

Reliable Transport in Delay Tolerant Networks

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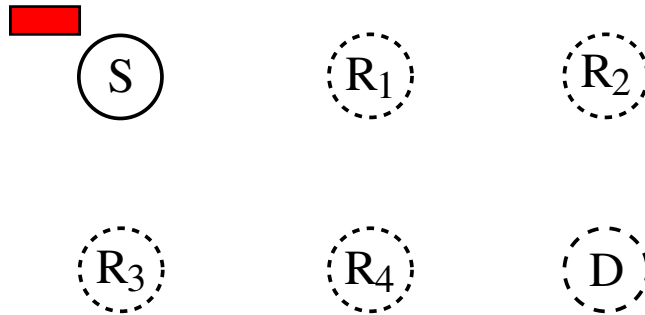
[1]

A. Ali, E. Altman, T. Chahed, M. Panda, L. Sassatelli, "A new reliable transport scheme in Delay Tolerant Networks based on acknowledgments and random linear coding," *23rd International Teletraffic Congress (ITC)*, pp. 214–221, 2011.

Delay Tolerant Networks (DTNs)



- Sparse network with mostly isolated nodes
- Mostly disconnected - No contemporaneous end-to-end path exists at any time
- Nodes communicate when they come within the radio range
- Requires **store-carry-and-forward** method of routing

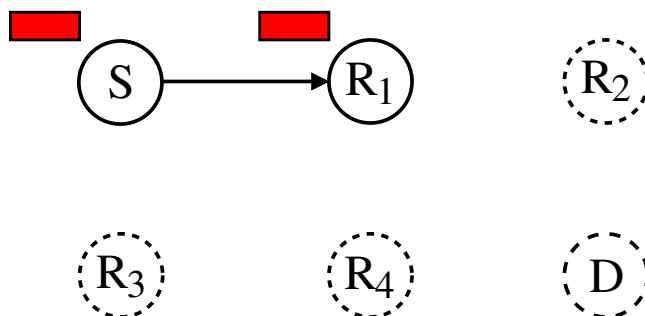


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- Multiple copies might be created inside the network

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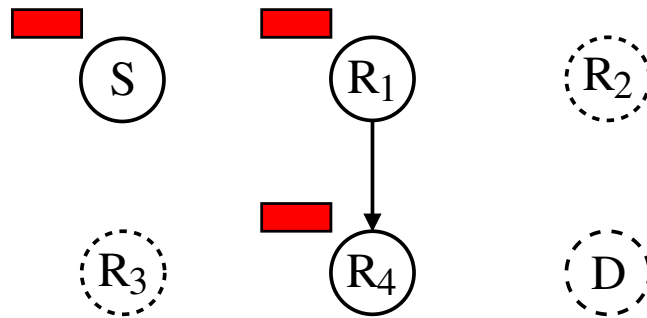


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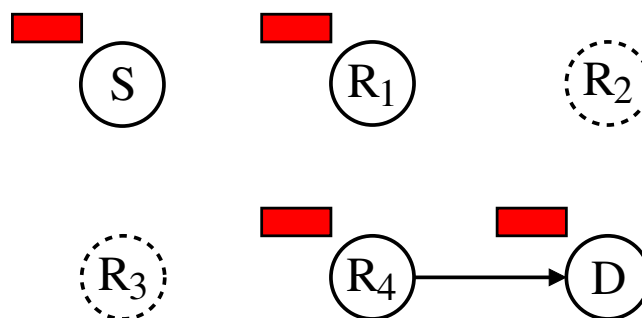


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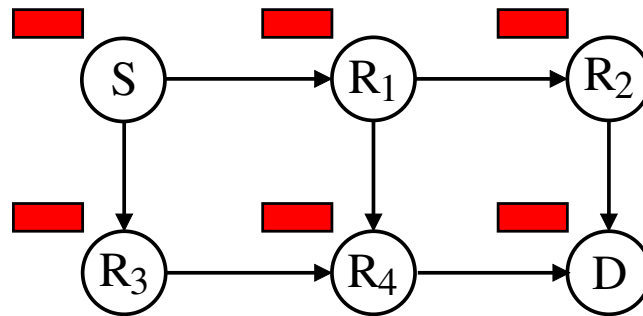
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Examples of DTNs



- Inter-planetary networks (IPNs)
- Sparse mobile ad hoc networks (MANETs)
- Sparse vehicular ad hoc networks (VANETs)
- Pocket switched networks (MSNs)
- Underwater networks (UWNs)
- Military battlefield networks
- Sensor networks for wildlife tracking
- Remote rural area (village) networks



Design a reliable transport mechanism for DTNs to minimize the end-to-end delivery delay

Literature on Reliable Transport in DTNs



■ Deep-Space

- TP-Planet, Bundle Protocol, SCPS-TP, CFDP, LTP, DS-TP, Saratoga, DTTP, ...

