



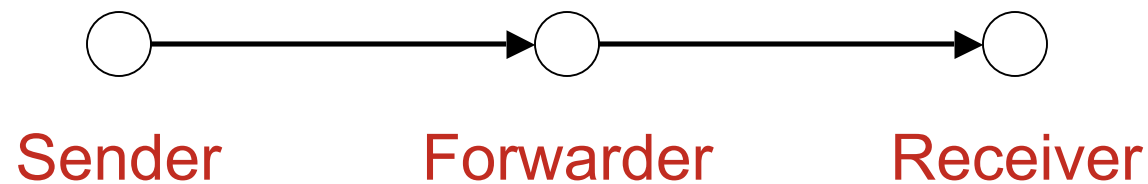
# Punishment in Selfish Wireless Networks: A Game Theoretic Analysis

Dave Levin

University of Maryland,  
College Park



# Wireless Ad Hoc Networks



- What **incentive** does the forwarder have
  - To use its own battery?
  - To not send its own packets instead?



# Solution Flavor #1

- Require **external means**
  - Trusted component (bank or hardware)
- Pay nodes to forward for you
  - Sprite, Ad Hoc-VCG
- Use tamper-proof hardware
  - [Buttyán & Hubaux, 2000]
- We'll call these **external incentive mechanisms**
- **Deployment Strategy?**

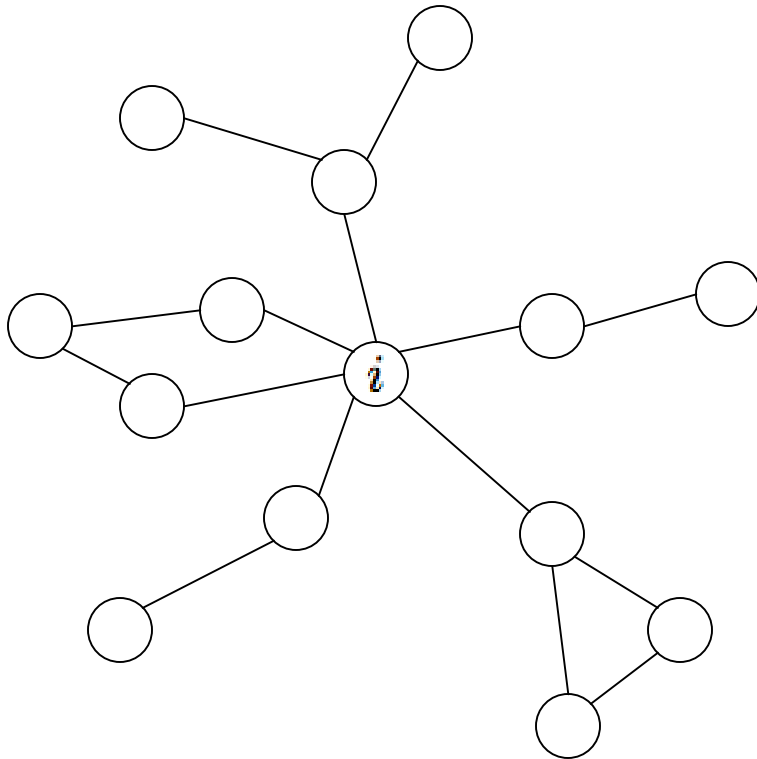


# Solution Flavor #2

- Goal: easier deployment
- Approach:
  - Internal incentive mechanisms that can be built on top of existing 802.11 primitives
- This work:
  - Model to understand internal mechanisms
  - New mechanism: jamming



# Assumptions: Network



**Edges**

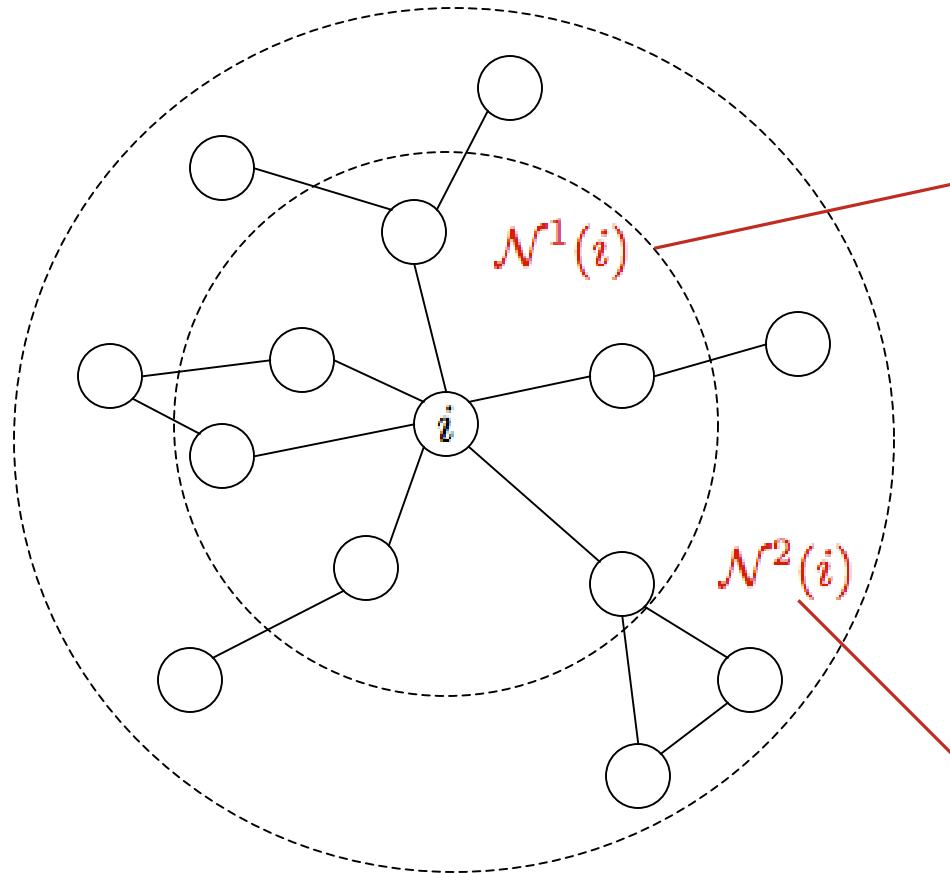
Can transmit  
to one another

**Bidirectional Links**

802.11 requires  
link-level ACKs



# Assumptions: Transmissions



**Transmission range**

All 1-hop nbrs hear  
 $i$ 's transmissions

**Carrier Sense Range**

No one within 2 hops  
can send/recv  
while  $i$  is transmitting



# Assumptions: Node Behavior

- Nodes are **rational** but **not malicious**
  - Maximize their connectivity over time

