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# Node-based Scheduling with Provable Evacuation Time

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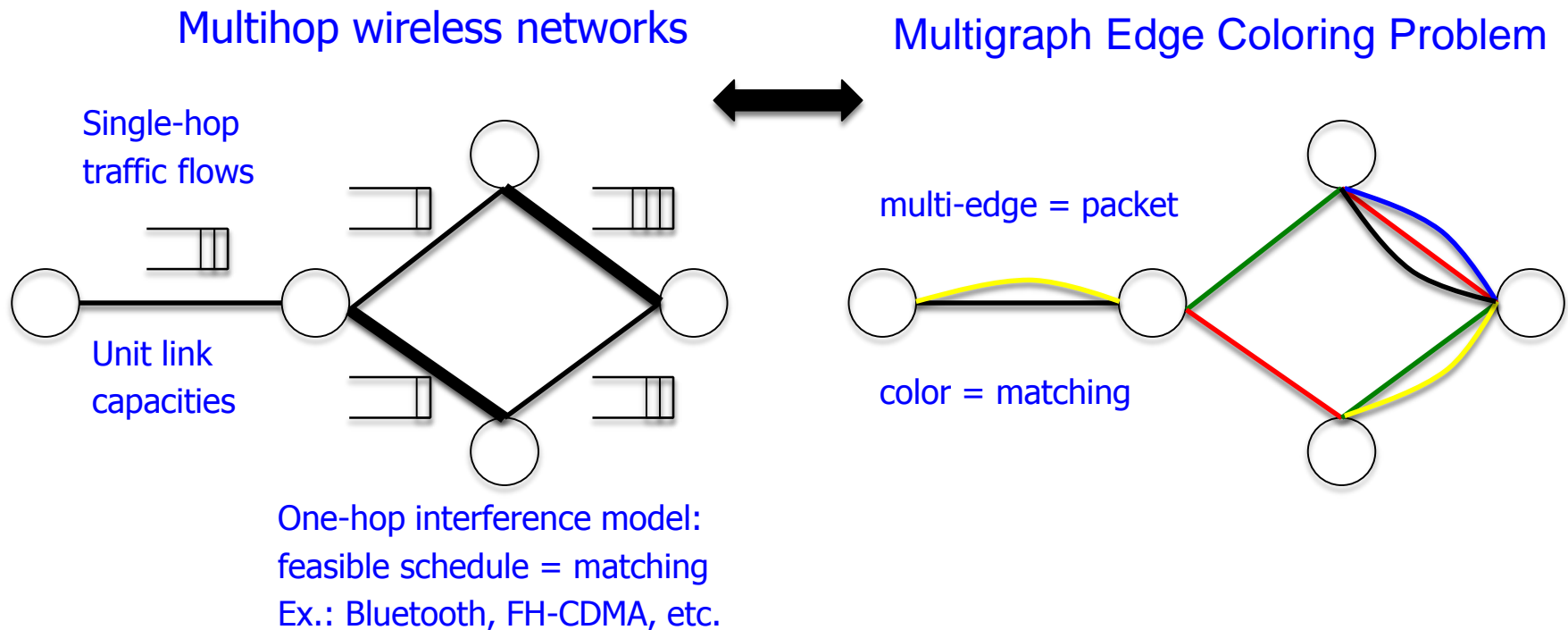
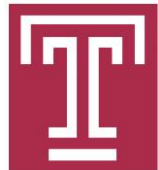
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# Link Scheduling for Minimum Evacuation Time



- **Evacuation time: time needed for draining all the existing packets**
  - A critical metric in **settings without future arrivals**
    - Goal: minimize the evacuation time
  - In settings with arrivals, a good measure of short-term throughput & closely related to the delay performance

# Multigraph Edge Coloring Problem



- The problem is generally NP-hard [Holyer'81]
- Approximations
  - Shannon's theorem [Shanon'49], Vizing's theorem [Vizing'64], ...
  - Any constant-factor approximation ratio better than  $4/3$  is NP-hard [Holyer'81]
  - If a small additive term is allowed, much better approximations (exact or asymptotic) [Sanders & Steurer'08,...]
- A survey book on graph edge coloring [Stiebitz et al.'12]
- Limitations
  - All rely on recoloring-based techniques
  - The colors (or schedules) are computed all at once
  - The complexity depends on # of multi-edges (or # of packets)
    - Could be impractically high
    - Unsuitable for link scheduling and packet evacuation
  - More limited applications to settings with arrivals

# Online Algorithms

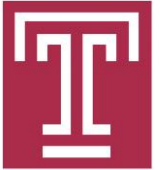


- Quickly compute one color (or schedule) at a time
  - Complexity is only dependent on network size
    - Link count and node count
  - High complexity is distributed over time
  - Desirable for applications such as link scheduling
  - Functional even if packet arrivals are considered
- Example algorithms
  - Maximum Weighted Matching (MWM) algorithm
  - MWM- $\alpha$  algorithm
  - Greedy Maximal Matching (GMM) algorithm
  - Randomized Maximal Matching (RMM) algorithm

} Edge-based

} Load-agnostic
- Existing online algorithms all have an approximation ratio no better than 2! [Gupta et al.'09]

# Node-based Approach

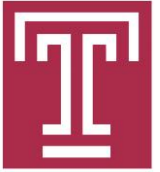


- Input-queued switches
  - Modeled as bipartite graphs
  - A class of Lazy Heaviest Port First (LHPF) algorithms [Gupta et al.'09]
    - **Maximum Vertex-weighted Matching (MVM)**, also known as Longest Port First algorithm [Mekkittikul & McKeown'98]
    - Maximum Node Containing Matching algorithm [Tabatabaee & Tassiulas'09]
  - LHPF is both evacuation-time-optimal and throughput-optimal
- Multihop wireless networks
  - Modeled as general graphs
  - Evacuation-time performance is largely unknown
  - **Our focus**: develop and analyze node-based scheduling algorithms with provable evacuation time and lower complexity

# Our Contributions



- Prove that MVM has an approximation ratio no greater than  $3/2$  in multihop wireless networks
- Propose a new node-based algorithm – Critical Node Matching (CNM) algorithm
  - CNM guarantees an approximation ratio no greater than  $3/2$  as well
  - CNM has a lower complexity of  $O(m \sqrt{n})$  than  $O(m \sqrt{n} \log n)$  of MVM, where  $m$  and  $n$  are the link count and the node count, respectively
- As a byproduct, these algorithms serve as an alternative for achieving Shannon's bound of  $3/2 \Delta$ , where  $\Delta$  is the maximum node degree

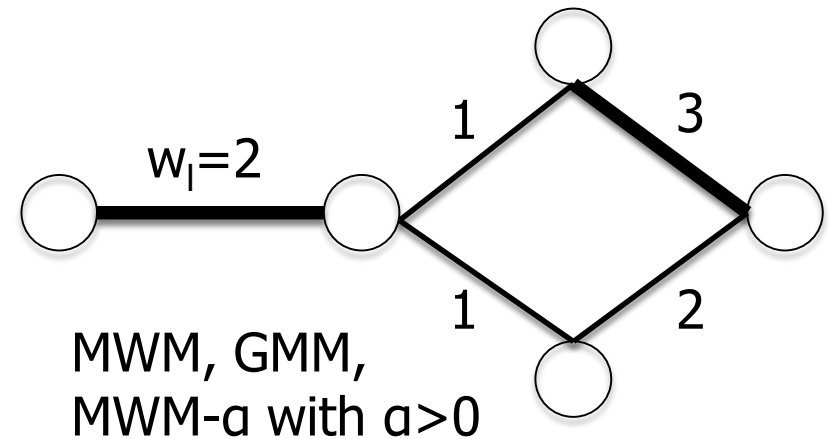
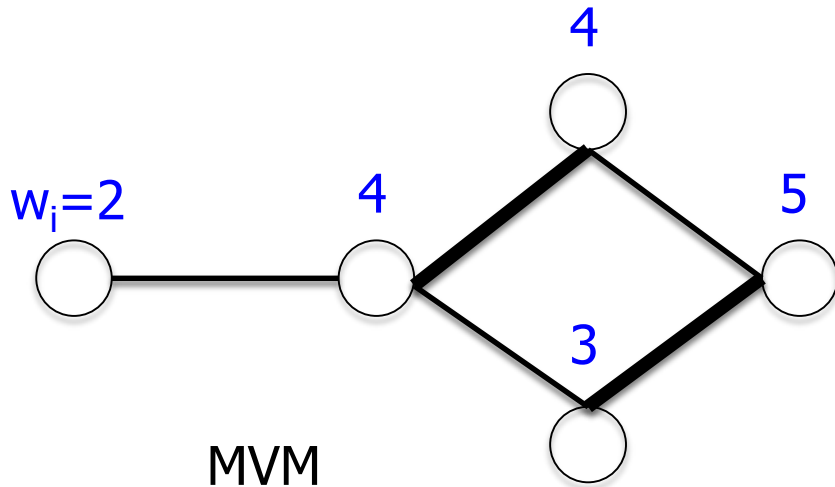
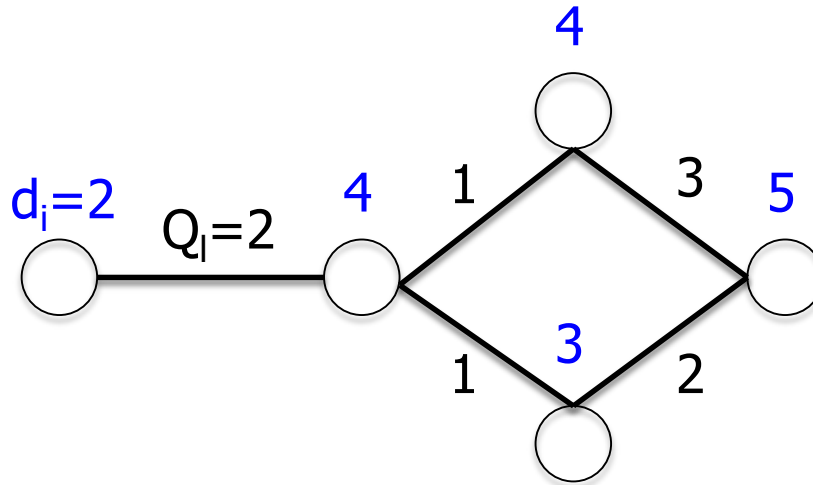
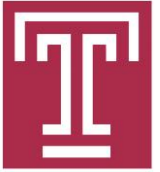


- $Q_l(t)$ : # of packets waiting to be transmitted over link  $l$
- $L(i)$ : set of links incident to node  $i$
- $d_i(t) = \sum_{l \in L(i)} Q_l(t)$ : degree of node  $i$
- $M$ : matching
- $G$ : set of all the matchings

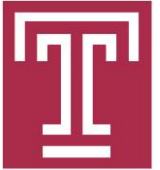
## MVM:

- $w_i(t) = d_i(t)$ : weight of node  $i$
- $w(M) = \sum_{i:L(i) \cap M \neq \emptyset} w_i(t)$ : weight of matching  $M$
- $MVM \hat{=} \arg \max_{M \in G} w(M)$ : Maximum Vertex-weighted Matching
- The MVM algorithm finds an MVM in each time slot
- MVM has a complexity of  $O(m \sqrt{n} \log n)$

# MVM - Example







# Main Result

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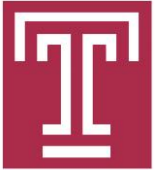
**Theorem 1:** MVM has an approximation ratio no greater than  $3/2$ .

Proof Sketch:

- Minimum evacuation time  $\geq$  maximum node degree =  $\Delta$
- MVM achieves Shannon's bound
  - Evacuation time of MVM  $\leq 3/2 \Delta$  (Proposition 1)

**Proposition 1:** Suppose the maximum node degree is no smaller than two. Under the MVM algorithm, the maximum node degree decreases by at least two within every three consecutive time-slots.

# Proof Sketch of Proposition 1



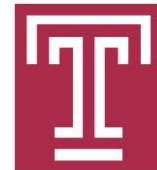
**Proposition 1:** Suppose the maximum node degree is no smaller than two. Under the MVM algorithm, the maximum node degree decreases by at least two within every three consecutive time-slots.

Proof Sketch:

- If the maximum node degree does not decrease in a time-slot, it will decrease in both of the following two time-slots
  - **Critical node:** Node having a maximum degree
  - **Lemma 1:** If the subgraph induced by all the critical nodes is bipartite, then there exists a matching that matches all the critical nodes [Anstee & Griggs'96]
  - **Lemma 2:** If there exists a matching that matches all the critical nodes, then MVM will match all of them as well
  - In both of the following two time-slots, the subgraph included by all the critical nodes is indeed bipartite

**Observation:** in order to achieve  $3/2$ , it is sufficient to focus on scheduling the critical nodes

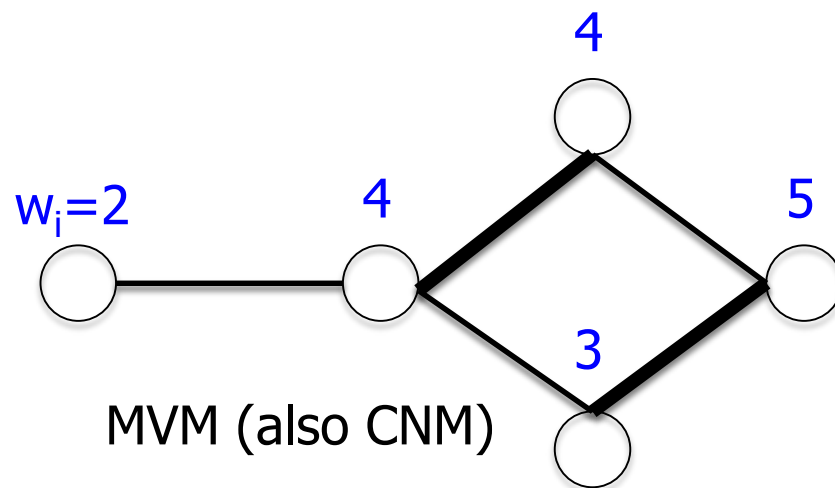
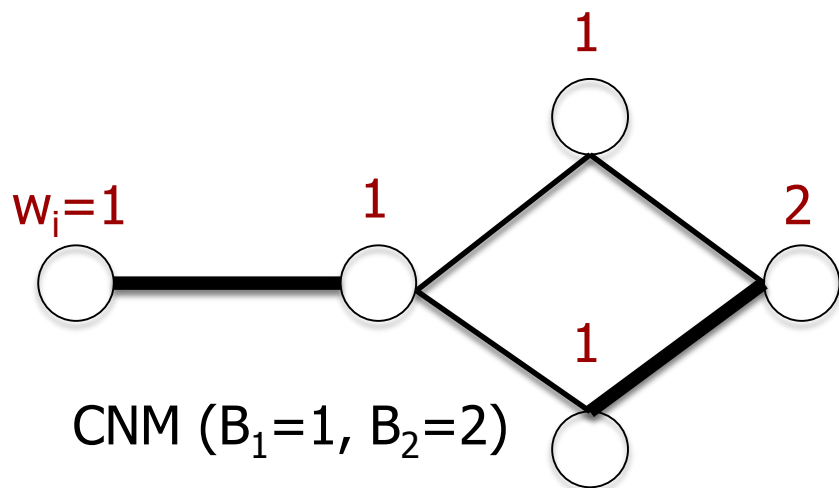
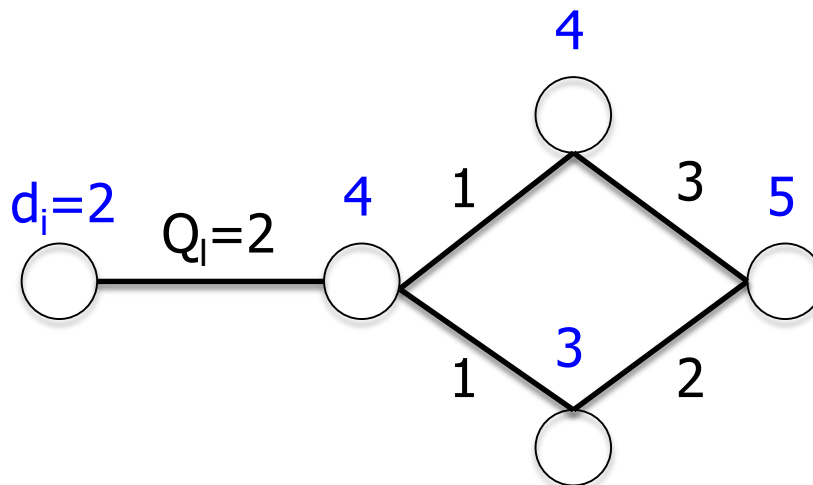
# CNM – Lower Complexity MVM



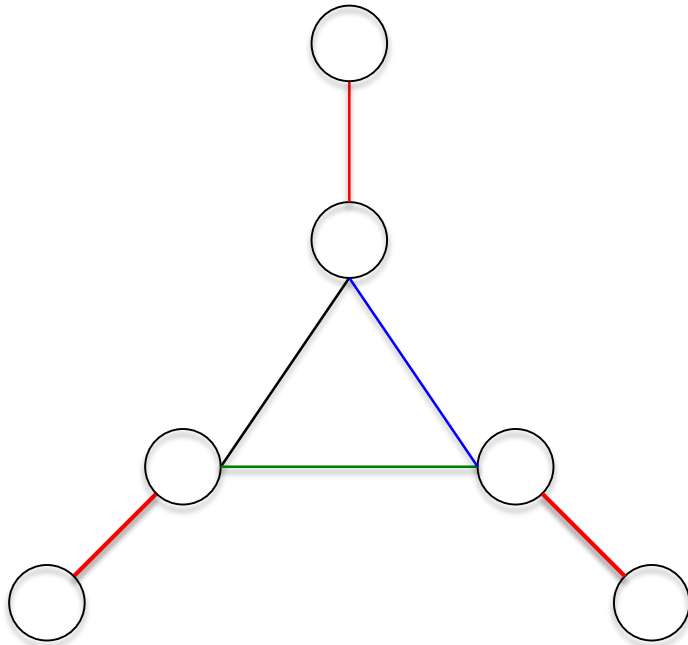
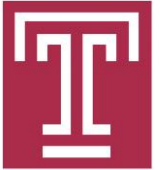
- Critical Node Matching (CNM) algorithm
  - Motivated by the key observation, focus on scheduling the critical nodes
  - Assign node weights as follows:
    - $w_i(t) = B_2$ , if  $i$  is a critical node
    - $w_i(t) = B_1$ , otherwise
    - $0 < B_1 < B_2 \in B$ , both  $B_1$  and  $B_2$  are bounded positive integer
  - Find an MVM based on the new weights in each time-slot
- An implementation with  $O(m \sqrt{n})$  complexity for bounded integer weights [Huang & Kavitha'12, Pettie'12]

**Theorem 2:** CNM has an approximation ratio no greater than  $3/2$ .

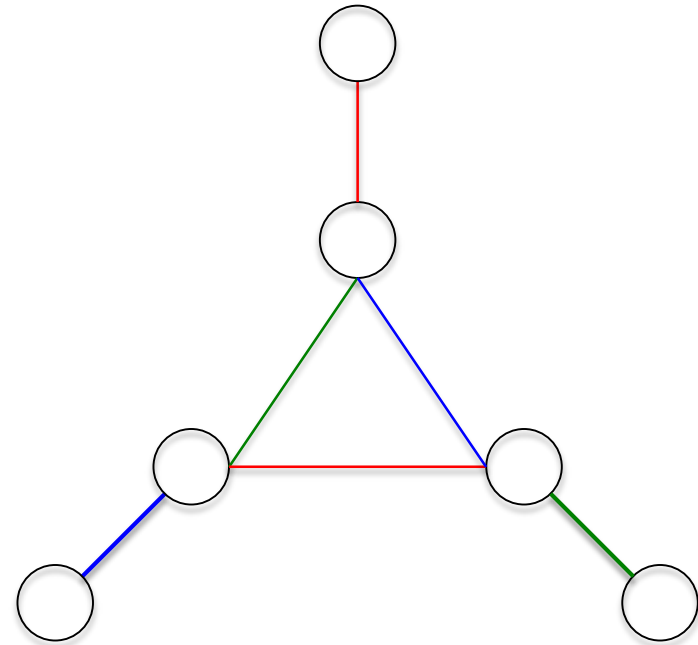
# CNM - Example



# Lower Bound of 4/3



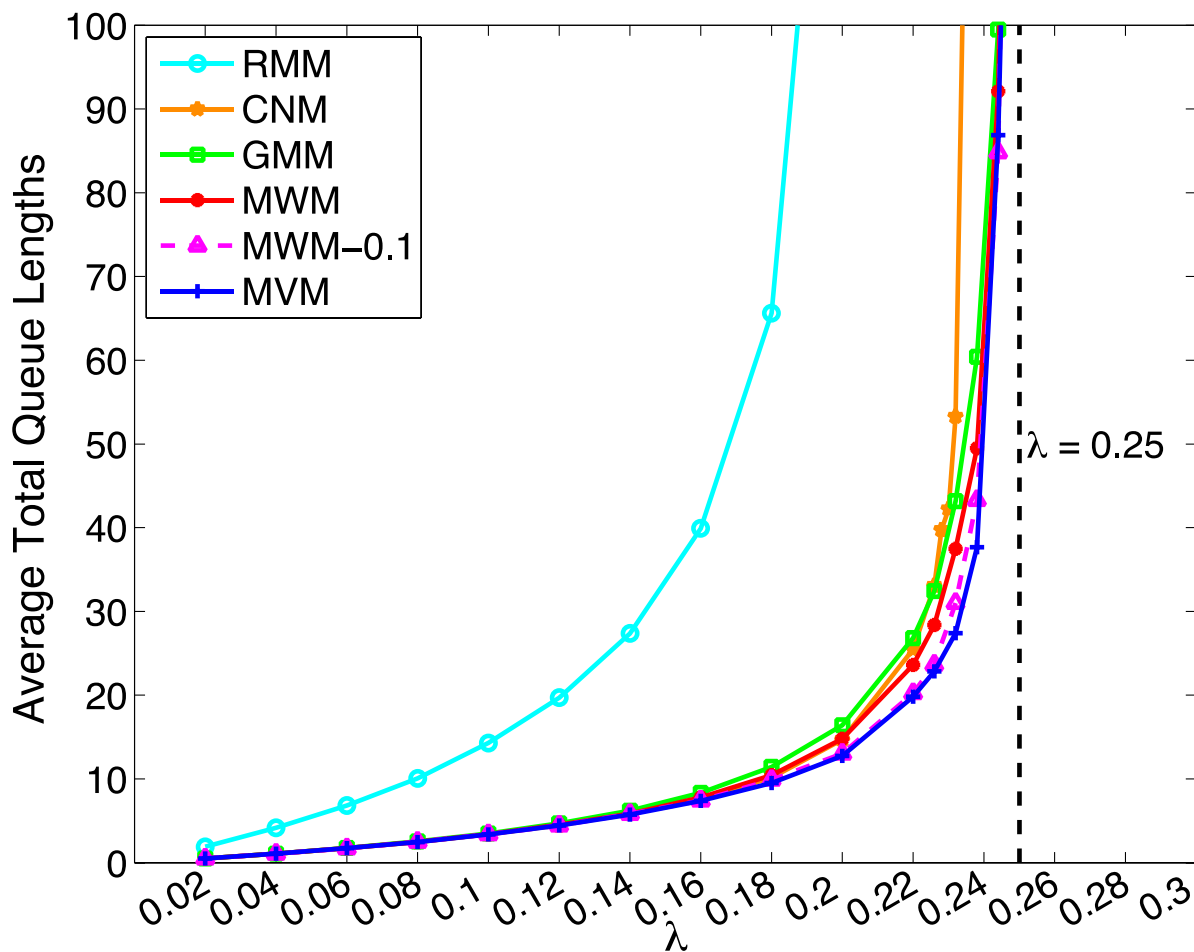
MVM & CNM: **4 slots**



Optimal: **3 slots**

First time-slot, second, third, and fourth.

# Throughput & Delay Performance



## Simulation settings

- 4X4 grid network
- unit link capacity
- A flow with arrival rate  $\lambda$  at each link

## Observations

- MVM & CNM both empirically achieve good throughput performance
- MVM empirically achieves best delay performance

# Conclusion



- Proved that MVM achieves an approximation ratio no greater than  $3/2$  for the minimum evacuation time problem
- By making a key observation that it is sufficient to focus on scheduling the critical nodes for achieving an approximation ratio no greater than  $3/2$ , we proposed a lower-complexity algorithm – CNM – with a same performance guarantee
- These algorithms serve as an alternative for achieving Shannon's bound
- Node-based approach is less studied
  - Performance limits of the node-based algorithms?
  - Conjecture:  $4/3$  is tight for MVM (and CNM) – much more challenging
  - If an additive term is allowed, can we develop node-based algorithms with better approximations (exact or asymptotic)?
  - Throughput performance in settings with arrivals?



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**Thank You !**

**Questions?**

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