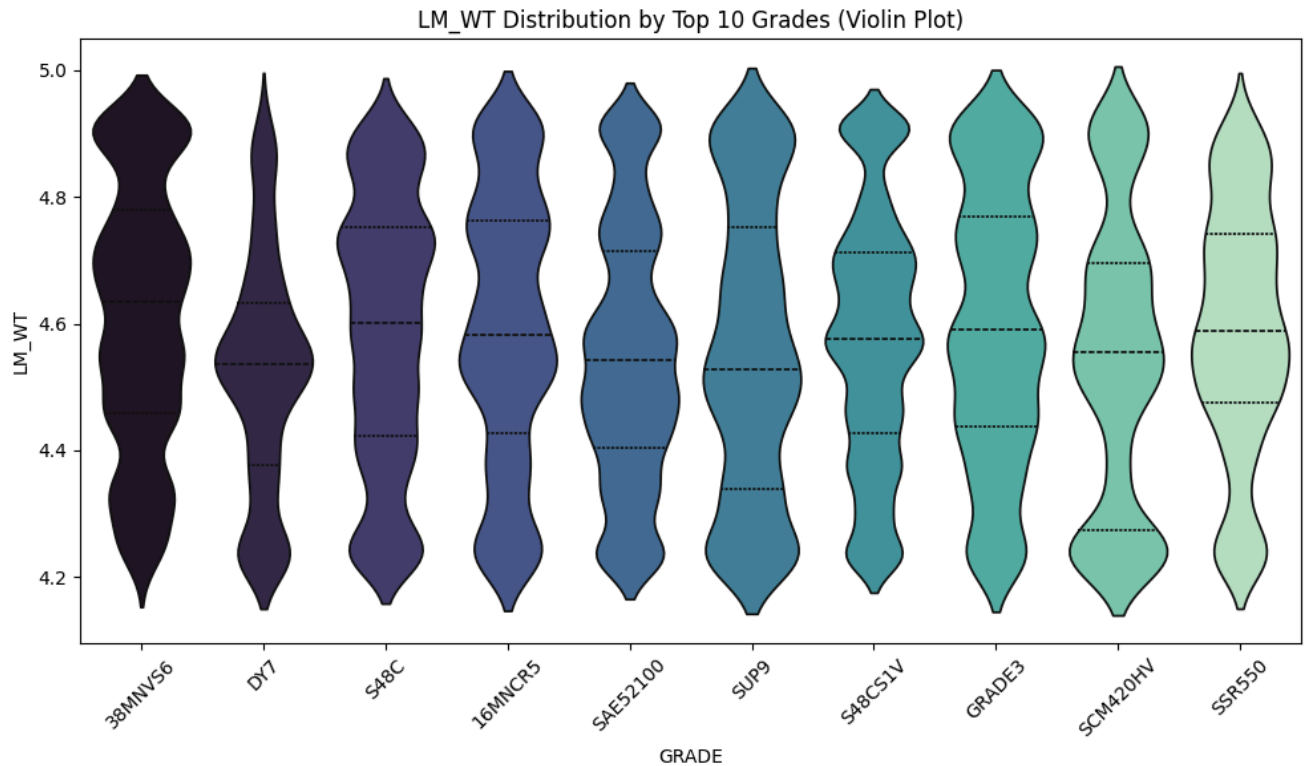
```
plt.figure(figsize=(10,6))
sns.violinplot(data=filtered_df, x='GRADE', y='LM_WT', palette='mako', inner='quartile')
plt.title("LM_WT Distribution by Top 10 Grades (Violin Plot)")
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```



/tmp/ipython-input-3317950946.py:2: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set

