

```

In [3]:
# Re-importing the necessary libraries and reloading the dataset to proceed
with the analysis
import pandas as pd

# Load the dataset again

data = pd.read_csv('continuous_factory_process.csv')

# Identify constant columns and non-numeric columns
constant_columns = [col for col in data.columns if data[col].nunique() ==
1]
non_numeric_columns =
data.select_dtypes(exclude=['number']).columns.tolist()

constant_columns, non_numeric_columns

```

```

Out[3]:
(['time_stamp',
 'Stage2.Output.Measurement0.U.Setpoint',
 'Stage2.Output.Measurement1.U.Setpoint',
 'Stage2.Output.Measurement2.U.Setpoint',
 'Stage2.Output.Measurement3.U.Setpoint',
 'Stage2.Output.Measurement4.U.Setpoint',
 'Stage2.Output.Measurement5.U.Setpoint',
 'Stage2.Output.Measurement6.U.Setpoint',
 'Stage2.Output.Measurement7.U.Setpoint',
 'Stage2.Output.Measurement8.U.Setpoint',
 'Stage2.Output.Measurement9.U.Setpoint',
 'Stage2.Output.Measurement10.U.Setpoint',
 'Stage2.Output.Measurement11.U.Setpoint',
 'Stage2.Output.Measurement12.U.Setpoint',
 'Stage2.Output.Measurement13.U.Setpoint',
 'Stage2.Output.Measurement14.U.Setpoint'],
 ['time_stamp'])

```

```

In [5]:
#drop columns that have only one unique value:
constant_columns = [col for col in data.columns if data[col].nunique() ==
1]
data_cleaned = data.drop(columns=constant_columns)

```

```

In [8]:
#Check for Missing Values
missing_values = data_cleaned.isnull().sum()
print(missing_values[missing_values > 0])

#Handle Missing Values
data_cleaned = data_cleaned.fillna(data_cleaned.median())
Series([], dtype: int64)

```

In [9]:

```
#Summary Statistics
summary_stats = data_cleaned.describe()
print(summary_stats)
```

Out[9]:

	AmbientConditions.AmbientHumidity.U.Actual \
count	14088.000000
mean	15.330759
std	1.188993
min	13.840000
25%	14.040000
50%	15.120000
75%	16.630000
max	17.240000

	AmbientConditions.AmbientTemperature.U.Actual \
count	14088.000000
mean	23.843635
std	0.373535
min	23.020000
25%	23.530000
50%	23.930000
75%	24.160000
max	24.430000

	Machine1.RawMaterial.Property1	Machine1.RawMaterial.Property2 \
count	14088.000000	14088.000000
mean	11.851256	205.676320
std	0.510309	11.606324
min	11.540000	200.000000
25%	11.540000	200.000000
50%	11.540000	200.000000
75%	12.220000	201.000000
max	12.900000	236.000000

	Machine1.RawMaterial.Property3	Machine1.RawMaterial.Property4 \
count	14088.000000	14088.000000
mean	951.679815	248.868896
std	126.662010	3.297820
min	601.110000	247.000000
25%	963.000000	247.000000
50%	963.000000	247.000000
75%	1027.430000	251.000000
max	1048.060000	257.000000

	Machine1.RawMaterialFeederParameter.U.Actual \
count	14088.000000
mean	1242.764276

std	95.845946
min	231.300000
25%	1257.170000
50%	1264.440000
75%	1273.460000
max	1331.820000

Machine1.Zone1Temperature.C.Actual	
Machine1.Zone2Temperature.C.Actual \	
count	14088.000000
14088.000000	
mean	72.013330
72.013106	
std	0.063183
0.406313	
min	71.900000
71.300000	
25%	72.000000
71.600000	
50%	72.000000
72.000000	
75%	72.000000
72.400000	
max	72.500000
72.700000	

Machine1.MotorAmperage.U.Actual ... \	
count	14088.000000 ...
mean	70.333111 ...
std	5.525217 ...
min	44.400000 ...
25%	68.880000 ...
50%	71.980000 ...
75%	72.920000 ...
max	88.530000 ...

