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## More Connections Are Not Always Better Braess-like Paradoxes on a Bipartite Transaction Network

RANDALL LAVIOLETTE and VITUS LEUNG  
**Sandia National Laboratories, NM**

INFORMS 2009

Sandia is a multiprogram laboratory operated by Sandia Corporation, a Lockheed Martin Company, for the United States Department of Energy's National Nuclear Security Administration under contract DE-AC04-94AL85000.



# Naive Exchange Model

Budget-Constrained Bilateral Exchange of One Good with Unit Price<sup>1</sup>

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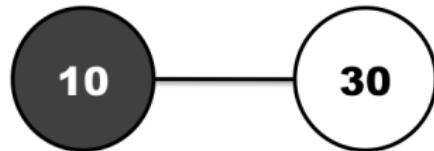
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- **Bilateral exchange must occur if feasible**



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<sup>1</sup>e.g., "Emergence of Price Divergence in a Model Short-Term Electric Power Market." LaViolette, Ellebracht, Stamber, Gieseler & Cook. <http://arxiv.org/abs/0905.2366>.

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- Bilateral exchange must occur if feasible
  - Buyer has finite demand



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- Bilateral exchange must occur if feasible
  - Buyer has finite demand
  - Seller has finite supply



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- Bilateral exchange must occur if feasible
  - Buyer has finite demand
  - Seller has finite supply
  - **There is a link between them**



---

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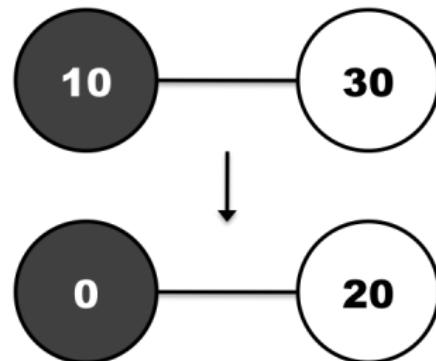
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- Bilateral exchange must occur if feasible

- Buyer has finite demand
- Seller has finite supply
- There is a link between them

- Maximum possible exchange must occur



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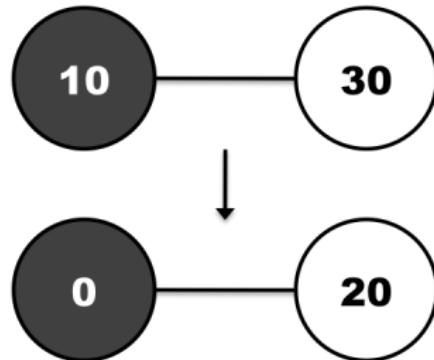
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- Bilateral exchange must occur if feasible
  - Buyer has finite demand
  - Seller has finite supply
  - There is a link between them
- Maximum possible exchange must occur
  - No holding back



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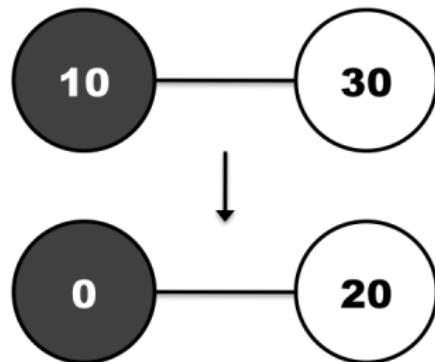
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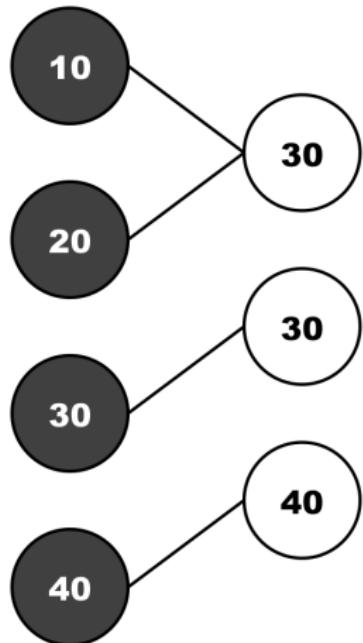
- Bilateral exchange must occur if feasible
  - Buyer has finite demand
  - Seller has finite supply
  - There is a link between them
- Maximum possible exchange must occur
  - No holding back
  - **No further exchange**



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# Naive Exchange Model

Statement of the Problem for Asynchronous Exchange on a Bipartite Graph



- Example of transactions on a multicomponent bipartite graph (buyers: gray, sellers: white)