■ Terrestrial

- PCMP, HIP+TCP timeout and retransmission, ...
- The general approach is to **modify TCP**
 - Hop-by-hop reliability
 - Selective Negative ACKnowledgments (SNACKs)
 - Host identity and/or connectivity management



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- The framework
 - Propose a reliable transport mechanism
 - Develop a fluid-limit analytical model
 - Optimize the parameters based on the analytical model



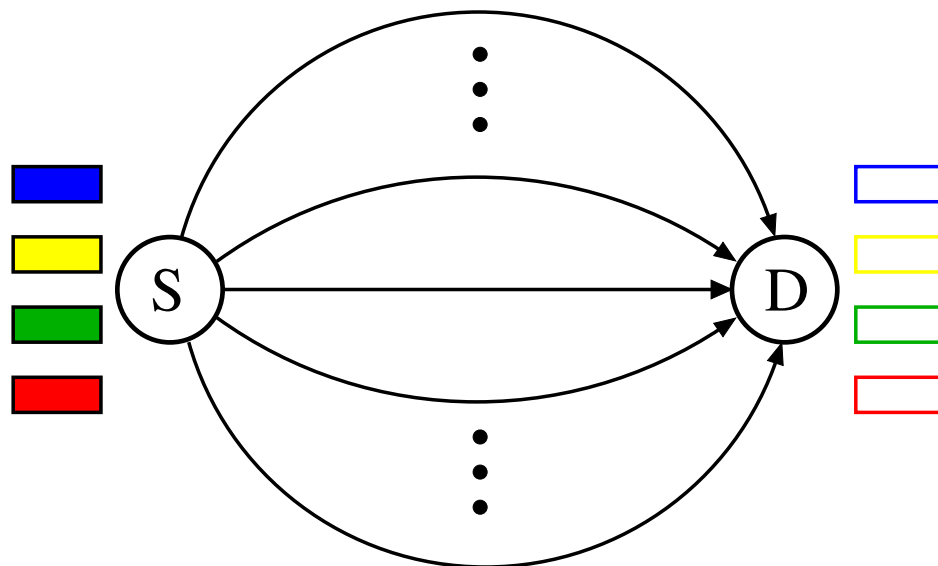
- We propose a framework rather than a detailed protocol
- The framework
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- Our transport mechanism is similar to Sundararajan et al [2]
 - **Random Linear Coding** at the source
 - **Degree of Freedom** (DoF) Acknowledgments (ACKs)

[2] J.K. Sundararajan, D. Shah, M. Medard, S. Jacobczak, M. Mitzenmacher, J. Barros, "Network Coding Meets TCP: Theory and Implementation," *Proceedings of the IEEE*, Vol. 99, No. 3, March 2011.

