**Emergence of Cooperative Long-lasting Loyalty in Double Auction Markets** 

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## **Motivation**

- Always buy from the same merchants?
  - Loyalty by design

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AIM

• Design stylized model of agents choosing among multiple markets to investigate whether loyalty can emerge spontaneously

## Model

Aloric et al. (2015) Advances in Artificial Economics

Aloric et al. (2016) PloS ONE

#### 2 Double Auction markets

- Discrete time
- Globally set trading price

#### Agents

- Choosing Strategy
- Trading Strategy

## Markets

- Executes trades based on which traders evaluate returns
- Sets a global trading price based on submitted bids and asks
- $\pi = \pi^{eq} + \theta(\langle b \rangle \langle a \rangle)$
- Matches buyers to sellers
- No limit order book

## Markets - price setting



## Markets - returns





## **Agents - Choosing strategy**

- Where to trade? (which market)
- How to trade? (to buy or to sell)



## **Agents - Choosing strategy**

- Where to trade? (which market)
- How to trade? (to buy or to sell)
- Decision is based on attractions:



 $A_{\gamma}(n+1) = \begin{cases} (1-r)A_{\gamma}(n) + rS_{\gamma}(n), & \text{if agent has chosen action } \gamma \\ (1-r)A_{\gamma}(n), & \text{otherwise} \end{cases}$ 

 $\gamma \in \{B1, S1, B2, S2\}$  r - forgetting rate  $S_{\gamma}(n)$  - score received during trading period n, when action  $\gamma$  is taken

 $p_\gamma \propto \exp(eta A_\gamma)$ , eta intensity of choice

## **Agents - Trading strategy**

#### Zero Intelligence Traders

- Bids/Asks are iid Gaussian random variables
- No dependence on previous success
- No information about other traders
- No wealth constraint
- Want to trade 1 unit of stock per trading period

## **Numerical Results**





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# Analytical Model

# Agents with fixed Buy-Sell preferences

- Agents' preference for Buying (Selling) non adaptive determined on input
- Only choice is where to trade
- Still develop loyalty in simulations, but easier to analyse



## **Phase Diagram**



## **Phase Diagram**



## Robustness

- Assumptions on Bid/Ask distributions
- Reinforcement learning
- Wealth constraints
- More sophisticated trading strategies
- Continuous Double Auction Market

## Summary

- Simple numerical model of double auction markets
- Observed long lasting loyalty for certain range of parameters
- Above critical intensity of choice β: the system is stabilized by traders who persistently chose to trade at suboptimal market - cooperative trade-enabling action
- Even the volume driven agents benefit from segregated state
- Adaptation/Learning is the key driver of segregation

# Thank you for the attention!

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