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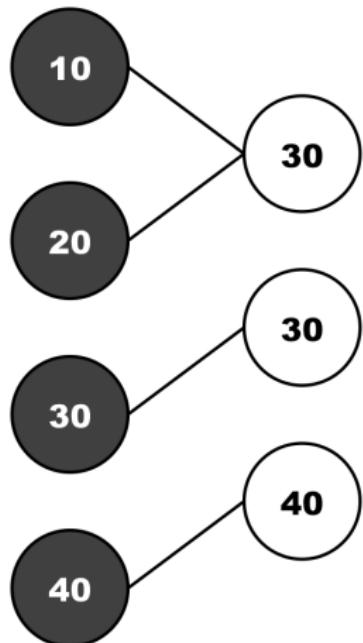
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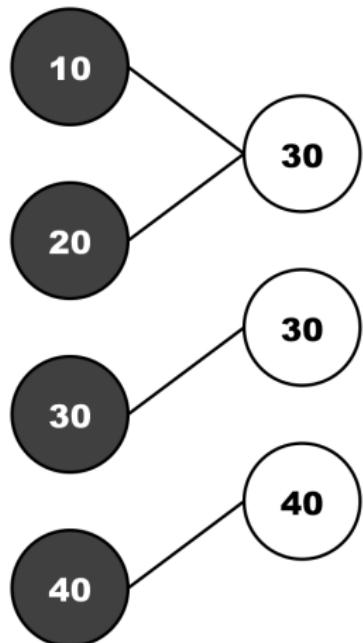
## Statement of the Problem for Asynchronous Exchange on a Bipartite Graph



- Example of transactions on a multicomponent bipartite graph (buyers: gray, sellers: white)
- In this example, all demands can be met regardless of the order in which transactions occur

# Naive Exchange Model

## Statement of the Problem for Asynchronous Exchange on a Bipartite Graph



- Example of transactions on a multicomponent bipartite graph (buyers: gray, sellers: white)
- In this example, all demands can be met regardless of the order in which transactions occur
- **What is necessary and sufficient for that to be true?**

# How to Connect For Success?

## Necessary and Sufficient Conditions

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always works

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### Definition

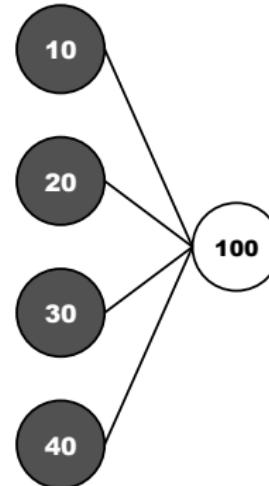
*A trading session on the graph consists of one of the (up to  $L!$ ) possible sequences of all possible trades on the graph of  $L$  links.*

### Theorem

*Given that supply equals demand, the demands are reduced to zero at the end of every trading session iff each component (for which, within that component, supply equals demand) is complete bipartite.*

# How to Connect For Success?

Example: Star graph (local monopoly) always works



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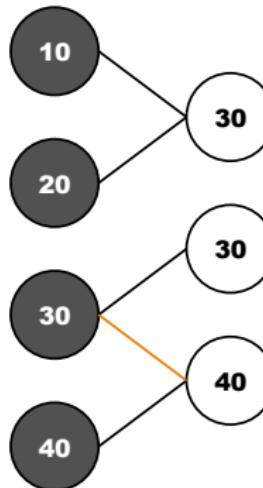
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Example: Starvation on an incomplete component



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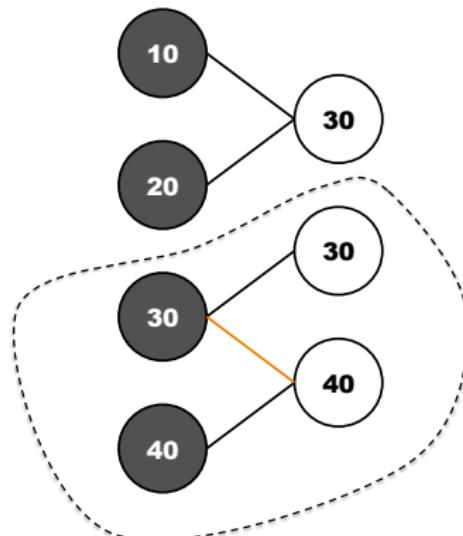
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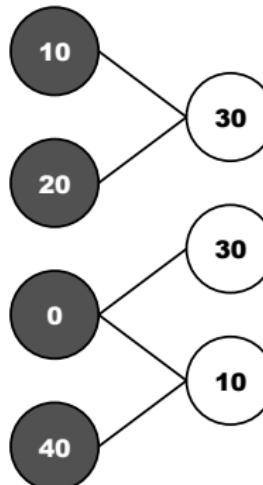
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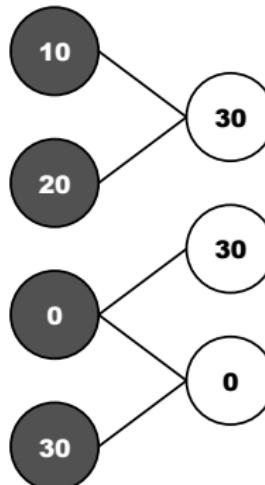
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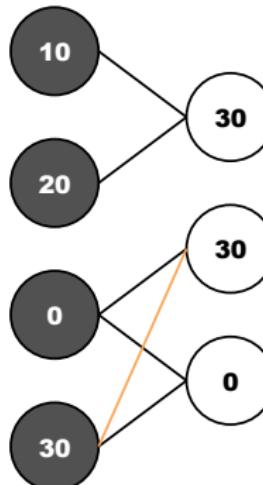
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## Enumeration