Transport With and Without Coding

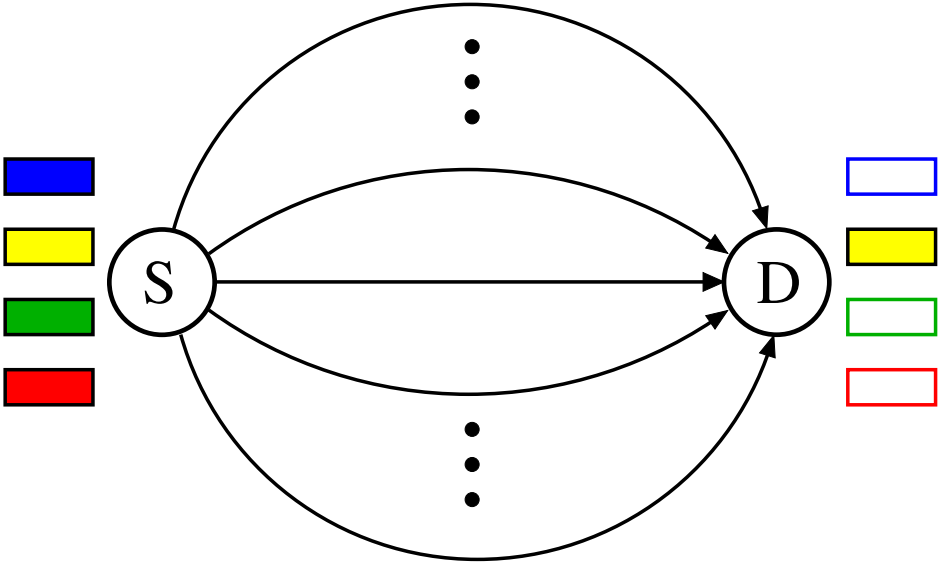


TRANSPORT WITHOUT CODING

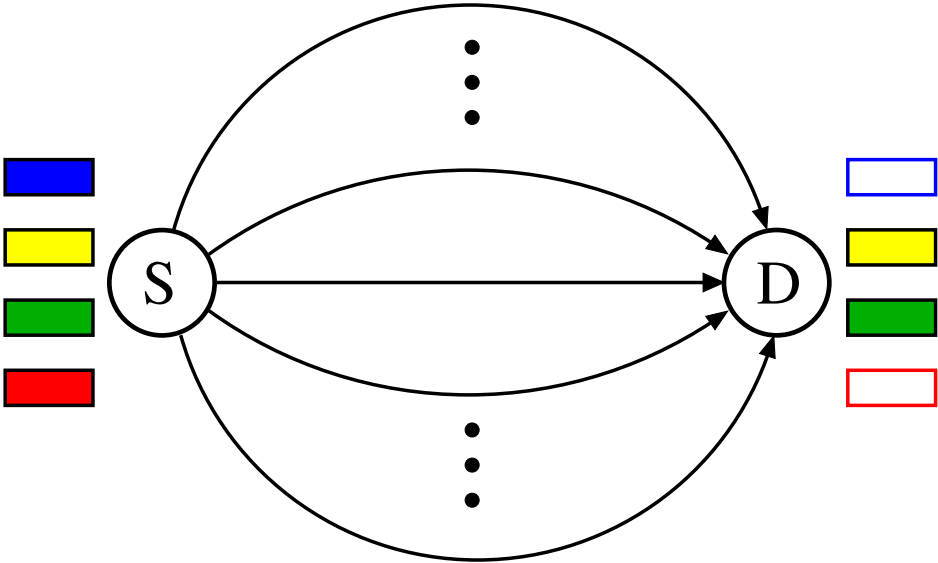




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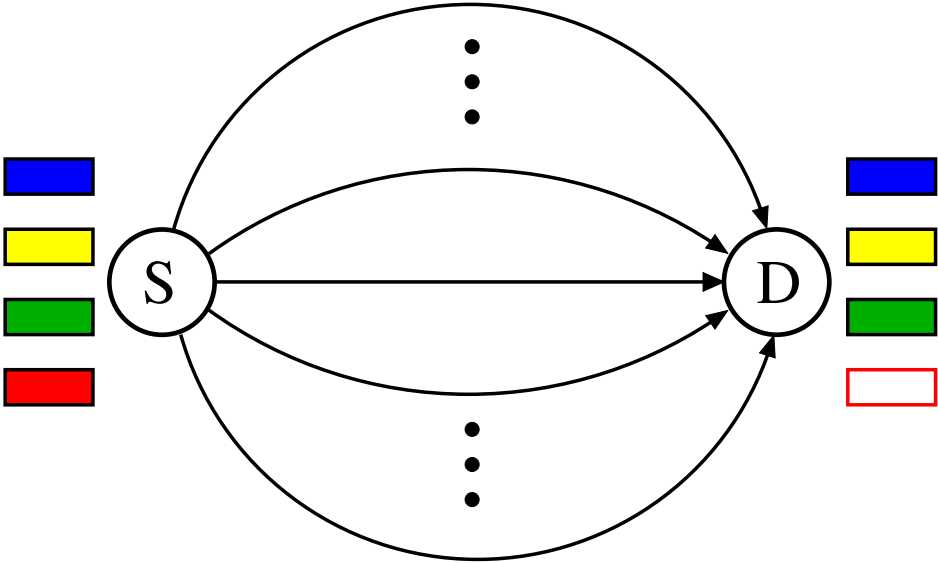