- Limit of means criterion

- $(u_i^t)$  preferred to  $(w_i^t)$  iff

$$\exists \epsilon > 0 \text{ s.t. } \frac{1}{T} \sum_{i=1}^T (u_i^t - w_i^t) > \epsilon$$

- i.e., go with the best strategies *on average*



# Assumptions: Node Preferences

- Connectivity is best  
Utility  $C$
- Disconnected is bad  
 $C > D$
- Forwarding costs  
 $C > F < 0$
- But connectivity overcomes  
 $C + F > D$

Nodes can be disconnected and forward

w.l.o.g.:

$$C = 2$$

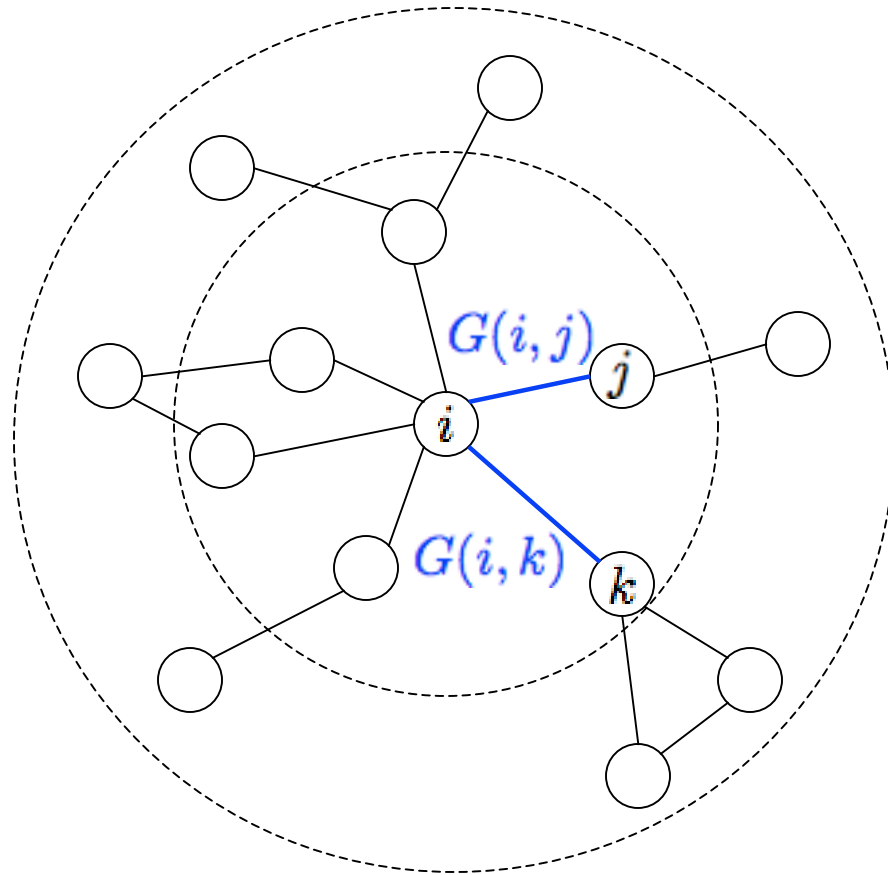
$$D = 0$$

$$F = -1$$





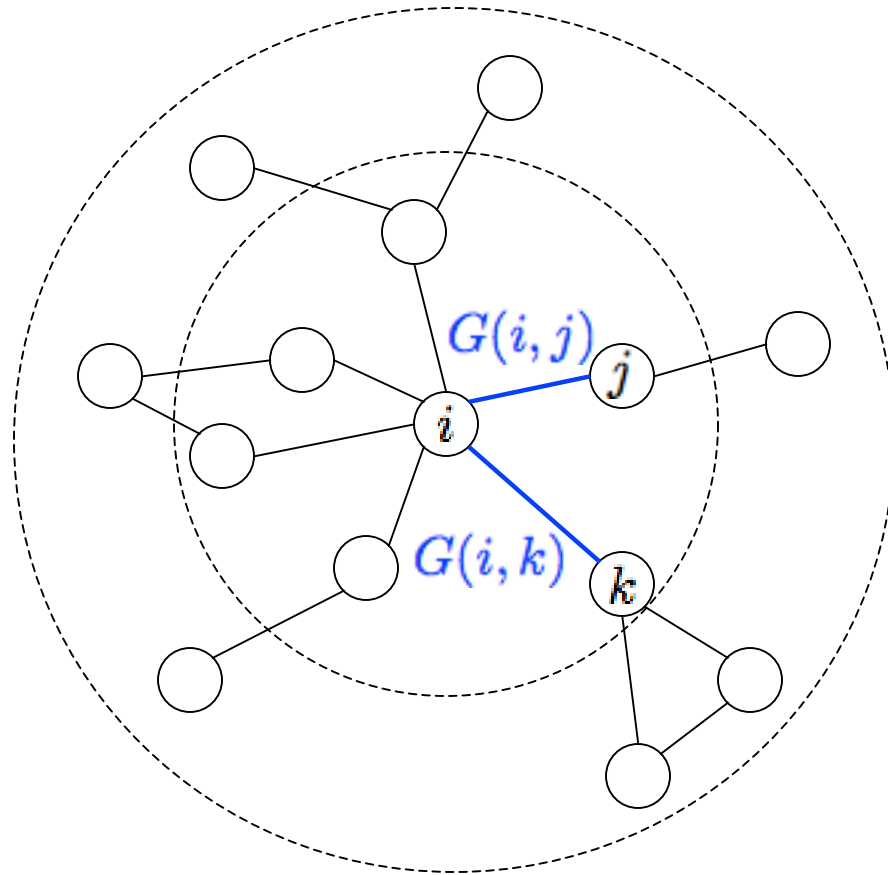
# Games with Neighbors



- A game with each one-hop neighbor
- Not necessarily independent
- Games themselves depend on the nodes' interests