```
sns.violinplot(data=filtered_df, x='GRADE', y='LM_WT', palette='mako', inner='quartile')
```



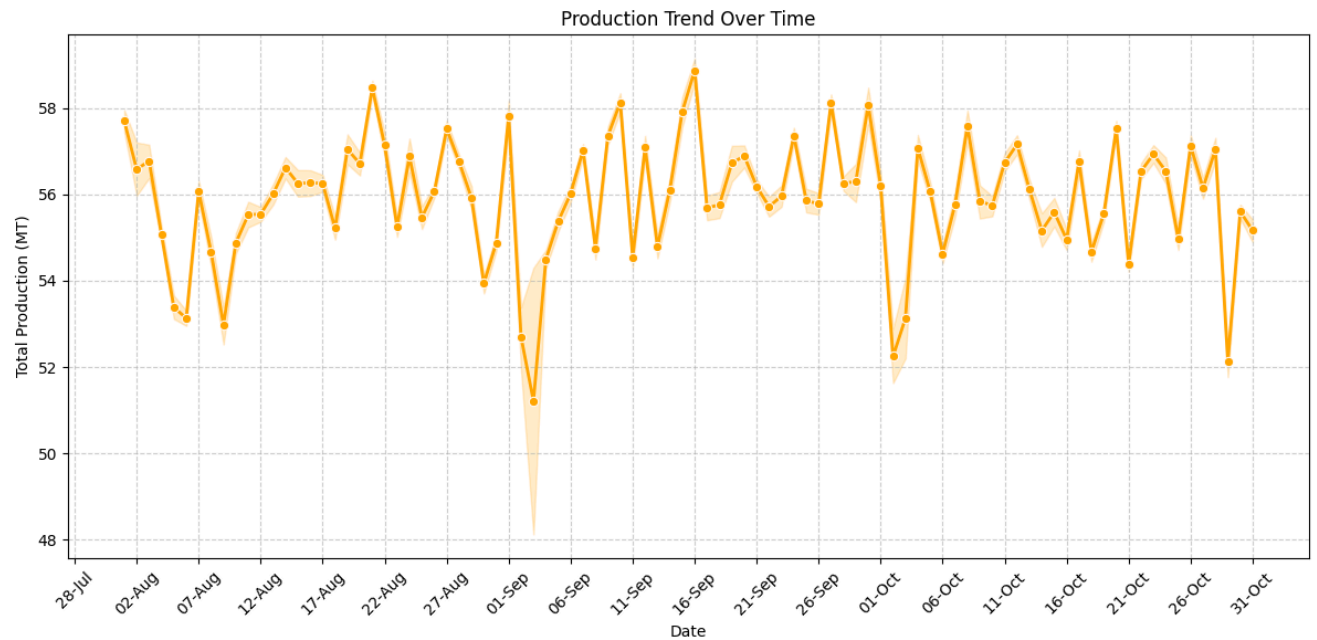
```
# Production Trend Over Time
import matplotlib.dates as mdates
```

```
plt.figure(figsize=(12,6))
sns.lineplot(data=merged_df, x='DATETIME', y='Production (MT)', marker='o', linewidth=2, color='orange')
```

```
plt.title("Production Trend Over Time")
plt.xlabel("Date")
plt.ylabel("Total Production (MT)")
```

```
# ☒ Force date ticks every 5 days
plt.gca().xaxis.set_major_locator(mdates.DayLocator(interval=5))
plt.gca().xaxis.set_major_formatter(mdates.DateFormatter('%d-%b'))
```

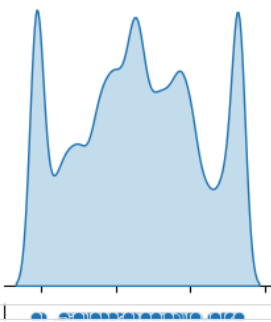
```
plt.grid(True, linestyle='--', alpha=0.6)
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```



