



# Some Routing Challenges in Dynamic Networks

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# Overview

1. Current State of Networking
  - More Wireless
  - Mobile and Opportunistic Applications
2. New Routing Challenges
  - Sample Challenges
  - Hybrid Solutions
3. Graph Algorithmic Solutions
  - Discrete Contacts: Dijkstra
  - Probabilistic Contacts: Bellman-Ford
4. A Bigger Picture
  - Future Applications and Challenges

# 1. Current State: More Wireless

- Current

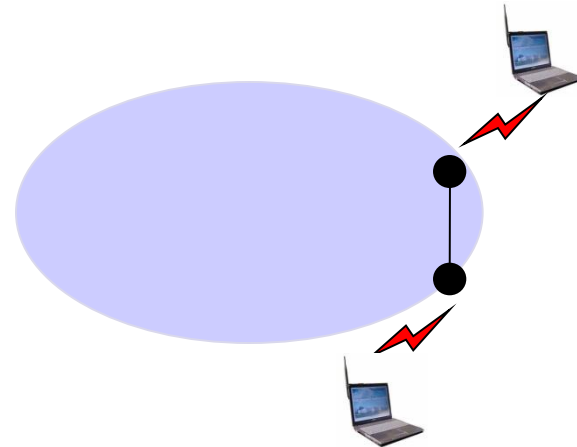
- Different types: smartphone, BlackBerry, iPad
- Internet connections: more wireless
- Dynamic link quality

- (Near) future

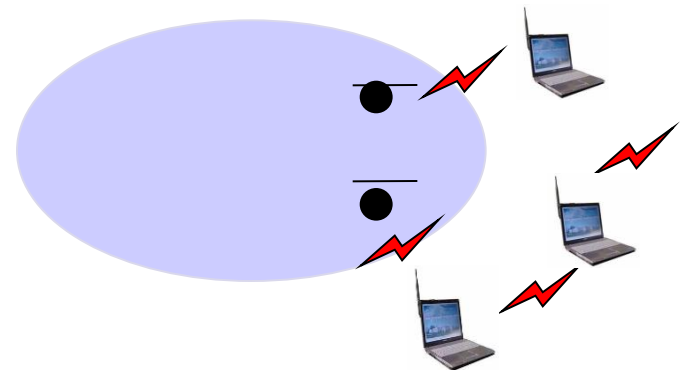
- 1 billion vehicles
- 5 billion RFID
- 10-15 billion sensor/embedded devices

- Future: *anytime, anywhere*

(a) Edge of the Internet



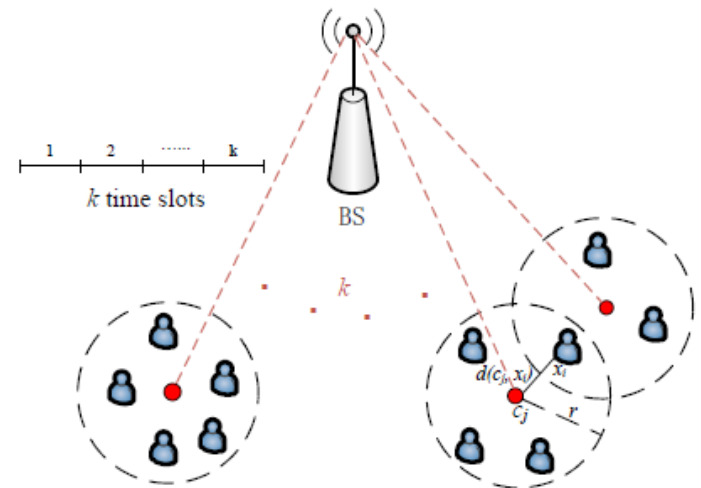
(b) General way of data transmission



# Mobile and Opportunistic Applications

- Node mobility
    - MANET (relatively dense)
    - DTN (relatively sparse)
  - Opportunistic contact
    - Temporal nature
    - Fixed and opportunistic contacts
- Explore both wireless channels and mobility
  - The whole is greater than the sum of parts!
  - Maximizing happiness (Wang, Guo, and Wu, ICPP 2011)

NSF grant: Mobile Content Sharing Networks: Theory to Implementation, 2011



## 2. New Routing Challenges

- Protocol design
  - Store-and-forward vs. store-carry-and-forward
- Mobility
  - Random movement vs. controlled mobility
- Search Efficiency
  - Improve search efficiency
    - connected-dominating-set (CDS)
  - Reduce search time
    - replication

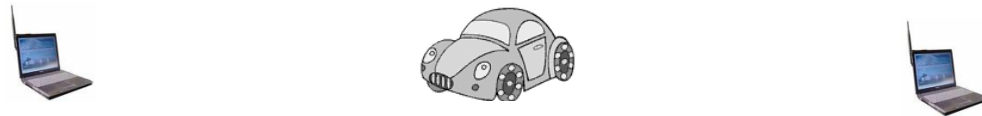
# Protocol Design

- TCP/IP connection-based: store-and-forward
- Non-connection-based: store-carry-and-forward

○ Store



○ Carry



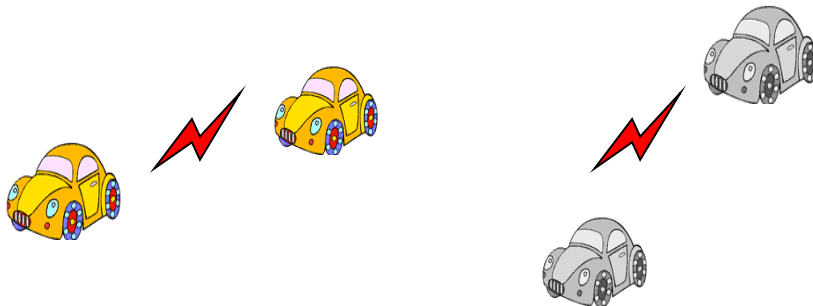
○ Forward



# Mobility

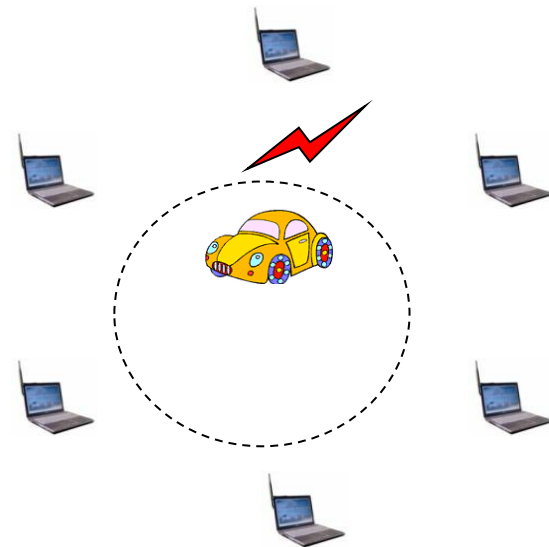
## Random: Epidemic Routing

- Nodes store and exchange the date when they meet
- Data is replicated by way of a random walk



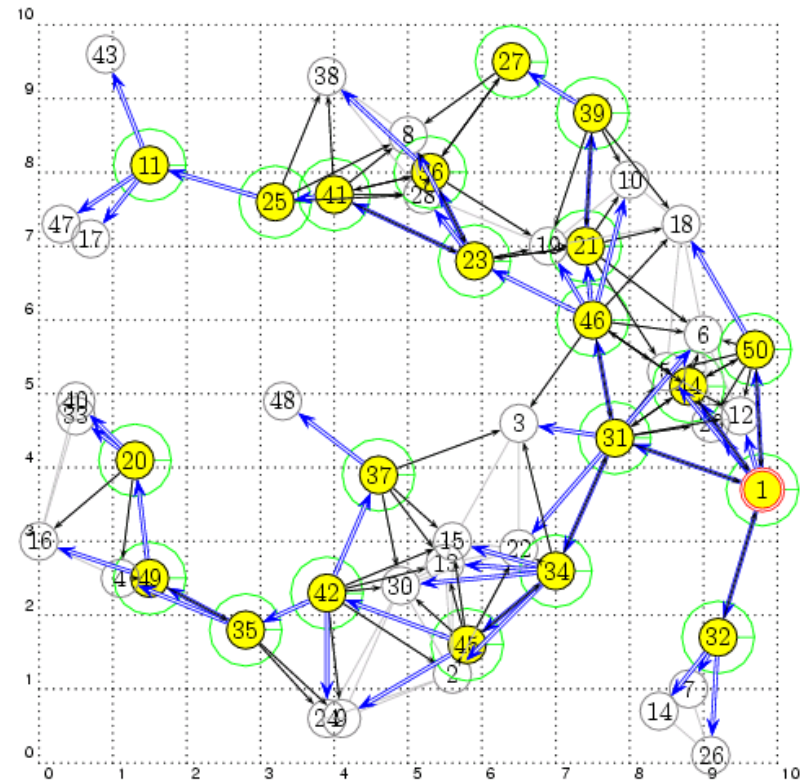
## Controlled: Message Ferrying

- Special nodes (ferries) have completely predictable routes in the geographic area



# CDS: Improve Search Efficiency

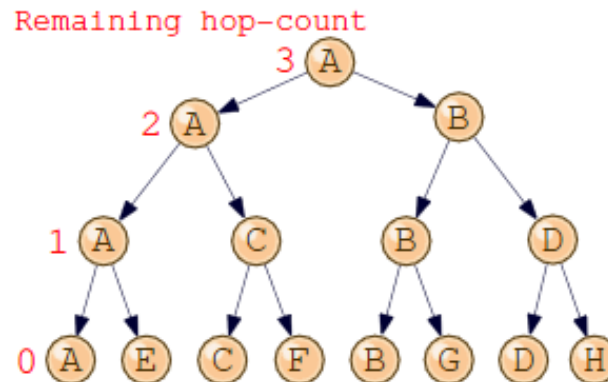
- Connected Dominating Set (CDS)
  - CDS: a connected subset
  - Any other node has a CDS neighbor
- Features
  - Virtual backbone
  - Local formation of a CDS
  - Efficient routing/broadcasting
- Extensions
  - k-connected, k-dominated CDS
    - Controlled redundant coverage
  - Directional CDS
    - Reduce interference
    - Save energy



NSF grant: A Dominating-Set-Based Routing Scheme in Ad-Hoc Wireless Networks, 2000

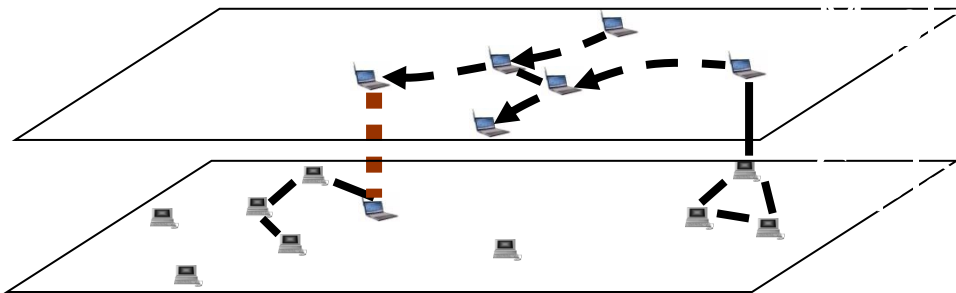
# Replication: Reduce Search Time

- Delegation forwarding
  - Each node has its own estimated distance to the destination
  - A packet holder will only forward the packet to a node with a higher quality
  - Number of forwardings:  $O(\sqrt{N})$
- Extended delegation forwarding
  - Relative forwarding qualities among all possible future contacts
  - Optimal stopping rule
    - Hop-count limited
    - Time-to-live (TTL)
  - Best time to forward: backward induction (Liu and Wu, MASS' 2009)



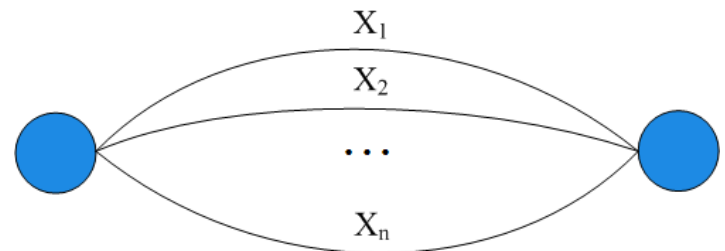
# Hybrid Solutions

- Store-and-carry and store-carry-forward (Wu, 2005)
  - M(mobile)-plane: mostly store-carry-and-forward
  - S(stationary)-plane: store-and-forward
  - Two types of nodes: **carriers** and **keepers**



NSF grant: Mobility-Assisted Routing in Mobile Networks, 2006

- Replication-based and non-replication-based (MobiCom'11, UMass)
  - Non-replication: MANET  
 $\mu = \min \{E[X_1], E[X_2], \dots, E[X_n]\}$
  - Replication: DTN  
 $\mu_{(1)} = E[\min \{X_1, X_2, \dots, X_n\}]$
  - **Replication gain:**  $\mu / \mu_{(1)}$
  - State transition: replication vs. forwarding based on estimated and actual delays



# Hybrid Solutions

- Fixed and on-demand routes
  - Fixed route: bus
  - On-demand: taxi
  - Hybrid: mixture of fixed and on-demand (Wu, Yang, and Dai, TPDS'07)
- Future transportation
  - CityCar - MIT Smart City
  - Semi-on-demand taxi - Microsoft campus
  - Public bike - Infosys

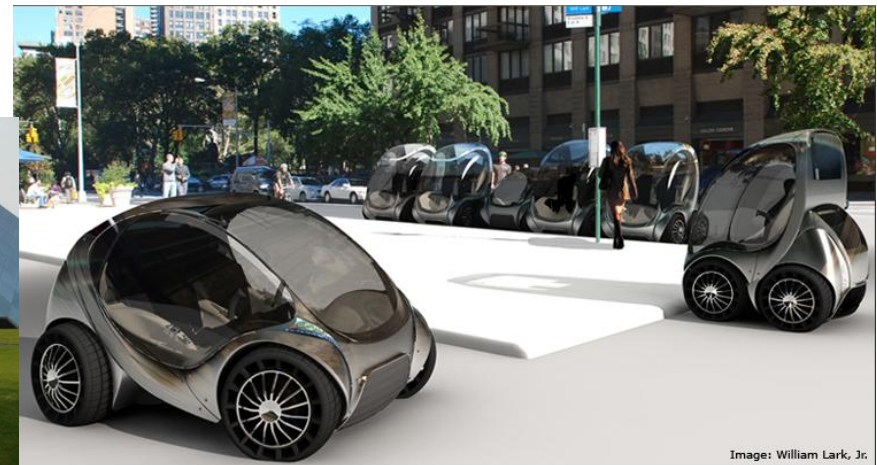
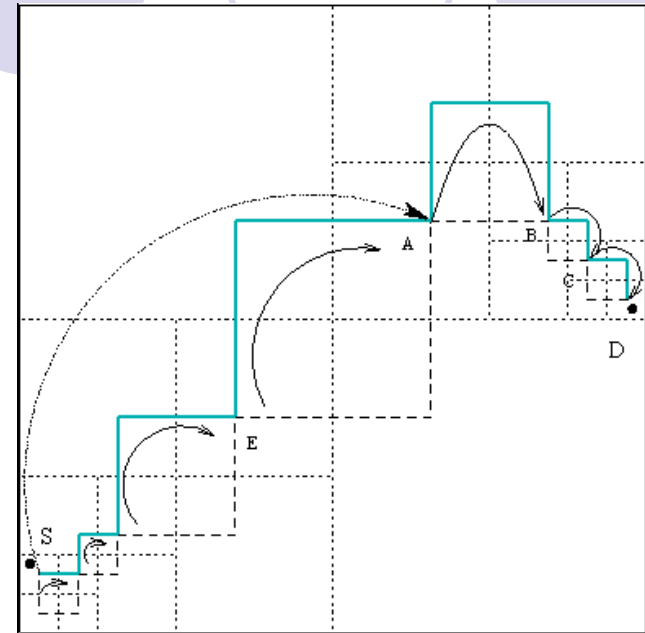
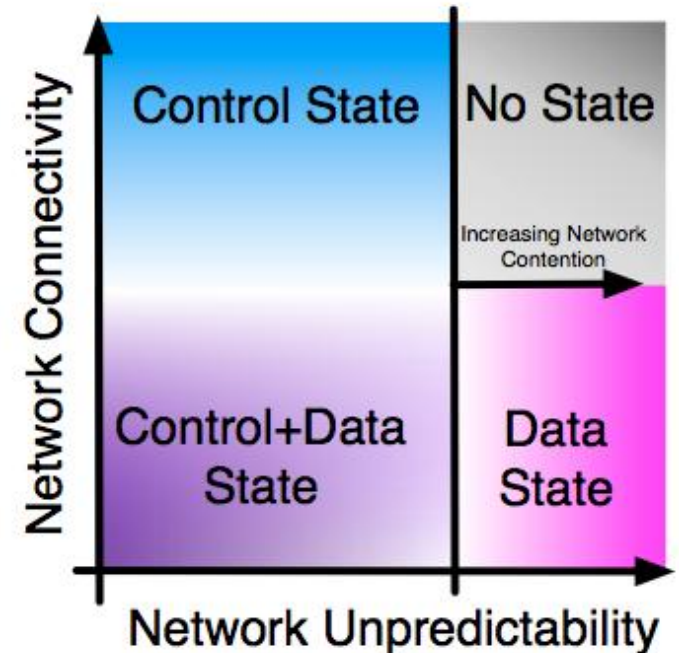
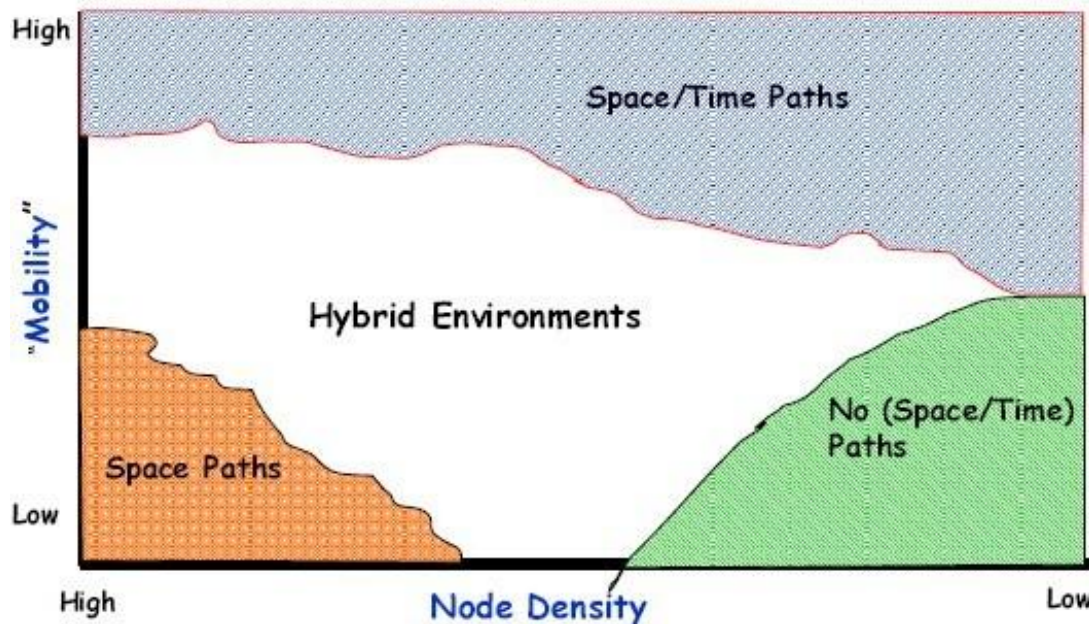


Image: William Lark, Jr.

# Sample Classification

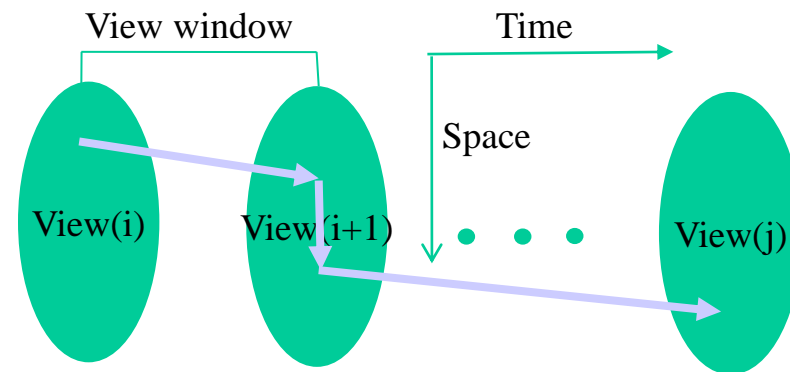


M. Ammar, MASS 2007 keynote [Link-up entropy](#),  $H(g_{t+i} | g_t)$  (Mobicom'11, UMass)  $g_t$ : arbitrary link up/down in  $G_t$

# 3. Graph Algorithmic Solutions

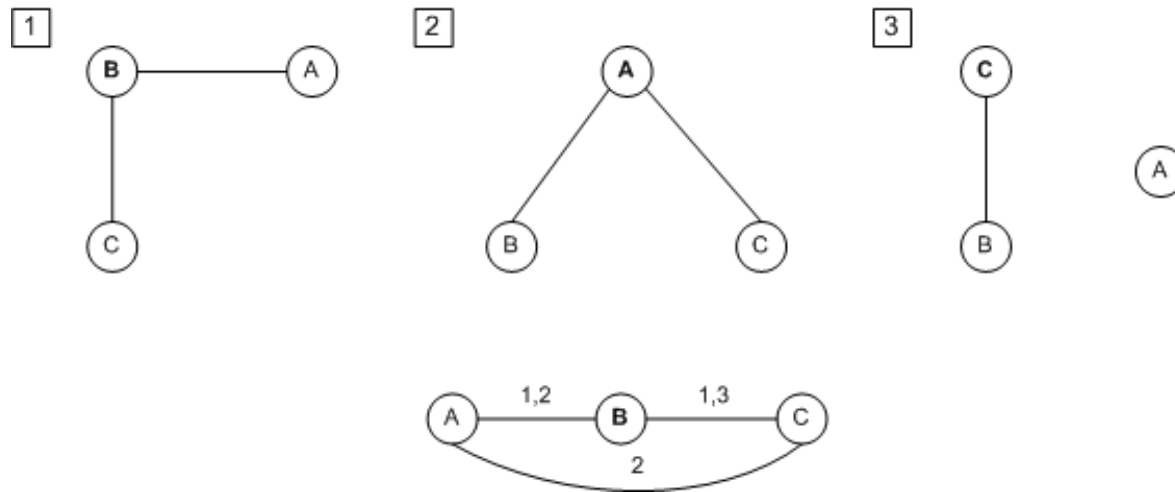
- Extend the classical graph model to the time-space model
  - Discrete contact model: Dijkstra algorithm
  - Probabilistic contact model: Bellman-Ford algorithm
- $(u,v)$  - connectivity under time-space view

- All  $i, (u(i), v(i))$
- Exist  $i, (u(i), v(i))$
- Exist  $i, j, (u(i), v(j))$



# Graph Extension: Time-Space Model

- Time sequence:  $t_1, t_2, \dots, t_L$
- $G_i = (V_i, E_i)$ : subgraph in  $[t_i, t_i + \Delta]$
- Evolving graph:  $G: G_1, G_2, \dots, G_L$   
where  $(u,v) = \{i \mid (u, v) \in E_i\}$  ( $i$ : time label)



A. Ferreira, Building a Reference Combinatorial Model for MANETs, IEEE Networks, Oct. 2004

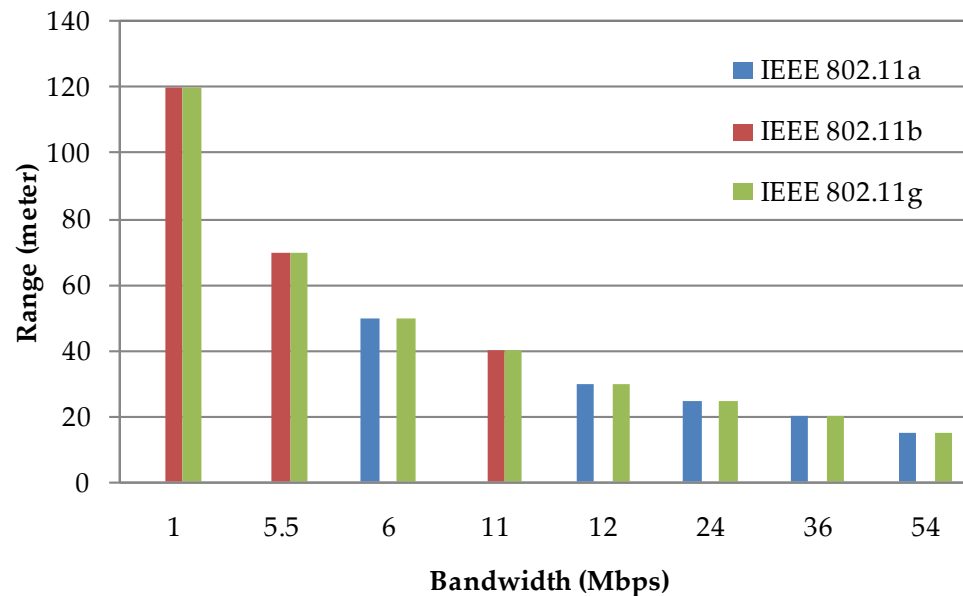
# Extended Evolving Graph

- Weighted evolving graph

$$(u, v) = \{(i, w_i) \mid (u, v) \in E_i\}$$

where **weight label**  $w_i$  is the bandwidth, reliability, latency, etc

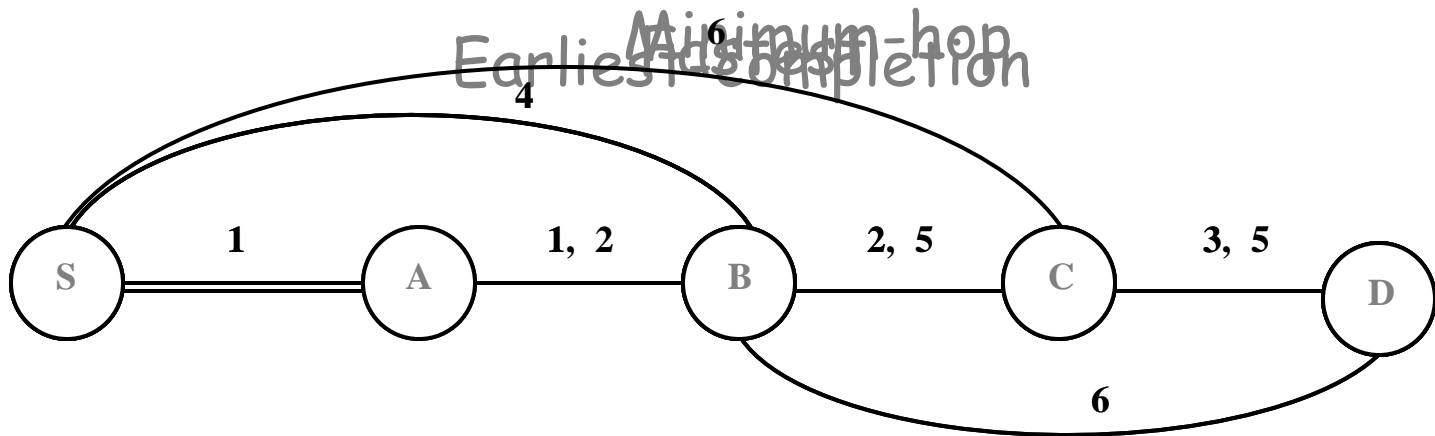
NSF grant: A New Algorithm an Graph Model for Networking in Challenged Environments, 2009



# Optimization Problems

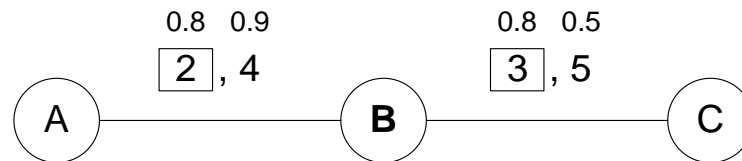
Optimization

- Earliest-completion
- Fastest (min. time span)
- Minimum-hop
- Maximum-bandwidth
- Maximum-reliability



# Challenges

- Greedy
  - Greedy-choice property: a globally optimal solution by making locally optimal (greedy) choices
- Optimal greedy
  - Optimal prefix principle: an optimal solution to a problem contains optimal solutions to sub problems within it
- Optimal prefix principle failure



# Slicing and Virtualization

- Virtualization

- Enlarge  $G$  to  $G'$  through virtualization
- Solve  $G'$  which includes a solution for  $G$

- Slicing

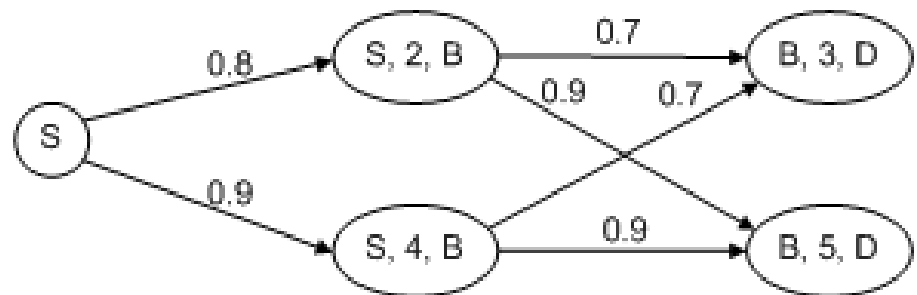
- Partition  $G$  into  $G_1, G_2, \dots, G_i$
- Select the best among  $i$  solutions for  $G_i$

Wu, Graph, Combinatorics, and Computing Conf. 2010

# Maximum Reliability

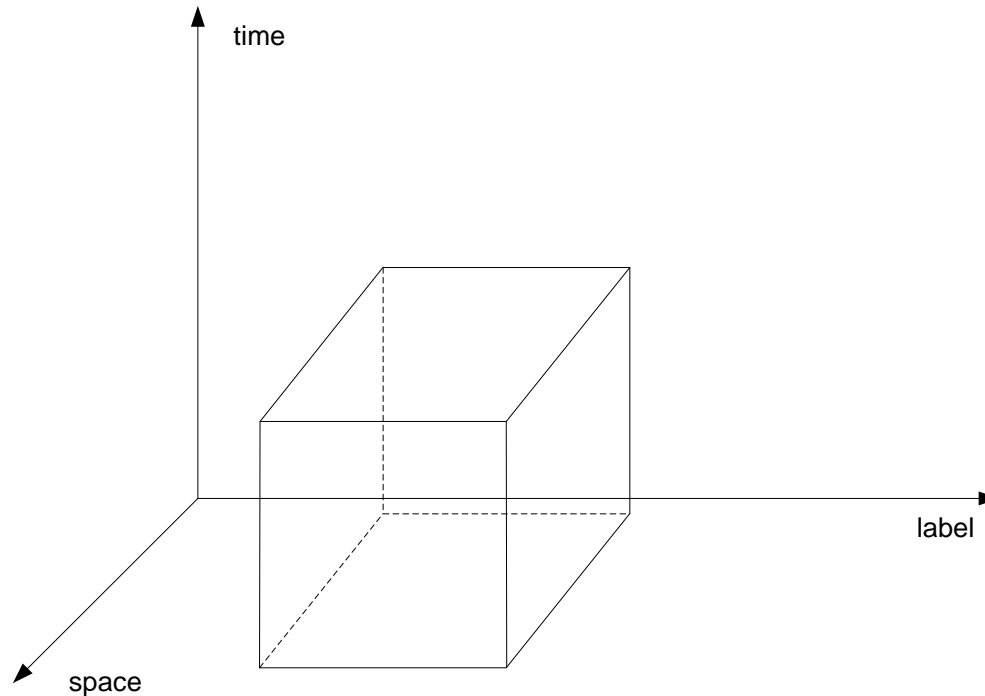
## Virtual Graph ( $G'$ )

- Each node hosts a certain number of virtual nodes
- For a node  $v$  in  $(u, v)$  with labels  $\{l_1, l_2, \dots, l_{L'}\}$ ,  $L'$  **virtual nodes**  $(u, l_i, v)$  are used for each  $v$
- $\text{Dijk}(G')$ , where  $G'=(V', E')$ ,  $|V'| = \Delta L|V|$ , and  $|E'| = \Delta L^2|E|$
- High complexity!

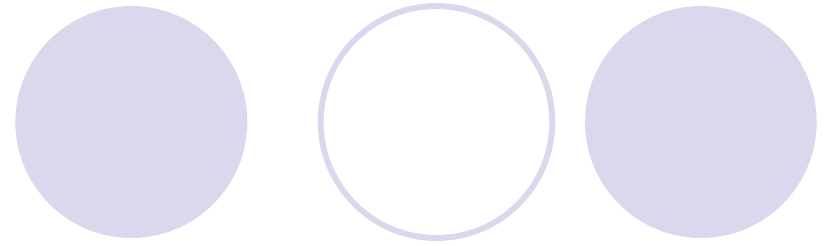


# Slicing Methods

- Multi-dimension: time, space, labels
- Overlapping vs. non-overlapping



# Journey

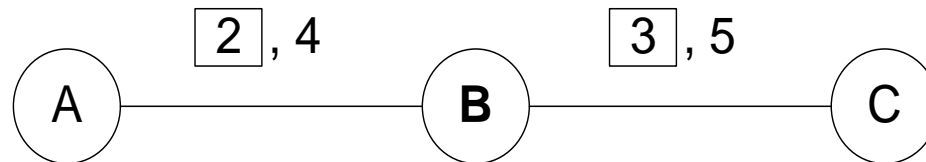


- Journey

- A selection of **non-decreasing link labels** along a path
- E.g., (2, 3), (2, 5), or (4,5)

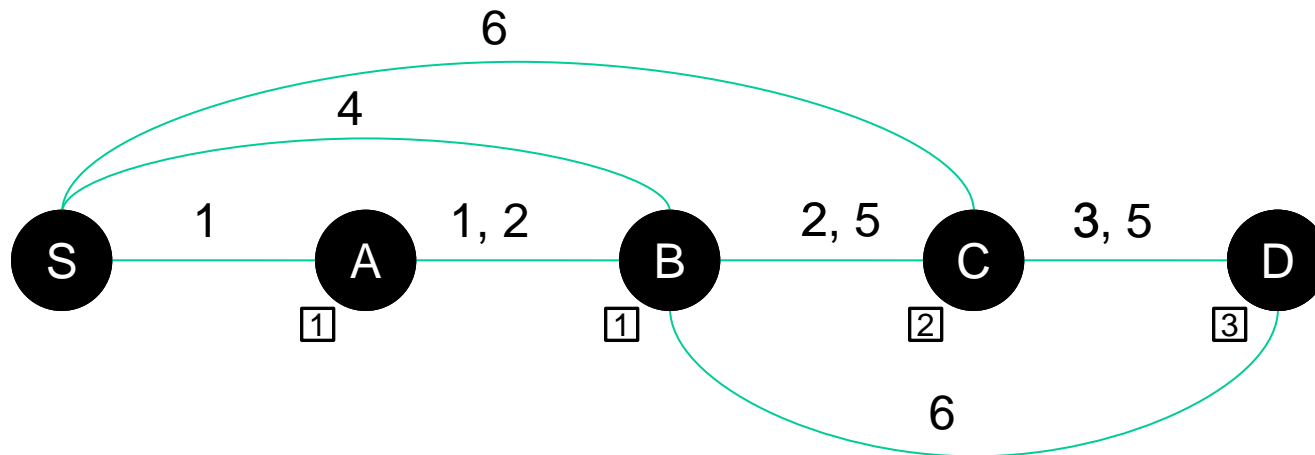
- Earliest journey

- A journal with the smallest last label



# Earliest Completion Path

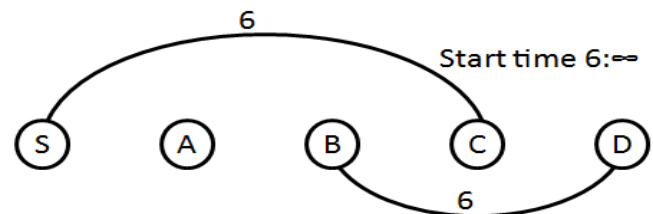
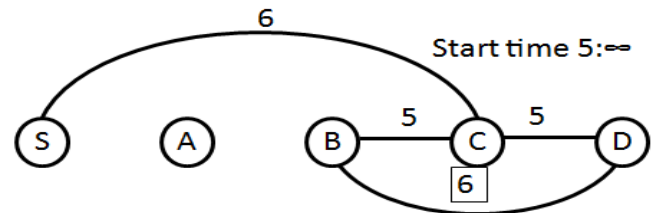
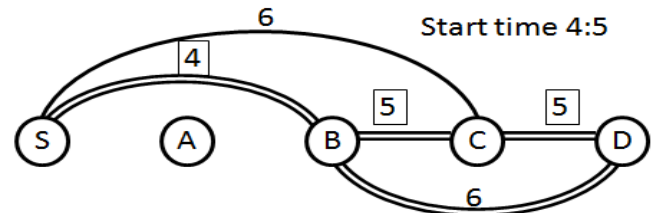
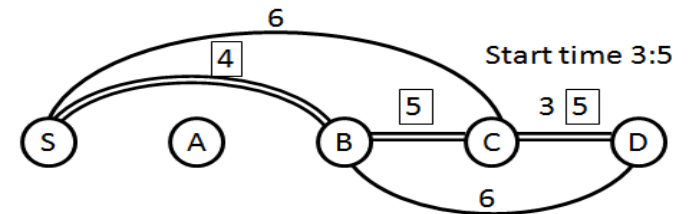
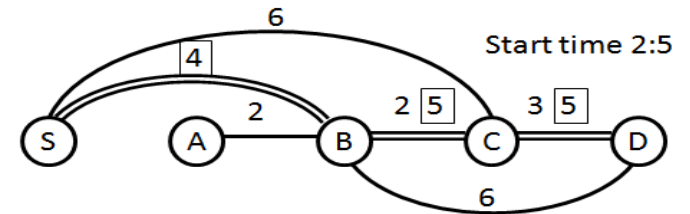
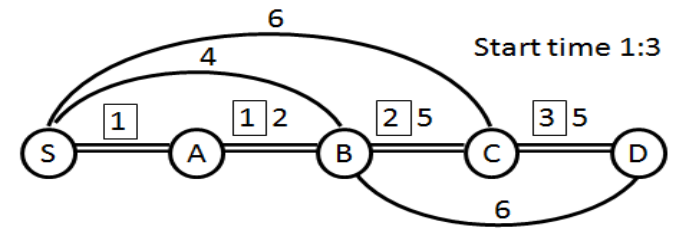
- Earliest completion path for  $G$ 
  - Dijk ( $G$ ) with "best" being the **earliest journey** of a path
  - Complexity
    - $O(V \log (LE))$  using a heap
    - $O(V \log V + LE)$  using a Fibonacci heap



# Fastest

- Sliding on start time:

- Start time is  $t$  at  $s$ :  $G(t)$ , a subgraph of  $G$
- Apply Dijk( $G(t)$ ) for earliest completion time
- Suppose completion time for  $d$  is  $f_t$ , then time span is  $s_t = f_t - t$
- Fastest:  $\min\{s_t\}$
- Complexity:  $L$  times of Dijk



# Minimum Hops

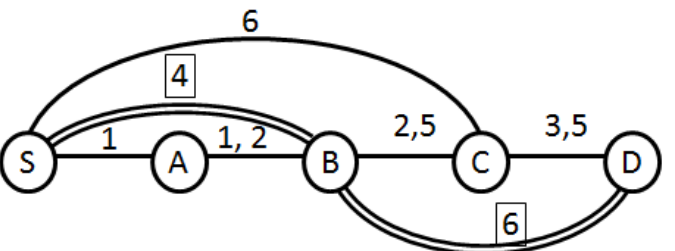
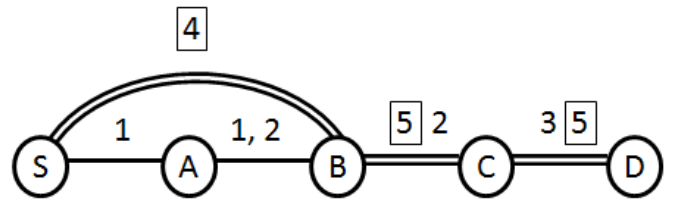
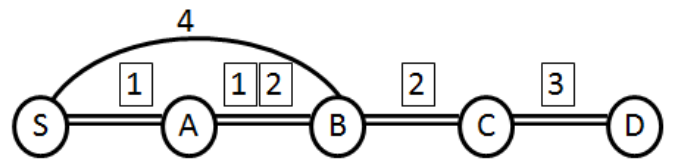
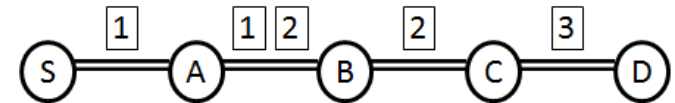
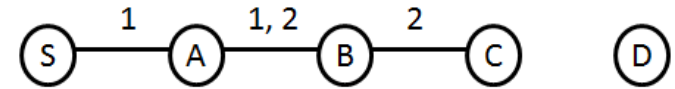
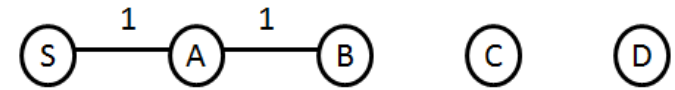
- Slicing on time label  $i$  of  $(i, w_i)$ :

$G(i \leq l)$ : a subgraph with labels  $\leq l$

- Dijk( $G(i \leq 1)$ )
- Dijk( $G(i \leq 2)$ ) on above results by relaxing only links with label 2
- ...
- Dijk( $G(i \leq k)$ ) on above results by relaxing only links with label  $k$

The result the is minimum hop count to  $d$  after Dijk( $G(i \leq L)$ )

Complexity:  $L$  times of Dijk\*

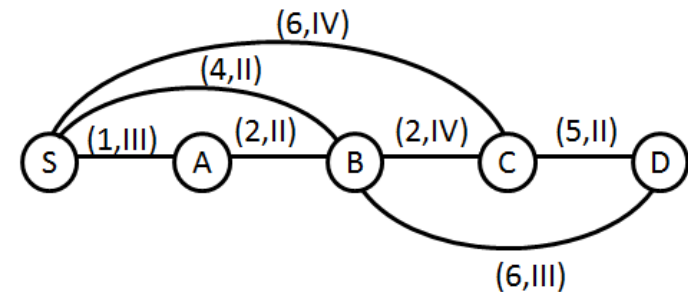
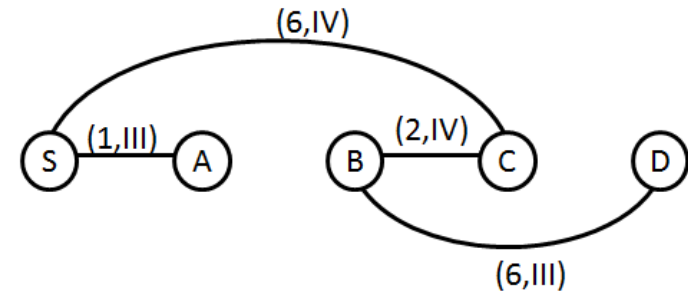
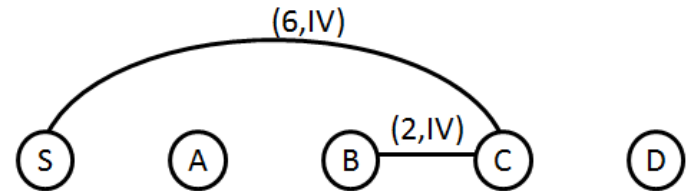
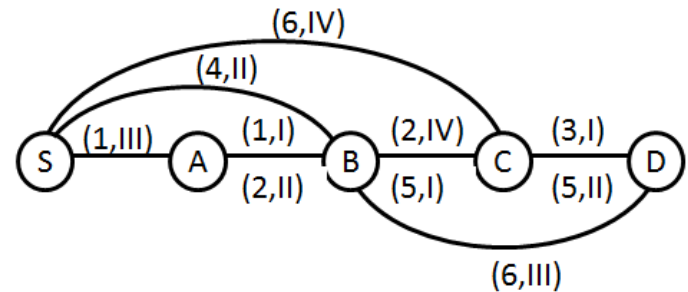


# Maximum Bandwidth

- Slicing on weight label  $w_i$  of  $(i, w_i)$

Round  $b$  (starting with the largest)

- $\text{Dijk}(G(w_i \geq b))$  /\* subgraph of labels with bandwidth  $\geq b$  \*/
- Stop if  $d$  is reachable and return bandwidth  $b$
- Otherwise, repeat the above for  $b = b - 1$
- Complexity:  $\log L$  times of Dijk using the binary search



# Virtualization vs. Slicing



- Nature

- Virtualization as a generalization
- Slicing as a specialization

- Efficiency

- Virtualization as a general purpose solution
- Slicing as a special purpose solution

- Slicing as an art

- Decompose the network into slices.
- Apply the optimal greedy strategy to each slice.

- Other optimization problems

- Minimum transmission delay

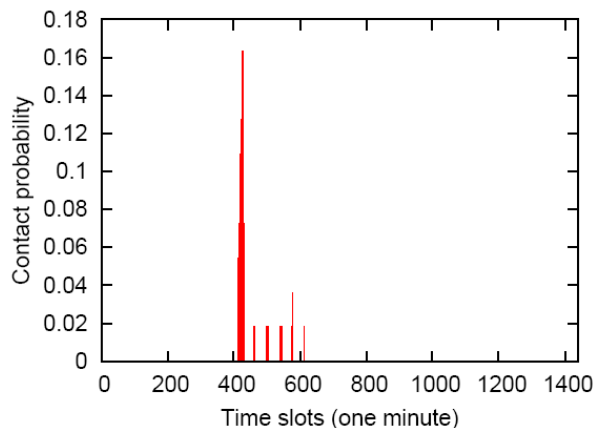
# Graph Extension: Probabilistic Contacts

## – Challenges

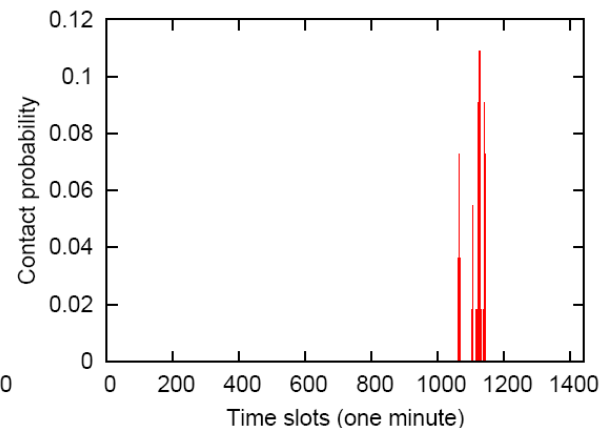
- Routing efficiency in probabilistic time-space graphs

## – Definition ( $t_i, p$ )

- $p$  is the contact probability of two nodes in  $t_i$



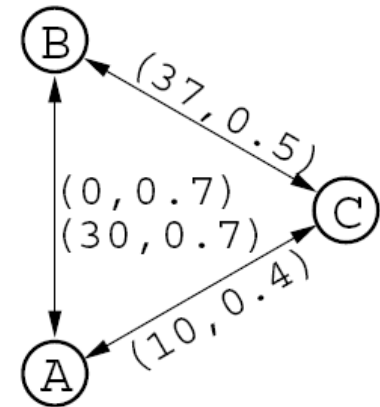
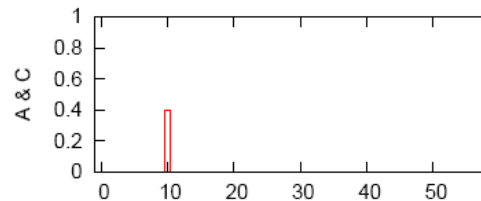
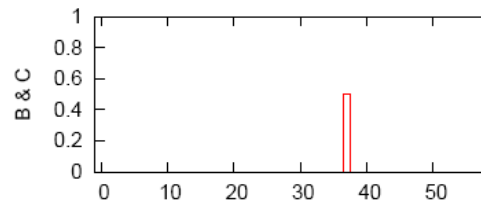
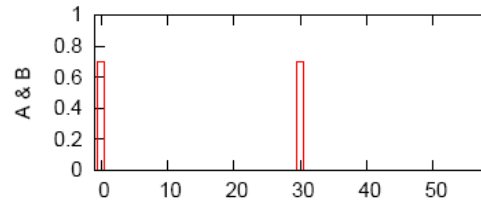
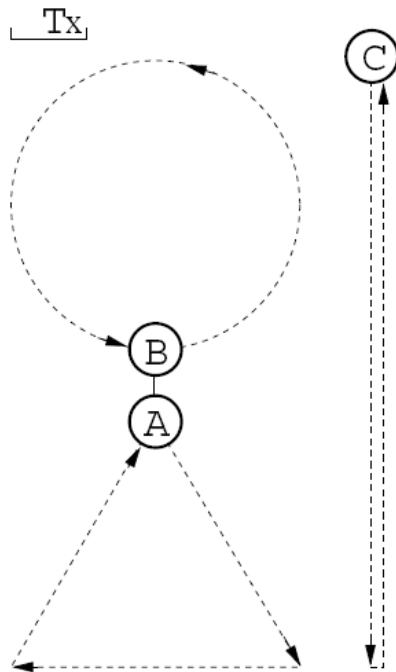
(a) Shifts 01/AM & 03/AM



(b) Shifts 32/PM & 21/EVE

# Probabilistic Time-Space Graph

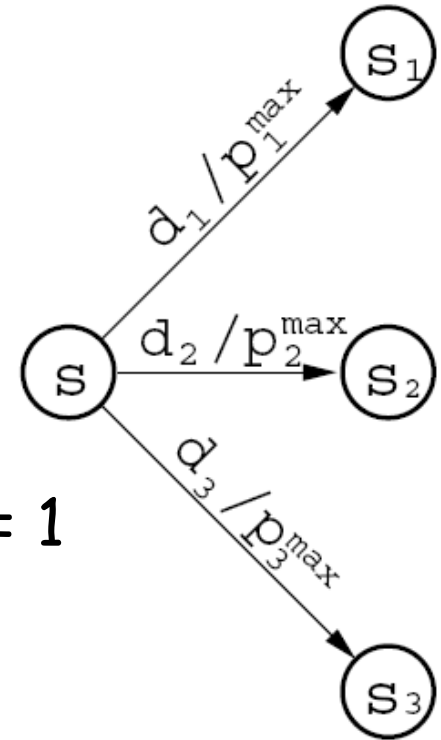
- A common motion cycle  $T$  (=60)





# Iterative Process

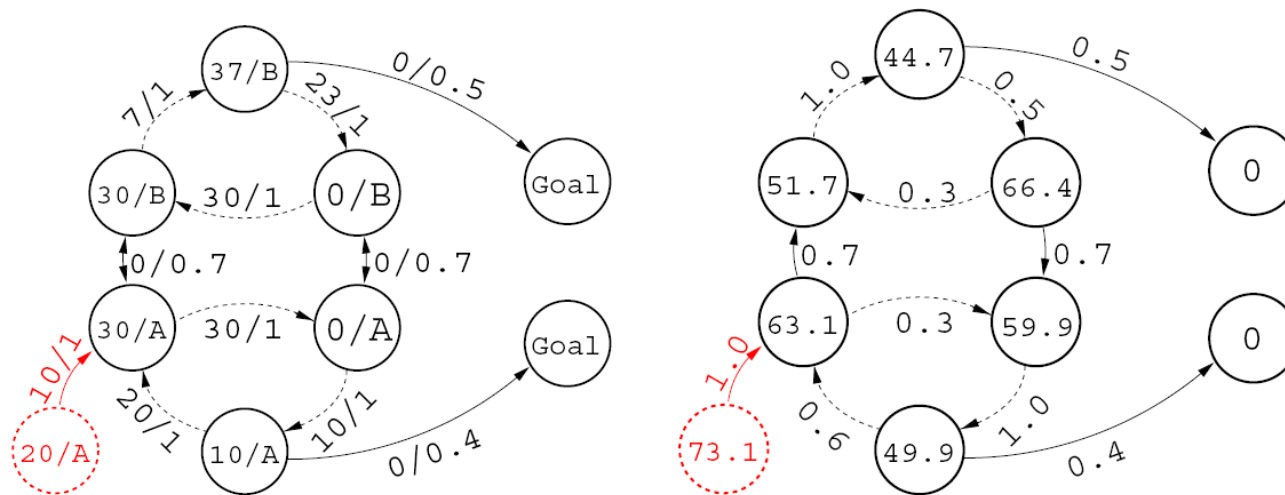
- Extended Bellman-Ford
  - Step  $t+1$  based on step  $t$
  - Ordering of neighbors based on distance to the destination
  - Selecting  $p_i \leq p_i^{\max}$  such that  $\sum_i p_i = 1$



$$v_s^{t+1} \leftarrow \min_{p_1, p_2, p_3, \dots} \{p_1 \times (d_1 + v_{s_1}^t) + p_2 \times (d_2 + v_{s_2}^t) + p_3 \times (d_3 + v_{s_3}^t) + \dots\}$$

# Expected Minimum Delay (EMD)

- Using the EMD as the delivery probability metrics  
(Liu and Wu, MobiHoc 2008)

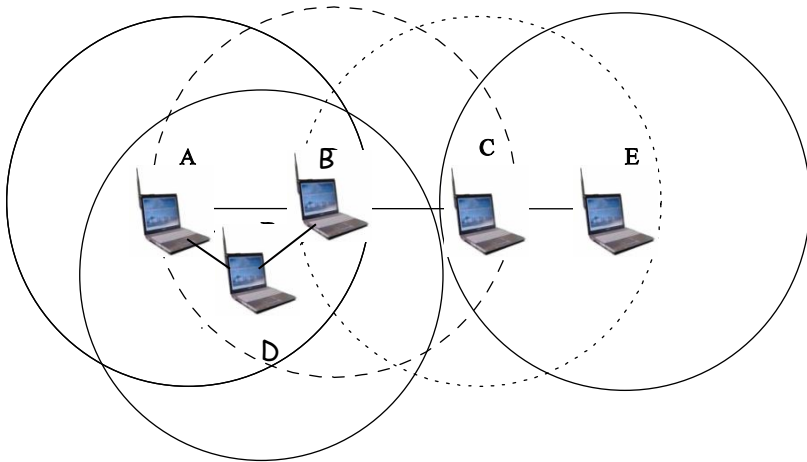


# Other Challenges

- Mobility
- Connectivity
- Complexity

- Bandwidth/storage
- Latency
- Security
- Multicast/broadcast

(Wu and Wang, MASS 2010)



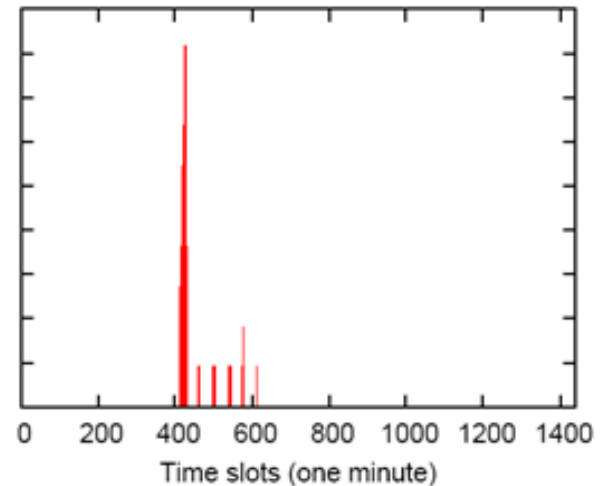
# Complexity

- Discrete contact graphs

- Lossless translation method
  - Graph virtualization  
(state explosion issue)
- Lossy comprehension method
  - Contact information compression

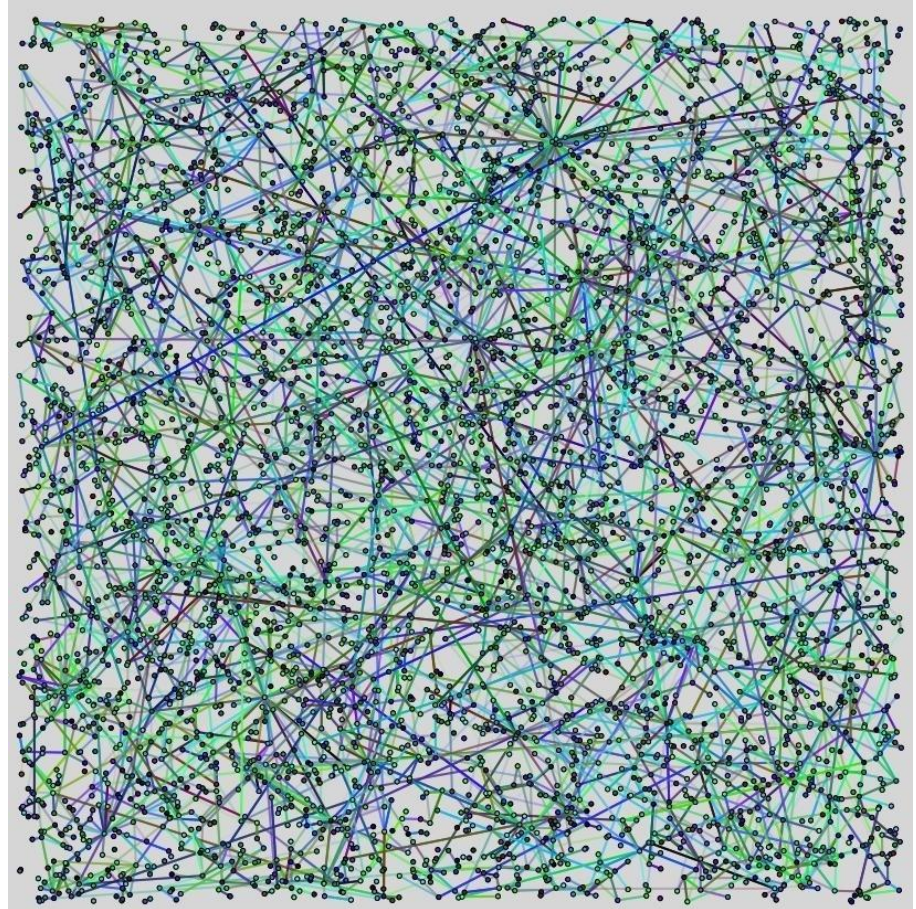
- Probabilistic contact graphs

- Lossy compression through clustering (Liu and Wu, ToN 2011)
- One cluster per contact event
  - Hierarchical clustering
  - K-mean partitioned clustering



# 4. A Bigger Picture

- Data Management
  - In-network processing
  - Tradeoffs among communication, computation, and storage
  - Cloud computing & data centers
- Theory
  - Rigorous model and scaling properties
  - Swarm intelligence
- Social Networks
  - Small-world (six degrees of separation)
  - Scale-free networks (power-law)



# Cloud Computing & Data Centers

- Cloud computing: software, platform, infrastructure
- Wireless and mobile applications in cloud computing (MobiCom'11, Cambridge) and data centers (SIGCOMM'11, Microsoft Research)

## Mobile and Wireless

- Portable: Follow us everywhere
- Rich in **context**
- Connect mobile and cloud computing

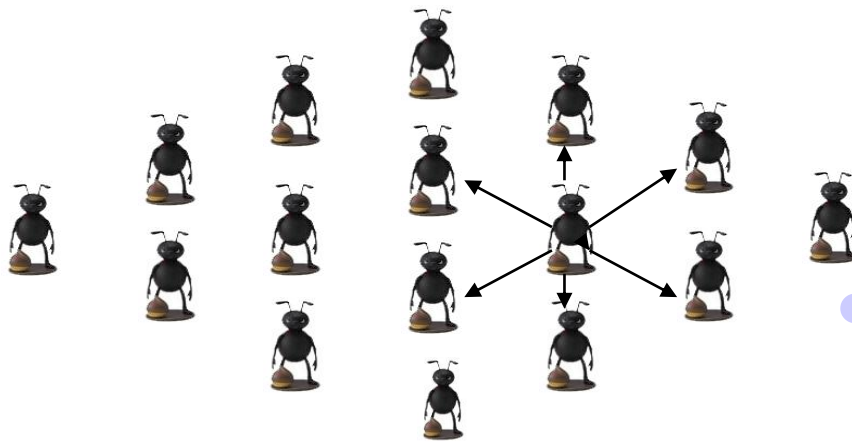


## Cloud computing

- Huge data centers
- Rich in **resources**
- Lots of reliable power, storage, and computing capabilities

# Swarm Intelligence: Self-Organization

- Local view
  - P2P and simple interaction (mostly local)
- Global functionality
  - Adaptive, robust, and scalable



- Four paradigms

(Prehofer and Bettstetter, Comm. Magazine, July 2005)

- $P_1$ : Local interactions with global properties
- $P_2$ : Minimizing the maintained state
- $P_3$ : Adaptive to changes (self-healing)
- $P_4$ : Implicit coordination

- CDS construction for four paradigms (Wu, Yang, and Dai, TC'09)

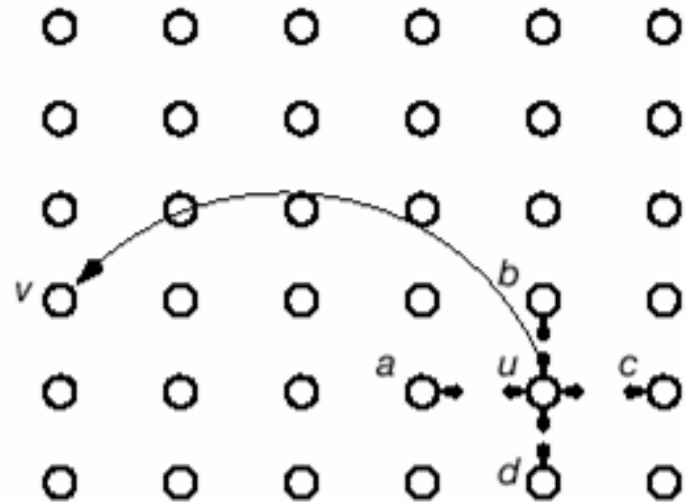
# Social Networks: Small World

- **Six degree of separation**: short path length
- **Clustered**: neighbors of a node being neighbors
- Local CDS processing work well: nodes with unconnected neighbors are marked

- $P$ : percentage of rewiring
- $CC$ : clustering coefficient

Average node degree: 10

$P$	$CC$	$CDS$
0.01	0.96	1.05
0.02	0.95	1.08
0.03	0.91	1.1



# Questions

