

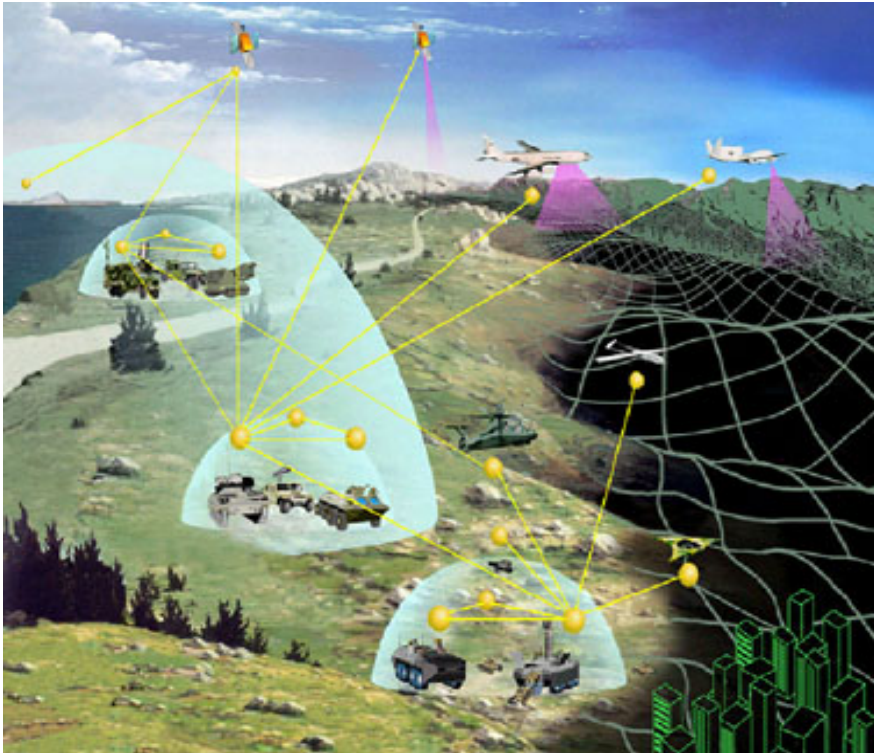
# A Study on The Network as Economy

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# The Premise

- Modern technological networks are on a collision course with human organizations, both civilian and military:
  - conflicts arise in all stages: design, configuration, and operations
  - conflicts with regulatory and C2 constraints
  - competing financial and other incentives
- Time is ripe to integrate **economic** thought into networking
  - current technology **isolated** from human goals and constraints
  - we must manage and **design** networks in their broader contexts

# Network-centric Operations are at Risk



- Increasingly pervasive networking capability
- Network configuration complexity is increasing
- Network speed and pace-of-change are increasing
- Traditional network management is **expensive** and **inflexible**:
  - significant % of soldiers in Iraq
  - overprovisioning
  - centralized control
  - need skilled people at the nodes
  - assume stable environment

**Economic networking** is a key enabler of network-centric operations

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# Modern Networks are Economic Systems (whether we like it or not)

- Highly decentralized and diverse
  - allocation of scarce resources; conflicting incentives
- Disparate network administrators operate by local incentives
  - network growth; peering agreements and SLAs
- Users may subvert/improvise for their own purposes
  - free-riding for shared resources (e.g. in peer-to-peer networks)
  - spam and DDoS as economic problems
- Regulatory environments for networking technology
  - for privacy and security concerns in the Internet
  - need more "knobs" for society-technology interface

# Economic Principles Can Provide Guidance

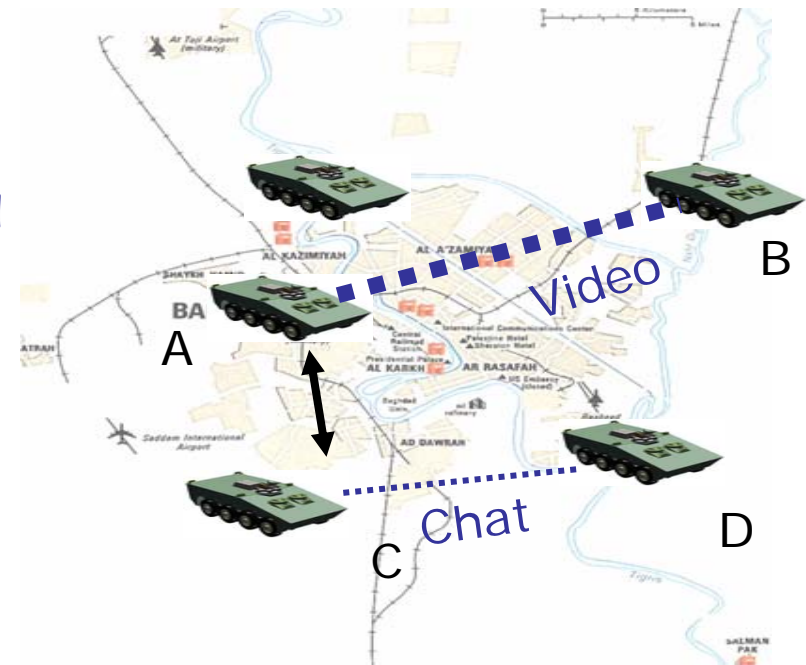
- **Markets** for the exchange of standardized resources
  - goods & services
  - prices encode exchange rates, compress info
  - efficiency and equilibrium notions for performance measurement
- **Game theory**, competitive and cooperative
  - strategic behavior and the management of competing incentives
- **Learning and adaptation** in economic systems
  - different and broader than traditional machine learning
- Certain **nontraditional topics** in economic thought
  - behavioral and agent-based approaches
- Active research at the CS-economics boundary

# Two Illustrative Scenarios

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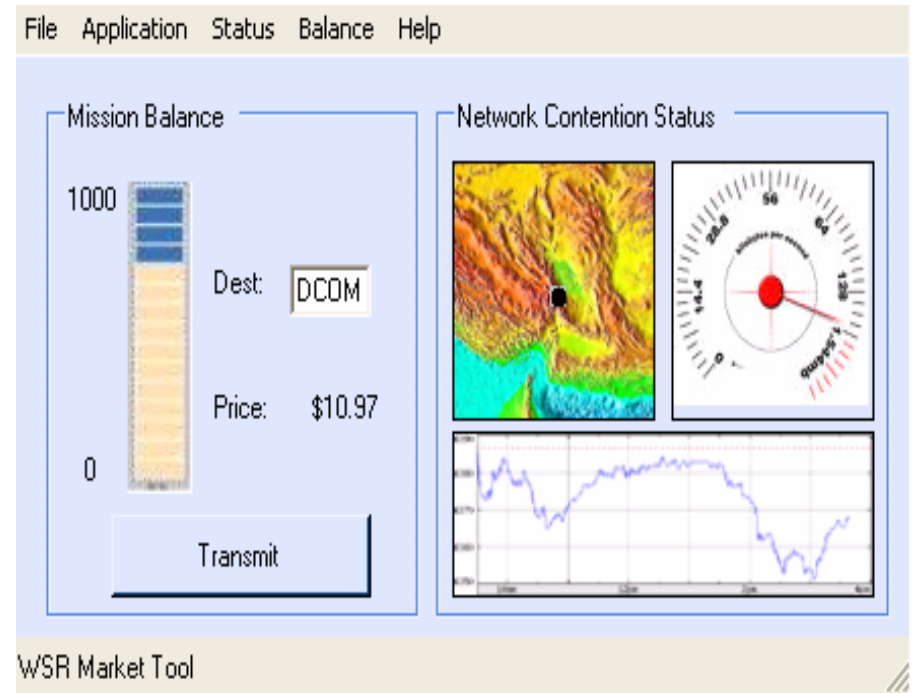
# Problem: Scarce Wireless Resources

- The Setting:
  - ad-hoc, wireless networking in tactical military environments
- The Problem:
  - resource allocation (e.g, bandwidth)
- How is it Solved Now?
  - priorities/constraints manually pre-assigned
  - traditional (centralized) optimization
- Why is it Economic?
  - scarce resources and multiple objectives
  - distributed, autonomous actors with competing/aligned incentives
    - human: commander-soldier
    - tech: video vs. chat
    - resolution should depend on situation
  - must balance individual incentives with collective mission



# An Economic Solution: A Wireless Bandwidth Market

- **Goods Being Exchanged:**
  - local bandwidth: the right to transmit a certain volume at a certain place and time
- **Currency:**
  - a virtual currency paid in exchange for local bandwidth
- **Allocations:**
  - dynamic budgets for units and individuals
  - top-down assignment through military chain of command
- **Pricing Mechanism:**
  - local adjustment according to local supply and demand
- **Human-System Interface:**
  - communication devices showing current cost of transmission



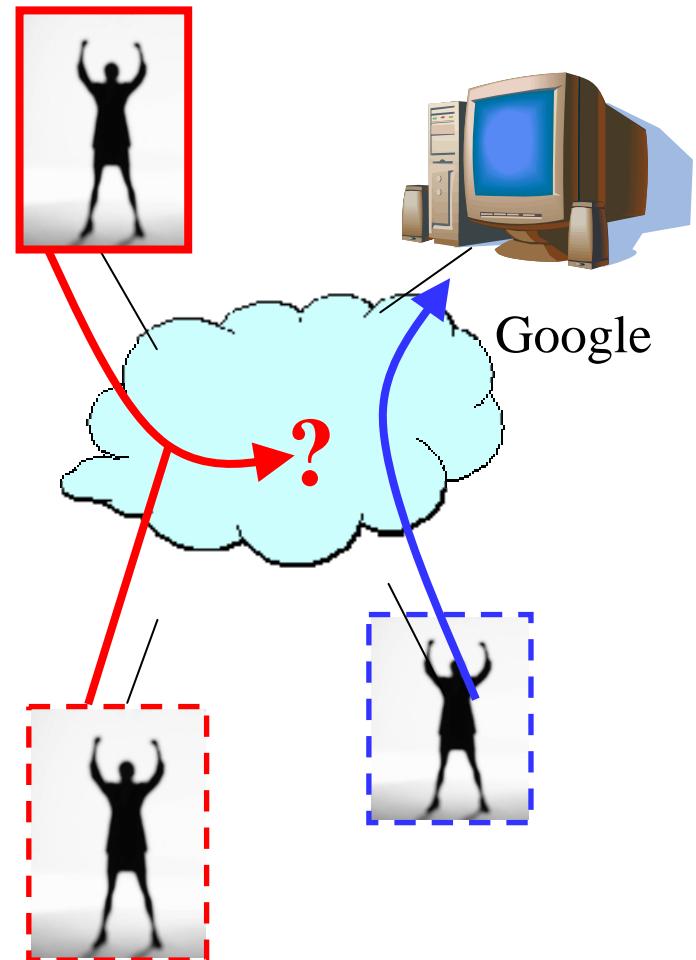


# Problem: Network Troubleshooting

- **The Setting:**
  - large, distributed networks of autonomous systems
  - rich peering and customer-provider relationships
  - includes both the Internet and military networks
- **The Problem:**
  - rapid diagnosis & repair of performance, reliability, and security problems
  - acquiring **global** information to troubleshoot
- **How is it Solved Now?**
  - it isn't
  - phone calls between NW operators, ping and traceroute, CERT advisories
- **Why is it Economic?**
  - distributed actors with competing/aligned incentives
  - real economic incentives to learn external network status (e.g. improve security, performance)
  - disincentives to reveal local information "for free"

# An Economic Solution: A Network Diagnostics Exchange

- **Goods Being Exchanged:**
  - local network status information
  - outputs of diagnostics
  - e.g. SNMP queries, output of SNORT rules, data feed subscriptions,...
- **Currency:**
  - real money (e.g. USD)
  - could also support barter exchange
- **Allocations:**
  - actual current assets (cash and info)
- **Pricing Mechanism:**
  - bid-ask limit order matching process
- **Human-System Interface:**
  - initially: human participants (e.g. NW operators) in an electronic market
  - eventually: protocols purchasing and acting on information



# Other Network Problems Amenable to (or Requiring) Economic Approaches

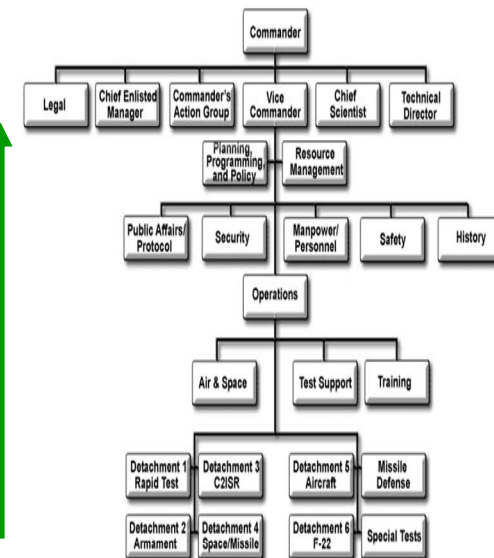
- Dissemination of information:
  - situation awareness, sensor networks, target tracking,...
- Peering relationships in commercial networks
- Routing optimization based on multiple constraints
- Quality-of-Service
- Investment planning in networks:
  - using price signals to drive network growth

# Research Challenges

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# Research Challenges for Economics

- Virtual currency and human incentives
  - need to design an **interface** between the two
  - military apps: tie virtual currency to org goals and reporting structure
    - allow deficit spending with accountability
    - bidirectional information flow via prices and allocations
- Practical market design
  - successful markets require infrastructure
    - legal system, regulatory bodies, settlement clearinghouses,...
  - designing infrastructure for new markets is nontrivial
    - integration with existing technological and social systems
    - little guidance from traditional economics
- Complexities
  - creating liquidity (avoiding Optimark)
  - crashes, bubbles, and speculation
  - middlemen and aggregators (e.g. Akamai)
  - options, futures, and other derivatives



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# Practical Market Design

- Successful markets require infrastructure
  - legal system, regulatory bodies, settlement clearinghouses,...
- Designing infrastructure for new kinds of markets is nontrivial
  - integration with existing technological and social systems
  - little guidance from traditional economics
- Settlement mechanisms and penalties
  - WRM: tied to informal human processes, trust and authority reln's
  - NDX: traditional
- Quality control
  - NDX: verifiability/accuracy of information
  - commodity futures contracts
- Centralized inputs ("fed rates")
  - WRM: commander budget allocations
- Regulatory oversight
  - NDX: vetting of participants

# Complexities

- Creating Liquidity (Avoiding Optimark)
  - WRM: demand not an issue; monopoly provider of supply
  - NDX: expect presence of (automated) market-makers
- Crashes, Bubbles and Speculation
  - WRM:
    - tight, centralized control of capital
    - bubbles more problematic than crashes; allow deficit spending
  - NDX:
    - not (initially) consumer investment vehicles; a private and controlled market
    - but may drive **corporate** speculation
- Middlemen and Aggregators
  - NDX:
    - expect potentially significant aggregation (e.g. Akamai);
    - may need mechanisms to control resale and piracy
- Options, Futures, and Other Derivatives
  - in NDX, for standard risk management/hedging practices
  - futures may also play role in WRM (guaranteed transmission)

# Learning, Adaptation and Robustness

- Adaptation at all levels will be necessary and inevitable
- Networks will be more **robust** due to economic incentives
  - richer information availability
  - faster dissemination
  - alignment of technology and incentives
- Learning can be used to:
  - predict network properties and behavior (without buying the information)
  - change network behavior: routing, admission & congestion control, etc.
  - change economic behavior: what goods to buy and sell, at what prices
- Learning technology:
  - effective today for single-agent prediction problems
  - require significant research to extend to multi-agent adaptation
  - behavioral considerations
  - learning in games, price discovery/adjustment processes,...

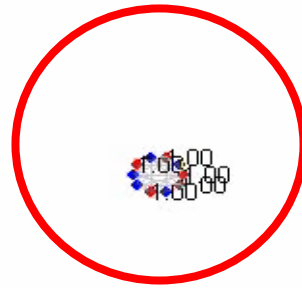
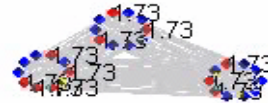


# Network Structure

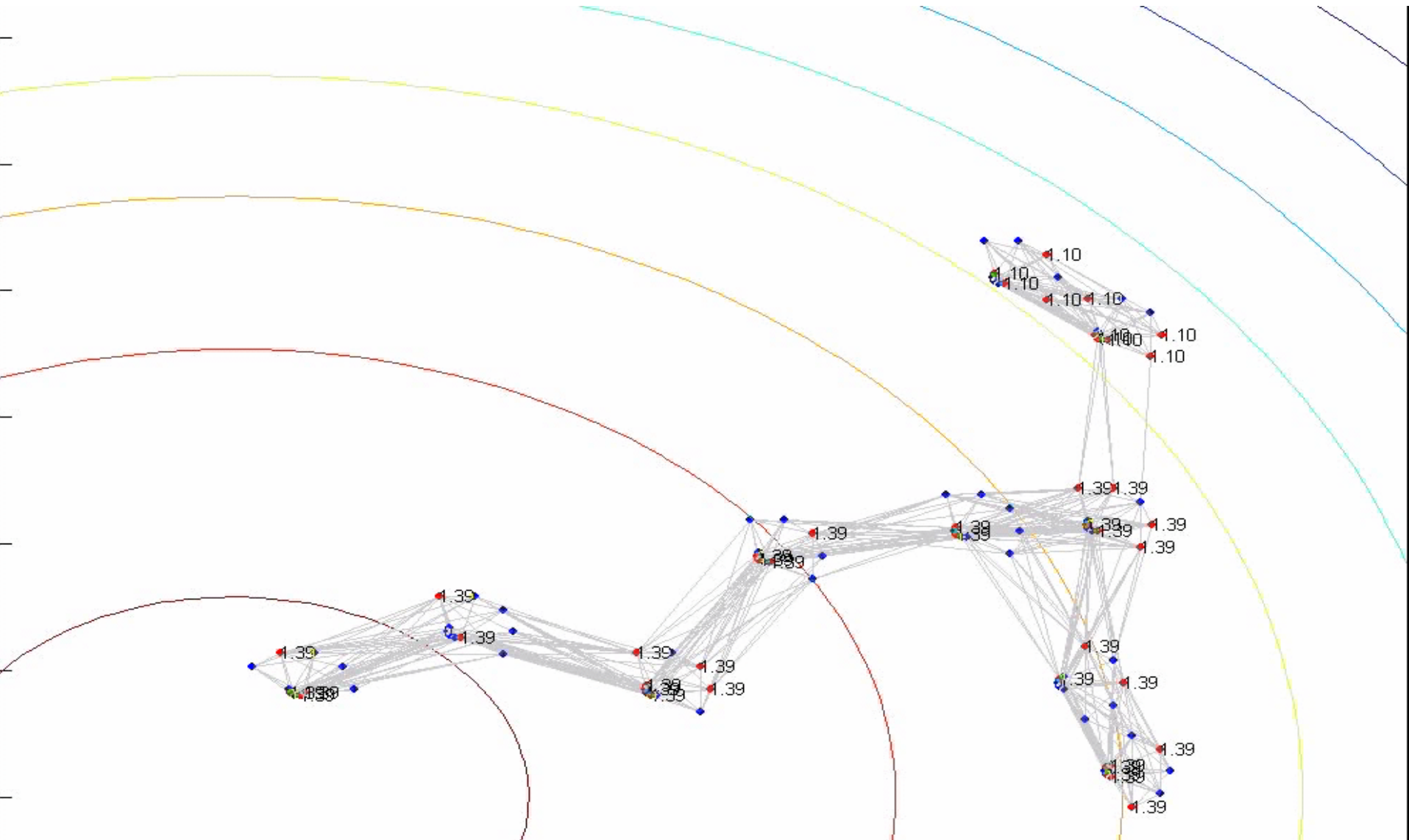
- Overwhelming bulk of economic thought assumes **complete connectivity**
  - centralized markets and exchanges, open competition, global info
  - imply no variation in prices
- In wireless scenario, network structure will be
  - potentially sparse
  - determined by the physics of transmission, terrain, physical movement...
- How will this network structure influence
  - equilibrium & stability
  - adaptive behavior
  - prices and performance
  - robustness

# Distributed Allocation of Scarce Resources: Interaction of Movement and Prices

- units of 10 individuals
- sellers (red) and buyers of a resource (e.g. routing)
- can only buy/sell from nearby parties
- mission: secure a perimeter
- numbers are equilibrium prices



# Distributed Allocation of Scarce Resources: Incorporating a Terrain Model

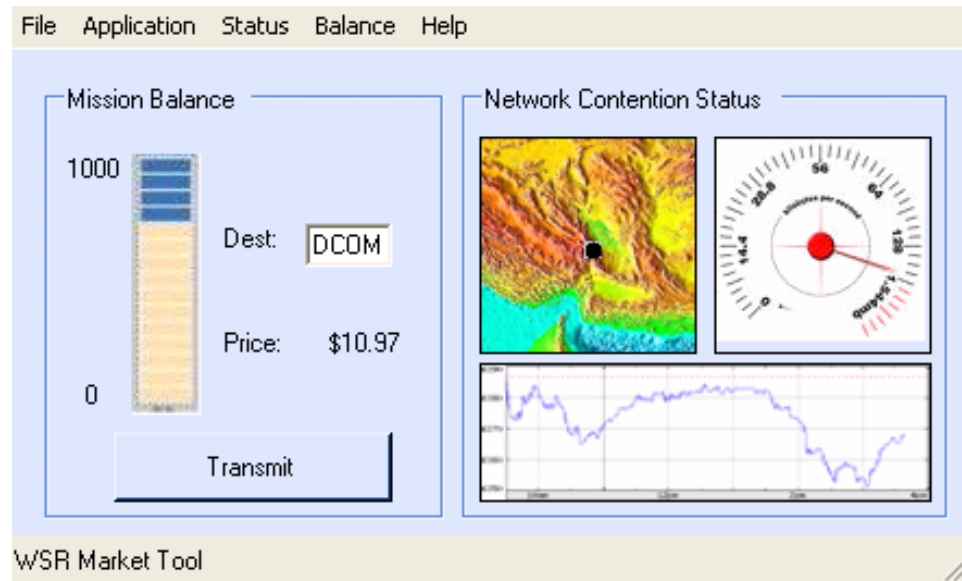


# Challenge Problems

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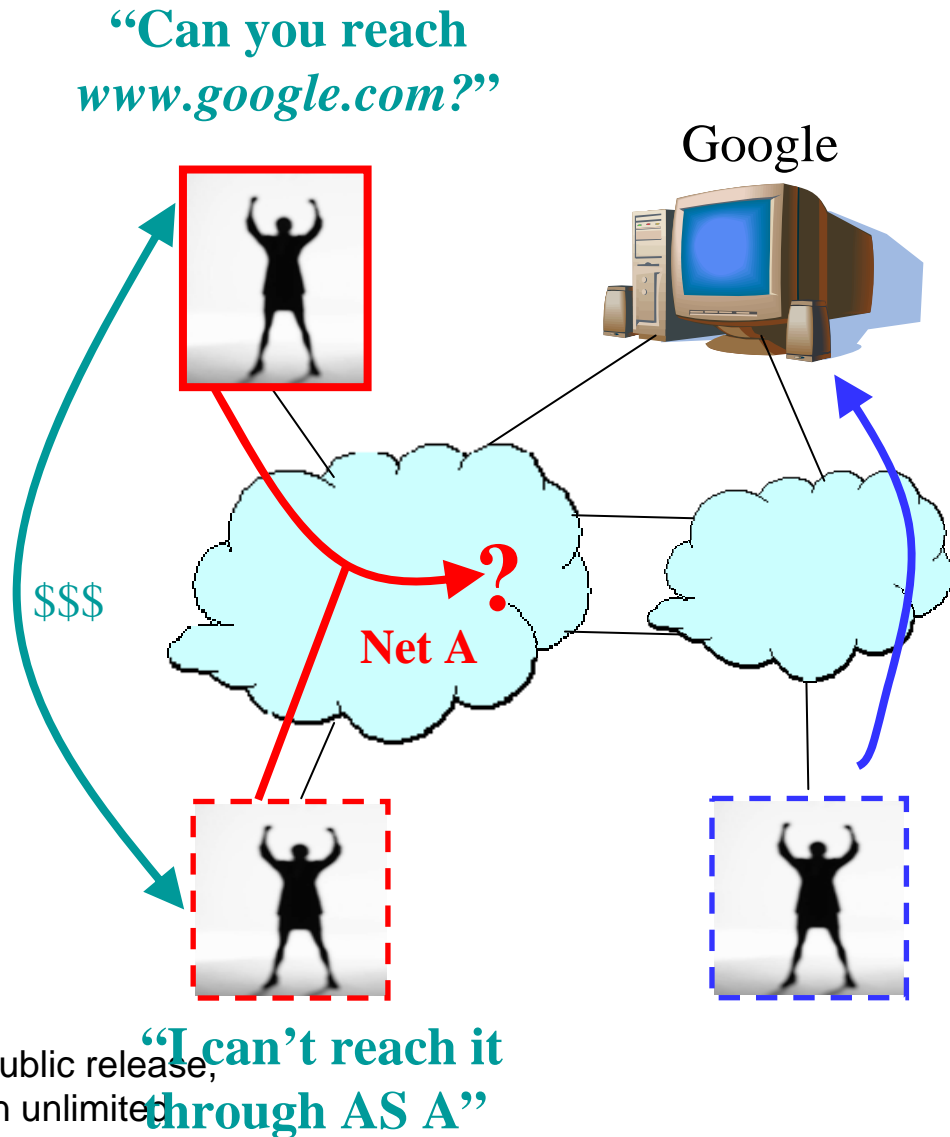
# WRM Prototype

- **System:**
  - capacity market system & interface
  - resource allocation subsystem and protocols
- **Experiments:**
  - urban ops field test scenario in Ft Irwin
  - Drexel SWAT running FBCB2 SA, IP voice
- **Participants:**
  - units training for urban ops
- **Metrics:**
  - MOE: mission succeeds
  - MOE: sum RI-RP-RT
  - MOP: price volatility
- **Goals:**
  - RI-RP-RT within 20% of red-teamed hypothetical optimum



# NDX Prototype

- **System:**
  - peer-to-peer exchange
  - pay to launch remote probes
  - combine to identify root cause
- **Experiments:**
  - on-demand diagnosis
  - fault injection in an overlay
  - "in the wild" on the Internet
- **Participants:**
  - volunteer users
  - initially with virtual currency
- **Metrics:**
  - successful diagnosis
  - fast, accurate, and efficient
  - increasing # of participants
  - engagement of providers
- **Goals:**
  - live and active NDX market
  - liberating the diagnostic data



# Why Now and Why DARPA?

- Networking/economics collision is happening and causing pain
  - must be addressed boldly and aggressively
  - DARPA has an opportunity that does not exist in commercial sector
    - both in scale and ability to implement "mixed" systems
- Military NW technology on bleeding edge where "traditional" approach may not even exist
  - e.g., hard power constraints
  - opportunity/need for systems mixing competitive & cooperative elements
- Relevant research has traction, is gaining momentum
  - algorithmic mechanism design and computational game theory
  - distributed optimization
  - strategic learning in multi-agent systems
  - engineering based on economic principles

# Conclusions

- There are compelling arguments for the use of economic methods and viewpoints in the design of modern networks
- Resource-constrained military networks are especially promising targets for this approach
- Economic thought provides new methods and **metrics**
  - market efficiency
  - market liquidity
  - Price of Anarchy
  - GDP and fed rate for complex networks?
- There is important foundational work providing initial traction, but many open research and implementation issues