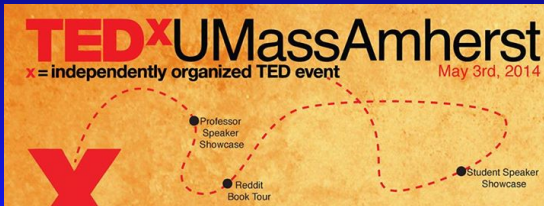


# The Traffic Circle of Life

Anna Nagurney

John F. Smith Memorial Professor  
Department of Operations & Information Management  
Isenberg School of Management

*TEDxUMassAmherst, Professor Speaker Showcase  
November 25, 2013*



*Special thanks to the organizers of this very special event – it is an honor to be here tonight.*

Also, sincerest thanks to all the great students at UMass Amherst, present, past, and future who continue to think past boundaries and build bridges across disciplines.

## Life is about *Choices*:

- from **which college** to attend
- to **which major** you pick
- to the **job offer** that you accept or **grad school** that you go to,
- to where you decide to **live (and with whom)**, and even
- to the **mode of transport** you chose to get to this event tonight and **the route** that you took.

And the choices that you make affect not only you but others who are journeying with you through the various networks.





# We Are in a New Era of Decision-Making Characterized by:

- ▶ *complex interactions* among decision-makers in organizations;
- ▶ *alternative and, at times, conflicting criteria* used in decision-making;
- ▶ *constraints on resources*: human, financial, natural, time, etc.;
- ▶ *global reach* of many decisions;
- ▶ *high impact* of many decisions;
- ▶ *increasing risk and uncertainty*;
- ▶ the *importance of dynamics* and realizing a timely response to evolving events.

# The Era of Supernetworks

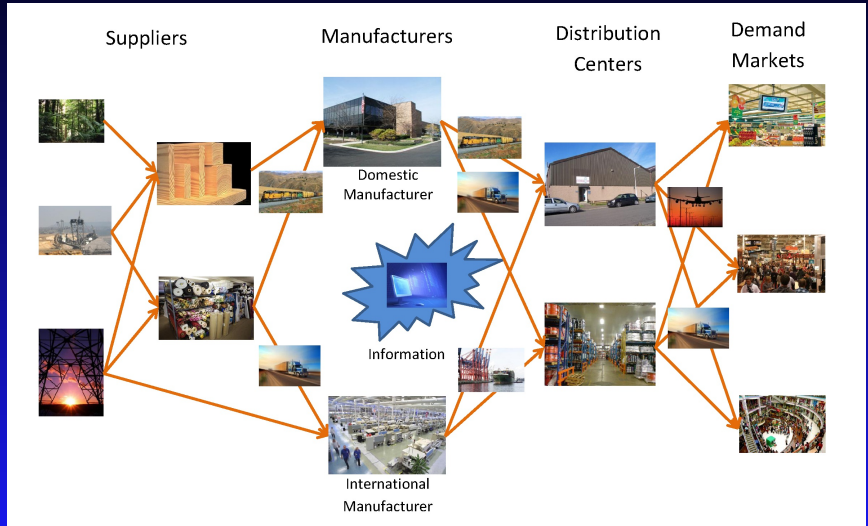
Supernetworks are *Networks of Networks*, and their prevalence in the world around us is illustrated by:

- *multimodal transportation networks;*
- *complex supply chain networks consisting of manufacturers, shippers and carriers, distributors, and retailers;*
- *electric power generation and distribution networks,*
- *multitiered financial networks,* and
- *social network platforms such as Facebook and Twitter,* along with the Internet itself.

