Work Trial Task: Cross-Impact Analysis of Order Flow Imbalance (OFI)

Objective:

The goal of this task is to assess your ability to process high-frequency equity market data, compute Order Flow Imbalance (OFI) metrics across multiple levels of the Limit Order Book (LOB), and evaluate cross-asset impacts on short-term price changes. You will implement the methodologies outlined in the paper "Cross-Impact of Order Flow Imbalance in Equity Markets" to complete this task. Additionally, you will demonstrate your skills in creating a well-documented GitHub repository and a concise LaTeX-based report summarizing your approach and findings.

Task Description:

You are provided with a subset of equity market data containing order book updates and trades for several highly liquid stocks. Your objective is to:

1. Compute OFI Metrics:

- Derive multi-level OFI metrics (up to 5 levels) for each stock in the dataset.
- Integrate these multi-level OFIs into a single metric using Principal Component Analysis (PCA) or another dimensionality reduction method.

2. Analyze Cross-Impact:

- Examine the contemporaneous cross-impact of OFI on short-term price changes across stocks.
- Evaluate the predictive power of lagged cross-asset OFI on future price changes (e.g., 1-minute and 5-minute horizons).

3. Quantify Results:

- Use regression models to assess the explanatory power of contemporaneous
 OFI and predictive power of lagged OFI.
- Compare self-impact (within the same stock) vs. cross-impact (between stocks) in your models.

4. Visualization and Reporting:

- Create visualizations (e.g., heatmaps, scatter plots) to illustrate cross-impact relationships and OFI trends.
- o Summarize your findings in a concise report.

Dataset Description:

We recommend you work with high-frequency data for 5 Nasdaq 100 stocks, representing various sectors:

Example Stocks:

• Tech: AAPL

• Healthcare: AMGN

• Consumer Discretionary: TSLA

Financials: JPMEnergy: XOM

Data To Use:

In order to implement this paper you will need at least 5 levels of order book depth (L2), over a time period of 1 week / 1 month. There are a few data sources that can provide this data, but we recommend Databento. In order to get this data:

- 1. Navigate to https://databento.com/ and sign up for an account
- 2. Once you have an account you can either
 - To download files individually → Navigate to the "Nasdaq TotalView-ITCH" catalog, specify the "MBP-10" schema, select a time frame, and click
 - b. To download via API → Navigate to API key from the side bar, and follow documentation to pull the data above from "Nasdaq TotalView-ITCH"
- 3. Check out data documentation for MBP-10 schema [here]

Note: When creating an account you will be asked for your payment information, but you will get \$125 in free credits to use, which should be more than enough for this dataset.

Deliverables:

- 1. Public GitHub Repository
 - Code and Scripts:
 - Python scripts for data preprocessing, OFI calculation, and cross-impact analysis.
 - Modularized code with clear documentation and comments.

Folder Structure:

oroject/	
data/	# Placeholder or sample datasets (no proprietary data)
notebooks/	# Jupyter notebooks for analysis and results
scripts/	# Python scripts for modular implementations
results/	# Outputs (e.g., figures, tables, analysis results)
README.md	# Detailed instructions on how to run the code

- requirements.txt # List of Python packages used in the project
- o README File:
 - Description of the task and steps to run the analysis.

Brief summary of the findings.

2. Research Write-Up in LaTeX:

- o A **1-2 page PDF** summarizing the methodology, findings, and key insights.
- Sections to Include:
 - **Title Page:** Project title, your name, and date.
 - **Abstract:** Overview of the task and key findings.
 - **Methodology:** Explanation of OFI calculation, PCA (if used), and cross-impact analysis.
 - **Results:** Key findings with relevant visualizations (e.g., heatmaps, scatter plots).
 - **Discussion:** Interpretation of results and implications for trading strategies.
 - Conclusion: Summary of results and proposed next steps.
 - References: List of any research papers or sources used.

3. Visualizations:

- o Include clear and informative charts/plots for:
 - OFI metrics for individual stocks.
 - Cross-impact relationships between stocks.

Submission Guidelines:

• GitHub Repository:

- Provide a public GitHub link to your repository with the folder structure outlined above
- Ensure all code is reproducible, and dependencies are clearly listed in requirements.txt.

PDF Report:

 Submit a well-formatted LaTeX-based PDF summarizing your methodology and findings.

Deadline:

 The task must be completed and submitted within 5 days of receiving the dataset.

• Submission:

Email your GitHub link and PDF report to [submission email].

Evaluation Criteria:

1. Data Handling and Preprocessing:

• Ability to clean and manage high-frequency datasets effectively.

2. Feature Engineering:

o Accuracy and quality of multi-level OFI calculations and integration.

3. Cross-Impact Analysis:

Depth and rigor of contemporaneous and predictive analysis.

4. Code Quality:

o Modularity, readability, and adherence to best practices.

5. Reporting:

o Clarity, structure, and professionalism of the LaTeX report.

6. Bonus (Optional):

 Sector-level insights or additional predictive modeling using advanced techniques (e.g., random forests, LSTMs).

Bonus Task (Optional):

Explore how cross-impact varies by stock sector (e.g., tech vs. healthcare) or investigate whether combining OFI with other features improves prediction accuracy.