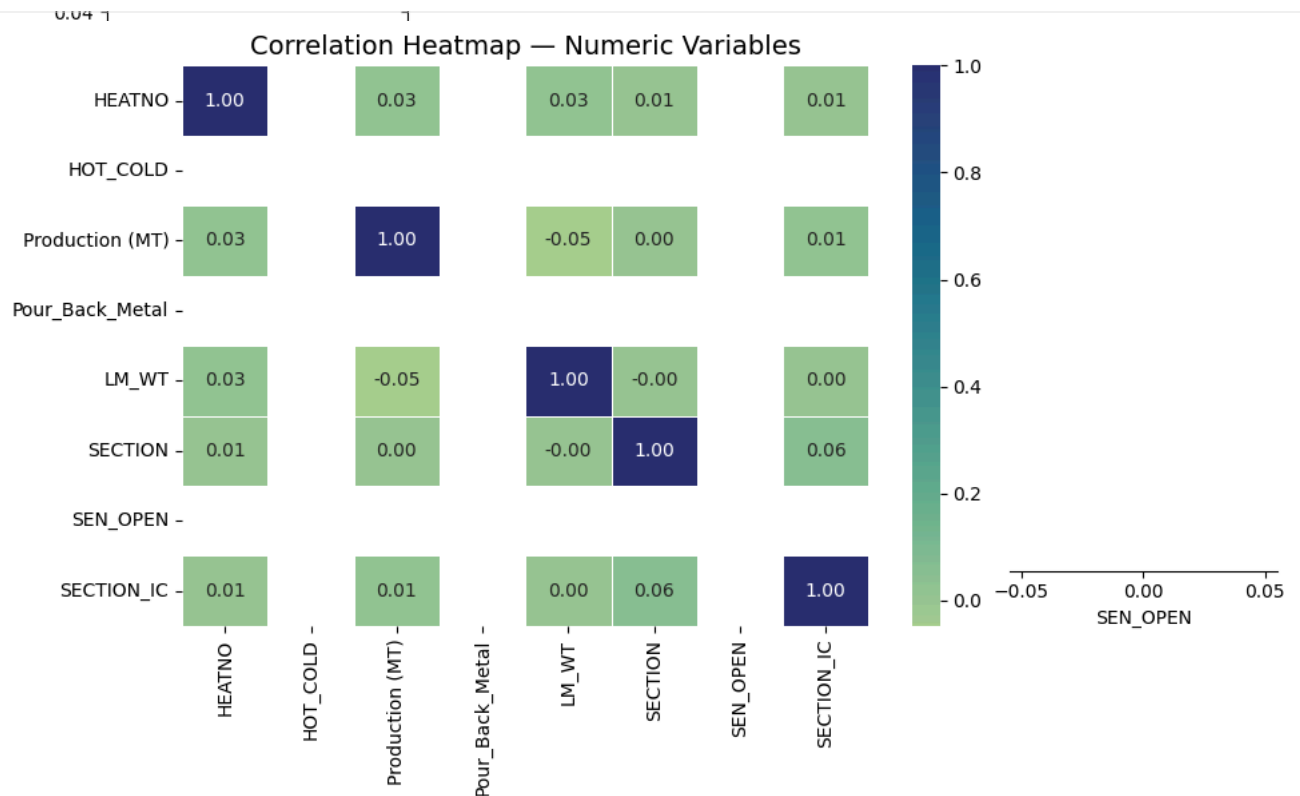
## Multi variant analysis

```
num_cols = ['LM_WT', 'Production (MT)', 'Pour_Back_Metal', 'SEN_OPEN']
sns.pairplot(merged_df[num_cols], diag_kind='kde', corner=True, plot_kws={'alpha':0.6})
plt.suptitle("Pairwise Relationship Among Key Numeric Variables", y=1.02)
plt.show()
```

## Pairwise Relationship Among Key Numeric Variables



```
plt.figure(figsize=(8,6))
sns.heatmap(
merged_df.corr(numeric_only=True),
annot=True,
cmap='crest',
fmt='.2f',
cbar=True,
linewidths=0.5
)
plt.title("Correlation Heatmap — Numeric Variables", fontsize=14)
plt.tight_layout()
plt.show()
```