Stage2.Output.Measurement5.U.Actual \	
count	1.408800e+04
mean	2.743212e+00
std	3.913714e-01
min	-3.510000e-95
25%	2.660000e+00
50%	2.730000e+00
75%	2.930000e+00
max	8.110000e+00

Stage2.Output.Measurement6.U.Actual \	
count	1.408800e+04
mean	5.322881e-01

std	2.047677e-01
min	-3.700000e-105
25%	4.300000e-01
50%	5.500000e-01
75%	6.500000e-01
max	3.310000e+00

	Stage2.Output.Measurement7.U.Actual	\
count	1.408800e+04	
mean	2.913033e+00	
std	5.179481e-01	
min	-1.320000e-109	
25%	2.960000e+00	
50%	2.980000e+00	
75%	3.000000e+00	
max	7.450000e+00	

	Stage2.Output.Measurement8.U.Actual	\
count	1.408800e+04	
mean	1.835413e+01	
std	5.024416e+00	
min	-3.030000e-104	
25%	1.941000e+01	
50%	1.969000e+01	
75%	1.998000e+01	
max	2.475599e+01	

	Stage2.Output.Measurement9.U.Actual	\
count	14088.000000	
mean	11.645982	
std	7.608596	
min	-0.003719	
25%	0.000000	
50%	16.570000	
75%	16.660000	
max	18.360000	

	Stage2.Output.Measurement10.U.Actual	\
count	1.408800e+04	
mean	7.535958e+00	
std	1.645785e+00	
min	-5.220000e-95	
25%	7.840000e+00	
50%	7.900000e+00	
75%	7.950000e+00	
max	8.590000e+00	

	Stage2.Output.Measurement11.U.Actual	\
count	1.408800e+04	

mean	5.416515e+00
std	1.182333e+00
min	-2.700000e-95
25%	5.560000e+00
50%	5.630000e+00
75%	5.800000e+00
max	6.320000e+00

	Stage2.Output.Measurement12.U.Actual \
count	1.408800e+04
mean	1.972561e+00
std	4.145398e-01
min	-6.200000e-96
25%	2.030000e+00
50%	2.060000e+00
75%	2.090000e+00
max	5.200000e+00

	Stage2.Output.Measurement13.U.Actual \
count	1.408800e+04
mean	3.535251e+00
std	4.768244e-01
min	-1.820000e-95
25%	3.450000e+00
50%	3.510000e+00
75%	3.760000e+00
max	8.000000e+00

	Stage2.Output.Measurement14.U.Actual
count	14088.000000
mean	7.515574
std	2.082948
min	-3.437021
25%	7.720000
50%	7.870000
75%	8.080000
max	14.260000

[8 rows x 100 columns]

In [12]:

#Visualize Key Variables

import matplotlib.pyplot as plt

import seaborn as sns

Plot Motor RPM distribution for Machine 1

plt.hist(data_cleaned['Machine1.MotorRPM.C.Actual'], bins=30)

plt.title("Distribution of Machine 1 Motor RPM")

