

# Prime Trading

**Project Lab - The University of Chicago**

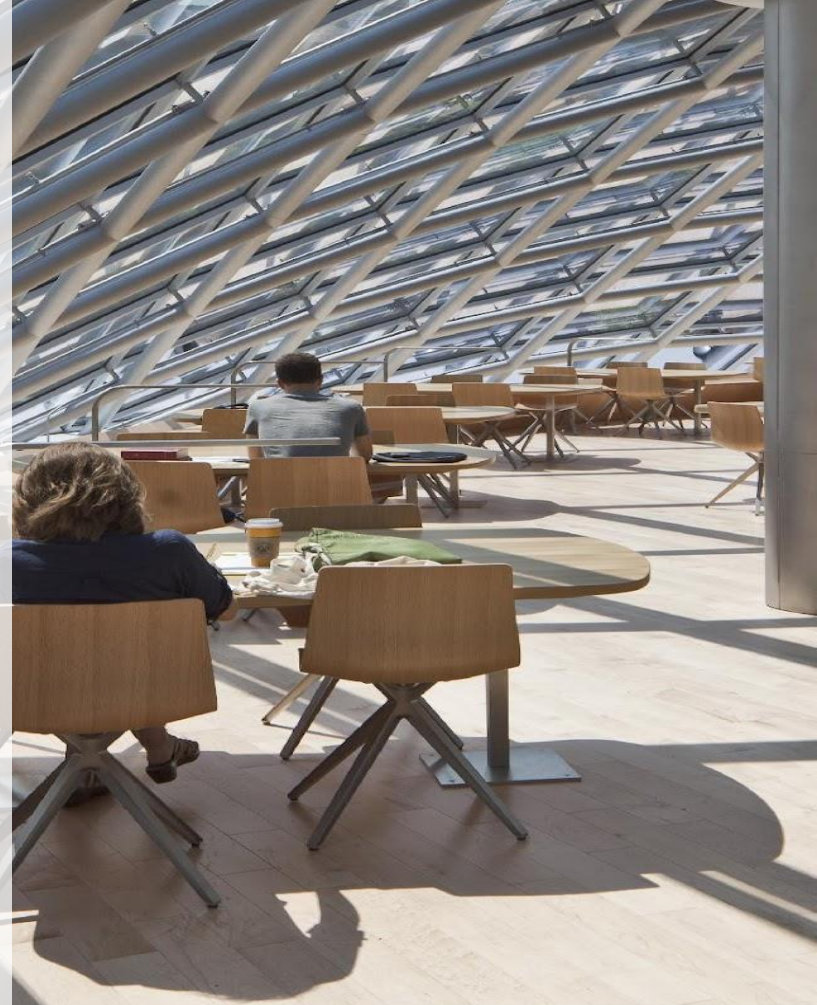
**April 25th meeting**

Futures Basis Model

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## **1. Theoretical value for basis**

- Interest rate
- Dividend yield / Points
- Market Implied Pricing

## **2. Milestone**



# 1. Theoretical value for basis

# Cost Carrying Model: Equations

(1) Definition of Basis

$$B_t = F_t^{\text{mkt}} - S_t$$

(2) Cost-of-Carry Model (Fair-Value Futures Price)

$$F_t^{\text{fair}} = S_t e^{(r-q)(T-t)}$$

(3) Definition of Fair-Value Basis

$$(S_t - D_t) e^{r(T-t)}$$

where  $D_t$  is expected dividend points from  $t$  to expiration.

# Interest rate

- **What interest rate curve should we use?**
- SOFR - standard risk free rate used for risk free, one day overnight collateralized rate
- However, SOFR is 1day interest rate thus introduced term SOFR (1M, 3M, 6M, 12M)
- CME is calculating Term SOFR  
<https://www.cmegroup.com/market-data/cme-group-benchmark-administration/term-sofr.html>

# Interest rate

- **How should we interpolate the curve**
- Linear interpolation : simple but inaccurate
- Piecewise CubicSpline : smoother curve fitting cubic spline for each data points
- Nelson Siegel