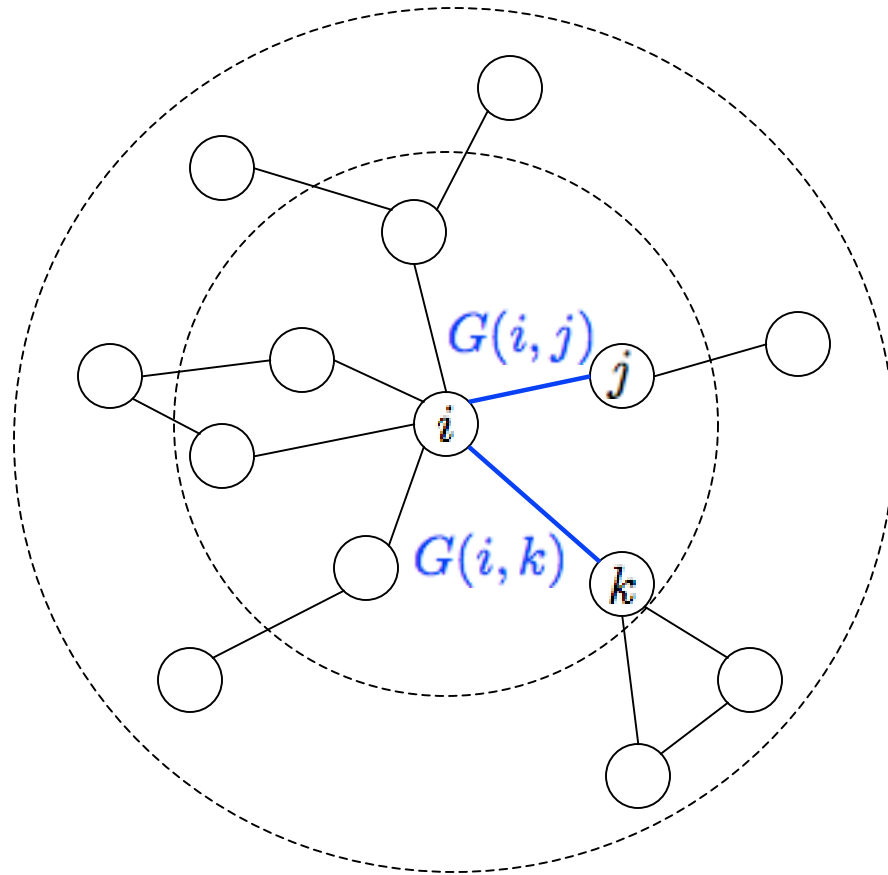
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- A game with each one-hop neighbor
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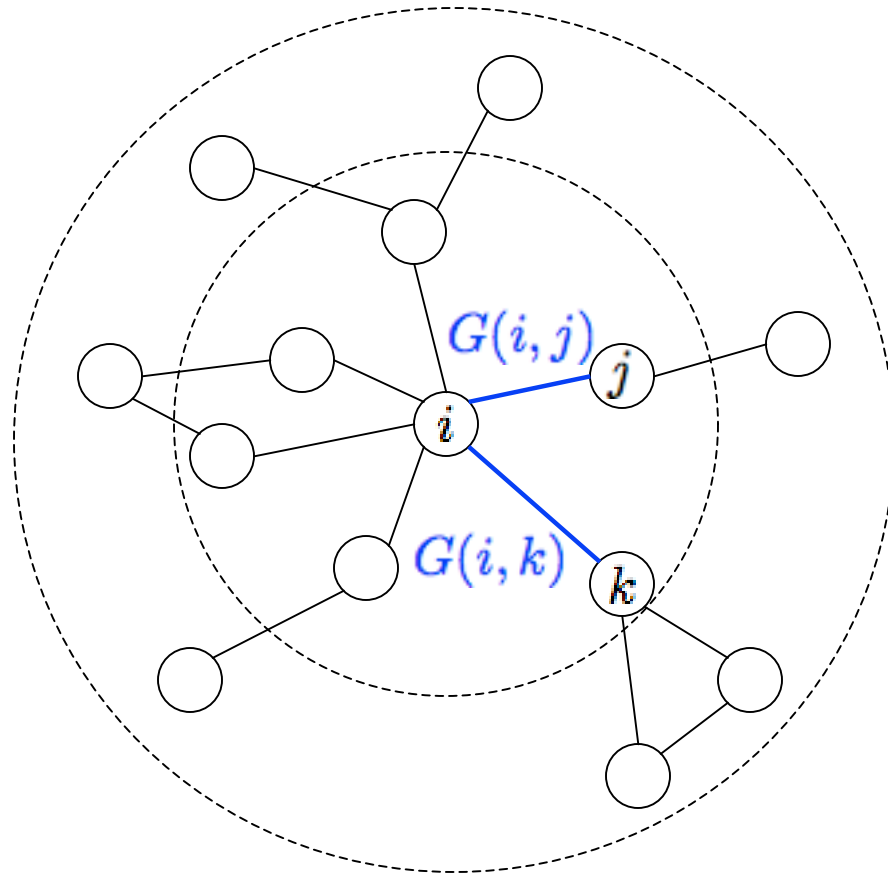
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Can only cooperate so much
  - Now: infinite-capacity
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# Games with Neighbors