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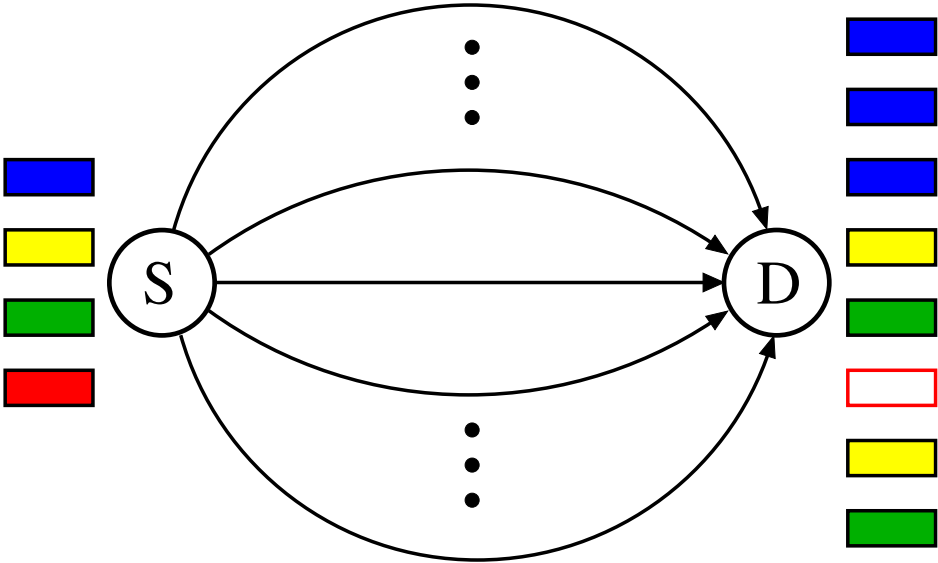




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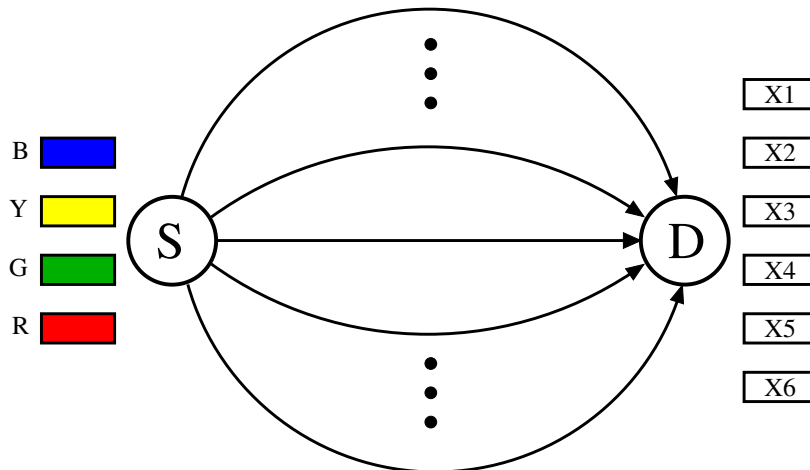


TRANSPORT WITHOUT CODING





TRANSPORT WITH CODING



$$\begin{aligned}
 X1 &= a1 B + b1 Y + c1 G + d1 R & X2 &= a2 B + b2 Y + c2 G + d2 R \\
 X3 &= a3 B + b3 Y + c3 G + d3 R & X4 &= a4 B + b4 Y + c4 G + d4 R \\
 X5 &= a5 B + b5 Y + c5 G + d5 R & X6 &= a6 B + b6 Y + c6 G + d6 R
 \end{aligned}$$

Degrees of Freedom (DoF)



Destination receives $\mathbf{x} = [X1 \ X2 \ X3 \ X4 \ \dots]^T$

Coding Vector for $X1$ is $[a1 \ b1 \ c1 \ d1]$

$$\text{Decoding Matrix } \mathbf{D} = \begin{bmatrix} a1 & b1 & c1 & d1 \\ a2 & b2 & c2 & d2 \\ a3 & b3 & c3 & d3 \\ a4 & b4 & c4 & d4 \\ \vdots & \vdots & \vdots & \vdots \end{bmatrix}$$