# Nelson Siegel Approach

1. SOFR data (different tenors)
2. Calibrate inputs to Nelson Siegel using OLS (fixed decay)
3. Use Nelson-Siegel to build continuous curve

$$y(\tau) = \beta_1 + \beta_2 \left[ \frac{1 - \exp(-\tau/\lambda)}{\tau/\lambda} \right] + \beta_3 \left[ \frac{1 - \exp(-\tau/\lambda)}{\tau/\lambda} - \exp(-\tau/\lambda) \right] .$$

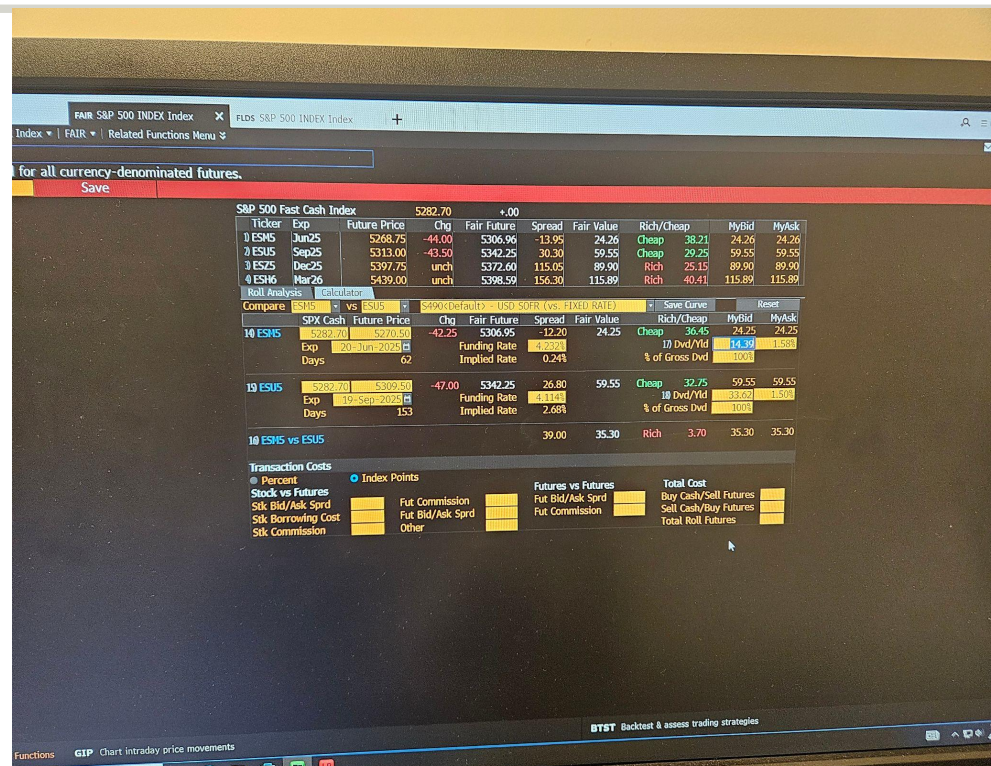
# Dividend points/ yield

- **What is the potential candidate method for dividend yield points?**
- Using Bloomberg analyst estimates
- Using Dividend index and futures
- Implied Q from futures contract or index option