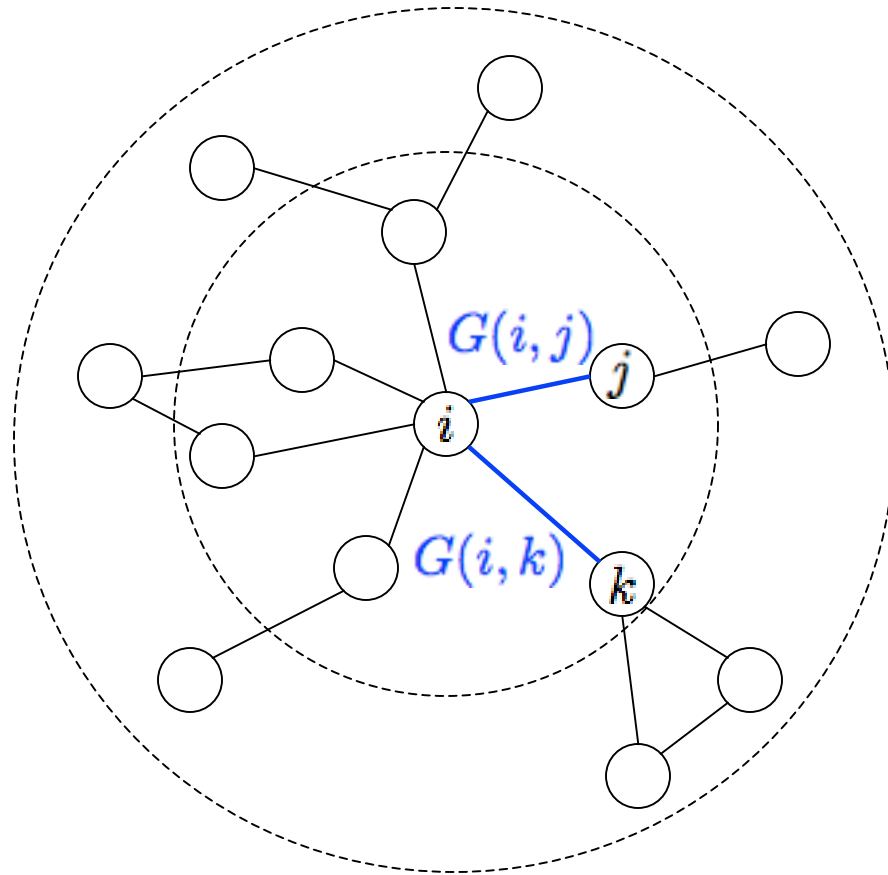
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  - Outcome of  $G(i, j) = \mathcal{U}_i^t(j)$
  - Total payout *not*

$$\sum_{j \in \mathcal{N}^1(i)} \mathcal{U}_i^t(j)$$

- Games themselves depend on the nodes' interests



# Games with Neighbors



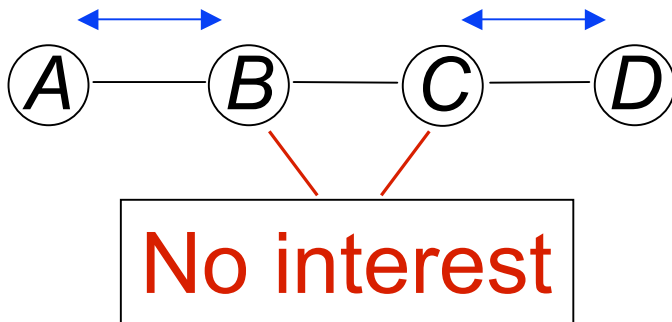
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# Ad Hoc Routing Game



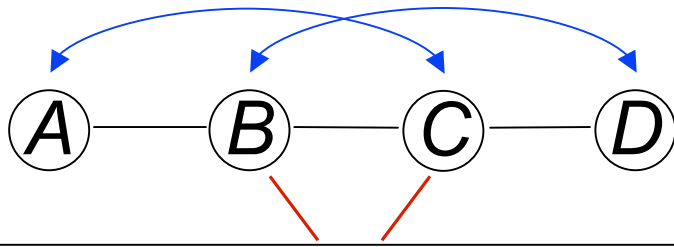
- Neither *B* nor *C* will ask one another to forward

<i>B</i> \ <i>C</i>	Coop	Defect
Coop	0, 0	0, 0
Defect	0, 0	0, 0

- Only one outcome:  
(Defect, Defect)



# Ad Hoc Routing Game



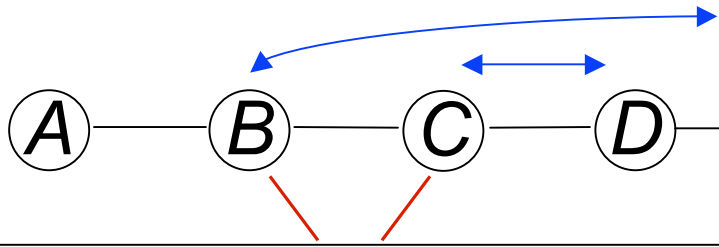
Symmetric Interest

$B \setminus C$	Coop	Defect
Coop	1, 1	-1, 2
Defect	2, -1	0, 0

- Both want each other to forward for them
- Iterated prisoner's dilemma
- Outcome using TFT:  
(Coop, Coop)



# Ad Hoc Routing Game



Asymmetric Interest

$B \setminus C$	Coop	Defect
Coop	2, -1	0, 0
Defect	2, -1	0, 0

- $B$  wants  $C$  to forward
- $C$  does not need  $B$

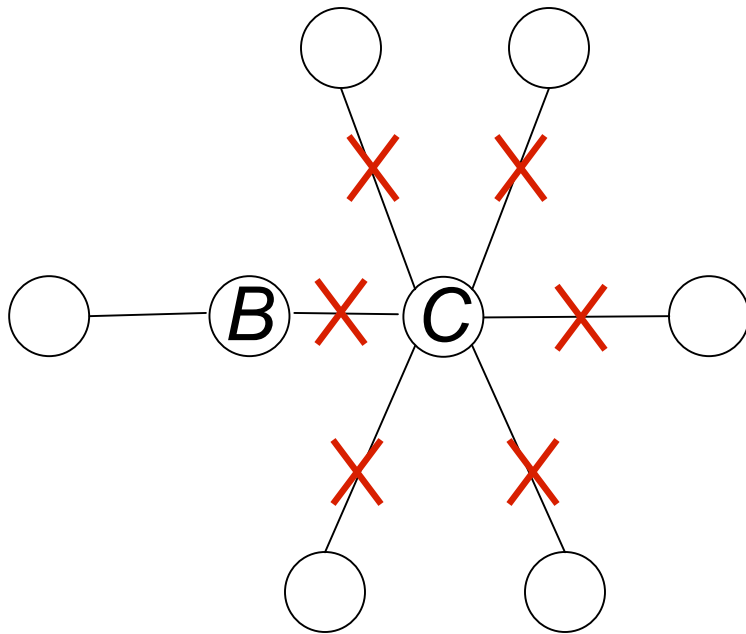
- $C$ 's dominant strategy:  
**Defect**

