## DeepStock

stock price prediction with deep learning

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# Background and Data



Previous <sup>1</sup>	Our Study
Low Frequency	High Frequency
(Daily)	(5-minute)
Simple architecture	Recurrent Neural Network
Price	Price and volume
Simple data processing	Sophisticated feature engineering
Offline learning	Online learning

- Minute-level US equity pricing and volume data since 2000, collected using Google Finance API. Processed with five-minute window.
- 50 largest stocks as ranked by market capitalization.
- Stocks are correlated, so we will use 600 dimensional lagged stock returns (50 stocks and 12 lagged returns) as raw level input data.

<sup>&</sup>lt;sup>1</sup>According to a survey on the previous researches of stock price prediction [1].

### Model and Method



Our model follows the research of Chong et al.[2]:

$$\mathbf{r}_t = [r_1, r_2, ..., r_{50}]$$

$$\mathbf{R}_t = [\mathbf{r}_t, \mathbf{r}_{t-1}, ..., \mathbf{r}_{t-12}]^T$$

$$\mathbf{r}_{t+1} = f \circ \phi(\mathbf{R}_t)$$

 $\phi$ :

- Data → Features, e.g. mean, variance, etc.
- PCA, autoencoder, RBM, and other unsupervised learning techniques.

f:

- Predictor function.
- Recurrent Neural Network (RNN), state of the art for financial time series data analysis [3].

#### **Evaluation and Promise**



- **Measurements:** normalized mean squared error, mean absolute error, root mean squared error, and mutual information.
- Bootstrap analysis: will be performed on assessment of the accuracy of the estimator by random resampling with replacement from the original dataset.
- Sensitivity: of the result with respect to each feature and each stock will also be analyzed.

We believe an accurate prediction for stock price will lay a solid ground for a successful trading strategy. It will also shed light on the research of economics, finance, behavioral science, and mathematics.

#### Thanks!



#### These slides are modified from maminian's template[4].

- [1] M. Kearns and Y. Nevmyvaka, "Machine learning for market microstructure and high frequency trading," 2013.
- [2] E. Chong, C. Han, and F. C. Park, "Deep learning networks for stock market analysis and prediction: Methodology, data representations, and case studies," *Expert Systems with Applications*, vol. 83, pp. 187 – 205, 2017.
- [3] M. Abe and H. Nakayama, "Deep Learning for Forecasting Stock Returns in the Cross-Section," *ArXiv e-prints*, Jan. 2018.
- [4] maminian, "uncmathbeamer." https://github.com/maminian/uncmathbeamer, 2017.



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