

Deep RL for algorithmic trading, Eric Benhamou

Executive summary

- ▶ **Deep Reinforcement Learning (DRL)** applications to finance are still unknown, whereas it is the **technique of choice** in games and has reached spectacular levels of efficiency, robust in **non stationary environments**.
- ▶ In this work, we apply deep policy gradient methods to optimal trading decision.
- ▶ We show this leads to acceptable results and provide a **model free alternative to rule based trading algorithms**.

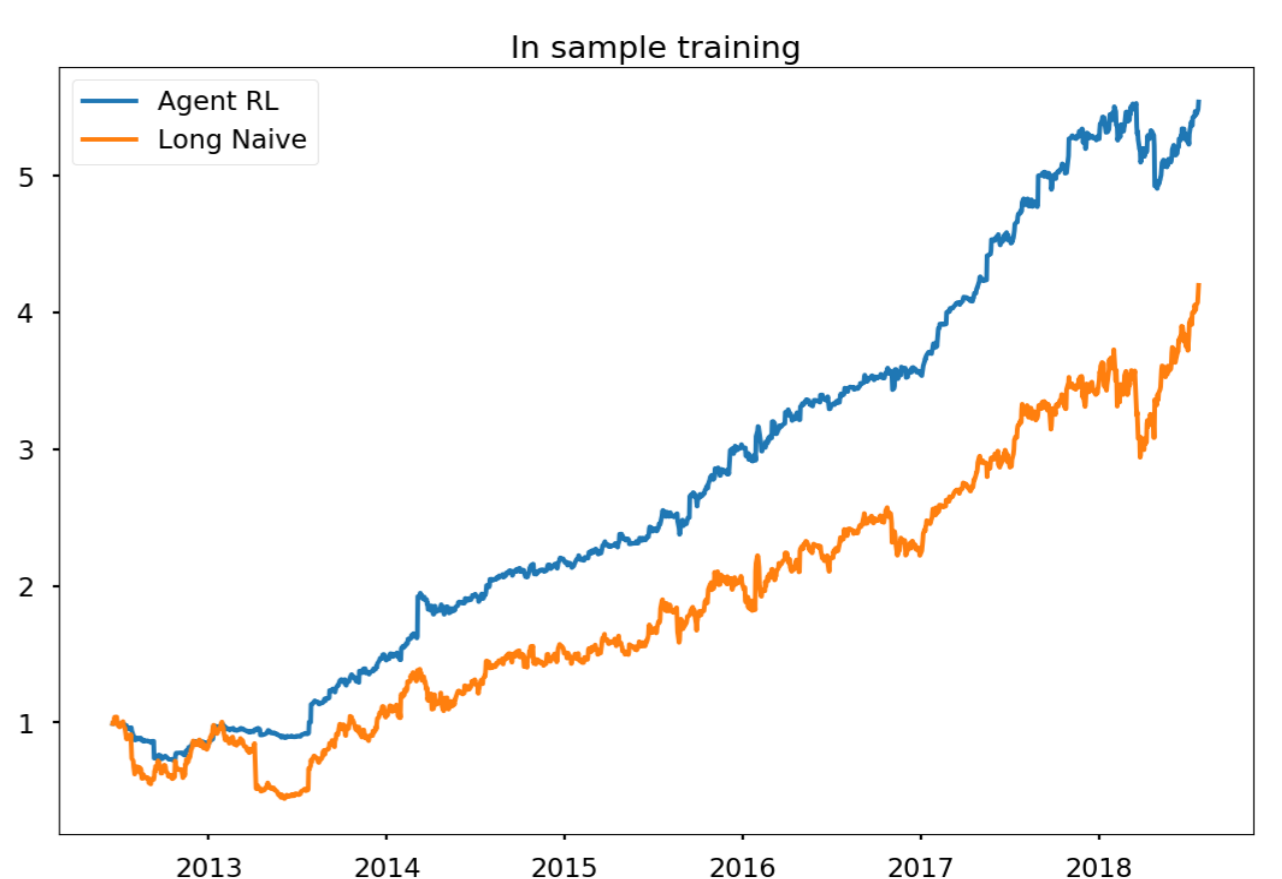
Motivating Questions

- ▶ Can an artificial agent learn to trade successfully? **[Yes]**
- ▶ Can data non-stationarity be solved? **[Yes]**
- ▶ Can we do with a few thousands points? **[Yes]**
- ▶ If markets change, can the agent act appropriately? **[Yes]**

