

ECO 426 (Market Design) - Lecture 3

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one-sided strategy proofness

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- If the true preferences are such that there is only one stable matching, no agent can benefit from misreporting their preferences
 - the unique stable matching is the outcome of both the DA men and DA women proposing algorithm
- When there are multiple stable matchings, **how much can a woman gain by manipulating her preferences in the DA men proposing mechanism?**

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 - The manipulation strategy is informationally demanding

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- Agents who are unmatched in a stable matching, are unmatched in all stable matchings (rural hospital theorem), hence they cannot gain from preference manipulation.

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 - if s is employed by h_1 the couple and the two hospitals “block”

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- Probability that a stable matching exists with a fixed number of couples converges to one as the number of agents grows.
 - Consistent with practice - NRMP has always been able to find a stable matching

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- What allocations would we expect to arise if agents can freely dispose of their endowment?

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$$\mu_S : S \rightarrow H_S.$$

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Gale's Top trading cycle algorithm

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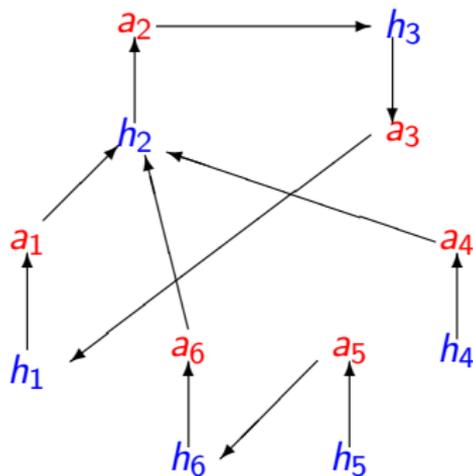
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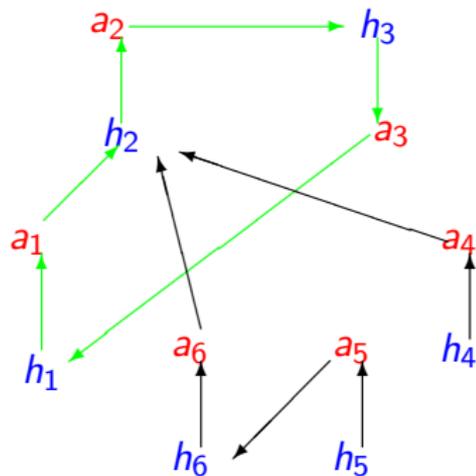
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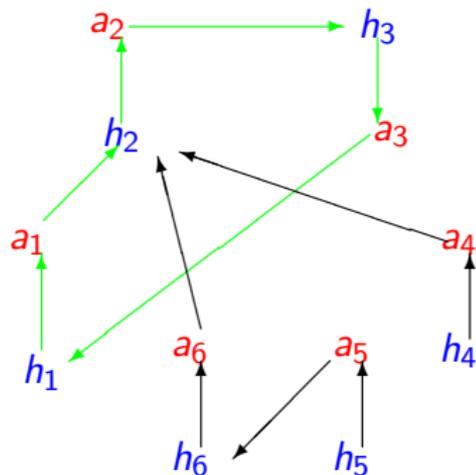
Housing Market - TTC

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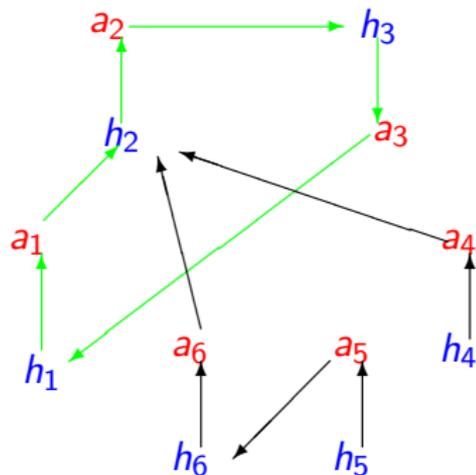
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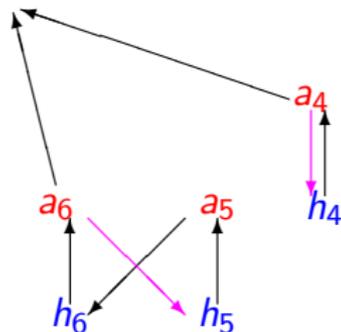
- remove all cycles assigning houses to agents
 - agents within a cycle exchange houses among each others

Housing Market - TTC

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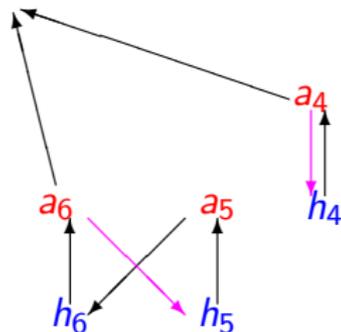
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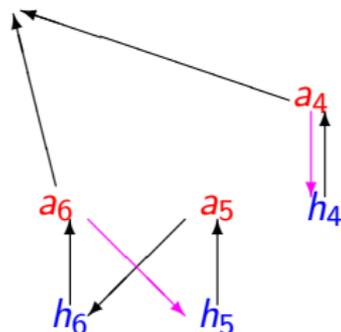
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- remove all cycles assigning houses to agents
- continue until no agent/house is left

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 - preference manipulation cannot give the agent a house that was assigned earlier than round n .
- getting an house that was assigned in a round later than n does not make the agent better off.

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