\mathbf{D} and \mathbf{x} grow with time

Coded packets satisfy $\mathbf{x} = \mathbf{D}\mathbf{y}$ where $\mathbf{y} = [B \ Y \ G \ R]^T$

Unique solution to \mathbf{y} when \mathbf{D} attains full rank

The source needs to receive as many Degrees of Freedom (DoF) as the number of original packets

Missing DoF = Number of native/original packets – Rank of \mathbf{D}

ACKs carry the missing DoF at the destination



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- We have **one** source-destination pair and a few relays
- M = Number of native/original packets to be sent



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■ Assumptions

- **A relay stores at most one data packet or ACK**
- **Drops packets from buffer after an expiry timeout**



■ Source-Relay Meetings

- The source generates a Random Linear Combination (RLC)
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- Updates the missing DoF and generates an ACK
- The relay gets the ACK



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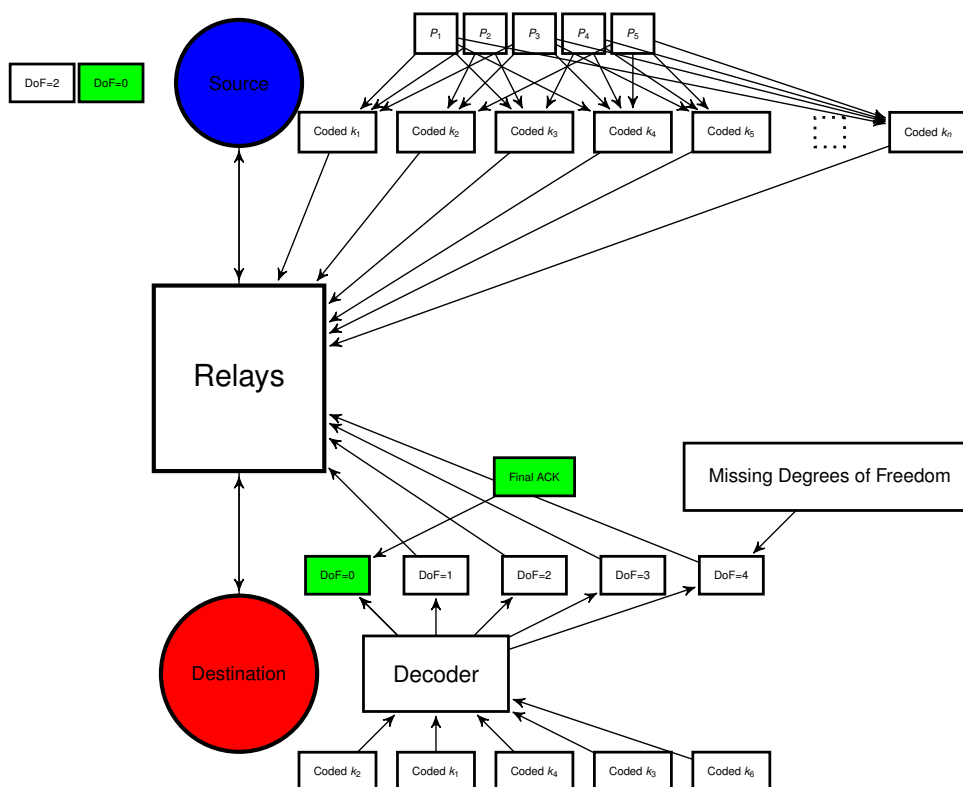
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Network Operation with Coded Packets



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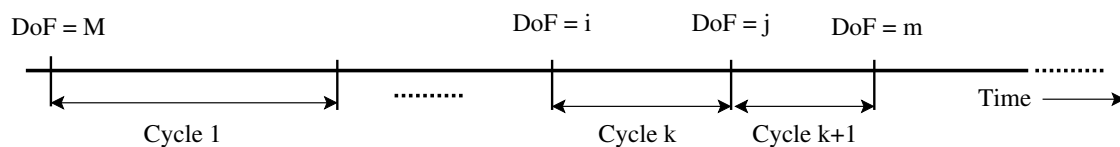