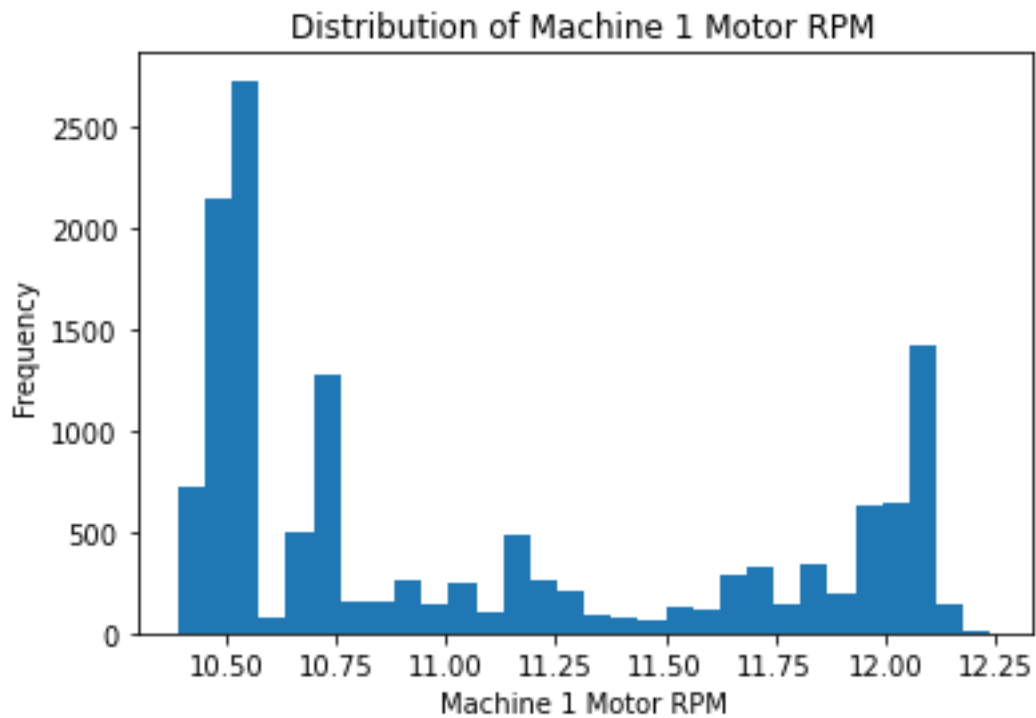
plt.xlabel("Machine 1 Motor RPM")