*This is what we're trying to solve*





# Punishing via Isolation

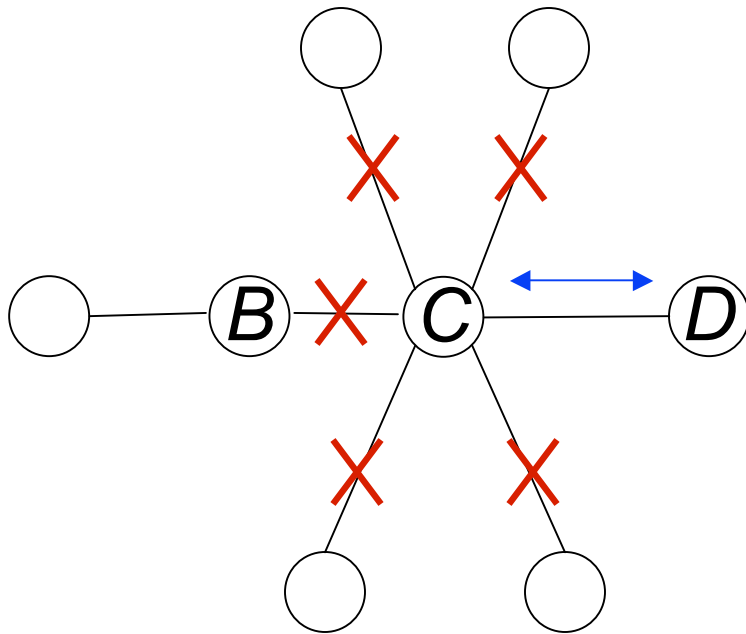


**C's utility at most 0**

- C does not forward for B
- B detects this
  - Watchdog [Marti et al]
- And gets C isolated
- Requests all  $i \in \mathcal{N}^1(C)$  to play Defect in  $G(i, C)$ 
  - Catch [Mahajan et al]



# Does Isolation Always Work?



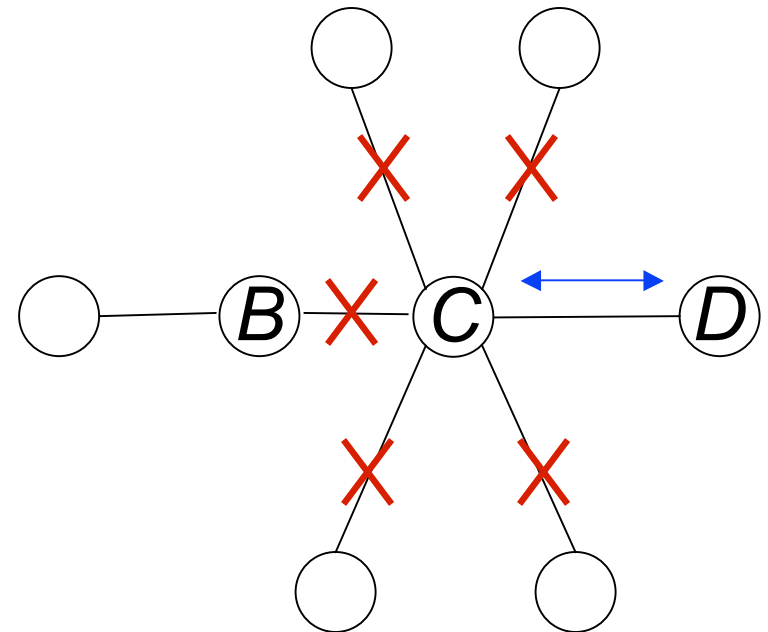
**C's utility not affected**

- *B* tries to get *C* isolated
- *D* has a connection to *C*
- *Why would D isolate?*
  - And cut off its own connection?
- To avoid punishment?
  - Hide their connection