# Multimodal Transportation



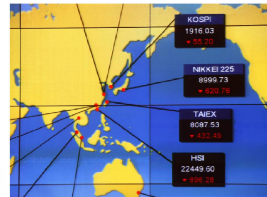
# Complex Supply Chain Networks



# Electric Power Generation and Distribution Networks



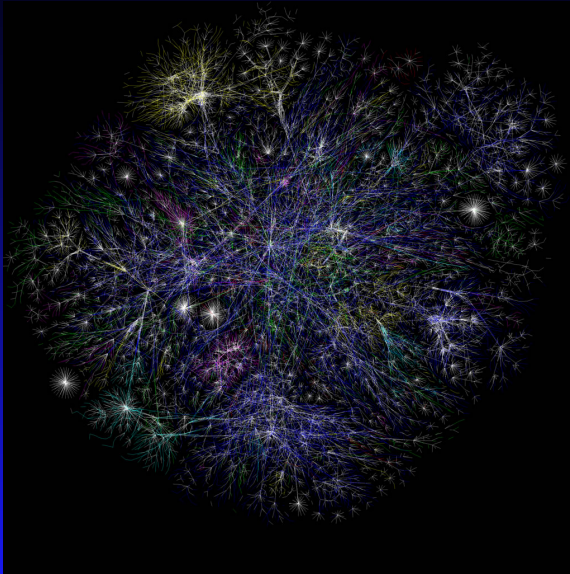
# Financial Networks



# Social Networks



# Visual Image of the Internet (opte.org)





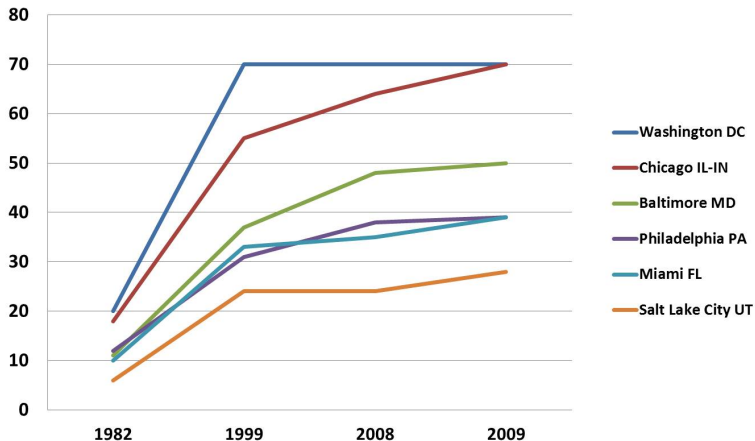
# Characteristics of Networks Today

# Characteristics of Networks Today

- ▶ *large-scale nature* and complexity of network topology;
- ▶ *congestion*, which leads to nonlinearities;
- ▶ *alternative behavior of users of the networks*, which may lead to paradoxical phenomena;
- ▶ *possibly conflicting criteria associated with optimization*;
- ▶ *interactions among the underlying networks themselves*, such as the Internet with electric power, financial, and transportation and logistical networks;
- ▶ recognition of *their fragility and vulnerability*;
- ▶ policies surrounding networks today may have major impacts not only economically, but also *socially, politically, and security-wise*.

# Congestion Delay for Commuters

Congestion Trends-Yearly Hours of Delay per Auto Commuter

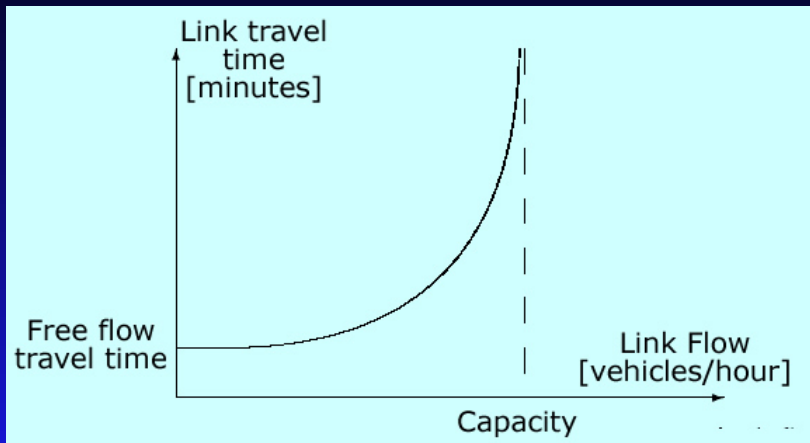


Congestion costs continue to rise: *the cost of congestion has risen from \$24 billion in 1982 to \$121 billion in 2011 in the United States.*

The average commuter spent an extra 38 hours traveling in 2011, up from 16 hours in 1982. In areas with over 3 million persons, commuters experienced an average of 52 hours of delay in 2011.

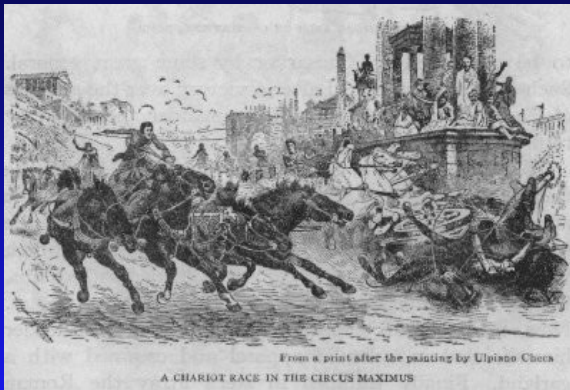
In 2011, *2.9 billion gallons of wasted fuel – enough to fill 4 New Orleans Superdomes.*

# Capturing Link Congestion



# Congestion is Not a New Phenomenon

The study of the efficient operation of transportation networks dates to ancient Rome. The Romans instituted a *time of day chariot policy*, whereby chariots were banned from Rome at particular times of day.

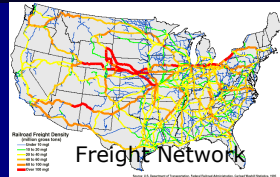


From a print after the painting by Ulpiano Checa  
A CHARIOT RACE IN THE CIRCUS MAXIMUS

# Congestion as the West was Won



# Some Network Systems

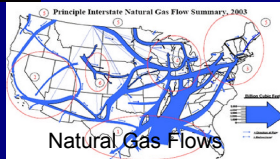
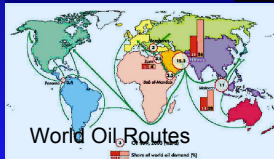


Network

Internet Traffic

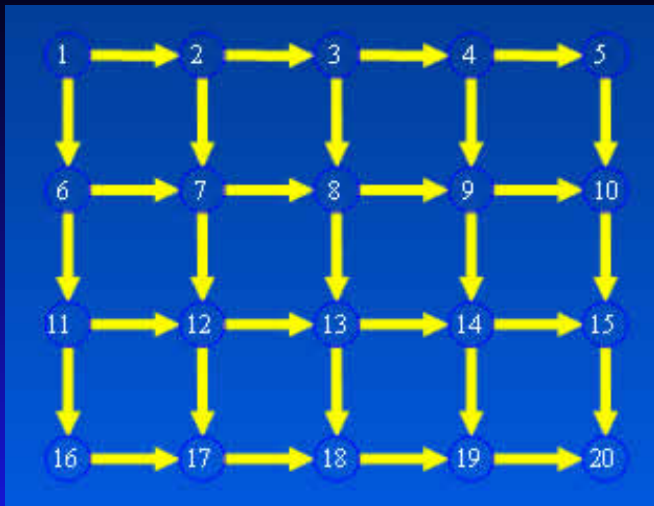


Systems



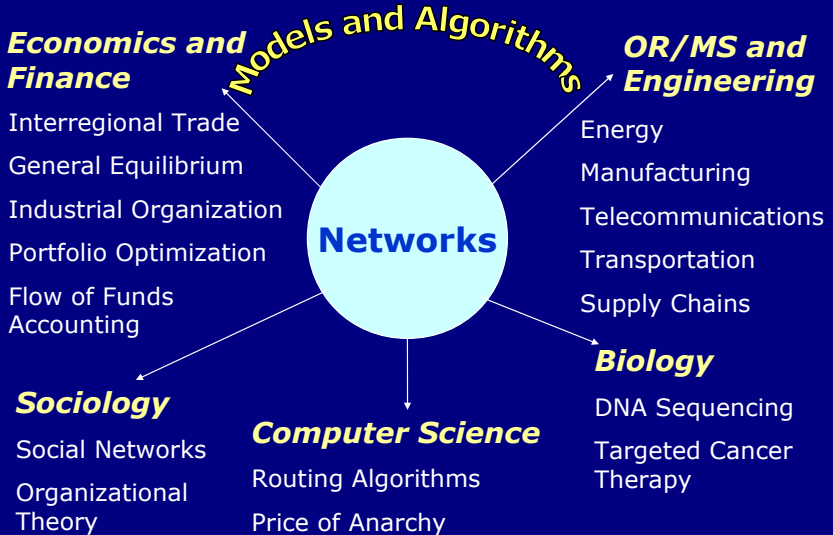


# Network Components



The components of networks as a theoretical (modeling, analysis, and solution) construct include: nodes, links, and flows.

# *Interdisciplinary Impact of Networks*



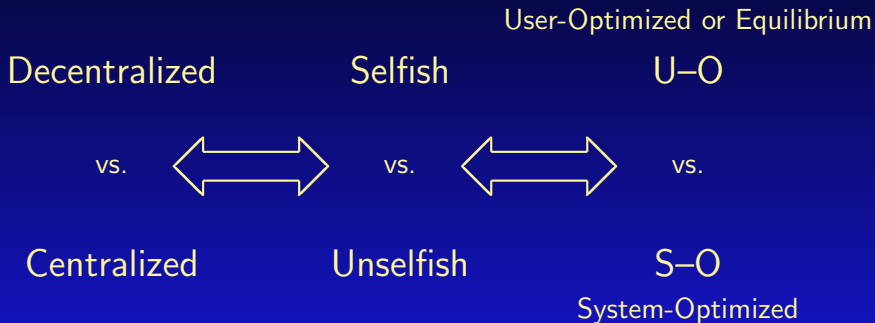
# Why Behavior Matters and Paradoxes

# Network Models from Analysis to Design Must Capture the Behavior of Users



# Behavior on Congested Networks

*Flows are routed on individual cost-minimizing routes.*



*Flows are routed so as to minimize the total cost.*

Two fundamental principles of flow (traffic) behavior, due to Wardrop (1952), with terms coined by Dafermos and Sparrow (1969).

*User-optimized (U-O) (network equilibrium) Problem* – each user determines his/her cost-minimizing route of travel between an origin/destination, until an equilibrium is reached.

*System-optimized (S-O) Problem* – users are allocated among the routes so as to minimize the total cost in the system.

*We Can State These Conditions Mathematically!*

# The U-O and S-O Conditions

## Definition: U-O or Network Equilibrium – Fixed Demands

A path flow pattern  $x^*$ , with nonnegative path flows and O/D pair demand satisfaction, is said to be U-O or in equilibrium, if the following condition holds for each O/D pair  $w \in W$  and each path  $p \in P_w$ :

$$C_p(x^*) \begin{cases} = \lambda_w, & \text{if } x_p^* > 0, \\ \geq \lambda_w, & \text{if } x_p^* = 0. \end{cases}$$

## Definition: S-O Conditions

A path flow pattern  $x$  with nonnegative path flows and O/D pair demand satisfaction, is said to be S-O, if for each O/D pair  $w \in W$  and each path  $p \in P_w$ :

$$\hat{C}'_p(x) \begin{cases} = \mu_w, & \text{if } x_p > 0, \\ \geq \mu_w, & \text{if } x_p = 0, \end{cases}$$

where  $\hat{C}'_p(x) = \sum_{a \in \mathcal{L}} \frac{\partial \hat{c}_a(f_a)}{\partial f_a} \delta_{ap}$ , and  $\mu_w$  is a Lagrange multiplier.



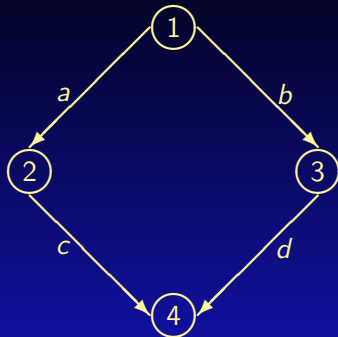
*The Braess Paradox Illustrates  
Why Behavior on Networks is Important*

# The Braess (1968) Paradox

Assume a network with a single O/D pair (1,4). There are 2 paths available to travelers:  $p_1 = (a, c)$  and  $p_2 = (b, d)$ .

For a travel demand of **6**, the equilibrium path flows are  $x_{p_1}^* = x_{p_2}^* = 3$  and

The equilibrium path travel cost is  
 $C_{p_1} = C_{p_2} = 83$ .



$$\begin{aligned}c_a(f_a) &= 10f_a, & c_b(f_b) &= f_b + 50, \\c_c(f_c) &= f_c + 50, & c_d(f_d) &= 10f_d.\end{aligned}$$

# Adding a Link Increases Travel Cost for All!

Adding a new link creates a new path  $p_3 = (a, e, d)$ .

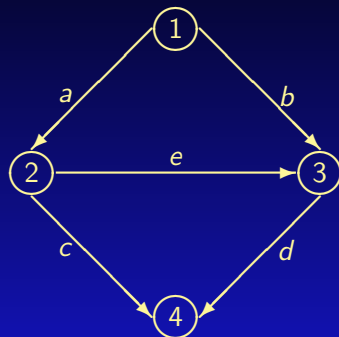
The original flow distribution pattern is no longer an equilibrium pattern, since at this level of flow the cost on path  $p_3$ ,  $C_{p_3} = 70$ .

The new equilibrium flow pattern network is

$$x_{p_1}^* = x_{p_2}^* = x_{p_3}^* = 2.$$

The equilibrium path travel cost:

$$C_{p_1} = C_{p_2} = C_{p_3} = 92.$$



$$c_e(f_e) = f_e + 10$$

Under S-O behavior, the total cost in the network is minimized, and the new route  $p_3$ , under the same demand of 6, would not be used.

*The Braess paradox never occurs in S-O networks.*

The 1968 Braess article has been translated from German to English and appears as:

D. Braess, A. Nagurney, and T. Wakolbinger (2005)  
*Transportation Science* **39**, 446-450.



# The Braess Paradox Around the World



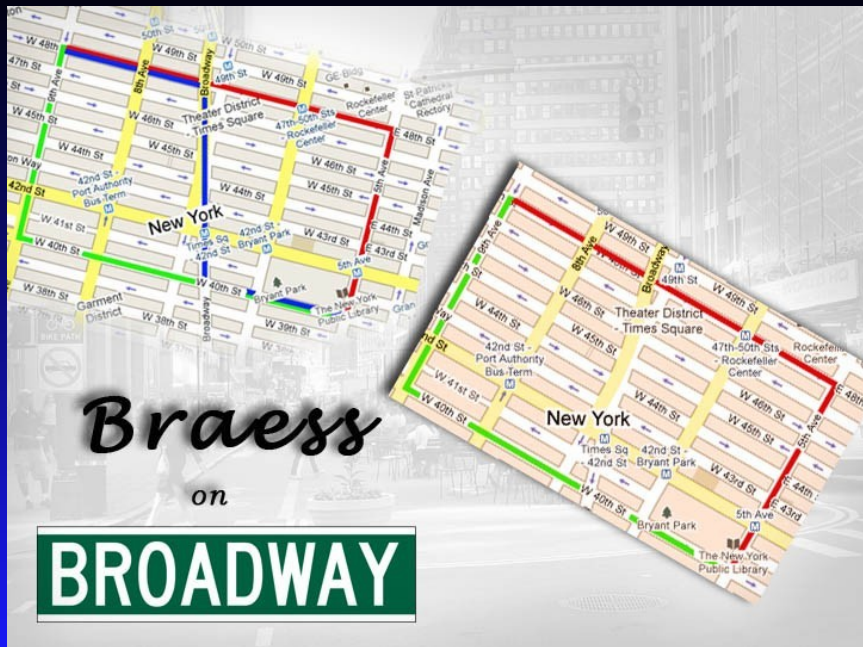
1969 - Stuttgart, Germany - The traffic worsened until a newly built road was closed.

1990 - Earth Day - New York City - 42<sup>nd</sup> Street was closed and traffic flow improved.



2002 - Seoul, Korea - A 6 lane road built over the Cheonggyecheon River that carried 160,000 cars per day and was perpetually jammed was torn down to improve traffic flow.



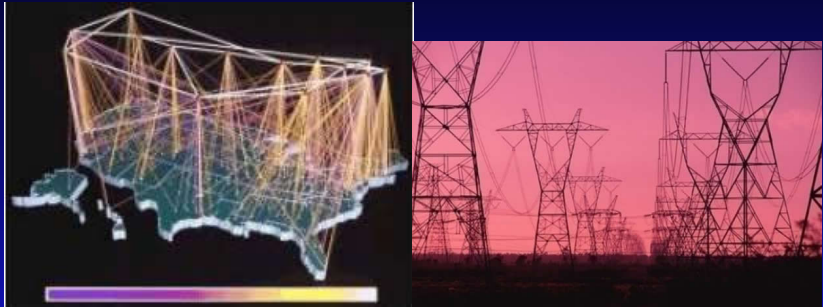


# Interview on Broadway for *America Revealed* on March 15, 2011

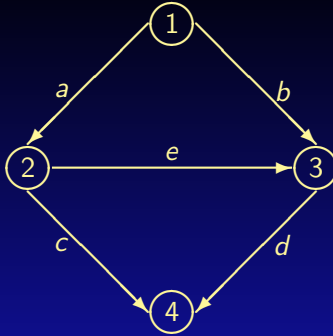




# Other Networks that Behave like Traffic Networks



The Internet, electric power networks, supply chains, and even multitiered financial networks!



Recall the Braess network with the added link  $e$ .

*What happens as the demand changes over time?*

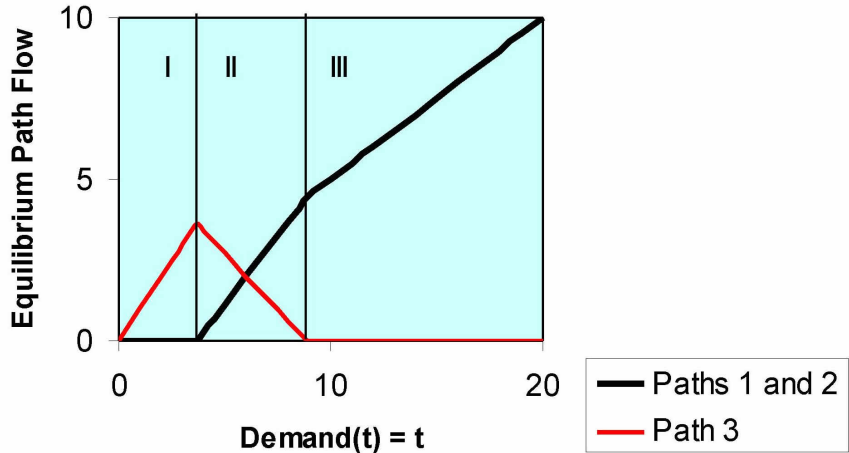
*For Networks with Time-Dependent Demands  
We Use Evolutionary Variational Inequalities*

# Radcliffe Institute for Advanced Study – Harvard University 2005-2006



Research with Professor David Parkes of Harvard University and  
Professor Patrizia Daniele of the University of Catania, Italy

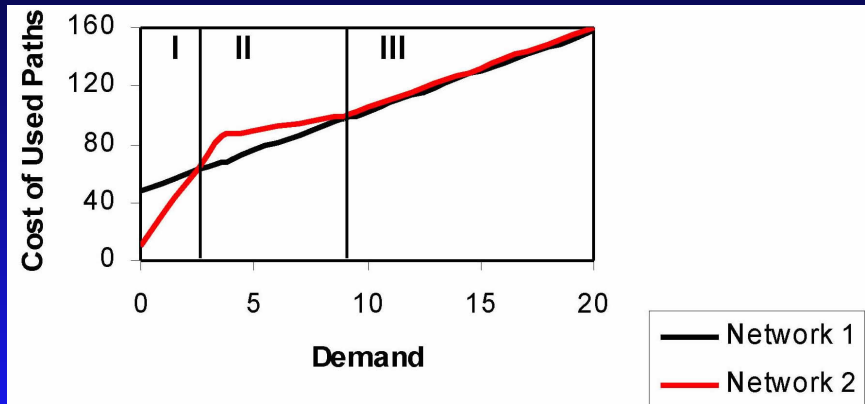
The U-O Solution of the Braess Network with Added Link (Path) and Time-Varying Demands Solved as an *Evolutionary Variational Inequality* in a Model of the **Internet** (Nagurney, Daniele, and Parkes (2007)).



In Demand Regime I, **Only the New Path is Used.**

In Demand Regime II, the demand lies in the range [2.58, 8.89],  
and *the Addition of a New Link (Path) Makes Everyone Worse Off!*

In Demand Regime III, when the demand exceeds 8.89, **Only the Original Paths are Used!**

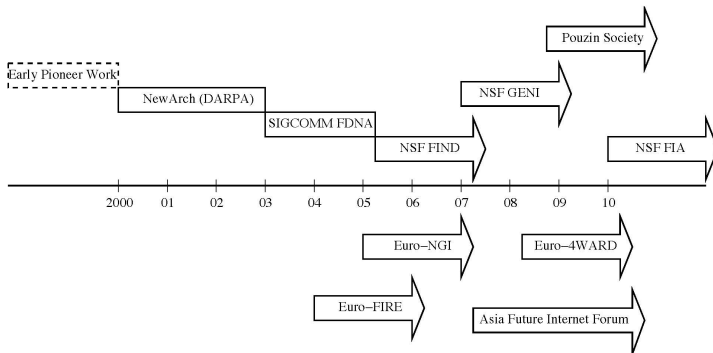


*The new path is never used, under U-O behavior,  
when the demand exceeds 8.89, even out to infinity!*

# From Transportation to the Internet



## Historical Perspective



# The Existing Internet

Much of the Internet's success comes from its ability to support a wide range of service at the edge of the network.

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However, the Internet offers little choice of service inside the network.

It is widely agreed that this limitation inhibits the development and deployment of new networking services, protocols, security designs, management frameworks, and other components that are essential to support the increasingly diverse systems, applications, and communication paradigms of **the next-generation Internet**.

# Envisioning a New Kind of Internet – ChoiceNet

# Envisioning a New Kind of Internet



We are one of five teams funded by NSF as part of the Future Internet Architecture (FIA) project.

Our project is: *Network Innovation Through Choice* and the envisioned architecture is *ChoiceNet* with UMass Amherst as the lead.

## Team:

University of Kentucky: Jim Griffioen, Ken Calvert

North Carolina State University:  
Rudra Dutta, George Rouskas

RENCI/UNC: Ilia Baldine

University of Massachusetts Amherst:  
Tilman Wolf, Anna Nagurney

# ChoiceNet Goals

- Expose choices throughout the network
  - Network is no longer a “black box”
- Interactions between technological alternatives and relationships
  - Introduction of a dynamic “economy plane”
  - Money as a driver to overcome inertia by providers
  - Market forces can play out within the network itself
- Services are at the core of ChoiceNet – “everything is a service”
  - Services provide a benefit but entail a cost
  - Services are created, composed, sold, verified, etc.

# ChoiceNet Principles

*Competition Drives Innovation!*



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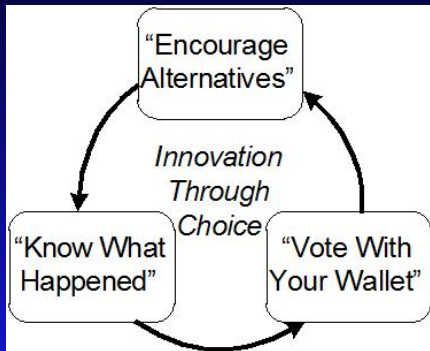
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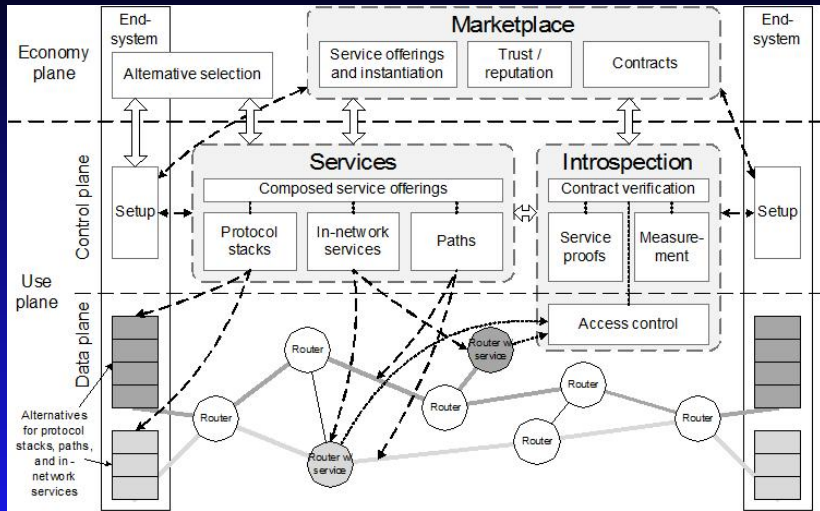
“Encourage alternatives” Provide  
building blocks for different types of  
services

“Know what happened” Ability to  
evaluate services

“Vote with your wallet” Reward good  
services!



# ChoiceNet Architecture



# Use Cases Enabled by ChoiceNet

- ChoiceNet / economy plane enables new business models in the Internet
  - Very dynamic economic relationships are possible
  - All entities get rewarded.
- Examples
  - Movie streaming
  - Reading *The New York Times* and *The Boston Globe* in a coffee shop (short-term and long-term contracts)
  - Customers as providers.



# Places that Working on Networks Will Take You

## *Bellagio Research Team Residency March 2004*



# Places that Working on Networks Will Take You

Yalta, Ukraine with my taxi driver Igor



Buenos Aires, Argentina and the Blue Lagoon in Reykjavik, Iceland



Anna Nagurney


The Traffic Circle of Life



# The Traffic Circle of Life




## Thank You!




### The Virtual Center for Supernetworks

Supernetworks for Optimal Decision-Making and Improving the Global Quality of Life



Director's Welcome	About the Director	Projects	Supernetworks Laboratory	Center Associates	Media Coverage	What's New
Downloadable Articles	Visuals	Audio/Video	Books	Commentaries & Op-Eds	The Supernetwork Sentinel	Congratulations & Kudos



**New INFORMS Fellows**  
October 2013

The Virtual Center for Supernetworks is an interdisciplinary center at the Isenberg School of Management that advances knowledge on large-scale networks and integrates operations research and management science, engineering, and economics. Its Director is Dr. Anna Nagurney, the John F. Smith Memorial Professor of Operations Management.

**Mission:** The Virtual Center for Supernetworks fosters the study and application of supernetworks and serves as a resource on networks ranging from transportation and logistics, including supply chains, and the Internet, to a spectrum of economic networks.

**The Applications of Supernetworks Include:** decision-making, optimization, and game theory; supply chain management; critical infrastructure from transportation to electric power networks; financial networks; knowledge and social networks; energy, the environment, and sustainability; risk management; network vulnerability, resiliency, and performance metrics; humanitarian logistics and healthcare.

Announcements and Notes from the Center Director	Photos of Center Activities	Photos of Network Innovators	Friends of the Center	Course Lectures	Fulbright Lectures	UMass Amherst INFORMS Student Chapter
Professor Anna Nagurney's Blog	Network Classics	Doctoral Dissertations	Conferences	Journals	Societies	Archive

**Announcements and Notes from the Center Director**  
**Professor Anna Nagurney**  
Updated: November 1, 2013

**Professor Anna Nagurney's Blog**  
**RENeW**  
Research, Education, Networks, and the World: A Female Professor Speaks

**Sustaining the Supply Chain**  
It often is difficult to get from Point A to Point B in a normal way. But what if there is a disaster or an emergency? What if the supply chain is disrupted? This is the focus of the research and teaching of the Virtual Center for Supernetworks.

**Mathematical Moments Podcast**  
A podcast featuring mathematical moments from the research and teaching of the Virtual Center for Supernetworks.

**America Revealed**  
PBS VIDEO

**New Book**  
**Networks Against Time**  
Analyzing the Perils of Delay

**Photos of Center Activities**  
A group photo of the center's staff and researchers.

**The Braess Paradox Translation Information Photos**  
A diagram illustrating the Braess Paradox, showing a network of nodes and edges.

**Publications**  
On a Paradox of Traffic Planning  
Environmental Impact Assessment of Transportation Networks with Degradable Links in an Era of Climate Change

For more information, see: <http://supernet.isenberg.umass.edu>