Experiment

- ▶ Done on Facebook stock
- ▶ Train: 01June2012 to 31May2018 (1,509 days = 87.7%)
- ▶ Test: 01June2018 to 04Apr2019 (212 days = 12.3%)
- ▶ Train mostly bullish
- ▶ Test quite different from train
- ▶ Impact of learning rate

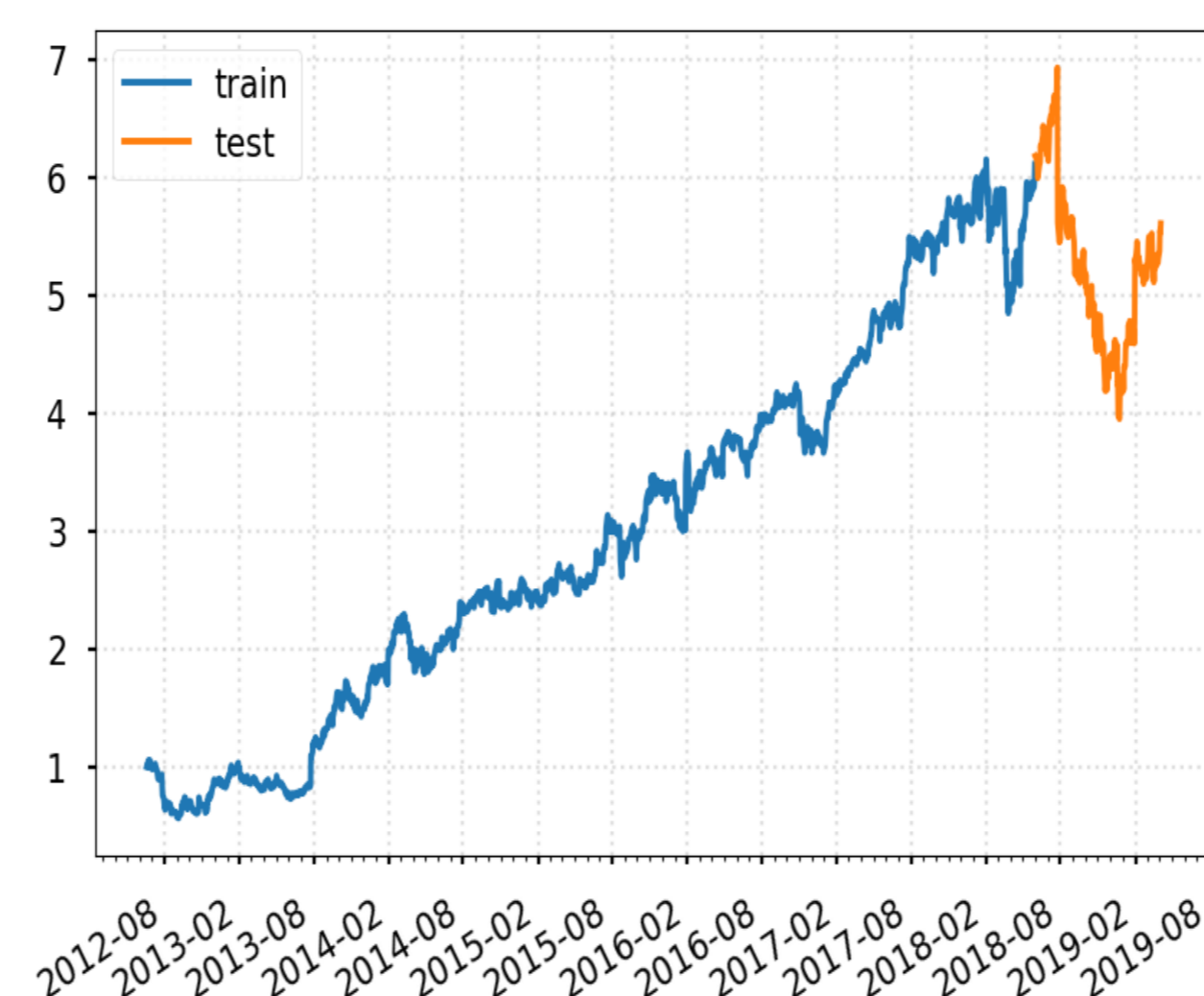
Train



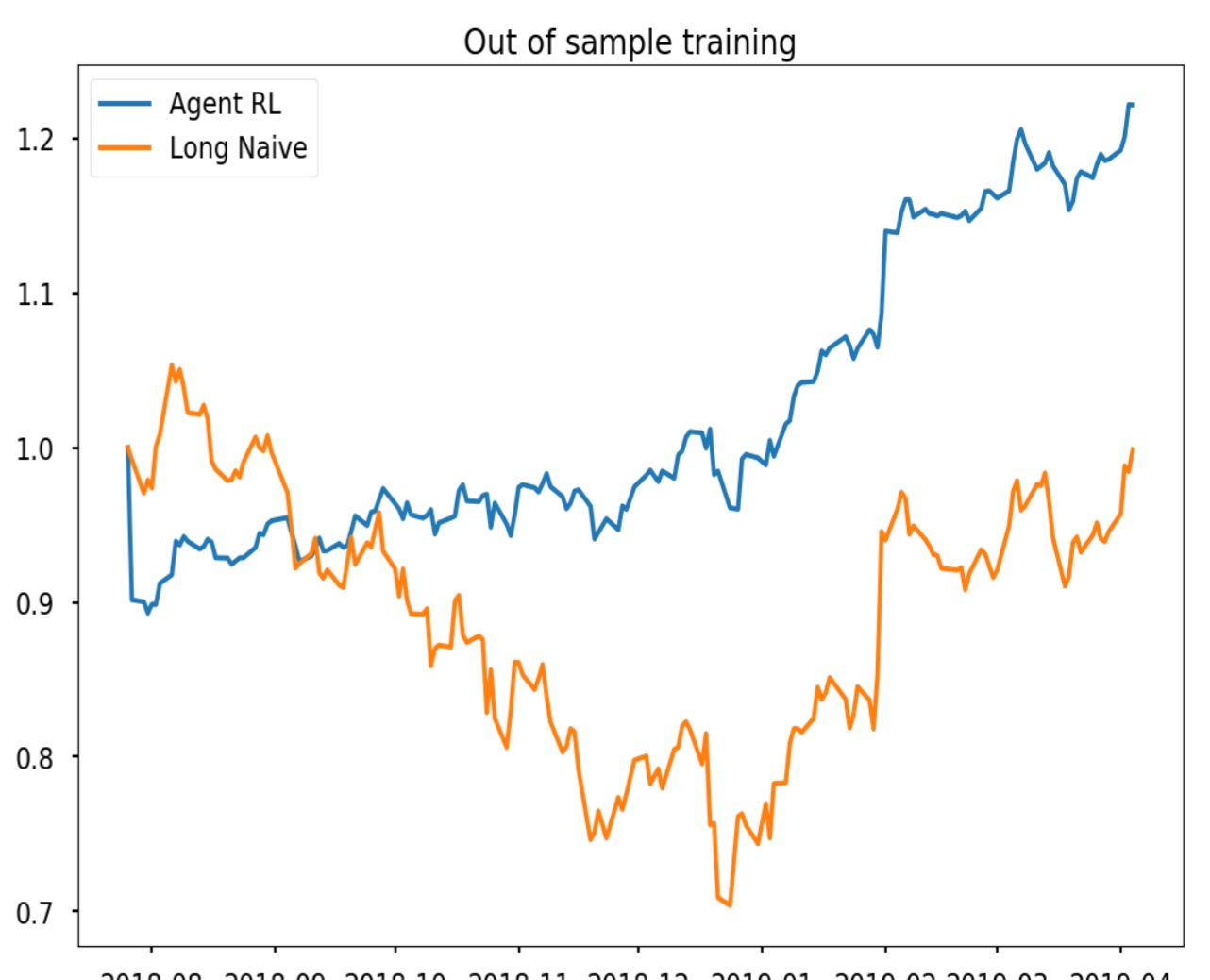
Key concepts

- ▶ Problem solved using A3C method as in [4] and [3]
- ▶ Non Markovianity handled by large buffer (20 days)
- ▶ Q function: 2×256 ELU + softmax activation
- ▶ Reward with Sharpe ratio for better risk balance than [1] or [2]
- ▶ Iteration though deep policy gradient method faster than [5]

