

SAND2009-6581C

More  
Connections  
Are Not  
Always Better

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Naive  
Exchange  
Model

How to  
Connect For  
Success?

Why We Care

Conclusions

# More Connections Are Not Always Better

## Braess-like Paradoxes on a Bipartite Transaction Network

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**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.



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

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Always Better

## Naive Exchange Model

## Statement of the Problem

## Why We Care

## Conclusions

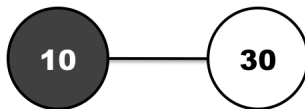
- 
- A diagram showing two nodes, 10 and 30, connected by a horizontal line. Node 10 is a dark gray circle on the left, and node 30 is a white circle on the right. They are connected by a solid black horizontal line.

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# Naive Exchange Model

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

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

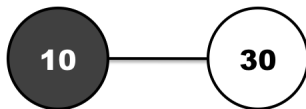


<sup>1</sup>e.g., "Emergence of Price Divergence in a Model Short-Term Electric Power Market." LaViolette, Ellebracht, Stamber, Gieseler & Cook. <http://arxiv.org/abs/0905.2366>.

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

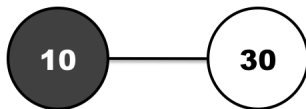


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# Naive Exchange Model

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

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

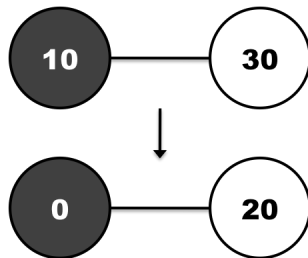


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Budget-Constrained Bilateral Exchange of One Good with Unit Price<sup>1</sup>

- 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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Exchange  
Model

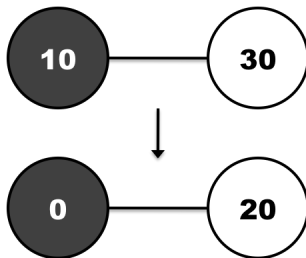
Bilateral  
Exchange  
Statement of the  
Problem

How to  
Connect For  
Success?

Why We Care

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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**



<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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Exchange  
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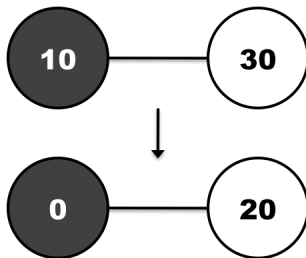
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Exchange  
Statement of the  
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How to  
Connect For  
Success?

Why We Care

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- Bilateral exchange must occur if feasible
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  - There is a link between them
- Maximum possible exchange must occur
  - No holding back
  - **No further exchange**



<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>.



# Naive Exchange Model

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

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Exchange  
Model

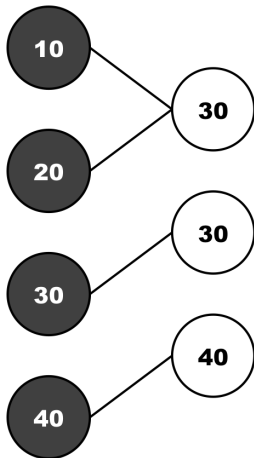
Bilateral  
Exchange

Statement of the  
Problem

How to  
Connect For  
Success?

Why We Care

Conclusions



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

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Connections  
Are Not  
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Naive  
Exchange  
Model

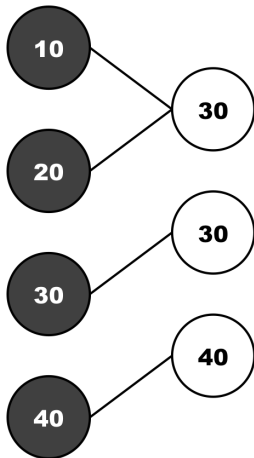
Bilateral  
Exchange

Statement of the  
Problem

How to  
Connect For  
Success?

