

# Distributed Load Shedding with Minimum Energy

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#### Introduction

- Problem: Congestion control at every **source** is complex.
  - Sources may not be trusted
  - Network variability
- Solution: In-network congestion control without source cooperation.
  - Simplified decision process in a large network
  - No specified nodes responsible for congestion control

#### In this talk:

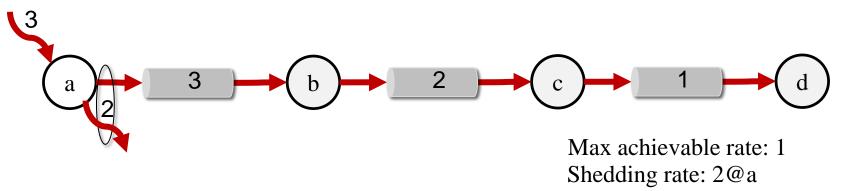
Resolve congestion inside the network without burdening source

- Sources inject packets
- The network adapts by shedding packets
- Packets are dropped as earlier as possible energy efficiency

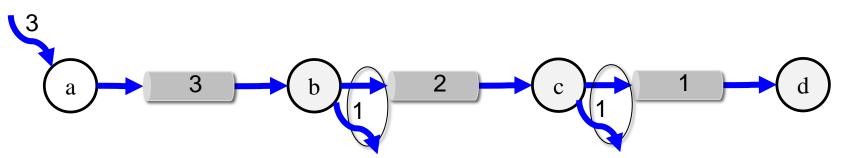


# **Congestion Control**

Source-based load shedding



Distributed load shedding

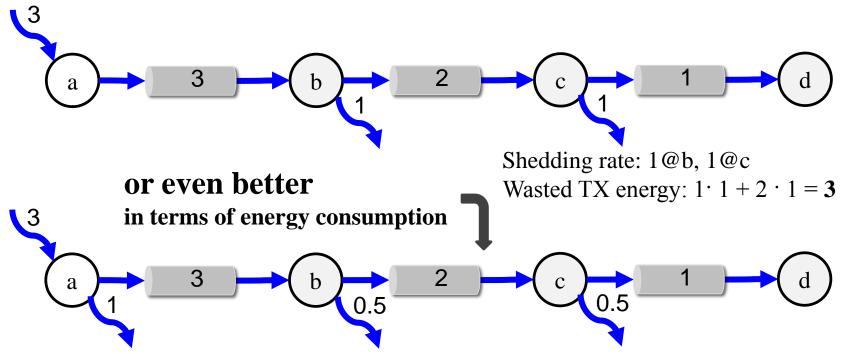


Max achievable rate: 1 Shedding rate: 1@b, 1@c



## Distributed Load Shedding (DLS)

- Source injects the whole load to the network
- Threshold-based load shedding at all nodes
- All nodes use the same threshold



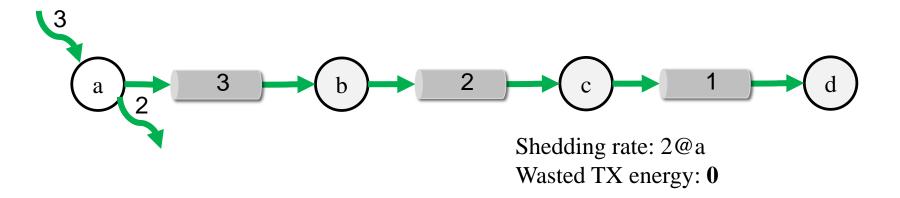
Shedding rate: 1@a, 0.5@b, 0.5@c

Wasted TX energy:  $1 \cdot 0.5 + 2 \cdot 0.5 = 1.5$ 



# Energy-efficient Distributed Load Shedding (E-DLS)

• **E-DLS**: Thresholds increase as the node gets closer to the destination

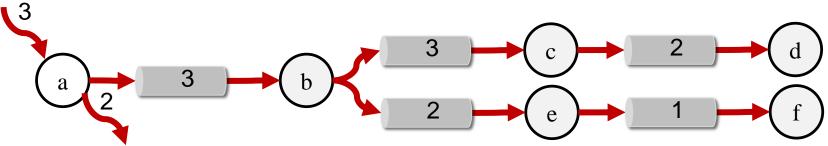


- Simple distributed load shedding
- Optimal throughput performance
- Minimum wasted TX energy as source-based load shedding