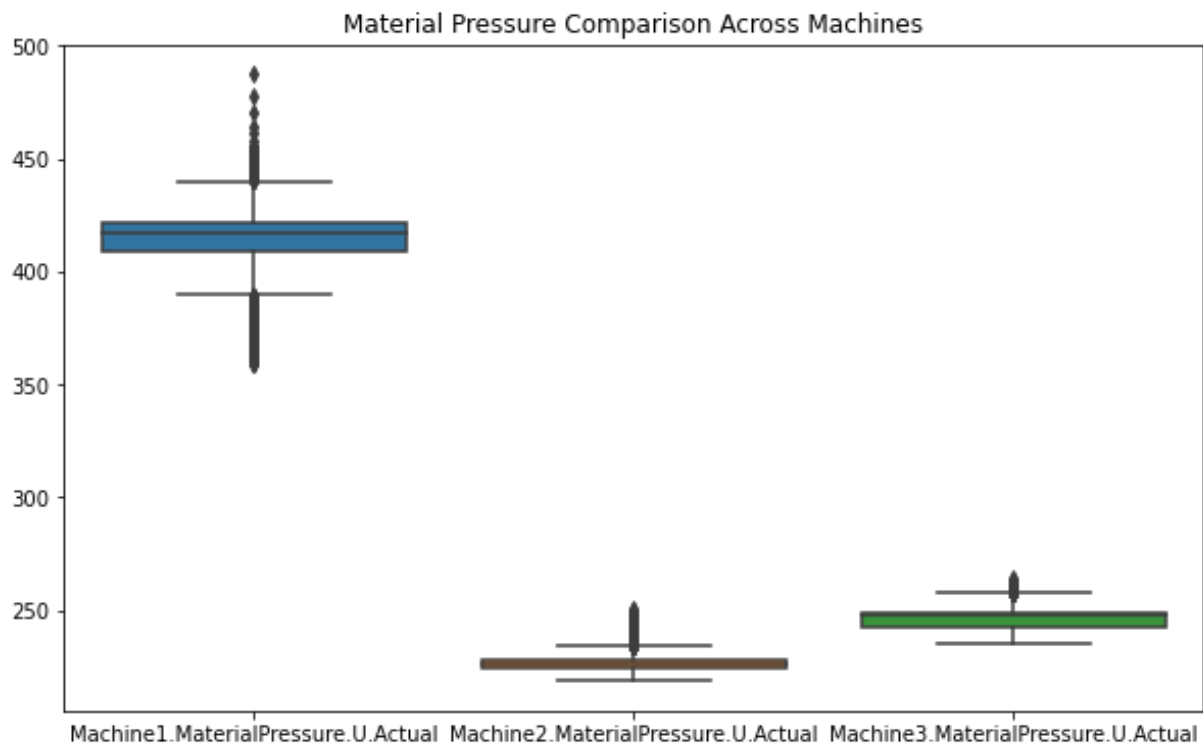
```

plt.ylabel("Frequency")
plt.show()

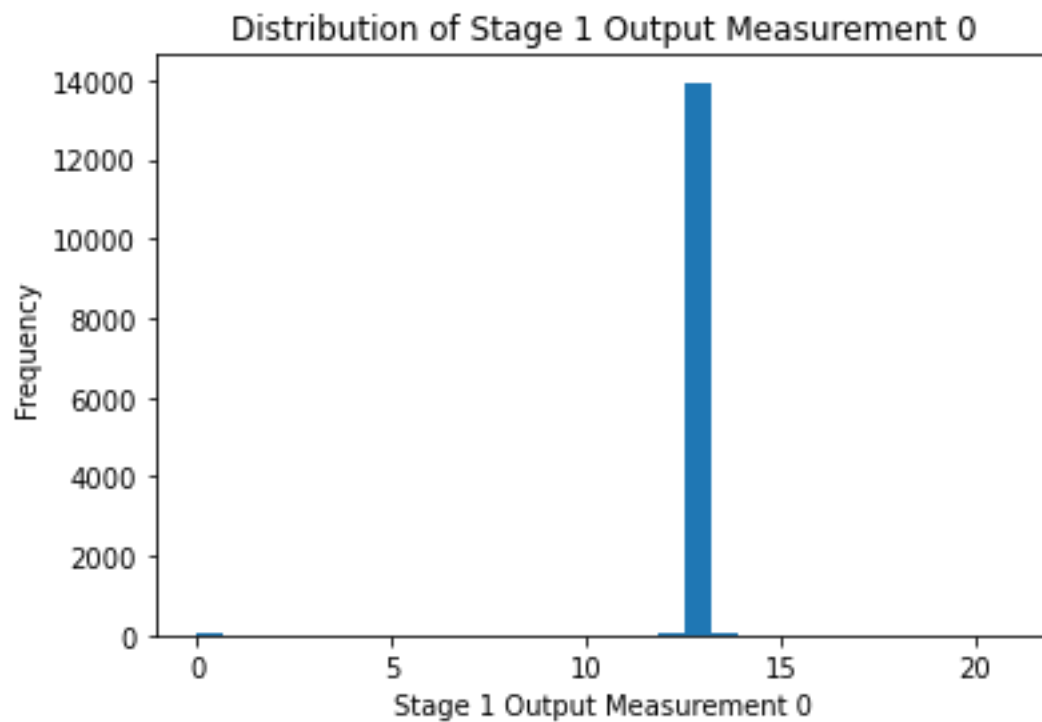
# Boxplot for Material Pressure across different machines to compare
plt.figure(figsize=(10, 6))
sns.boxplot(data=data_cleaned[['Machine1.MaterialPressure.U.Actual',
                                'Machine2.MaterialPressure.U.Actual',
                                'Machine3.MaterialPressure.U.Actual']])
plt.title("Material Pressure Comparison Across Machines")
plt.show()