# Dividend points/ yield

- Using Bloomberg analyst estimates
- Ideal: fetching dividend points on bbg

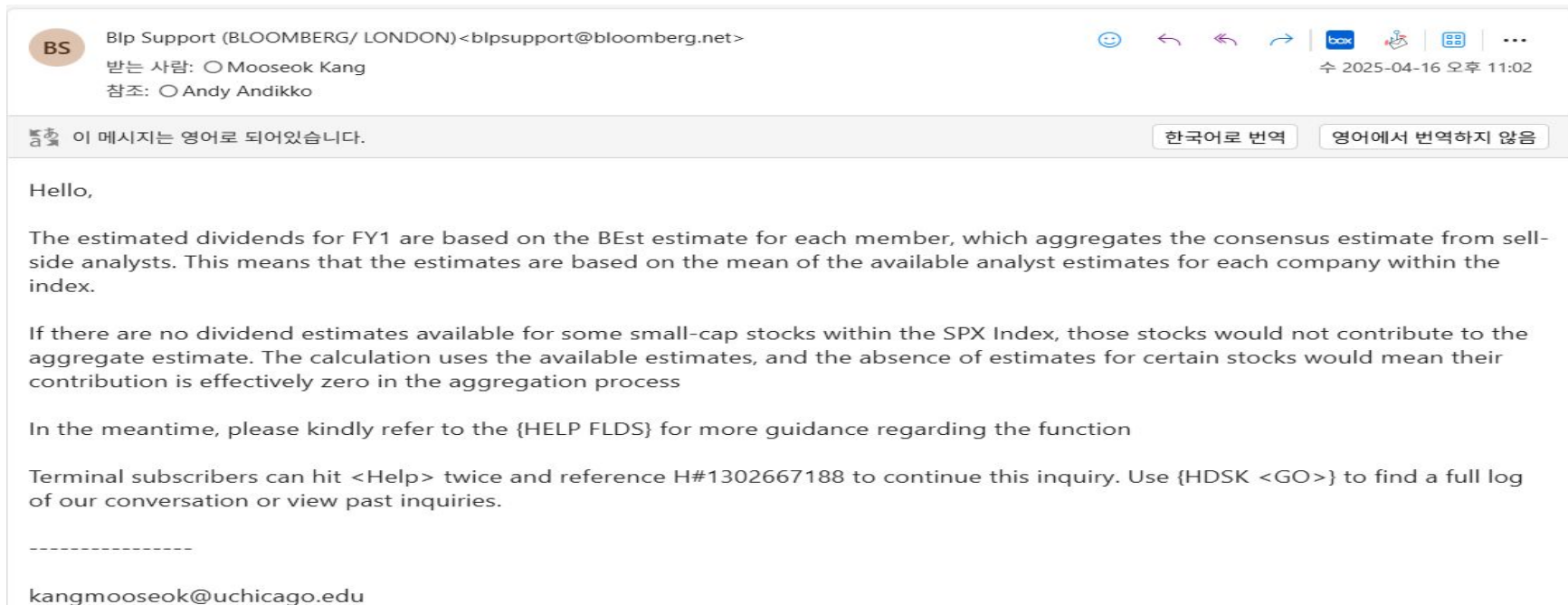


# Dividend points/ yield

- Using Bloomberg analyst estimates
- IDX\_EST\_DVD\_YLD is not a good proxy for  $q$ (index dividend yield)
- It is calculated as Estimated Dividends FY1 / Last Price of Index
- It is not reflecting estimated dividends until expiration date we are targeting
- Even worse, if there is no analyst coverage then it leaves as 0

# Dividend points/ yield

- Bloomberg Help desk email



# Dividend points/ yield

- Using Dividend index and futures
- What is Dividend Index and futures?
- Dividend index is a index that accumulates dividend in points on ex-dates
- Dividend futures is a futures traded as a expectation in dividend points level
- Dividend futures has both quarterly and annual contracts

# Dividend points/ yield

- Using Dividend index and futures
- <https://www.spglobal.com/spdji/en/indices/equity/sp-500-dividend-points-index-quarterly/#overview>
- <https://www.cmegroup.com/markets/equities/sp/sp-500-quarterly-dividend-index.quotes.html?videoid=6370489182112>
- Dividend futures - Dividend index will be market expectation of the dividend points until the end of the expiration date
- However, quarterly contracts are very illiquid thus, don't think this can be used
- <https://www.cmegroup.com/markets/equities/sp/sp-500-quarterly-dividend-index.volume.html?videoid=6370489182112>

# Dividend points/ yield

- Implied Q
- We can pull out implied  $q$  from the futures contract but that is no different from using the market price
- Pros would be that if there is a information leak, they can reflect the dividends better than the analyst forecast

# Dividend points/ yield

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# Theoretical value for basis

- Viable methods and data necessary
  1. Interest rate
    - Use Term SOFR, interpolate with either cubic spline or Nelson Siegel
  2. Dividend points / yield
    - Use forward looking dividend points in FAIR monitor
    - If don't have such, use dividend futures - dividend index ( although its illiquid )...?