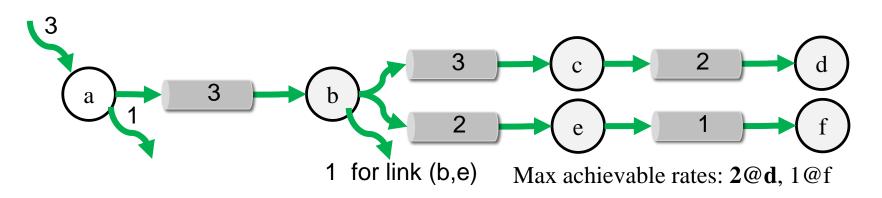
#### multicast E-DLS

Source-based load shedding



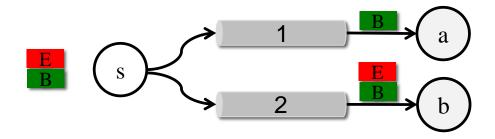
Max achievable rates: 1@d, 1@f

multicast E-DLS





#### Multirate multicast

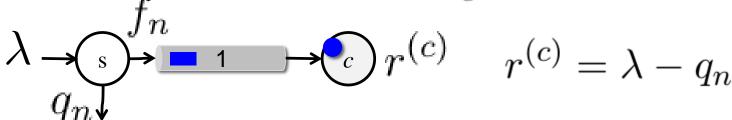


- Same stream at **different rate** per receiver
- Layered video coding
  - Basic layer packets: necessary for decoding at lowest quality
  - Enhanced layer packets: improve quality



#### Formulation of NUM

Throughput maximization:  $\max_{\boldsymbol{f},\boldsymbol{q}} \sum_{c} r^{(c)}$ 

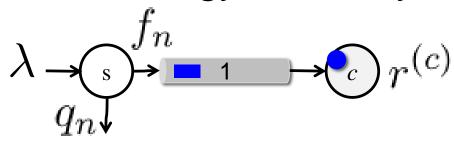


Equivalent to minimization of shedding rates

that is (for one session c): 
$$\min_{\boldsymbol{f},\boldsymbol{q}} \sum_{n} q_{n}$$



#### NUM for energy-efficiency



Transmissions minimization:  $\min_{\boldsymbol{f},\boldsymbol{q}} \sum_n f_n$ 

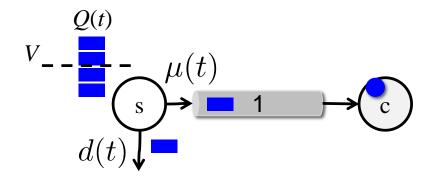
Equivalent to maximization of weighted shedding rates :

$$\max_{\boldsymbol{f},\boldsymbol{q}} \sum_{n} h_n q_n$$

subject to: 
$$\min_{\boldsymbol{f},\boldsymbol{q}} \sum_{n} q_n$$



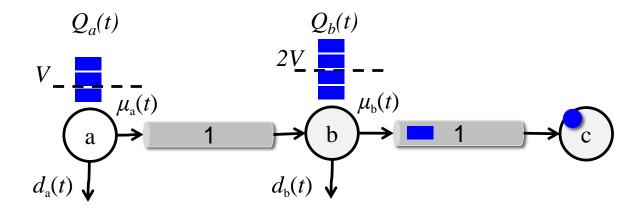
## Real-time control: shedding



- At every slot
  - Choose d(t) to drop packets
  - Choose  $\mu(t)$  to route packets
- Threshold-based shedding: If  $Q(t) > V \operatorname{drop} d_{\max}$  packets, else zero