Why We Care

Conclusions



- 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

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Connections  
Are Not  
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Exchange  
Model

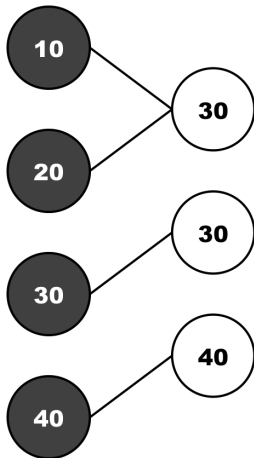
Bilateral  
Exchange

Statement of the  
Problem

How to  
Connect For  
Success?

Why We Care

Conclusions



- 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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Naive  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

Example: Star  
graph (local  
monopoly)  
always works

Example:  
Starvation on an  
incomplete  
component

Enumeration  
Worst Case  
Reserves

Why We Care

Conclusions

### Definition

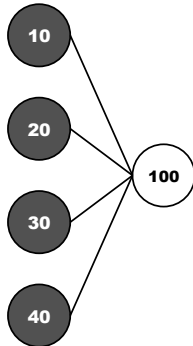
*A trading session on the graph consists of one of the (up to  $L!$ ) possible sequences of all possible trades on the graph of  $L$  links.*

### 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.*

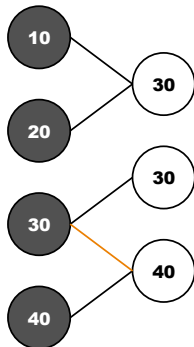
# How to Connect For Success?

Example: Star graph (local monopoly) always works



# How to Connect For Success?

Example: Starvation on an incomplete component



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Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
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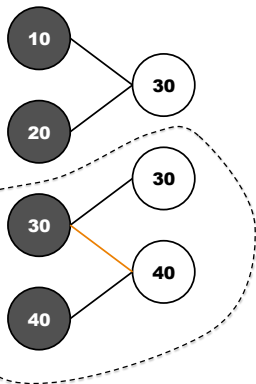
Enumeration  
Worst Case  
Reserves

Why We Care

Conclusions

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Example: Starvation on an incomplete component



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Connections  
Are Not  
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Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

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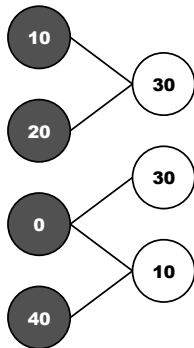
Enumeration  
Worst Case  
Reserves

Why We Care

Conclusions

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Connections  
Are Not  
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Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

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Enumeration  
Worst Case  
Reserves

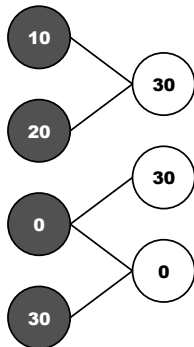
Why We Care

Conclusions



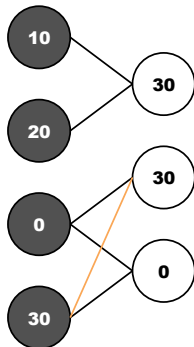
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Connections  
Are Not  
Always Better

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Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

Example: Star  
graph (local  
monopoly)  
always works

Example:  
Starvation on an  
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component

Enumeration  
Worst Case  
Reserves

Why We Care

Conclusions

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## Enumeration

More  
Connections  
Are Not  
Always Better

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National  
Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
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Starvation on an  
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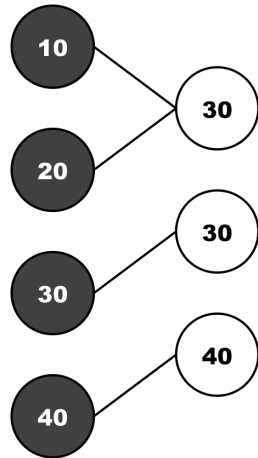
Enumeration

Worst Case  
Reserves

Why We Care

Conclusions

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



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More  
Connections  
Are Not  
Always Better

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National  
Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
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Starvation on an  
incomplete  
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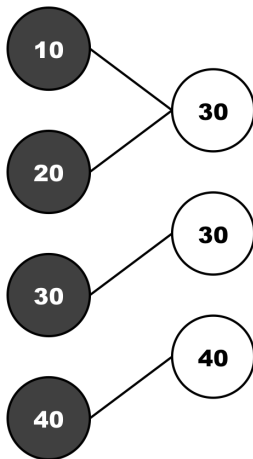
Enumeration