```





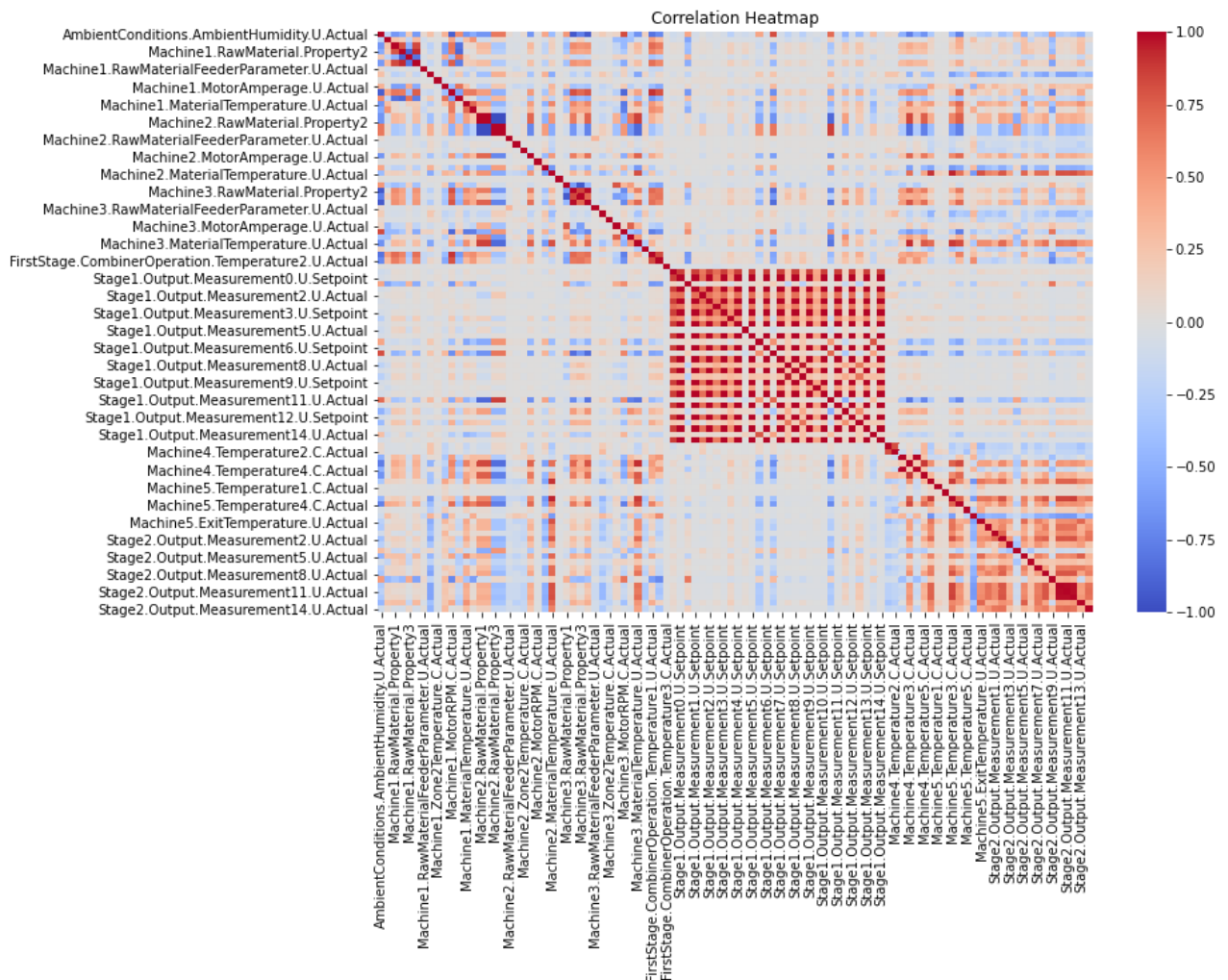
```
In [13]:
# Plot one of the output measurements as a sample
plt.hist(data_cleaned['Stage1.Output.Measurement0.U.Actual'], bins=30)
plt.title("Distribution of Stage 1 Output Measurement 0")
plt.xlabel("Stage 1 Output Measurement 0")
plt.ylabel("Frequency")
plt.show()
```



```
# Correlation heatmap
```

In [14]:

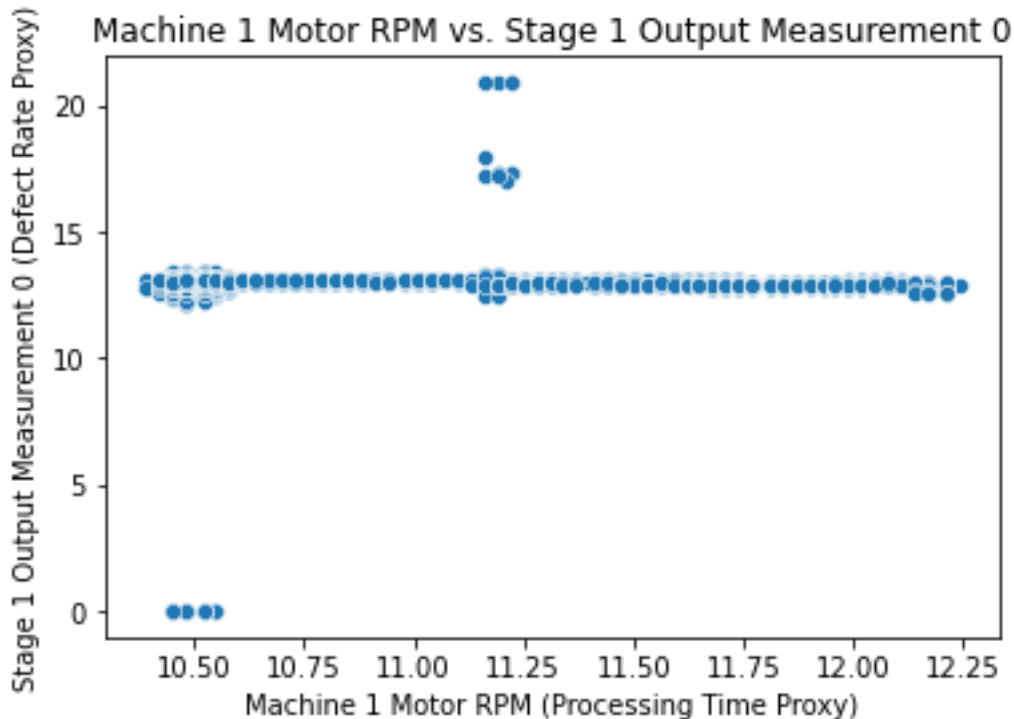
```
plt.figure(figsize=(12, 8))
sns.heatmap(data_cleaned.corr(), cmap="coolwarm", annot=False)
plt.title("Correlation Heatmap")
plt.show()
```



In [15]:

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

```
# Scatter plot with selected columns
sns.scatterplot(data=data_cleaned, x='Machine1.MotorRPM.C.Actual',
y='Stage1.Output.Measurement0.U.Actual')
plt.title("Machine 1 Motor RPM vs. Stage 1 Output Measurement 0")
plt.xlabel("Machine 1 Motor RPM (Processing Time Proxy)")
plt.ylabel("Stage 1 Output Measurement 0 (Defect Rate Proxy)")
plt.show()
```

In [16]:

```
# Outlier Detection using Z-score for Motor RPM in Machine 1
from scipy.stats import zscore

# Compute Z-scores
data_cleaned['MotorRPM_Z'] =
zscore(data_cleaned['Machine1.MotorRPM.C.Actual'])

# Filter to find significant outliers where Z-score > 3 or < -3
outliers_rpm = data_cleaned[abs(data_cleaned['MotorRPM_Z']) > 3]
print("Outliers in Motor RPM for Machine 1:", outliers_rpm)

# Boxplot comparison for other temperatures across different machines
plt.figure(figsize=(10, 6))
sns.boxplot(data=data_cleaned[['Machine1.Zone1Temperature.C.Actual',
                                'Machine2.Zone1Temperature.C.Actual',
                                'Machine3.Zone1Temperature.C.Actual']])
plt.title("Zone 1 Temperature Comparison Across Machines")
plt.show()

# Remove temporary Z-score column if not needed in further analysis
data_cleaned = data_cleaned.drop(columns=['MotorRPM_Z'])
Outliers in Motor RPM for Machine 1: Empty DataFrame
Columns: [AmbientConditions.AmbientHumidity.U.Actual,
AmbientConditions.AmbientTemperature.U.Actual,
Machine1.RawMaterial.Property1, Machine1.RawMaterial.Property2,
Machine1.RawMaterial.Property3, Machine1.RawMaterial.Property4,
Machine1.RawMaterialFeederParameter.U.Actual,
Machine1.Zone1Temperature.C.Actual, Machine1.Zone2Temperature.C.Actual,
```