Double-click (or enter) to edit

```
from mpl_toolkits.mplot3d import Axes3D

fig = plt.figure(figsize=(10,7))
ax = fig.add_subplot(111, projection='3d')

# Filter to remove zeros for visibility
filtered = merged_df[(merged_df['LM_WT'] > 0) & (merged_df['Production (MT)'] > 0)]

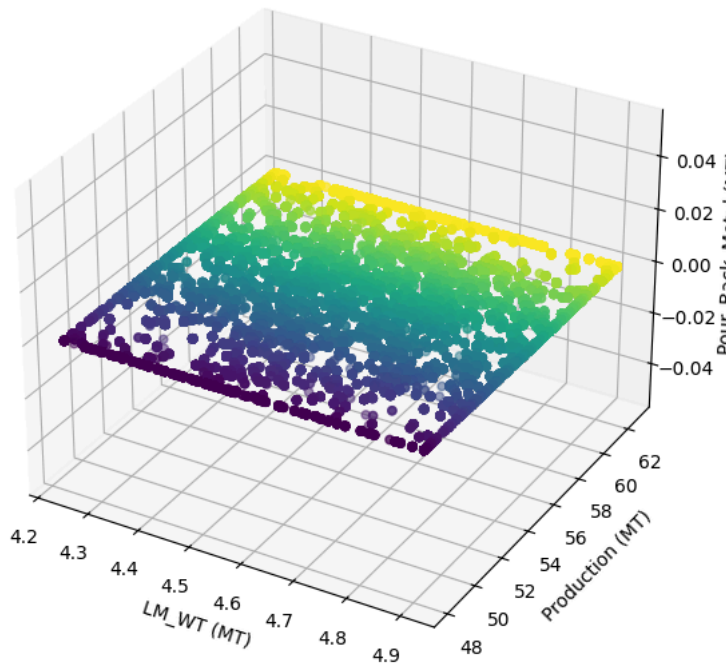
ax.scatter(
    filtered['LM_WT'],
    filtered['Production (MT)'],
    filtered['Pour_Back_Metal'],
    c=filtered['Production (MT)'],
    cmap='viridis',
    alpha=0.5,
    s=20
)
```

```

ax.set_xlabel("LM_WT (MT)")
ax.set_ylabel("Production (MT)")
ax.set_zlabel("Pour_Back_Metal (MT)")
ax.set_title("3D Relationship: LM_WT vs Production vs Pour_Back_Metal", pad=20)
plt.show()

```

3D Relationship: LM\_WT vs Production vs Pour\_Back\_Metal



```

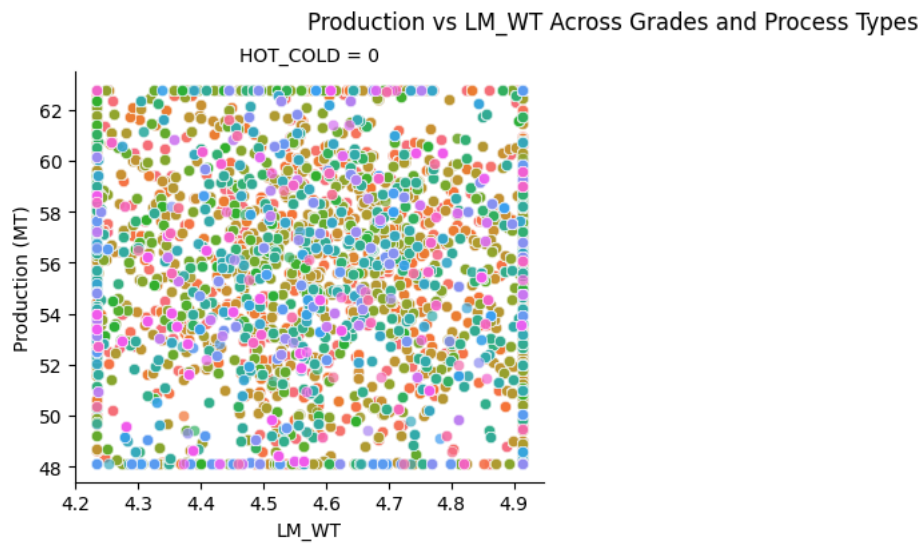
g = sns.FacetGrid(merged_df, col='HOT_COLD', hue='GRADE', col_wrap=2, height=4)
g.map(sns.scatterplot, 'LM_WT', 'Production (MT)', alpha=0.7)
g.add_legend()
g.fig.suptitle("Production vs LM_WT Across Grades and Process Types", y=1.03)
plt.show()