Worst Case  
Reserves

Why We Care

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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”)



# How to Connect For Success?

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More  
Connections  
Are Not  
Always Better

Sandia  
National  
Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
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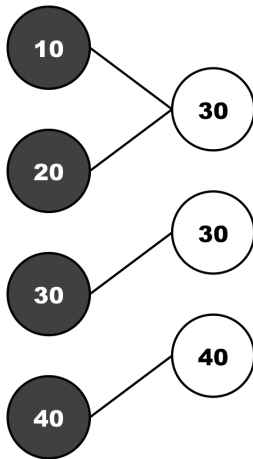
Enumeration

Worst Case  
Reserves

Why We Care

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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?

## Enumeration

More  
Connections  
Are Not  
Always Better

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Laboratories

Naïve  
Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

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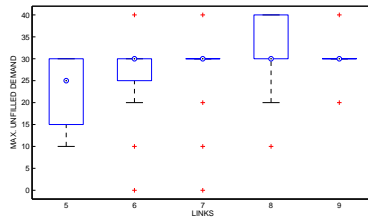
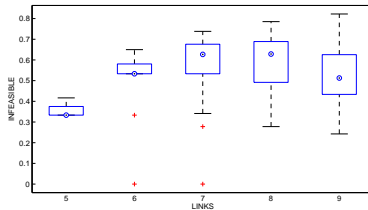
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Starvation on an  
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component

Enumeration

Worst Case  
Reserves

Why We Care

Conclusions



# How to Connect For Success?

What Reserves Would Be Needed to Meet Demand?

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Exchange  
Model

How to  
Connect For  
Success?

Necessary and  
Sufficient  
Conditions

Example: Star  
graph (local  
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Starvation on an  
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component

Enumeration

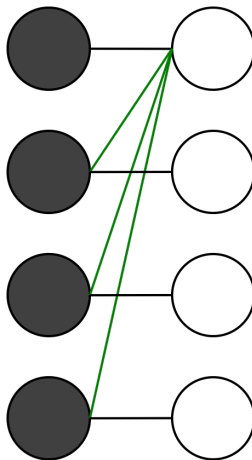
Worst Case  
Reserves

Why We Care

Conclusions

## Lower Bound

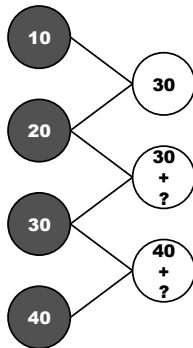
*The reserves that would be required by sellers in order to meet demand in the worst case has a lower bound that is proportional to the number of buyers.*



# Why We Care

## Tomorrow's "Smart Grid"

- "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/>



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Are Not  
Always Better

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## Naive Exchange Model

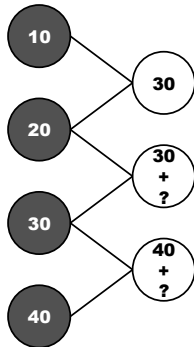
## How to Connect For Success?

## Why We Care

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- Savings are supposed to result from lower reserve requirements



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Connections  
Are Not  
Always Better

Sandia  
National  
Laboratories

Naive  
Exchange  
Model

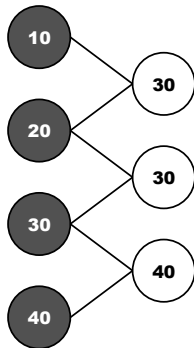
How to  
Connect For  
Success?

Why We Care

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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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Connections  
Are Not  
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Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Why We Care

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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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More  
Connections  
Are Not  
Always Better

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National  
Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Why We Care

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

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More  
Connections  
Are Not  
Always Better

Sandia  
National  
Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Why We Care

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Connections  
Are Not  
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Sandia  
National  
Laboratories

Naive  
Exchange  
Model

How to  
Connect For  
Success?

Why We Care

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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
- Enumeration and Lower Bounds show that reserve requirements (or unmet demand) could be large if these conditions were not satisfied