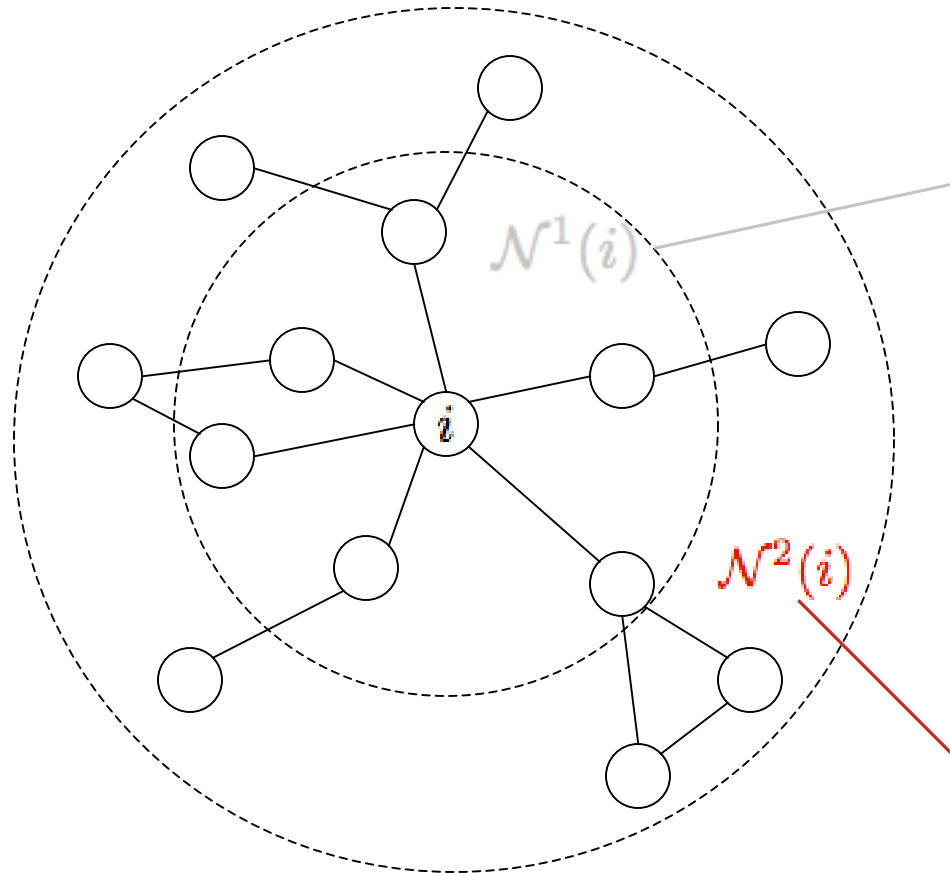
# Ensuring Cooperation

- Why didn't isolation work?
  - Collusion!
- Would any other isolation system work?
- *B* needs a way to break the *C* - *D* connection





# Recall



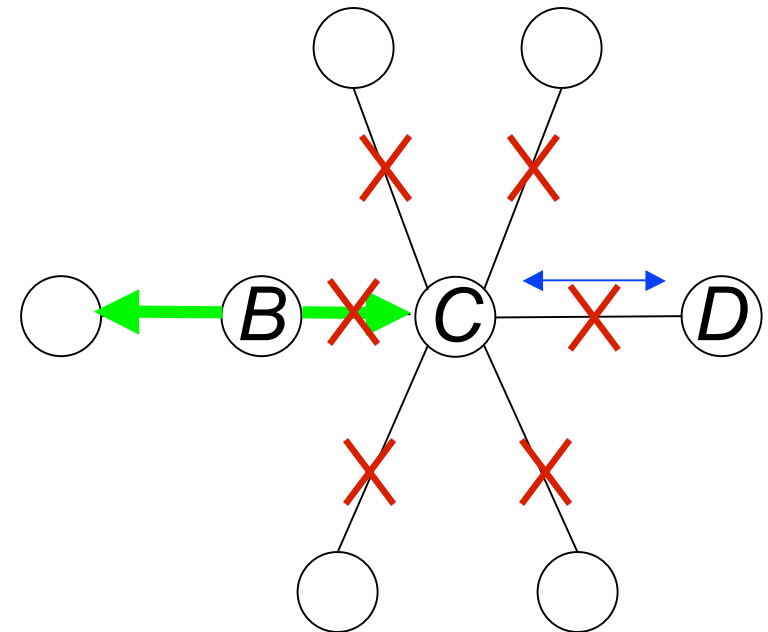
Transmission range  
All 1-hop nbrs hear  
 $i$ 's transmissions

**Carrier Sense Range**  
No one within 2 hops  
can send/recv  
while  $i$  is transmitting



# Assured Punishment

- While *B* is sending
  - *C* cannot send or recv
  - The *C* - *D* connection is broken
- If *B* has nothing to send?
  - Send garbage
  - **Jamming**
- *C* can collude all he wants



*B* can always punish *C*



# Node Preferences w/ Jamming

- Connectivity is best  
Utility  $C$
- Disconnected is bad  
 $C > D$
- Forwarding costs more  
 $C > D > F < 0$
- But connectivity overcomes  
 $C + F > D$
- Costs more to Jam than Fwd  
 $0 > F > J$

Nodes can be disconnected and forward

w.l.o.g.:

$$C = 2$$

$$D = 0$$

$$F = -1$$

$$J = -2$$



# Payoffs with Jamming

- **Recall:** Games  $G(i, j)$  and  $G(i, k)$  not independent
  - Jamming affects all nearby games
- If node  $i$  is playing Cooperate for  $f_i(t)$  neighbors:

$$U_i(t) \stackrel{\text{def}}{=} \begin{cases} -2 & \text{if } i \text{ is Jamming} \\ -f_i(t) & \exists j \in \mathcal{N}^2(i) \text{ Jamming} \\ \sum_{j \in \mathcal{N}^1(i)} \mathcal{U}_i^t(j) & \text{otherwise} \end{cases} \leq 0$$

Normal payoffs



# Is Jamming Viable?

- When  $B$  Jams:
  - The best  $C$  can do is stop forwarding

$$U_C(t) = -f_C(t) = 0$$

- $C$ 's minmax payoff

$$U_i(t) \stackrel{\text{def}}{=} \begin{cases} -2 & \text{if } i \text{ is Jamming} \\ -f_i(t) & \exists j \in \mathcal{N}^2(i) \text{ Jamming} \\ \sum_{j \in \mathcal{N}^1(i)} U_i^t(j) & \text{otherwise} \end{cases} \leq 0$$





# Is Jamming Viable?

- When  $B$  Jams:
  - The best  $C$  can do is stop forwarding

$$U_C(t) = -f_C(t) = 0$$

- $C$ 's minmax payoff
- Folk theorem: There exist SPNE with
  - Payoffs greater than disconnectedness
  - Jamming used as punishment



# Jamming /s Viable

- It works
- In fact:
  - When there is no packet loss (noise)  
Every participant will always forward
- What happens when there is noise?
  - Free-riding vs. Packet loss



# Modeling Noise

- Packets dropped with probability  $p$
- Expected gain from my neighbor's Cooperation:  $(1 - p)U_c + pU_d$
- Expected gain from my neighbor's Defection:  $U_d$

*Depend on interest*



## Symmetric Game

$B \setminus C$	Coop	Defect
Coop	$1-2p, 1-2p$	$-1, 2-2p$
Defect	$2-2p, -1$	$0, 0$

## Asymmetric Game

$B \setminus C$	Coop	Defect
Coop	$2-2p, -1$	$0, 0$
Defect	$2-2p, -1$	$0, 0$



# Modeling Noise

- For any  $p < 1$ 
  - Minmax payoff from (Jam, Defect)
  - Jamming will yield a SPNE

