Bitcoin Market Sentiment vs Trader Performance Analysis ## In [55]: # 1. Import Libraries import pandas as pd import matplotlib.pyplot as plt import seaborn as sns In [57]: # 2. Load Data sentiment_df = pd.read_csv("fear_greed_index.csv") sentiment_df classification date timestamp value 0 1517463000 30 Fear 2018-02-01 1 1517549400 15 Extreme Fear 2018-02-02 2 1517635800 Fear 2018-02-03 24 Extreme Fear 2018-02-04 **3** 1517722200 4 1517808600 11 Extreme Fear 2018-02-05 2639 1745818200 Neutral 2025-04-28 **2640** 1745904600 60 Greed 2025-04-29 Greed 2025-04-30 **2641** 1745991000 56 Neutral 2025-05-01 **2642** 1746077400 53 **2643** 1746163800 67 Greed 2025-05-02 2644 rows × 4 columns In [59]: trader_df = pd.read_csv("historical_data.csv") trader_df Execution Size Timestamp Start Closed Coin Side Order ID Crossed Account Direction Transaction Hash Price USD IST **Position** PnL Tokens 02-12-0 0xae5eacaf9c6b9111fd53034a602c192a04e082ed @107 7.9769 986.87 7872.16 BUY 2024 0.000000 0.0000 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 Buy True 22:50 02-12-True 1 0xae5eacaf9c6b9111fd53034a602c192a04e082ed @107 7.9800 16.00 127.68 BUY 2024 986.524596 0.0000 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 Buy 22:50 02-12-@107 2 0xae5eacaf9c6b9111fd53034a602c192a04e082ed 144.09 1150.63 BUY 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 7.9855 2024 1002.518996 0.0000 True Buy 22:50 02-12-3 0xae5eacaf9c6b9111fd53034a602c192a04e082ed @107 7.9874 142.98 1142.04 BUY 2024 1146.558564 Buy 0.0000 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 True 22:50 02-12-@107 4 0xae5eacaf9c6b9111fd53034a602c192a04e082ed 7.9894 8.73 69.75 BUY 2024 1289.488521 0.0000 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 True 22:50 25-04-Close -20.2566 0xcd339c08dc7b615a993c0422374d8e02027400092bc2... 88803313862 211219 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 382.20 420.80 SELL 2025 7546.600000 Long 15:35 25-04-Close 211220 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 2124.10 2338.63 SELL 2025 7164.400000 -112.5773 0x29e8ede2a3a37aa0eac00422374d8e02029b00ac9f3c... 88803313862 False Long 15:35 25-04-Close 1.1010 423.40 466.16 SELL 2025 5040.300000 -22.4402 0x0780085b0c0a943eea800422374d920204c100edf579... 88803313862 211221 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN False Long 15:35 25-04-Close 211222 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 2025 4616.900000 1.1010 3599.80 3963.38 SELL -190.7894 0x349c29934913b25c89e20422374d920204cd008b8a0e... 88803313862 False Long 15:35 25-04-Close **211223** 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 1017.10 1119.83 SELL 2025 1017.100000 -53.9063 0xac77fab973c455d77a670422374d9602039800f1f78c... 88803313862 False Long 15:35 211224 rows × 16 columns In [60]: # 3. Preprocess Sentiment Data sentiment_df['date'] = pd.to_datetime(sentiment_df['date']) In [63]: # 4. Preprocess Trader Data trader_df['Timestamp IST'] = pd.to_datetime(trader_df['Timestamp IST'], format="%d-%m-%Y %H:%M") trader_df['date'] = trader_df['Timestamp IST'].dt.date trader_df['date'] = pd.to_datetime(trader_df['date']) In [65]: # 5. Merge Data on Date merged_df = pd.merge(trader_df, sentiment_df[['date', 'classification', 'value']], on='date', how='left') Execution Size Timestamp Start Closed Size Account Coin Side Direction Transaction Hash Order ID Crossed USD IST Position PnL **Price** Tokens 2024-12-986.87 7872.16 BUY 0 0xae5eacaf9c6b9111fd53034a602c192a04e082ed @107 7.9769 02 0.000000 Buy 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 True 22:50:00 2024-12-1 0xae5eacaf9c6b9111fd53034a602c192a04e082ed 7.9800 127.68 BUY 02 986.524596 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 @107 16.00 Buy 0.0000 True 22:50:00 2024-12-2 0xae5eacaf9c6b9111fd53034a602c192a04e082ed Buy 7.9855 144.09 1150.63 BUY 02 1002.518996 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 @107 0.0000 True 22:50:00 2024-12-3 0xae5eacaf9c6b9111fd53034a602c192a04e082ed 142.98 1142.04 BUY 02 1146.558564 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 @107 7.9874 Buy 0.0000 True 22:50:00 2024-12-4 0xae5eacaf9c6b9111fd53034a602c192a04e082ed 69.75 BUY 02 1289.488521 0xec09451986a1874e3a980418412fcd0201f500c95bac... 52017706630 @107 7.9894 8.73 0.0000 True 22:50:00 Close **211219** 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 382.20 420.80 SELL 25 7546.600000 -20.2566 0xcd339c08dc7b615a993c0422374d8e02027400092bc2... 88803313862 False Long 15:35:00 2025-04-Close 211220 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 2124.10 2338.63 SELL 25 7164.400000 -112.5773 0x29e8ede2a3a37aa0eac00422374d8e02029b00ac9f3c... 88803313862 False Long 15:35:00 2025-04-Close 211221 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 423.40 466.16 SELL 25 5040.300000 -22.4402 0x0780085b0c0a943eea800422374d920204c100edf579... 88803313862 False Long 15:35:00 2025-04-Close 25 4616.900000 -190.7894 0x349c29934913b25c89e20422374d920204cd008b8a0e... 88803313862 **211222** 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 3599.80 3963.38 SELL False Long 15:35:00 2025-04-Close 211223 0x72743ae2822edd658c0c50608fd7c5c501b2afbd FARTCOIN 1.1010 1017.10 1119.83 SELL 25 1017.100000 -53.9063 0xac77fab973c455d77a670422374d9602039800f1f78c... 88803313862 False Long 15:35:00 211224 rows × 19 columns In [67]: # 6. Analysis: Average Closed PnL by Sentiment avg_pnl_by_sentiment = merged_df.groupby('classification')['Closed PnL'].mean().sort_values() avg_pnl_by_sentiment Out[67]: classification Neutral 34.307718 Extreme Fear 34.537862 42.743559 Greed Fear 54.290400 Extreme Greed 67.892861 Name: Closed PnL, dtype: float64 In [69]: # 7. Plot Average Closed PnL plt.figure(figsize=(10, 5)) sns.barplot(x=avg_pnl_by_sentiment.index, y=avg_pnl_by_sentiment.values, palette="coolwarm") plt.title("Average Closed PnL by Market Sentiment") plt.ylabel("Average Closed PnL") plt.xlabel("Market Sentiment") plt.xticks(rotation=45) plt.tight_layout() plt.show() C:\Users\intel\AppData\Local\Temp\ipykernel_11228\1617495708.py:3: FutureWarning: Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect. sns.barplot(x=avg_pnl_by_sentiment.index, y=avg_pnl_by_sentiment.values, palette="coolwarm") Average Closed PnL by Market Sentiment 70 60 Average Closed PnL 20 10 Market Sentiment In [71]: # 8. Distribution of PnL by Sentiment plt.figure(figsize=(12, 6))