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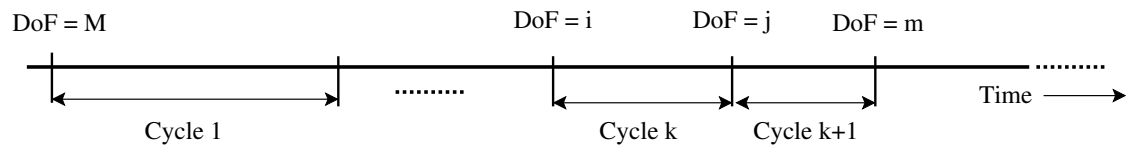
 - Limit the duration of waiting for ACKs - **ACK Waiting Time**
 - Drop everything after some time and restart - **Cycle Time**

Our Proposal Operates in Cycles



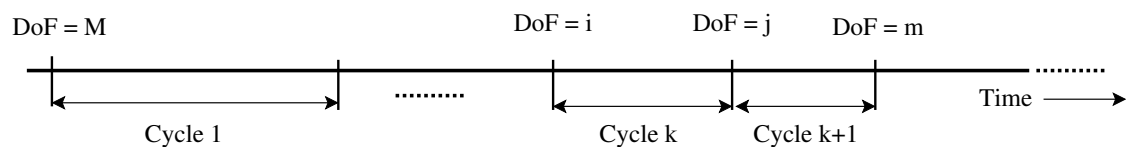
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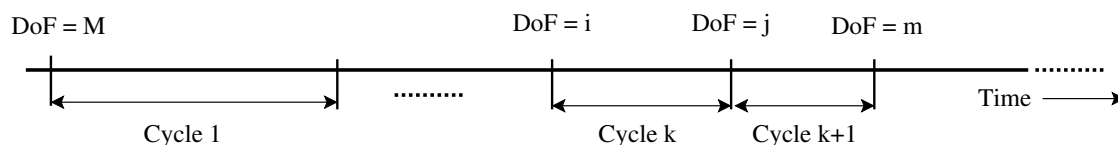
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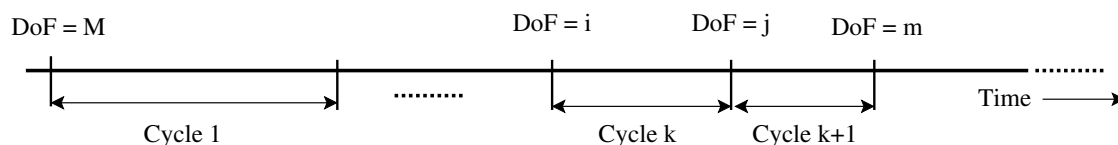
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 - Number of coded packets, M_i
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 - Number of coded packets, M_i
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- Continue until the source receives the final ACK



Suppose that the cycle begins with missing DoF i



Control Parameters

- M_i = Number of coded packets to be sent
- $\tau_{i,S}$ = Spreading time
- $\tau_{i,W}$ = ACK wait time
- t_k = Time of generation of coded packet k , $1 \leq k \leq M_i$
- Each coded packet is replicated for a duration $\tau_{i,S}$
- E.g., the coded packet k is replicated during $(t_k, t_k + \tau_{i,S}]$
- Cycle duration:

$$\tau_i := t_{M_i} + \tau_{i,S} + \tau_{i,W}$$

- There can be up to $i - 1$ ACKs indicating missing DoF = $i - 1, \dots, 0$

Outline



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- 1 sources, 1 destination, N_0 relays



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 - β_s = Rate of meeting between source and a relay
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- Exponentially distributed buffer expiry time
 - $\tau_e = 1/\beta_e$ = Mean time to buffer expiry



Each cycle can be modeled independently

Fluid-Limit Equations



Each cycle can be modeled independently

Coded packets replication

- $x_k(t)$ = fraction of relay nodes having the coded packet k
- $y_l(t)$ = fraction of relay nodes having the ACK l
- $x(t) := \sum_k x_k(t), y(t) := \sum_k y_k(t)$
- $q_k(t) = \Pr(k - 1 \text{ source-relay meetings up to } t)$
- $\lambda_s = N_0\beta_s, \lambda_d = N_0\beta_d, \lambda_r = N_0\beta_r, s = d = 1/N_0$



$$\frac{dx_k(t)}{dt} = \begin{cases} (s\lambda_s q_k(t) + \lambda_r x_k(t))(1 - x(t) - y(t)) - d\lambda_d x_k(t) - \beta_e x_k(t), & \text{for } 0 \leq t \leq \frac{k}{\lambda_s} + \tau_{i,s}, \\ -d\lambda_d x_k(t) - \beta_e x_k(t), & \text{for } \frac{k}{\lambda_s} + \tau_{i,s} < t \leq \tau_i. \end{cases}$$