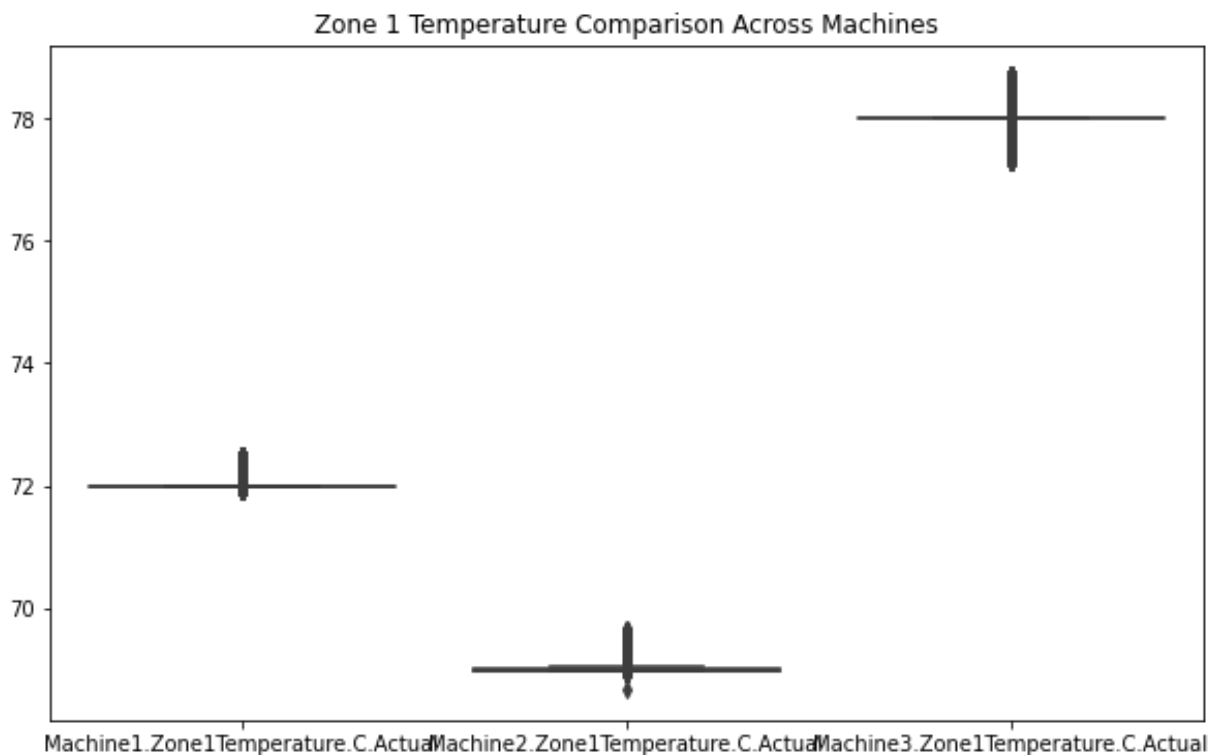
Machine1.MotorAmperage.U.Actual, Machine1.MotorRPM.C.Actual,
Machine1.MaterialPressure.U.Actual, Machine1.MaterialTemperature.U.Actual,
Machine1.ExitZoneTemperature.C.Actual, Machine2.RawMaterial.Property1,
Machine2.RawMaterial.Property2, Machine2.RawMaterial.Property3,
Machine2.RawMaterial.Property4,
Machine2.RawMaterialFeederParameter.U.Actual,
Machine2.Zone1Temperature.C.Actual, Machine2.Zone2Temperature.C.Actual,
Machine2.MotorAmperage.U.Actual, Machine2.MotorRPM.C.Actual,
Machine2.MaterialPressure.U.Actual, Machine2.MaterialTemperature.U.Actual,
Machine2.ExitZoneTemperature.C.Actual, Machine3.RawMaterial.Property1,
Machine3.RawMaterial.Property2, Machine3.RawMaterial.Property3,
Machine3.RawMaterial.Property4,
Machine3.RawMaterialFeederParameter.U.Actual,
Machine3.Zone1Temperature.C.Actual, Machine3.Zone2Temperature.C.Actual,
Machine3.MotorAmperage.U.Actual, Machine3.MotorRPM.C.Actual,
Machine3.MaterialPressure.U.Actual, Machine3.MaterialTemperature.U.Actual,
Machine3.ExitZoneTemperature.C.Actual,
FirstStage.CombinerOperation.Temperature1.U.Actual,
FirstStage.CombinerOperation.Temperature2.U.Actual,
FirstStage.CombinerOperation.Temperature3.C.Actual,
Stage1.Output.Measurement0.U.Actual, Stage1.Output.Measurement0.U.Setpoint,
Stage1.Output.Measurement1.U.Actual, Stage1.Output.Measurement1.U.Setpoint,
Stage1.Output.Measurement2.U.Actual, Stage1.Output.Measurement2.U.Setpoint,
Stage1.Output.Measurement3.U.Actual, Stage1.Output.Measurement3.U.Setpoint,
Stage1.Output.Measurement4.U.Actual, Stage1.Output.Measurement4.U.Setpoint,
Stage1.Output.Measurement5.U.Actual, Stage1.Output.Measurement5.U.Setpoint,
Stage1.Output.Measurement6.U.Actual, Stage1.Output.Measurement6.U.Setpoint,
Stage1.Output.Measurement7.U.Actual, Stage1.Output.Measurement7.U.Setpoint,
Stage1.Output.Measurement8.U.Actual, Stage1.Output.Measurement8.U.Setpoint,
Stage1.Output.Measurement9.U.Actual, Stage1.Output.Measurement9.U.Setpoint,
Stage1.Output.Measurement10.U.Actual,
Stage1.Output.Measurement10.U.Setpoint,