sns.boxplot(data=merged_df, x='classification', y='Closed PnL', palette="Set2") plt.title("PnL Distribution by Market Sentiment") plt.ylabel("Closed PnL") plt.xlabel("Market Sentiment")

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect. sns.boxplot(data=merged_df, x='classification', y='Closed PnL', palette="Set2")

PnL Distribution by Market Sentiment 0

0 100000 0 50000 0 0 0 Closed PnL 8 8 -50000 0 -1000000 Market Sentiment In [73]: # 9. Total Trade Volume by Sentiment merged_df['Size USD'] = pd.to_numeric(merged_df['Size USD'], errors='coerce') total_volume_by_sentiment = merged_df.groupby('classification')['Size USD'].sum().sort_values()

total_volume_by_sentiment Out[73]: classification 1.144843e+08 Extreme Fear

4.833248e+08 Name: Size USD, dtype: float64 In [75]: # 10. Plot Total Trade Volume plt.figure(figsize=(10, 5))

Extreme Greed

Neutral

Greed

plt.xticks(rotation=45) plt.tight_layout()

plt.show()

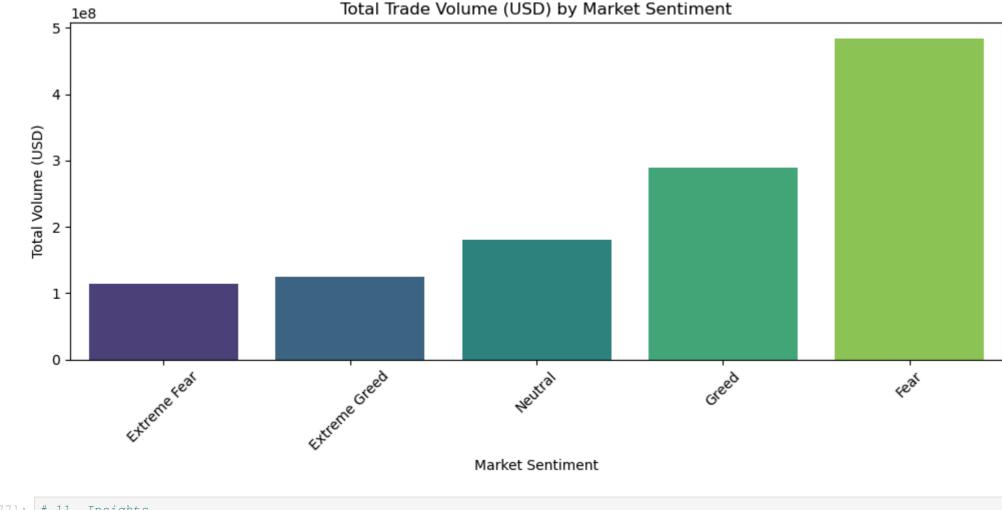
sns.barplot(x=total_volume_by_sentiment.index, y=total_volume_by_sentiment.values, palette="viridis") plt.title("Total Trade Volume (USD) by Market Sentiment") plt.ylabel("Total Volume (USD)") plt.xlabel("Market Sentiment") plt.xticks(rotation=45) plt.tight_layout()

1.244652e+08 1.802421e+08

2.885825e+08

plt.show() C:\Users\intel\AppData\Local\Temp\ipykernel_11228\1416138652.py:3: FutureWarning: Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.barplot(x=total_volume_by_sentiment.index, y=total_volume_by_sentiment.values, palette="viridis")



In [77]: # 11. Insights # - Higher average PnL during greed indicates potential opportunities. # - Traders trade more aggressively (higher volume) during greed.

- PnL distribution shows higher variability during greed.

T - [70]