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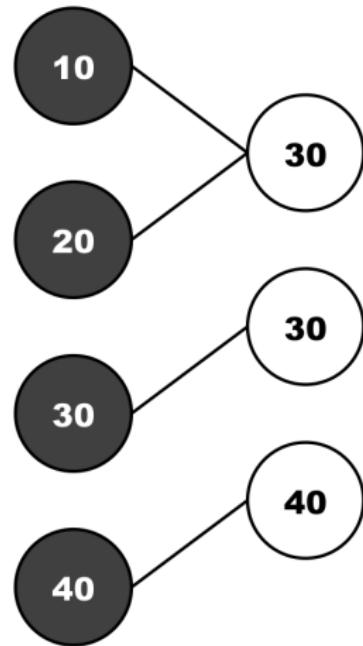
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- Begin with the minimally connected example (four links) and add all possible links one at a time



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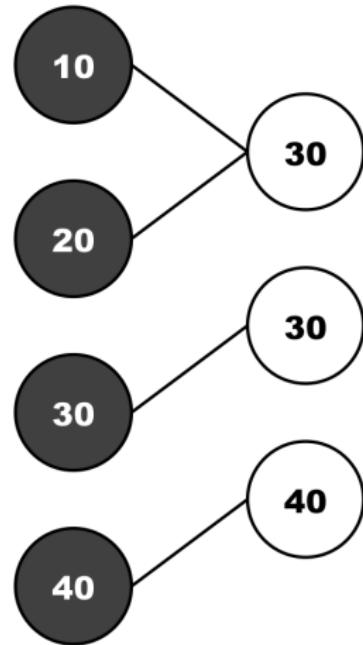
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- Begin with the minimally connected example (four links) and add all possible links one at a time
- Record the fraction of trading sessions that do NOT meet demand ("infeasible")



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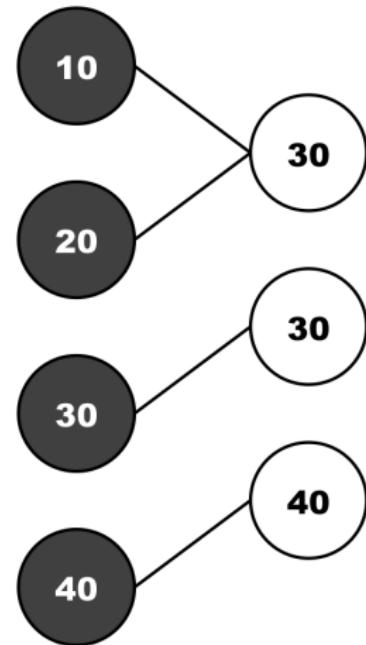
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- Begin with the minimally connected example (four links) and add all possible links one at a time
- Record the fraction of trading sessions that do NOT meet demand ("infeasible")
- **Also record the maximum demand left unmet after each trading session**



# How to Connect For Success?

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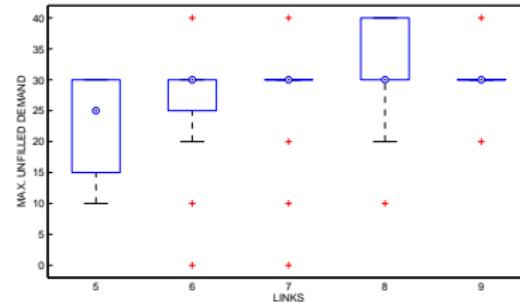
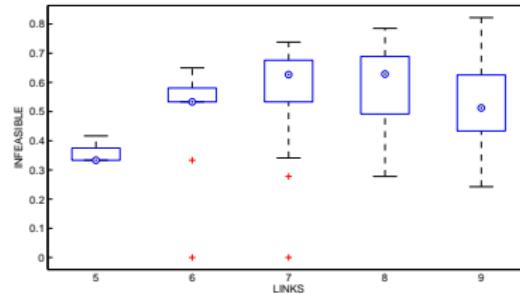
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What Reserves Would Be Needed to Meet Demand?