## Data Necessary

- Term SOFR daily (1M,3M,6M,12M)
- FAIR dividend points daily estimates
- Dividend futures 1min / Dividend index daily



# Market Implied Pricing through Trade data

1. Data Download & Load:
  - Downloads trade data from Google Drive using `gdown` and read it using Polars.
2. Rolling VWAP Model:
  - Defines a class to compute rolling VWAP based on traded price and volume over a given window size.
  - Default window size = 5
3. Hampel Filter:
  - Applies a median-based outlier detection filter on the VWAP time series.
  - Replaces values that deviate significantly from the local median based on MAD (Median Absolute Deviation).
  - Default window size = 10, threshold = 3

MAD (Median Absolute Deviation) is computed as:

$$\text{MAD} = \text{median}(|x_i - \text{median}(x)|)$$

A point is considered an outlier if:

$$|x_i - \text{median}| > \text{threshold} \times \text{MAD}$$

# Market Implied Pricing through Trade data

## Evaluation of the results:

1. Error Metric Evaluation:
  - Computes log return errors for both original and filtered VWAP series.
  - Evaluates error mean and mean absolute error (MAE) across the entire time series.
2. Visualization:
  - Uses Plotly to plot original vs filtered VWAP values over time.

Hampel filter replaced 89 outliers.

Overall Log Return Error Comparison:

Original Error Mean:  $-0.0000027909$

Filtered Error Mean:  $-0.0000027909$

Original MAE:  $0.0001278832$

Filtered MAE:  $0.0001273319$



Example Plot on 1 min trade data

# Market Implied Pricing through Quote Data

Since only have top of the book (nbbo) quote data, vwap through depth of the book is unavailable.

If only current setup, potential models:

- **TopOfBookTheoWeighted**: Computes size-weighted average of bid and ask prices.
- **TopOfBookTheoMid**: Computes the midpoint between bid and ask.

# Market Implied Pricing through Quote Data

## Comparison of the example plots

Original Error Mean: 0.000000041  
Filtered Error Mean: 0.000000041  
Original MAE: 0.00000675  
Filtered MAE: 0.00000589

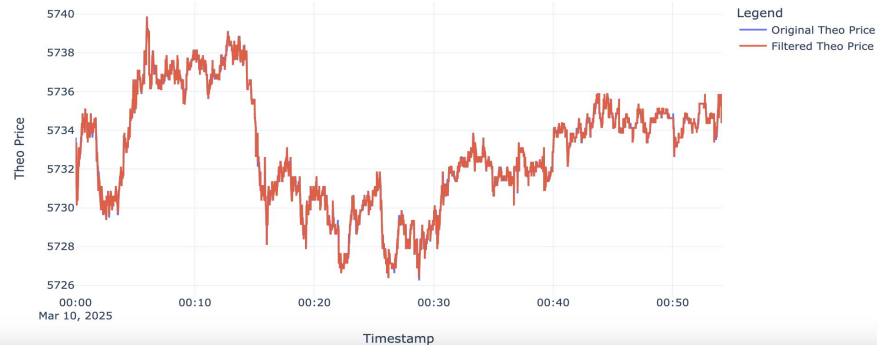
Theoretical Price (Model: TopOfBookTheoWeighted)



Example Plot with size weighted

Original Error Mean: 0.000000039  
Filtered Error Mean: 0.000000039  
Original MAE: 0.00000262  
Filtered MAE: 0.00000204

Theoretical Price (Model: TopOfBookTheoMid)



Example Plot with mid price



## 2. Milestone

# Milestones

- **Week April 28th:** Finalize theoretical pricing model and identify patterns between market price
- **Week May 5th:** Design trading strategy framework.
  - strategy:
    - Define entry/exit signals based on patterns (e.g., arbitrage when theoretical vs. market spread exceeds  $2\sigma$ ).
    - Incorporate Rolling VWAP (window=5) as a baseline for fair value.
  - risk management:
    - Set position sizing, stop-loss thresholds, and maximum exposure.
    - Consider transaction costs, volume limitation etc..

- **Week May 12th:** Backtest strategy and analyze performance.
  - Simulate trades using provided ES data from 03-05 to 03- 21
  - Validate signals against Hampel-filtered VWAP and term SOFR-driven theoretical prices(not sure about whether the frequency would match)
  - Calculate sharpe ratio, max drawdown, win rate, return, extra.
  - Identify any potential edge cases
- **Week May 19th:**
  - Optimize hyperparameters such as VWAP window, Hampel filter parameters, etc using grid-search , check on overfitting
  - Adjust thresholds based on backtesting results

**Thank you!**