```



GRADE

- 38MNSIVS6
- AISI430L
- 38MNSIVS5
- C45
- 38MNV56
- SCM435
- AISI420
- DY7
- 52CRMOV4
- EN353
- 20MNCR5
- S45CS1V
- 42CRMOS4
- S48C
- 16MNCR5
- 34CRNIMO6
- SCR420HV
- SAE52100
- SAE1015
- SCM420HVI
- C60
- S55
- SAE1030
- 38B3
- 45CP3
- SAE8617H
- 36MNV56
- SUP9A
- S45CP3
- 10601C60
- SCM415H
- 41CR4
- S35C
- 100CR6
- EN8D
- SAE15B41
- SCM420H2V2
- SUP9
- S48CS1V
- S45C
- EN19
- SAE8650
- 16MNCR5H
- GRADE3
- SCM420H
- 12L14
- AISI410
- SAE9254
- GTD450
- S48CSS1V
- 34CRMO4
- 15B25
- EN9
- 94B17H
- SCM435H
- EN18D
- 35MN6MO3
- VS13113
- SCR420H
- SS400
- 60SICR8
- SCM415HV
- SCM420HV
- C45GPB
- SAE1541M
- S45CS1QDS
- 38MNS6
- AISI434MNH
- S53CG
- AISI435MOH
- 385MNV56
- EN19C
- 25MOCR4



- 20MOCR4
- 52CRMO2V
- 16MNCR5LSI
- 60SI7
- SAE8720M
- 56SICR7
- EN1A
- 266GRADE2
- SCR420
- 38MNV55
- SUP11A
- WSS340A2
- WSSMIA340A
- SCM420
- WSSMIA340
- SCM415
- SCM420HVC
- 46S20N
- VS13111
- 60SICR7
- SAE1050
- SAE8620H
- C43
- C15PBK
- SAE8720
- 15B41M
- R10S10U
- 2NI2CRMO
- EN8C
- SAE4140
- SSR550
- SAE15B41H
- ICSS1218
- 51CRV4
- S45CSQDS1
- GRADE2
- 44MNSIVS6
- C45MOD2
- 44MNSIVS6
- LF2
- 40CAD612PB
- R16
- SAE8620
- ST52
- C56E2
- C70S6
- C45R
- 16MNCR4H
- SA350LF2
- 16MNSCR4
- 42CRMO4
- S40C
- SA266
- 5150N
- 45C8
- C60K
- C10
- C38N
- C10C
- C38M
- SAE1141
- 25CRMO4
- SAE1548
- C40MOD2
- 40CR4B
- 40CR4C
- CF53
- SAE9310
- SUP11AM
- 430L
- EN52
- ASI434MO
- SUP6
- ASI434MO1
- N52

- SUP9M
- S25C
- 41CR4C
- VS14250
- 53CG
- S45CQDS
- SCM420IYM
- 16MNCR5D
- AISI1117
- ST523
- SAE4135H
- S35CP3
- SAE1018
- SAE1144
- 22MN6
- V252550
- C45RPB
- SCM420V
- Unknown
- C45RPBHH
- VS1311354
- AISI416
- AISI420VS
- AISI420VL
- 15B41
- S45CS1VQD
- E3250
- NITRAALLO
- 16MNCR5HH
- S53C
- SAE8319
- C15M
- SAE59254
- C70S6K
- X22
- C45MO
- S48CSIV
- S115C
- 36MNV54
- SCM420H3V2
- SCR420HN
- S15CP3
- SAE4135
- SAE5150
- 42CR4MO2
- 1541M
- UC1
- SAE94B17H
- S70CVS1
- 38MN2CR
- SCR415HM
- SCR415HN
- S43C
- SAE1541
- 40MNSIVS6
- B14
- AI434MO1
- AISI434MOI
- AISI434MOL
- 18MF5
- 350LF6
- 25MO2V
- SUP9AM
- SUP11
- C45MO2
- S48CS
- 44MN1VS6
- 27MNCRB5
- VS131135U
- 40MNV56
- SAE1117
- SAE1026
- SAE1040
- 52CR4MO2V
- 500N



