Prime Trade AI - Data Science Assignment Report

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1. Executive Summary

- Briefly state the goal: analyze trader behavior vs market sentiment.
- Highlight **top insights**: e.g., traders tend to take higher risk during Greed periods, Fear periods correlate with conservative trading but lower PnL.
- Keep it short: 3-5 sentences.

2. Datasets Overview

2.1 Bitcoin Market Sentiment

• Columns: Date, Classification (Fear/Greed)

2.2 Historical Trader Data (Hyperliquid)

- Key columns: account, symbol, execution price, size, side, time, start position, event, closedPnL, leverage
- Mention number of rows and any preprocessing summary.

3. Data Cleaning & Feature Engineering

- Steps taken to clean data: remove duplicates, handle missing values.
- Feature engineering:
 - sentiment_num (Fear=0, Greed=1)
 - o Daily aggregated metrics: total trades, total PnL, avg leverage, etc.
- Reference: all cleaned CSVs in csv_files/.

4. Exploratory Data Analysis (EDA)

- Visualizations (store in outputs/):
 - total_trades_vs_sentiment.png

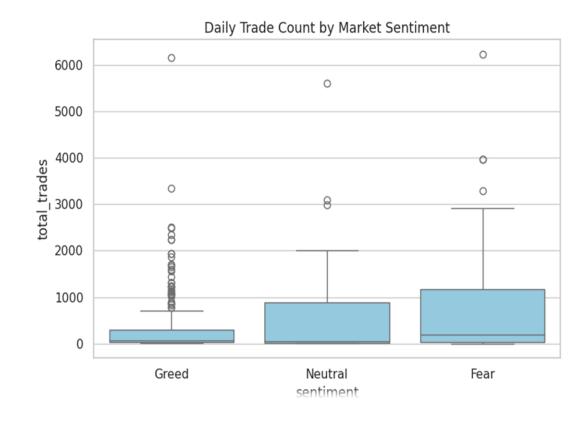
- 2. avg_pnl_vs_sentiment.png
- 3. total_pnl_vs_sentiment.png
- 4. correlation_matrix.png
- Brief insights for each plot. Example: "Average PnL is higher during Greed periods, indicating traders take advantage of bullish sentiment."

Example for EDA Section:

4. Exploratory Data Analysis (EDA)

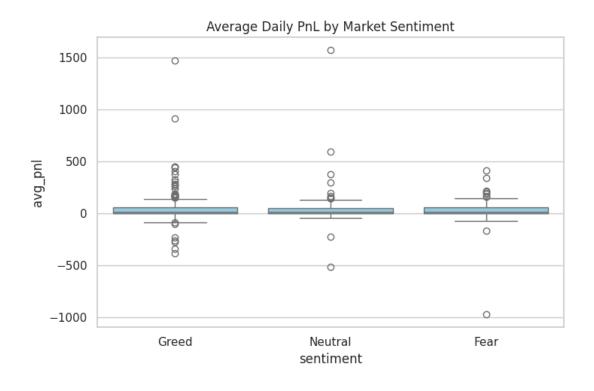
4.1 Total Trades vs Sentiment

- Insight: Traders execute more trades during Greed periods.
- Screenshot:



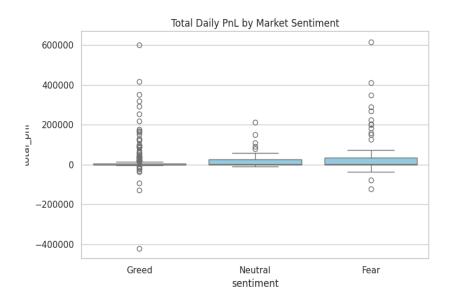
4.2 Average PnL vs Sentiment

- Insight: Average PnL is higher in Greed periods.
- Screenshot:



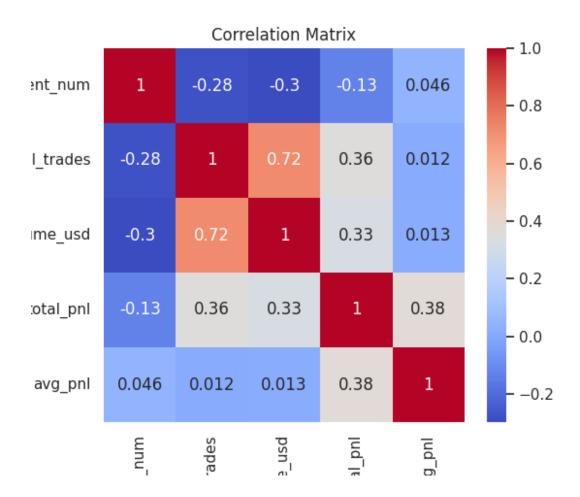
4.3 Total PnL vs Sentiment

- Insight: Extreme Fear periods show negative total PnL for most traders.
- Screenshot:



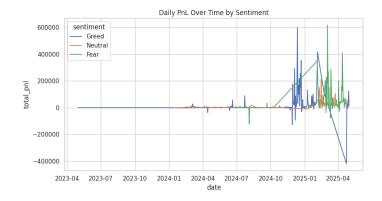
4.4 Correlation Matrix

- Insight: Leverage is moderately correlated with closed PnL.
- Screenshot:



4.5 PnL Over Time

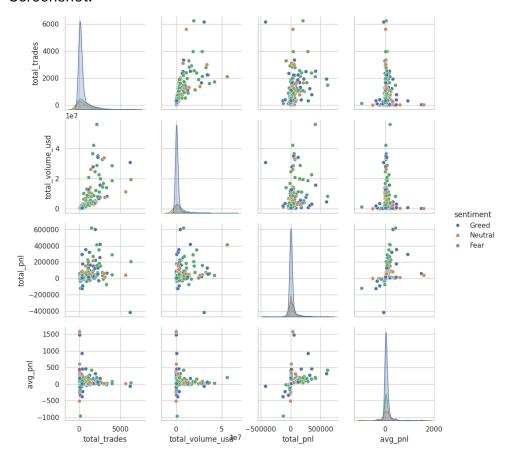
- Insight: Shows the trend of trader profitability over time.
- Screenshot:



4.6 Pairplot Metrics

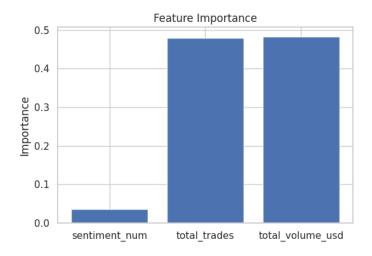
• Insight: Visualizes relationships between key metrics: total_trades, total_volume_usd, avg_leverage, closedPnL, sentiment_num.

Screenshot:



4.7 Pairplot Metrics

- Insight: Displays which factors contribute most to predicting daily PnL.
- Screenshots:



5. Analysis & Key Insights

- How trader behavior aligns/diverges from market sentiment.
- Risk-taking patterns with leverage vs sentiment.
- Profitability trends in Fear vs Greed.
- Highlight any hidden patterns: e.g., certain accounts consistently profit in Fear periods, suggesting contrarian strategy.

6. Predictive/Quantitative Analysis (Optional but Strong)

- Example: Predicting daily PnL using sentiment_num, total_trades, total_volume_usd via RandomForestRegressor.
- Include metrics (MSE, R²) and top features contributing to predictions.

7. Conclusions & Recommendations

- Summarize actionable insights:
- Traders could adjust trade size and leverage depending on market sentiment.
- Identify signals to improve trading strategies.
- Keep concise, professional, and relevant to Web3 trading strategy.

8. Appendices / References

- Colab notebooks: notebook_1.ipynb (main)
- Outputs folder with visualizations
- Cleaned CSVs in csv_files/
- Dataset links:
 - Historical Trader Data
 - Fear & Greed Index