Symmetric Game

$B \setminus C$	Coop	Defect
Coop	$1-2p, 1-2p$	$-1, 2-2p$
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Asymmetric Game

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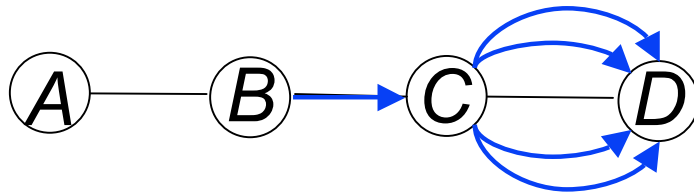
# Behaviors with Noise

- Greedy nodes may try to free-ride
  - Looks like packet loss
- But what about risk-averse nodes?
  - May try to avoid even packet loss



# “Forward Error Correction”

- Nodes may forward a given packet **more than once**
  - To make sure their neighbors see it



Probability  $B$  sees  
Defection =  $p^4$

- Will pay the cost multiple times
  - If the **punishment is strong enough**

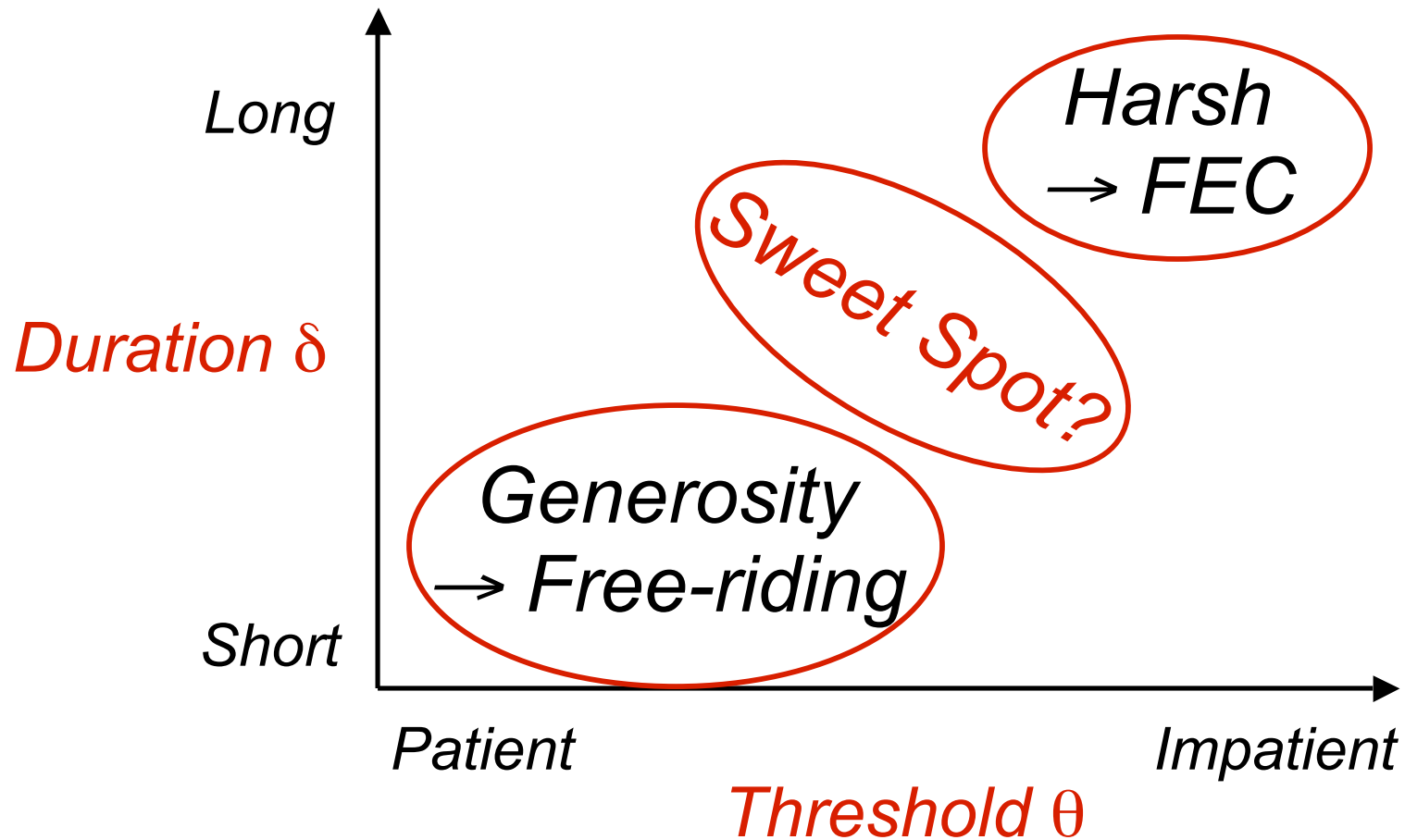


# Punishment Strength

- When to punish?
  - Each node uses a watchdog
  - Punish once they forward less than **threshold  $\theta$**
- How hard of a punishment?
  - Punish for **duration  $\delta$**
- Strength of punishment:  **$\delta / \theta$**



# Emergent Behaviors







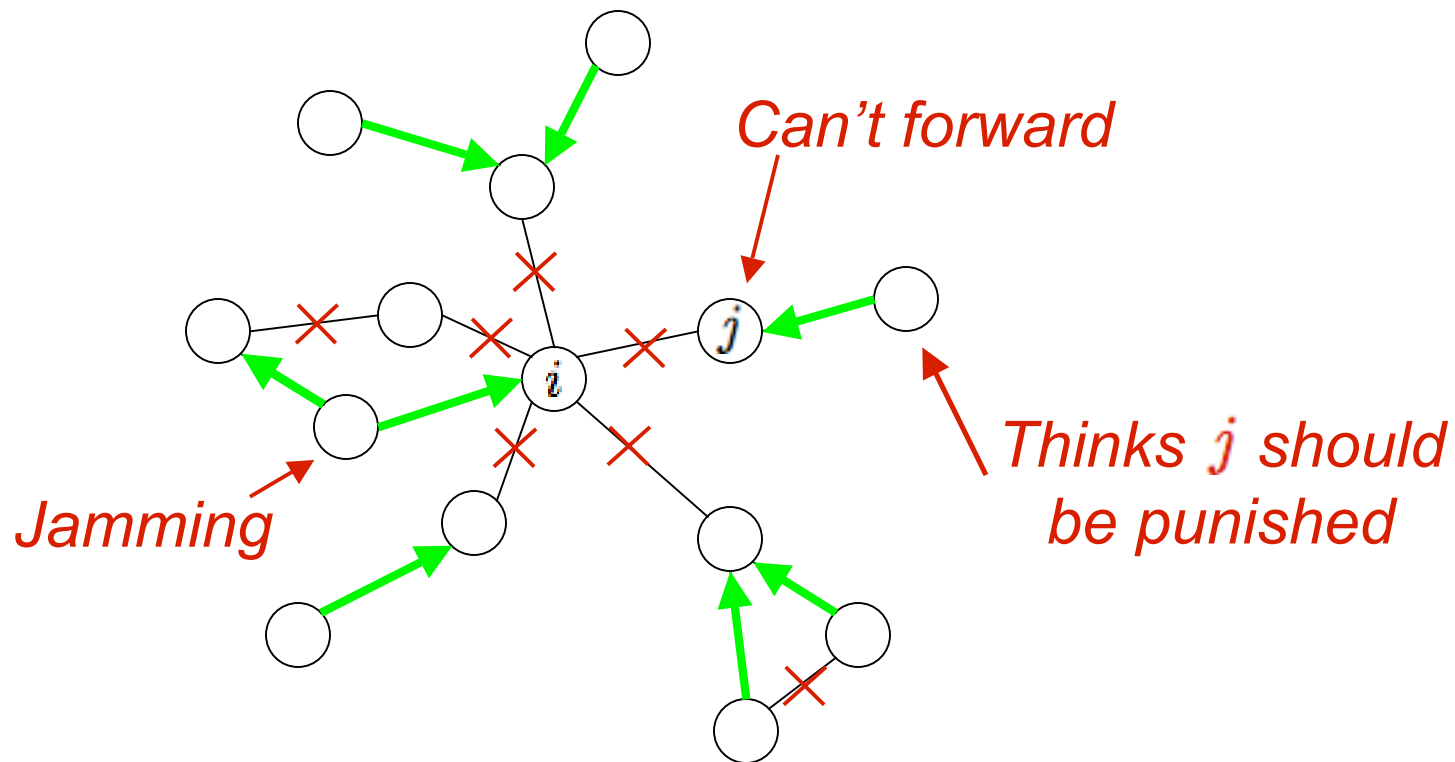
# Jamming Strategy: Guidelines

- Strategy should be adaptive
  - Adjust to noise levels
  - Don't punish nodes for not doing the impossible
- Nodes may have to share info
  - To better understand capacity
  - How to do this truthfully?
- Deal with punishment echoes



# Punishment Echoes

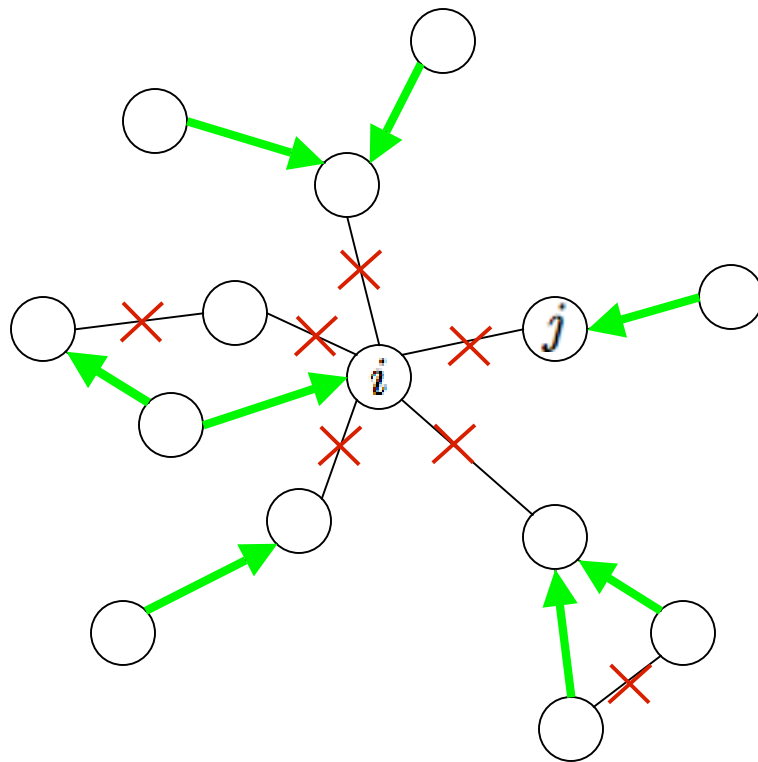
- Jamming can echo





# Punishment Echoes

- Jamming can echo



Mutually assured  
destruction

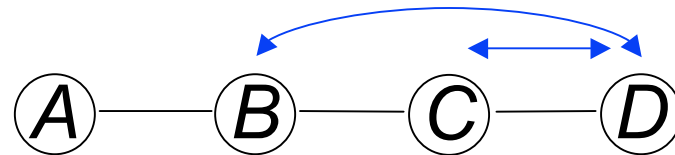
**Potential solution 1:**  
Punish with some  
small probability

**Potential solution 2:**  
Tell nbrs you are  
being jammed



# Is Jamming Worth Doing?

- Addresses the Asymmetric case



- Should we always have cooperation?
  - Should nodes be allowed to opt out?
- **It works** but is it worth the loss in
  - Efficiency?
  - Network lifetime?

*Goal: minimize these*



# Conclusion

- Internal incentives easier to deploy
  - No trusted components
- Isolation does not always work
  - “Collusion” happens
- Jamming works
  - SPNE
- But not without issues
  - Echoes, efficiency loss...
- Question:

**Are there easy-to-deploy, viable solutions?**



# Thanks

- Seungjoon Lee
- Vijay Gopalakrishnan
- Bobby Bhattacharjee