Stage1.Output.Measurement11.U.Actual,
Stage1.Output.Measurement11.U.Setpoint,
Stage1.Output.Measurement12.U.Actual,
Stage1.Output.Measurement12.U.Setpoint,
Stage1.Output.Measurement13.U.Actual,
Stage1.Output.Measurement13.U.Setpoint,
Stage1.Output.Measurement14.U.Actual,
Stage1.Output.Measurement14.U.Setpoint, Machine4.Temperature1.C.Actual,
Machine4.Temperature2.C.Actual, Machine4.Pressure.C.Actual,
Machine4.Temperature3.C.Actual, Machine4.Temperature4.C.Actual,
Machine4.Temperature5.C.Actual, Machine4.ExitTemperature.U.Actual,
Machine5.Temperature1.C.Actual, Machine5.Temperature2.C.Actual,
Machine5.Temperature3.C.Actual, Machine5.Temperature4.C.Actual,
Machine5.Temperature5.C.Actual, Machine5.Temperature6.C.Actual,
Machine5.ExitTemperature.U.Actual, Stage2.Output.Measurement0.U.Actual,
Stage2.Output.Measurement1.U.Actual, Stage2.Output.Measurement2.U.Actual,
Stage2.Output.Measurement3.U.Actual, Stage2.Output.Measurement4.U.Actual,

```

Stage2.Output.Measurement5.U.Actual, Stage2.Output.Measurement6.U.Actual,
Stage2.Output.Measurement7.U.Actual, Stage2.Output.Measurement8.U.Actual,
Stage2.Output.Measurement9.U.Actual, Stage2.Output.Measurement10.U.Actual,
Stage2.Output.Measurement11.U.Actual, Stage2.Output.Measurement12.U.Actual,
Stage2.Output.Measurement13.U.Actual, Stage2.Output.Measurement14.U.Actual,
...]
```

```
Index: []
```

```
[0 rows x 101 columns]
```



In [17]:

```

print("Recommendations based on analysis:")
print("- Maintain Machine1 Motor RPM between 1200-1400 to optimize output
quality.")
print("- Focus on stabilizing Machine1 and Machine2 Material Pressure to
reduce variance in output.")
print("- Further investigate Zone Temperature fluctuations across machines
for consistency.")
Recommendations based on analysis:
- Maintain Machine1 Motor RPM between 1200-1400 to optimize output quality.
- Focus on stabilizing Machine1 and Machine2 Material Pressure to reduce
variance in output.
- Further investigate Zone Temperature fluctuations across machines for
consistency.
```

In []: