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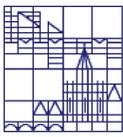
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**School and Workshop on Market Microstructure: Design, Efficiency
and Statistical Regularities**

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Learning, Market Clearing and Trading Institutions

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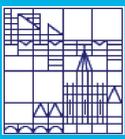


Learning, Market Clearing, and Trading Institutions

Theory and Experiments

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Learning, Market Clearing, and Trading Institutions

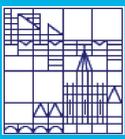
Introduction

The Model

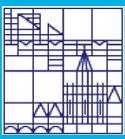
Stochastically Stable Institutions

Experimental Test

Conclusion



Introduction



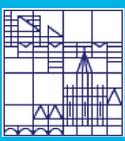
▶ Market institution:

trading rules that determine the matching and price formation process

▶ Market institutions matter for efficiency, surplus distribution, and convergence to market clearing outcome (Plott 1982, Holt 1993, Ockenfels and Roth 2002)

▶ Questions:

- ◇ Is there any mechanism that guarantees that existing market institutions support market-clearing outcomes?
- ◇ Is there any mechanism that guarantees that actual markets are characterized by efficient institutions?



Two approaches:

(I) How do institutions emerge? Which are the properties of these emerging institutions?

- ▶ Market institutions as Networks: Bala and Goyal (2000), Jackson (2002), Kranton and Minehart (2001)
- ▶ Experimental literature: Kirchsteiger, Niederle and Potters (2005)

(II) If several trading institutions exist, which one survives in the long run?

- ▶ Claim (Hayek etc.):

Because of efficiency reasons, only trading institutions that guarantee market clearing survive in the long run.

- ▶ Question of this paper:

If traders have to choose between different trading institutions, will they learn to choose a market-clearing (efficient) one?



Basic Approach

Introduction The Model Stochastically Stable Institutions Experimental Test Conclusion

- ▶ Traders are boundedly rational

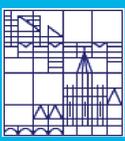
They follow myopic behavioral rules to choose the institution they are active in.

- ▶ The learning process is dynamic

Institution choice can (potentially) be revised every period (discrete time).

- ▶ Techniques: **Stochastic Stability**.

The basic learning process is a Markov Chain, perturbed with small-probability (vanishing) mistakes.



▶ Choice of Market Institution:

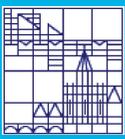
- ◇ Gerber and Bettzüge (2007): Alternative (market clearing) asset markets
- ◇ Alós-Ferrer and Kirchsteiger (2010): Alternative platforms in GE-Models
- ◇ Alós-Ferrer, Kirchsteiger, and Walzl (2010) → [Tomorrow](#)

▶ Learning in Coordination Games and Oligopolies:

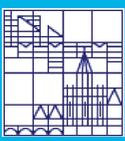
- ◇ Kandori, Mailath, and Rob (1993), Young (1993), Ellison (2000)
- ◇ Alós-Ferrer (2004), Alós-Ferrer and Ania (2005).

▶ Price Rigidities in Exchange Models:

- ◇ Drèze (1975)
- ◇ Herings and Kononov (2009)



The Model



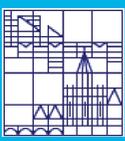
Primitives of the Model

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- ▶ One homogenous good (partial equilibrium model)
- ▶ n identical **buyers** and m identical **sellers**
- ▶ **Demand function** $d(p) \geq 0$, $d(0) > 0$, continuous and strictly decreasing where $d(p) > 0$, $\lim_{p \rightarrow \infty} d(p) = 0$
- ▶ **Supply function** $s(p)$, $s(0) = 0$, continuous and strictly increasing.
- ▶ **Market outcome:** (p, q_B, q_S) ; *rationing possible*
- ▶ Evaluation of the outcome (\sim payoff functions):

$$v_B(p, q_B) \quad \text{and} \quad v_S(p, q_S)$$

- ▶ **Examples:**
 - ◇ Standard demand/supply derived from utility/profit maximization.
 - ◇ Consumer/producer surplus.
 - ◇ BUT: allows for more general modes of behavior.



Behavioral Assumptions

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(A1) In absence of rationing, a lower price is better for buyers and worse for sellers:

$$v_B(d(p), p) > v_B(d(p'), p') \quad \text{and} \quad v_S(s(p), p) < v_S(s(p'), p')$$

for all $p < p'$ with $d(p) > 0$.

(A2) Given the price, traders prefer not to be rationed:

$$v_B(d(p), p) > v_B(q_B, p) \quad \text{and} \quad v_S(s(p), p) > v_S(q_S, p)$$

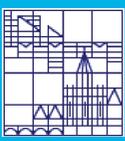
for all $p > 0$ and all $0 < q_B < d(p)$, $0 < q_S < s(p)$

(A3) Given the price, traders prefer being rationed to not being able to trade:

$$v_B(q_B, p) > v_B(0, p') \quad \text{and} \quad v_S(q_S, p) > v_S(0, p')$$

for all $p > 0$, p' and all $0 < q_B < d(p)$, $0 < q_S < s(p)$

A1-A3 fulfilled by Examples 1, 2.



Trading Institutions

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- ▶ Good traded at different institutions.
Traders choose the institution at which they want to trade.
 m_z, n_z denote sellers and buyers who choose institution z .

- ▶ Market clearing price $p^*(n_z, m_z)$ for z : Solution of $m_z \cdot s(p) = n_z \cdot d(p)$

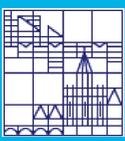
- ▶ z characterized by bias function β_z . Actual price at z :

$$p_z = p_z(n_z, m_z) = \beta_z(n_z, m_z) \cdot p^*(n_z, m_z)$$

- ▶ $\beta_z \equiv 1$: market clearing institution.
- ▶ $\beta_z(n_z, m_z) \neq 1$: non-market clearing institution.
Short market side not rationed; Traders at the long market side equally rationed.

$$\beta_z > 1: \quad q_B^z = d(p_z) \quad q_S^z = \frac{n_z}{m_z} d(p_z)$$

$$\beta_z < 1: \quad q_B^z = \frac{m_z}{n_z} s(p_z) \quad q_S^z = s(p_z)$$



► **Example 1: Constant-bias institutions.**

$$\beta_z(n_z, m_z) = \beta_z \quad \forall n_z, m_z$$

► **Example 2: Oligopolistic institutions.**

Sellers compete in quantities taking demand functions as given.

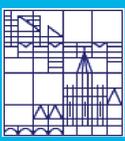
$$\beta_z(n_z, m_z) = \frac{p^C(n_z, m_z)}{p^*(n_z, m_z)}$$

where p^C is the Cournot price.

► **Example 3: Price regulation.**

There exists $p^H > 0$ such that

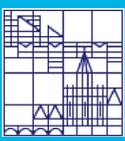
$$\beta_z(n_z, m_z) \leq \frac{p^H}{p^*(n_z, m_z)}.$$



Choice of the Institution

Introduction The Model Stochastically Stable Institutions Experimental Test Conclusion

- ▶ Traders choose simultaneously among a finite set of feasible institutions; at least one market clearing institution feasible.
- ▶ Trades are conducted and outcomes evaluated (payoffs derived).
- ▶ **Coordination game:**
Due to **A3**, full coordination at any institution is a strict Nash Eq., even coordination at institution leading to Pareto-inferior outcome.
- ▶ **Q:** Do traders learn to coordinate on market clearing institutions?



The Learning Process

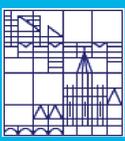
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- ▶ States ω describe institutions chosen by each trader.
- ▶ At the end of a period t , traders observe outcome (prices and quantities) of all institutions active at t .
- ▶ If a trader is allowed to revise his choice of institution, he switches to the institution with the outcome at t which is “best for him” (in term of realized price and quantity for traders of the same type).

This determines the distribution of traders over institutions for period $t + 1$ (Markovian).

Myopic behavior: move to institutions currently perceived as best.

- ▶ At $t + 1$, trade is conducted and outcomes are evaluated again.
- ▶ **Note:** since buyers/sellers are homogenous, this behavior is equivalent to *imitation learning*.



Revision opportunities

- ▶ Random revision opportunities.

$E(k, \omega)$ event that trader k receives revision opportunity at state ω .

$E^*(k, \omega) \subseteq E(k, \omega)$ event that k is the only trader of his type with revision opportunity at ω .

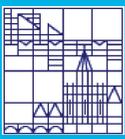
- ▶ For every trader k and state ω ,

(D1) $Pr(E^*(k, \omega)) > 0$.

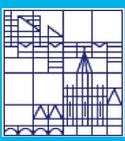
(D2) either $Pr(E^*(k, \omega) \cap E^*(k', \omega)) > 0$ for any trader k' of the other type, or $Pr(E^*(k, \omega) \cap E(k', \omega)) = 0$ for all such k' .

- ▶ Encompasses many standard learning models, like those with

- ◇ **independent inertia**: Exogenous, independent, strictly positive probability that an agent cannot revise.
- ◇ **asynchronous learning**: only one agent per period has positive probability of revision.



Stochastically Stable Institutions



Mistakes / Experiments

Introduction The Model Stochastically Stable Institutions Experimental Test Conclusion

- ▶ Small experimentation probability $\varepsilon > 0$.

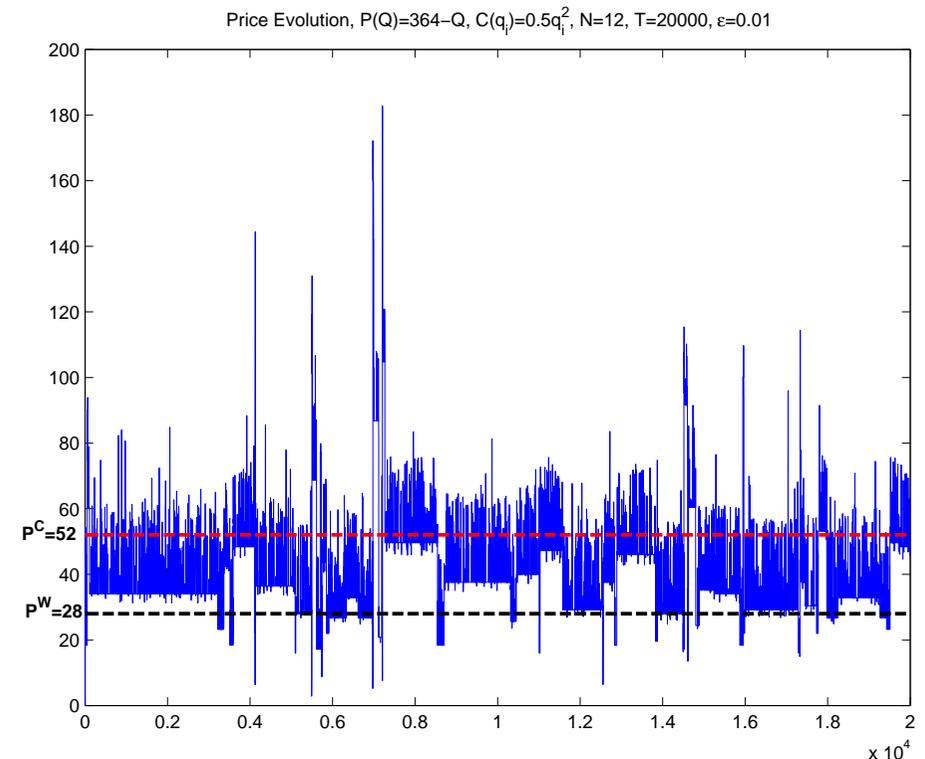
In case of experimentation: institution chosen at random, prob. distribution with full support over institutions.

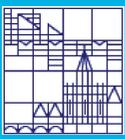
- ▶ Unique invariant distribution $\mu(\varepsilon)$ with full support on the state space. (state: distribution of traders over institutions)
- ▶ Limit invariant distribution

$$\mu^* = \lim_{\varepsilon \rightarrow 0} \mu(\varepsilon)$$

Stochastically stable states: those in the support of μ^* .

- ▶ By the Ergodic Theorem, the stochastically stable states are the only ones observed a significant proportion of time in the long run (for ε very small).
- ▶ Techniques in the proofs: Ellison (2000).





Stochastically Stable Institutions

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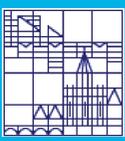
- ▶ **Lemma:** Under A1-A3, D1 and D2, only states with full coordination on one institution can be stochastically stable.

Stochastically stable institutions: institutions at which all traders coordinate in stochastically stable states.

- ▶ Suppose there is a market clearing institution and any number of non-market clearing ones.

Theorem 1: Under A1-A3, D1 and D2, the market clearing institution is stochastically stable.

- ▶ **Message:** coordination in the market-clearing institution will always be observed a significant part of the time.



Key Idea of the Proof

Lemma: Let a market clearing institution 0 and another institution z be active at state ω . Let $p_0 = p(n_0, m_0)$, $p_z = p(n_z, m_z)$, $\beta_z(n_z, m_z) \neq 1$. Then, either $v_B(q_B^0, p_0) > v_B(q_B^z, p_z)$ or $v_S(q_S^0, p_0) > v_S(q_S^z, p_z)$;

At least one market side always strictly prefers switching to a market-clearing institution.

Proof. Let $\beta_z(n_z, m_z) < 1$ (> 1 analogous)

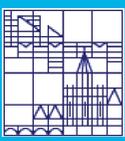
Buyers (not sellers) are rationed at $z \longrightarrow q_S^0 = s(p_0)$, $q_S^z = s(p_z)$.

Suppose $v_S(q_S^0, p_0) \leq v_S(q_S^z, p_z)$.

By A1 (sellers): $p_0 \leq p_z$.

By A1 (buyers): $v_B(q_B^0, p_0) \geq v_B(d(p_z), p_z)$.

Since $d(p_z) > q_B^z$ (buyers are rationed): By A2, $v_B(d(p_z), p_z) > v_B(q_B^z, p_z)$. ■



Other stable institutions

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- ▶ Focus on constant-bias institutions. Assume there is at least one market-clearing institution.
- ▶ For $\beta_z > 1$, sellers get higher price than with market clearing but are rationed. Effect is unclear. Intuition?

Think of a standard case with demand/supply coming from utility/profit maximization. Monopoly/cartel price is above competitive eq. price. Further, profits are increasing at the competitive price.

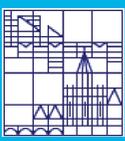
Hence, for $\beta_z > 1$ but close to 1, we expect the direct effect of higher prices to overcome the indirect effect of lower quantities (rationing).

- ▶ Let $V_B(\beta_z, m_z, n_z)$, $V_S(\beta_z, m_z, n_z)$ be the buyers', sellers' payoff, if they trade at z and n_z, m_z traders have chosen z .

(A4) For any fixed $m_z, n_z > 0$, there exist $\underline{\beta}(m_z, n_z) < 1 < \bar{\beta}(m_z, n_z)$ such that

for all $\underline{\beta}(m_z, n_z) < \beta_z < 1$, $V_B(\beta_z, m_z, n_z) > V_B(1, m_z, n_z)$ and

for all $1 < \beta_z < \bar{\beta}(m_z, n_z)$, $V_S(\beta_z, m_z, n_z) > V_S(1, m_z, n_z)$



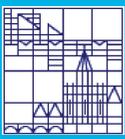
Other stable institutions

Introduction The Model Stochastically Stable Institutions Experimental Test Conclusion

- ▶ A non-market clearing institution z is called **favored**, if, at *any* state,

$$\text{either } v_B(q_z^B, p_z) > v_B(q_0^B, p_0) \quad \text{or} \quad v_S(q_z^S, p_s) > v_S(q_0^S, p_s).$$

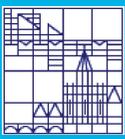
- ▶ **Lemma:** If $A1$ and $A4$ hold, then for a given number of buyers and sellers there exist favored institutions with a β that is in an open neighbourhood of 1.
- ▶ **Theorem 2:** Under $A1$ - $A4$, $D1$ and $D2$, there exist favored institutions and every favored institution is stochastically stable.



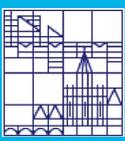
Model's Message

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- ▶ Traders will learn to coordinate on market clearing institutions, at least part of the time...
- ▶ ... but in general other, non-market clearing institutions will also be observed.



Experimental Test



Design

Introduction The Model Stochastically Stable Institutions Experimental Test Conclusion

- ▶ 2 Treatments \times 6 experimental markets \times 14 participants
- ▶ Participants: University of Konstanz students (no econ, no psych)
- ▶ Experiment at LakeLab (Univ. Konstanz), recruitment with ORSEE, programmed with z-Tree.

- ▶ In each experimental market:
 - ◇ 7 buyers and 7 sellers choose between 2 trading platforms
 - ◇ 90 trading rounds (with same, anonymous partners)
 - ◇ Choice of platforms completely determines payment (no actual trade)
 - ◇ Payments: demand and supply determined by maximization of utility function and profit function, payments equal utility/profit for realized prices and quantities.
 - ◇ Participants provided with payoff matrices.





Treatments

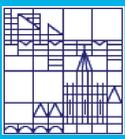
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▶ Treatment 1:

- ◇ Platform A: market clearing (hence stochastically stable)
- ◇ Platform B: non-market clearing **and not** stochastically stable.
- ◇ **Prediction:** Convergence to coordination in Platform 1.

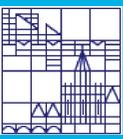
▶ Treatment 2:

- ◇ Platform A: market clearing (hence stochastically stable)
- ◇ Platform B: non-market clearing **but also** stochastically stable.
- ◇ **Prediction:** Both platforms active over time.



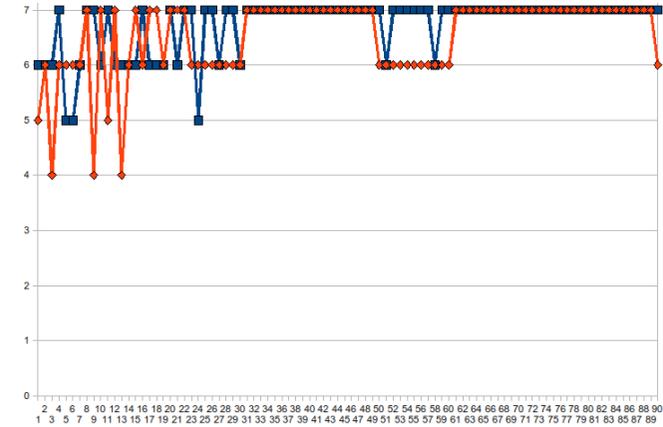
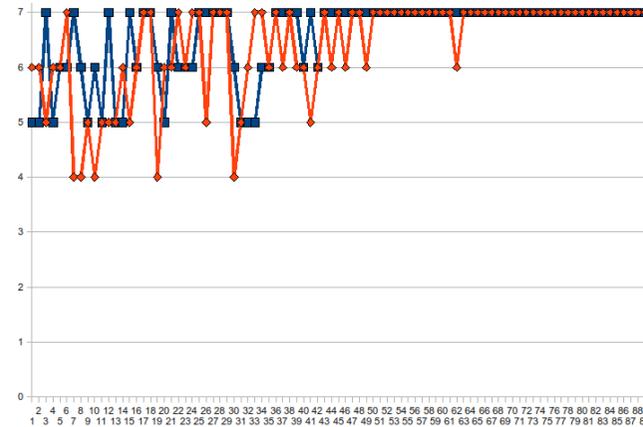
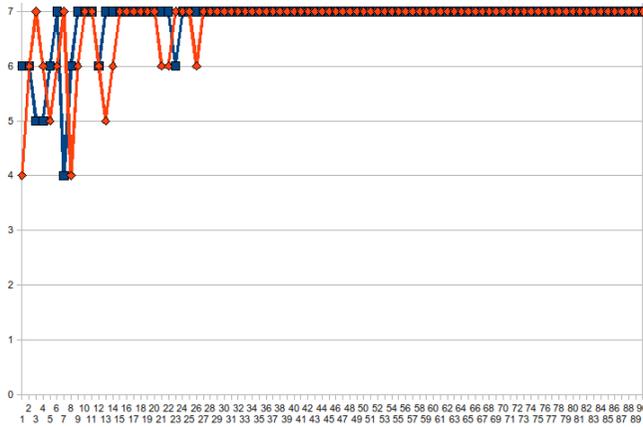
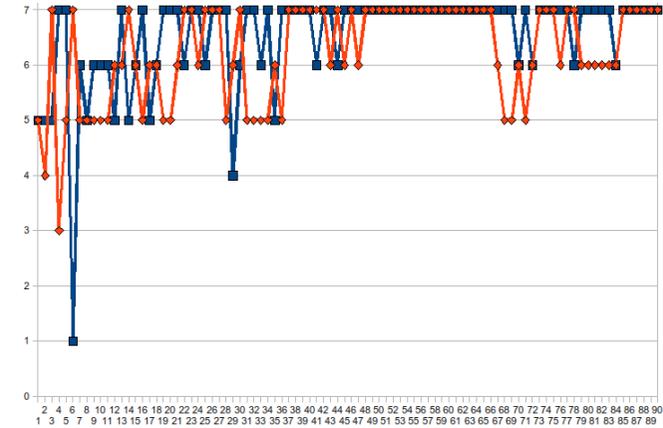
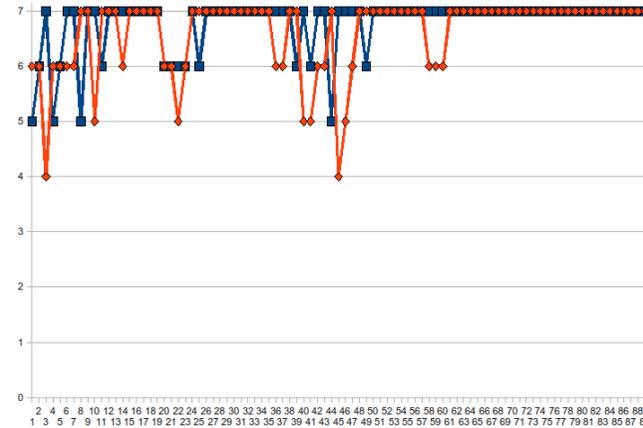
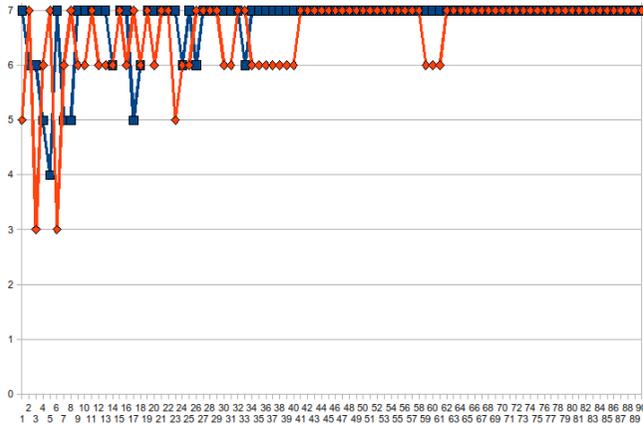
Plots

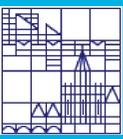
- ▶ Show the evolution in time of the number of traders in Platform A.
- ▶ Vertical axis: number of traders
- ▶ Horizontal axis: Time period.
- ▶ **BLUE**: Sellers
- ▶ **RED**: Buyers



Treatment 1

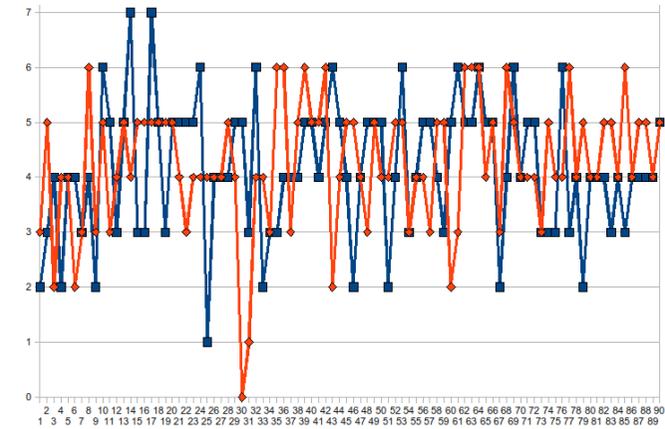
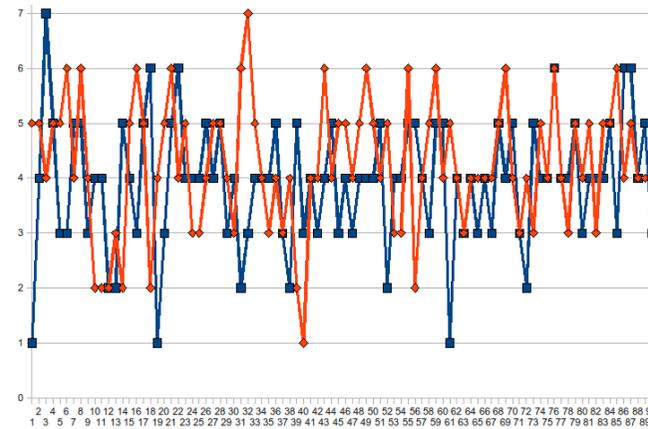
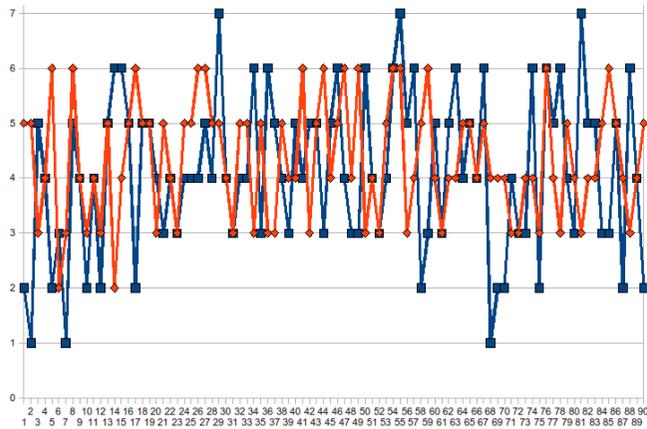
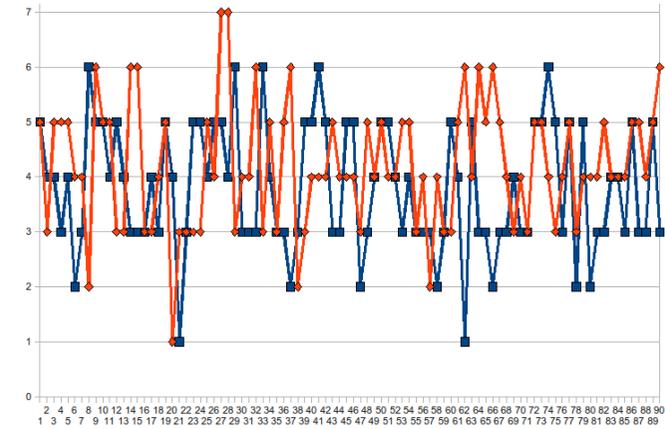
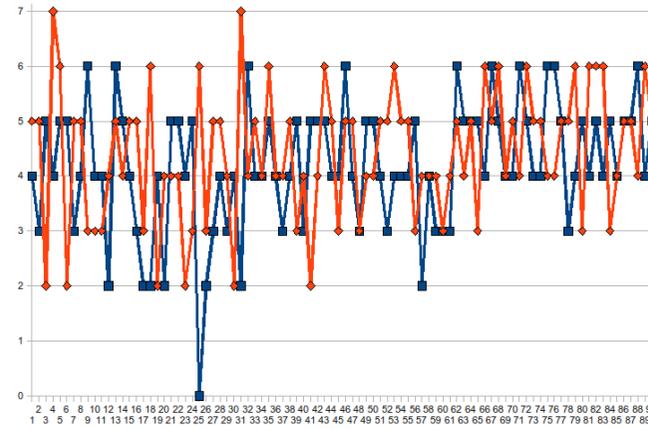
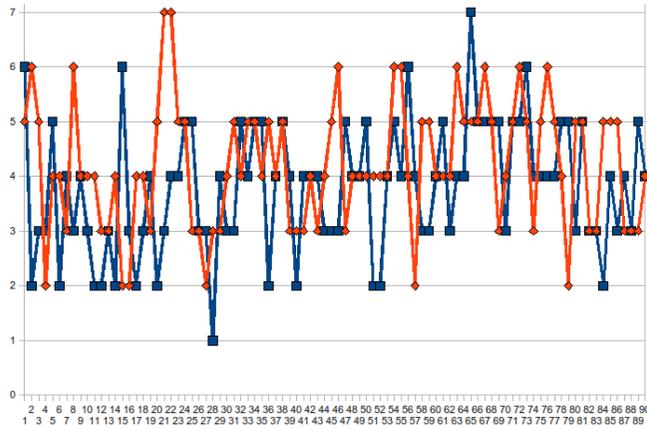
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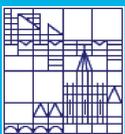




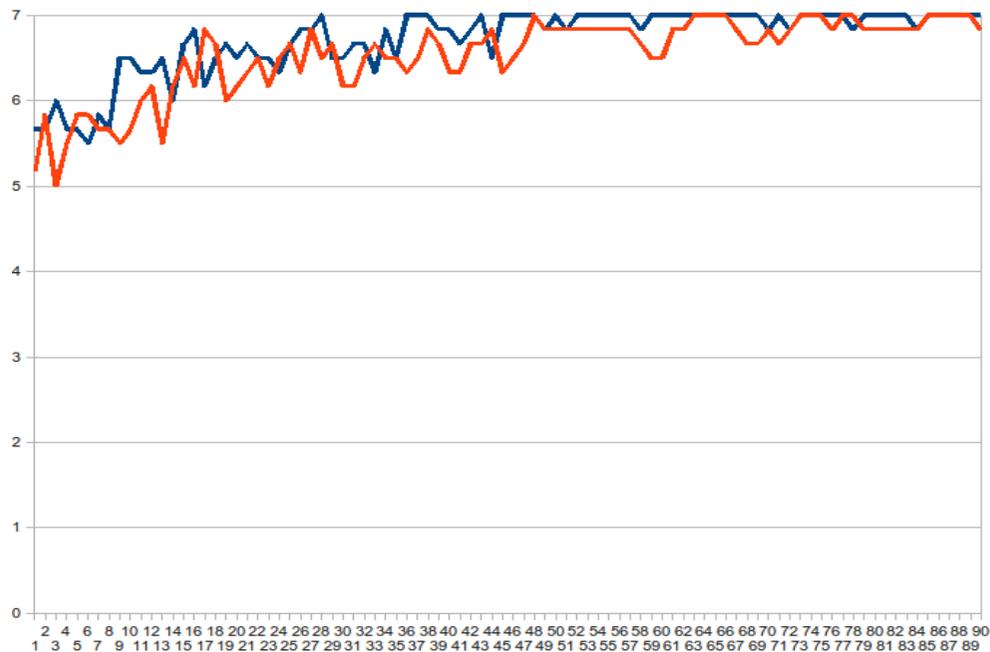
Treatment 2

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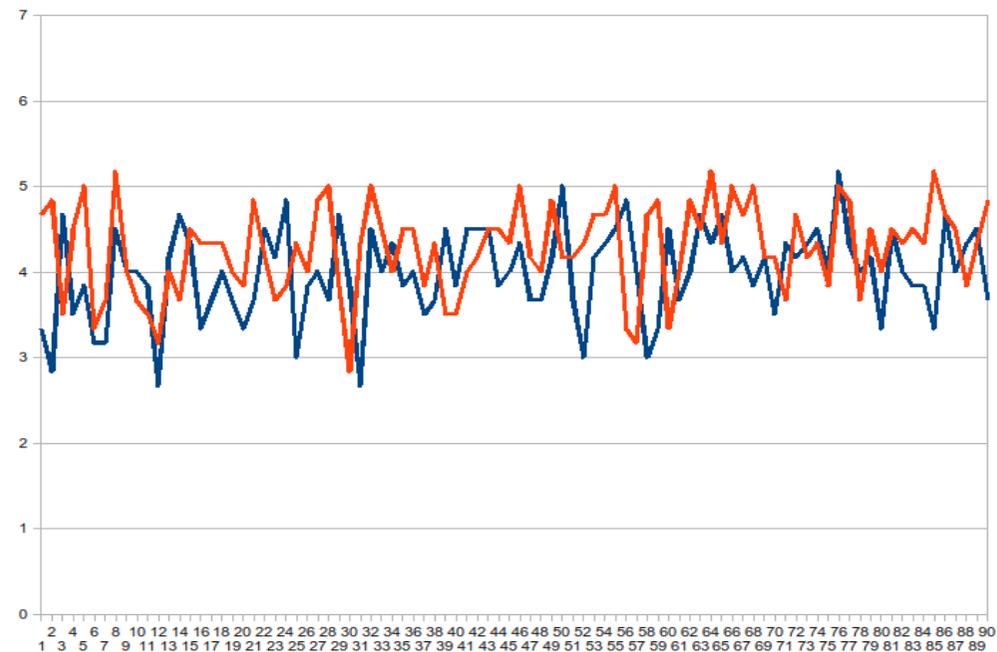




Average Plots

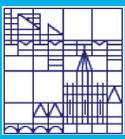


Treatment 1

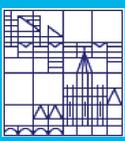


Treatment 2

- ▶ In line with model predictions.
- ▶ If there is a unique stochastically stable institution, convergence is observed.
- ▶ If there are two stochastically stable institutions, both remain active.

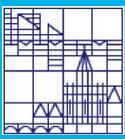


Conclusion



Conclusion

- ▶ Market-clearing institutions are “dynamically attractive”, they will always be observed (if available) in the long run.
Maybe this is not good news. Are job “black markets” market-clearing?
- ▶ But, depending on design details, coordination in other market institutions might also occur.
This has consequences for the game played among designers (Alós-Ferrer, Kirchsteiger, and Walzl 2010).
- ▶ Not just a “stylized theoretical model” result.
 - ◇ A version of this result holds for general equilibrium (exchange) settings with n goods and heterogeneous traders (Alós-Ferrer and Kirchsteiger, 2010).
 - ◇ Stochastic stability entails a double limit ($t \rightarrow \infty, \varepsilon \rightarrow 0$) but results also have meaning in the lab.



Thank You for Your Attention