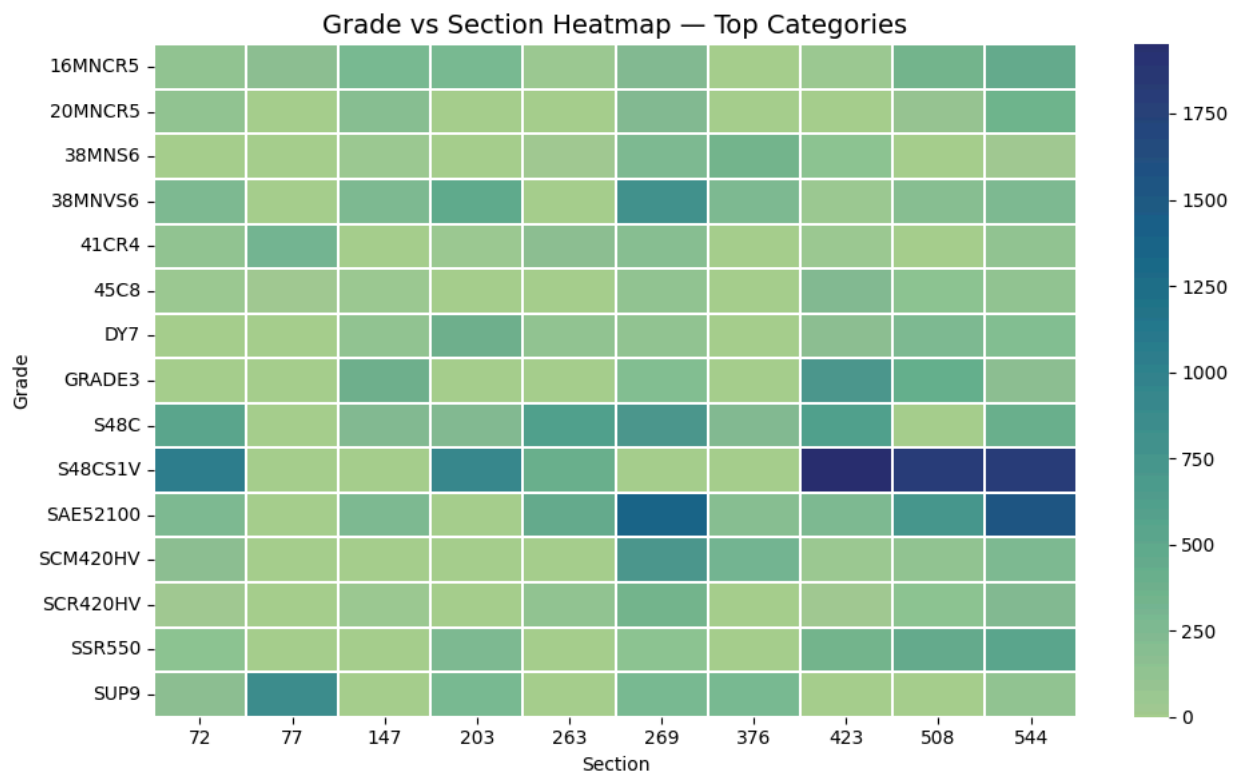
```
# Grade vs Section – Heatmap (Categorical Relationship)

# Use only top 15 grades & top 10 sections for clarity
top_grades = merged_df['GRADE'].value_counts().nlargest(15).index
top_sections = merged_df['SECTION'].value_counts().nlargest(10).index

subset_df = merged_df[
    (merged_df['GRADE'].isin(top_grades)) &
    (merged_df['SECTION'].isin(top_sections))
]

grade_section = pd.crosstab(subset_df['GRADE'], subset_df['SECTION'])

plt.figure(figsize=(10,6))
sns.heatmap(grade_section, cmap='crest', cbar=True, linewidths=0.3)
plt.title("Grade vs Section Heatmap – Top Categories", fontsize=14)
plt.xlabel("Section")
plt.ylabel("Grade")
plt.tight_layout()
plt.show()
```



```
# Grade vs Section – Heatmap (Categorical Relationship)

# Use only top 15 grades & top 10 sections for clarity
top_grades = merged_df['GRADE'].value_counts().nlargest(15).index
top_sections = merged_df['SECTION'].value_counts().nlargest(10).index

subset_df = merged_df[
    (merged_df['GRADE'].isin(top_grades)) &
    (merged_df['SECTION'].isin(top_sections))
]

grade_section = pd.crosstab(subset_df['GRADE'], subset_df['SECTION'])

plt.figure(figsize=(10,6))
sns.heatmap(grade_section, cmap='crest', cbar=True, linewidths=0.3)
plt.title("Grade vs Section Heatmap – Top Categories", fontsize=14)
plt.xlabel("Section")
plt.ylabel("Grade")
plt.tight_layout()
plt.show()
```