Initial Condition: $x_k(0) = 0$, for all $1 \leq k \leq M_i$



ACKs replication

- $P_{X_k}(t)$ = Probability that the destination has received coded packet k by time t
- $Q_l^{(i)}(t)$ = Prob. that exactly $i - l$ DoFs have been received by the destination in the current cycle by time t

$$Q_l^{(i)}(t) = \sum_{E \subset \{1, \dots, M_i\} : |E|=i-l} \prod_{m \in E} P_{X_m}(t) \prod_{m' \in \{1, \dots, M_i\} \setminus E} (1 - P_{X_{m'}}(t)).$$

$$\frac{dy_l(t)}{dt} = \lambda_r y_l(t)(1 - x(t) - y(t)) + d\lambda_d Q_l^{(i)}(t)(1 - y_l(t))$$

for $0 < t \leq \tau_i$.

Initial Condition: $y_l(0) = 0$, for all $0 \leq l \leq i - 1$

Fluid-Limit Equations



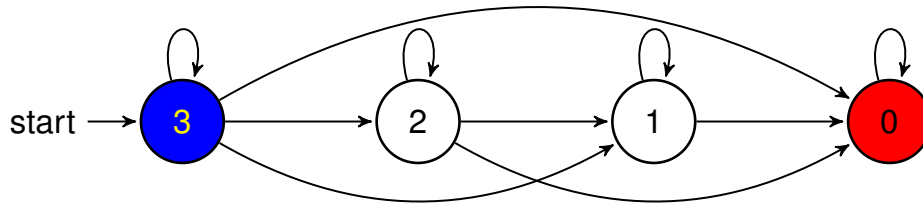
Equations for the CDFs of Packet and ACK Delay

- $P_{X_k}(t)$ = Probability that the destination has received coded packet k by time t
- $P_{Y_l}(t)$ = Probability that the source has received ACK l by time t

$$\frac{dP_{X_k}(t)}{dt} = \lambda_d x_k(t)(1 - P_{X_k}(t))$$

$$\frac{dP_{Y_l}(t)}{dt} = \lambda_s y_l(t)(1 - P_{Y_l}(t))$$

Initial Condition: $P_{X_k}(0) = 0$, for all $1 \leq k \leq M_i$,
 $P_{Y_l}(0) = 0$, for all $0 \leq l \leq i - 1$.



State: Missing DoF at source at the beginning of cycle
 P_{ij} = Transition probability from state i to state j , $j = i - 1, \dots, 0$

$$P_{ij} = P_{Y_j(\tau_i)} \prod_{l=0}^{j-1} (1 - P_{Y_l(\tau_i)}), \quad \text{for } j < i \text{ and } P_{ii} = 1 - \sum_{j=0}^{i-1} P_{ij}.$$

T_i = mean time to reach state 0 starting from state i

$$T_i = \frac{\sum_{j=1}^{i-1} P_{ij} T_j + \tau_i - \int_0^{\tau_i} P_{i0}(t) dt}{1 - P_{ii}(\tau_i)}.$$