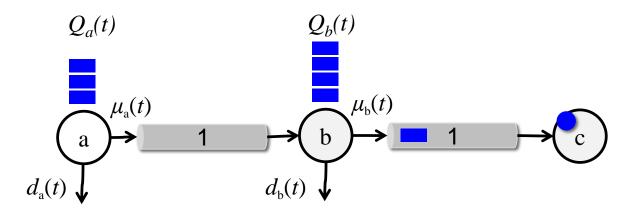
# Proposed energy-efficient shedding



- Threshold **increases** as hop count to the destination **reduces**
- Threshold at each node:  $(K h_n) V$



### Real-time control: Proposed routing (path)

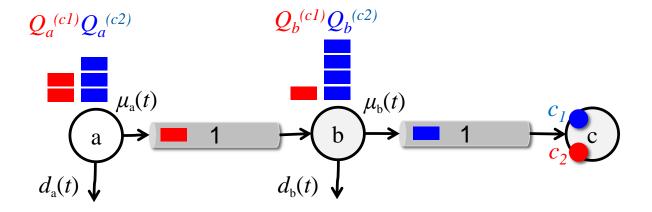


• Backpressure routing: Transmit at capacity if  $Q_a(t) > Q_b(t)$  (positive differential backlog)

Backpressure+threshold-based shedding = maximum throughput for this unicast session



# Proposed routing (multiple sessions)

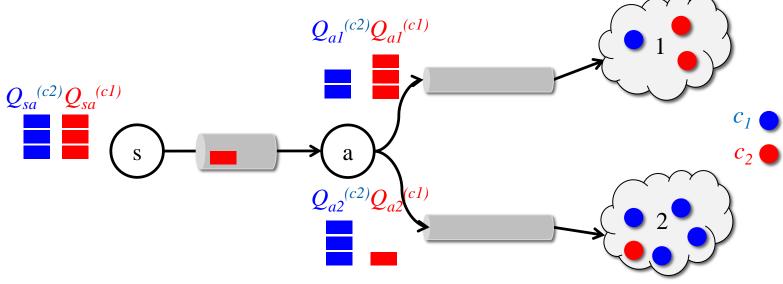


- Backpressure weight:  $Q_a^{(c_1)} Q_b^{(c_1)}$  or  $Q_a^{(c_2)} Q_b^{(c_2)}$ 
  - Transmit the session with the maximum weight

#### Max sum throughput for multiple unicast



# Proposed multicast routing (tree)



• Backpressure weight:  $Q_l^{(c)}(t) - \sum_{l':p(l')=l} Q_{l'}^{(c)}(t)$  $\lim_{l \to \infty} \{ Q_{sa}^{(c_2)} - Q_{a1}^{(c_2)} - Q_{a2}^{(c_2)} \}_{l':p(l')=l}$   $Q_{sa}^{(c_1)} - Q_{s1}^{(c_1)} - Q_{s2}^{(c_1)} \}_{l'}$ 

• Transmit the session with the maximum weight

Max sum throughput for multirate multicast



## Summary of contributions

• Formulate NUM using **shedding rates** focusing on energy efficiency.

- In-network optimal congestion control policy for unicast & multirate multicast:
  - Threshold-based shedding

     Backpressure routing
     Gradually increased thresholds

     Maximum throughput
     Energy Efficient



## Testbed experimentation

- Testbed experimentation
  - NITOS testbed (Volos, Greece)
  - Click Modular Router
- Implementation of the policy
  - Exchange backlog information
  - Virtual slot mechanism

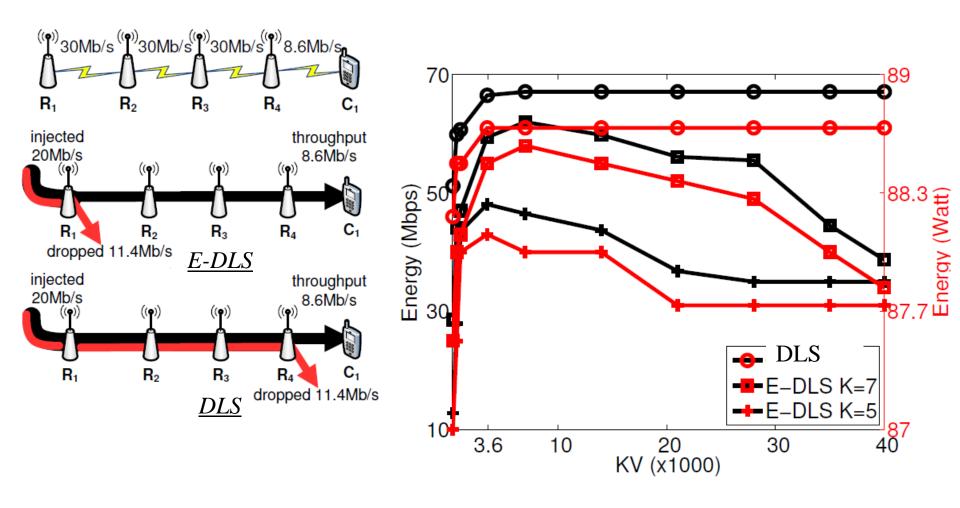


- Full throughput
- Minimum energy consumption
- Negligible messaging overhead

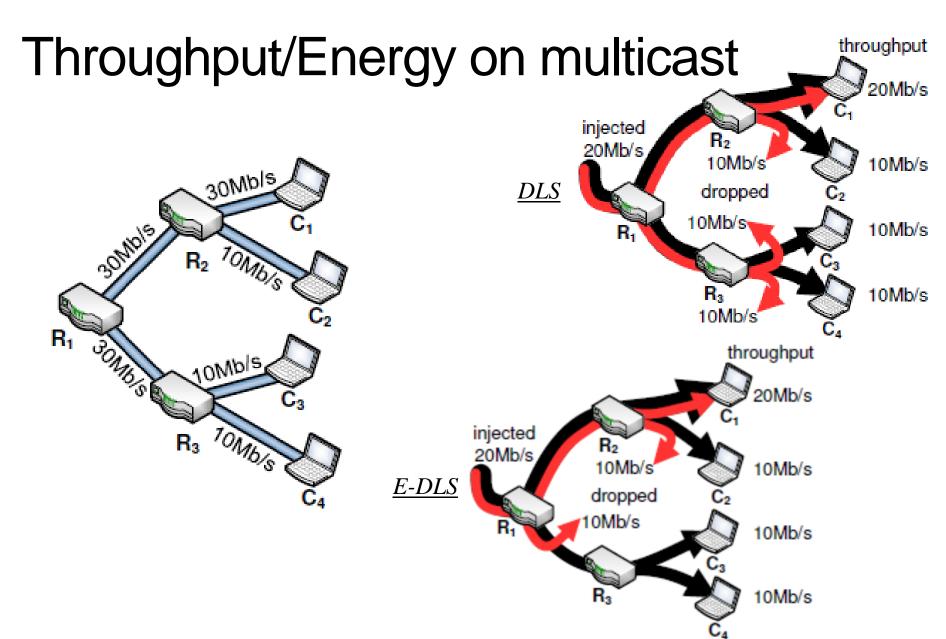




# Throughput/Energy on 4-hop path









### Conclusions

- Proposed an energy-efficient distributed congestion control scheme
  - Support for unicast sessions and proof of optimality
  - Extension for multirate multicast
  - Validation of both schemes with testbed experimentation
- Future work:
  - Proof of the optimality of the extension for multirate multicast



Thank you!

Questions?

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#### Previous solutions

- Primal-Dual algorithms: [Kar02], [Deb04]
  - Messaging between sources and receivers
- Backpressure-based: [Neely05], [Bui08]
  - Sources decide how many packets to inject
- Backpressure-based and Distributed: [Li12, Paschos14]
  - Adaptation inside the network