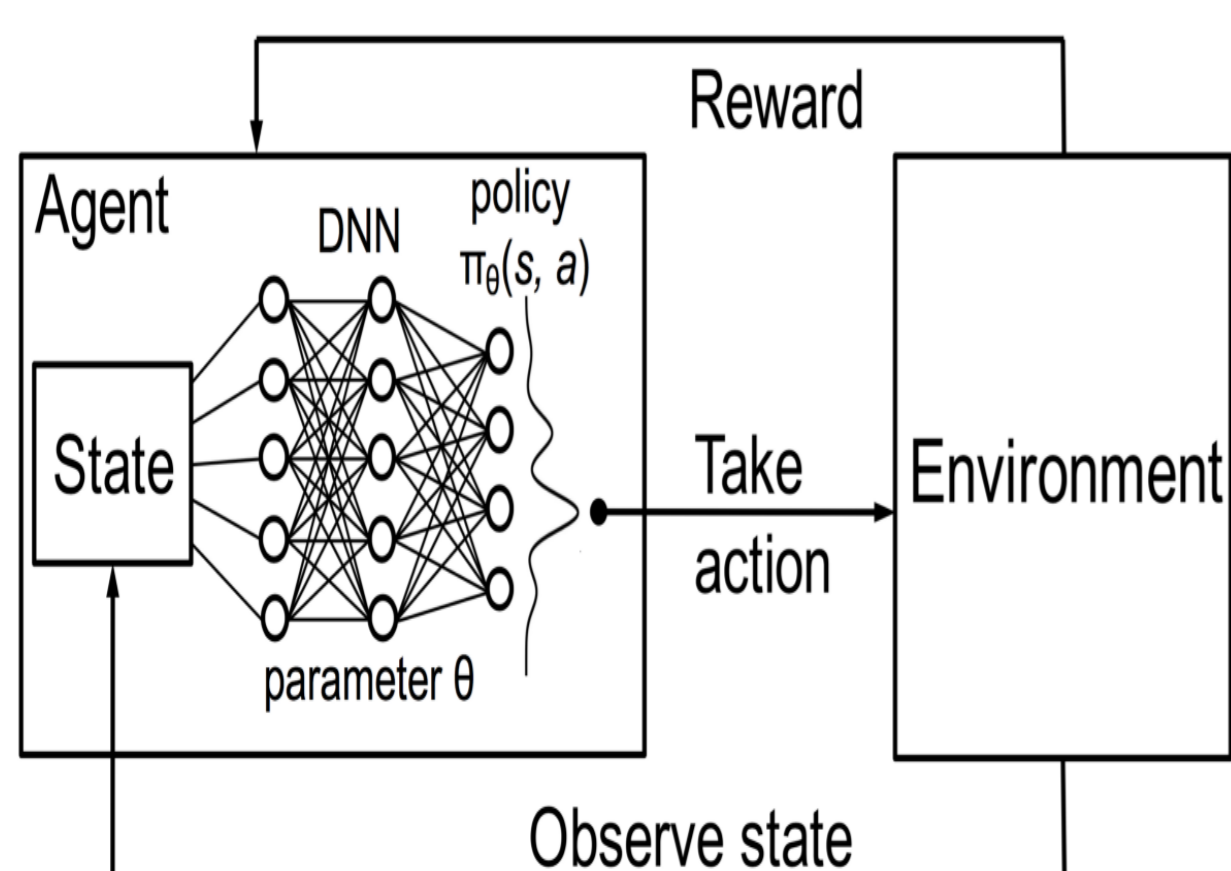
Data



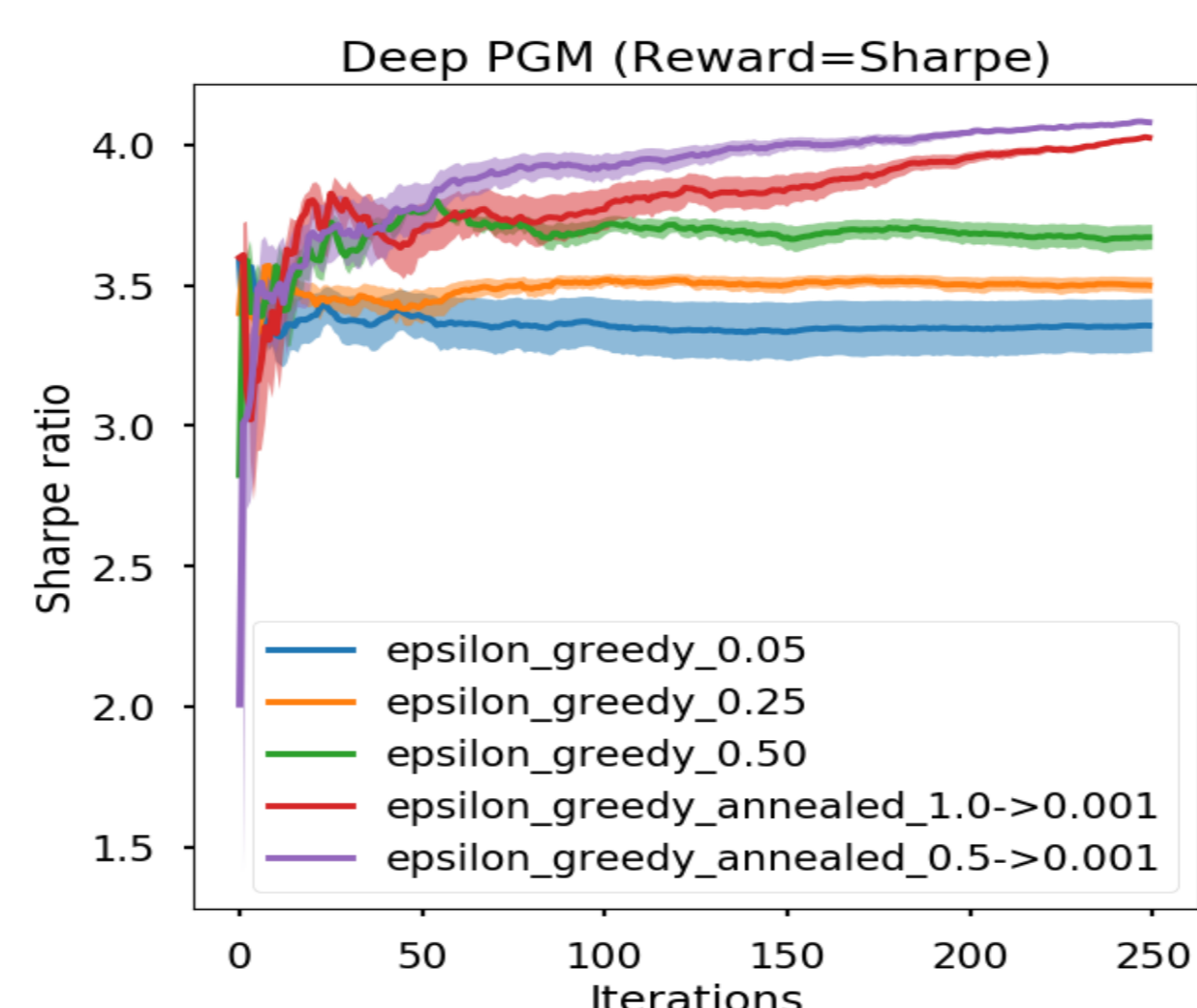
Test



Model



Results



References

- ▶ Yue Deng et al. "Deep Direct Reinforcement Learning for Financial Signal Representation and Trading". In: *IEEE Transactions on Neural Networks and Learning Systems* 28 (2017), pp. 653–664.
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- ▶ Volodymyr Mnih et al. "Asynchronous Methods for Deep Reinforcement Learning". In: *ICML*. Vol. 48. NY, USA: PMLR, 20-22 Jun 2016, pp. 1928–1937.
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