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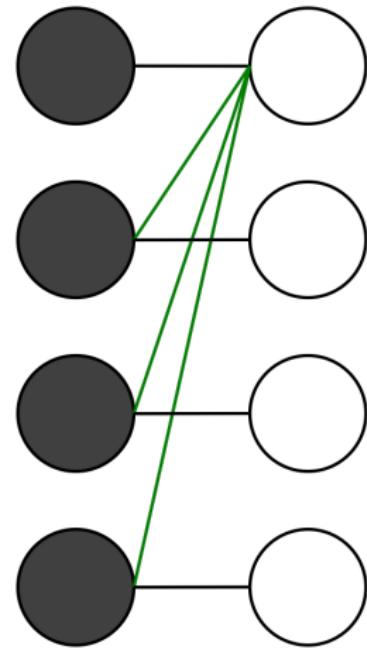
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## Lower Bound

*The reserves that would be required by sellers in order to meet demand in the worst case has a lower bound that is proportional to the number of buyers.*



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## Tomorrow's "Smart Grid"

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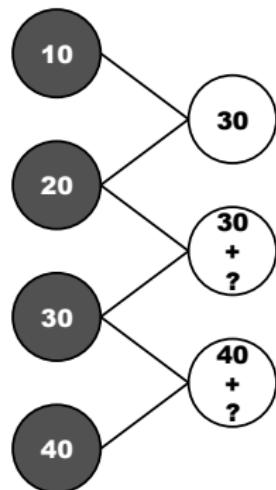
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Conclusions

- “Smart Grid” has the potential to turn  $5 \times 10^7$  households into market points (from 200 now)<sup>a</sup>



<sup>a</sup> “A Smart Grid is a Transactive Grid.” Kieseling.  
[http://knowledgeproblem.com/2009/03/03/  
a-smart-grid-is-a-transactive-grid-part-2-of-5/](http://knowledgeproblem.com/2009/03/03/a-smart-grid-is-a-transactive-grid-part-2-of-5/)

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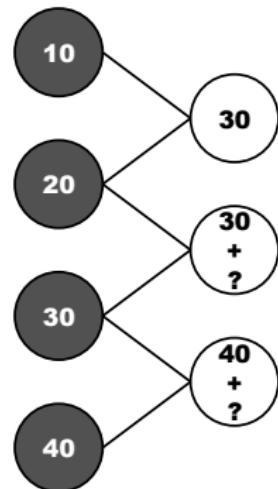
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- Savings are supposed to result from lower reserve requirements



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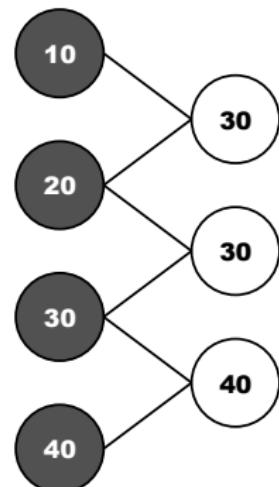
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Conclusions

- "Smart Grid" has the potential to turn  $5 \times 10^7$  households into market points (from 200 now)<sup>a</sup>
- Savings are supposed to result from lower reserve requirements
- Meeting demand with lower reserves may be more difficult than advertised



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- Proved necessary and sufficient topological conditions for naive model (asynchronous bilateral unit-price) transactions to satisfy demand on a bipartite graph

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  - Star-graph/local-monopoly always works for this model

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- Proved necessary and sufficient topological conditions for naive model (asynchronous bilateral unit-price) transactions to satisfy demand on a bipartite graph
  - Star-graph/local-monopoly always works for this model
  - **Otherwise maintaining complete components may be challenging**

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Conclusions

- Proved necessary and sufficient topological conditions for naive model (asynchronous bilateral unit-price) transactions to satisfy demand on a bipartite graph
  - Star-graph/local-monopoly always works for this model
  - Otherwise maintaining complete components may be challenging
- Enumeration and Lower Bounds show that reserve requirements (or unmet demand) could be large if these conditions were not satisfied