T_M = **Mean Delivery Delay** or **Mean File Transfer Time**

Outline



Our Proposed Transport Framework

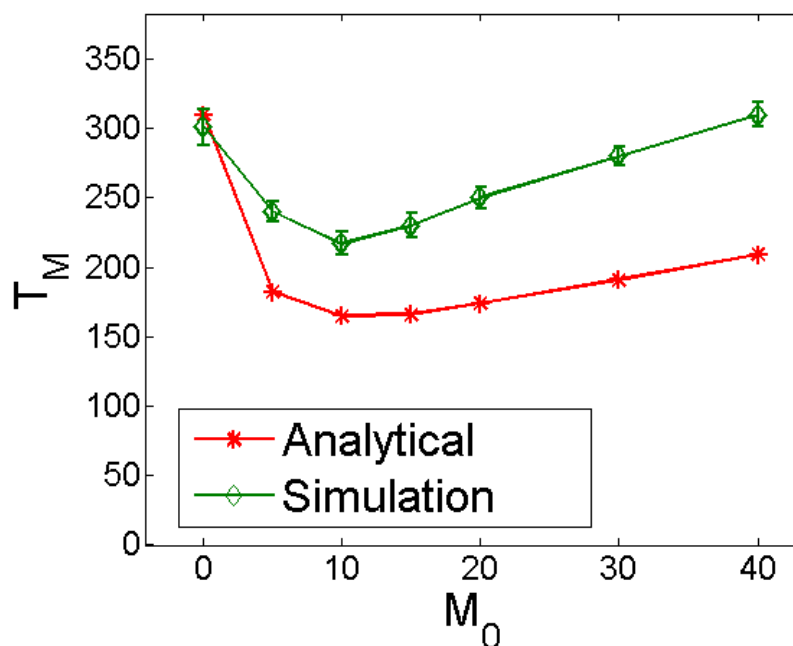
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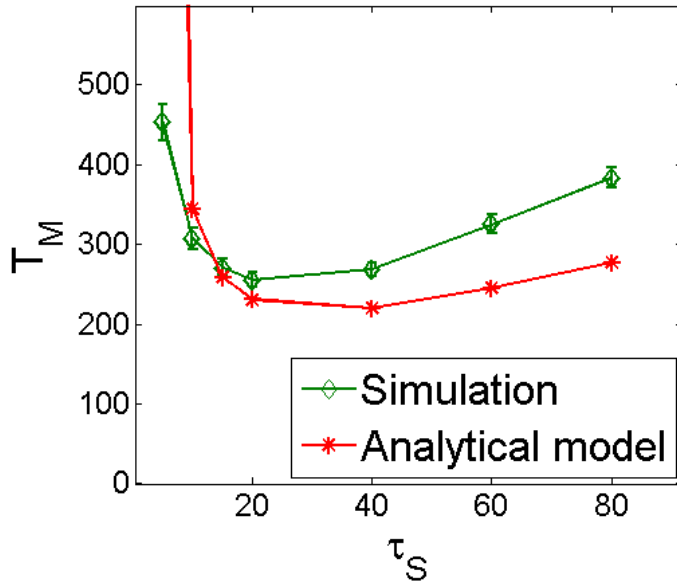
- Number of packets to be transferred $M = 10$
- Number of relay nodes $N_0 = 100$
- Inter meeting rate $\beta_s = \beta_d = \beta_r = \beta = 0.005$
- $\tau_{i,S} = \tau_S, \tau_{i,W} = \tau_W, M_i = M_0 + i$
- M_0 : Level of redundancy
- $\tau_S = \tau_W = \tau_e = 10, M_0 = 0, 20$
- Developed a Matlab based simulation
- Random **binary** coefficients are used
- Simulation results averaged over 1000 runs

Mean Delivery Delay, T_M , vs. Redundancy, M_0



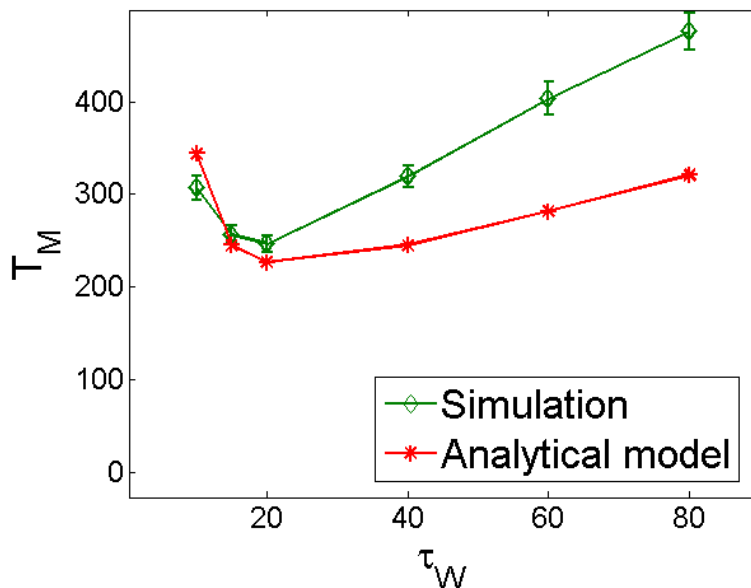
Mean Delivery Delay, T_M , vs. Spread Time, τ_S

$M_0 = 0$



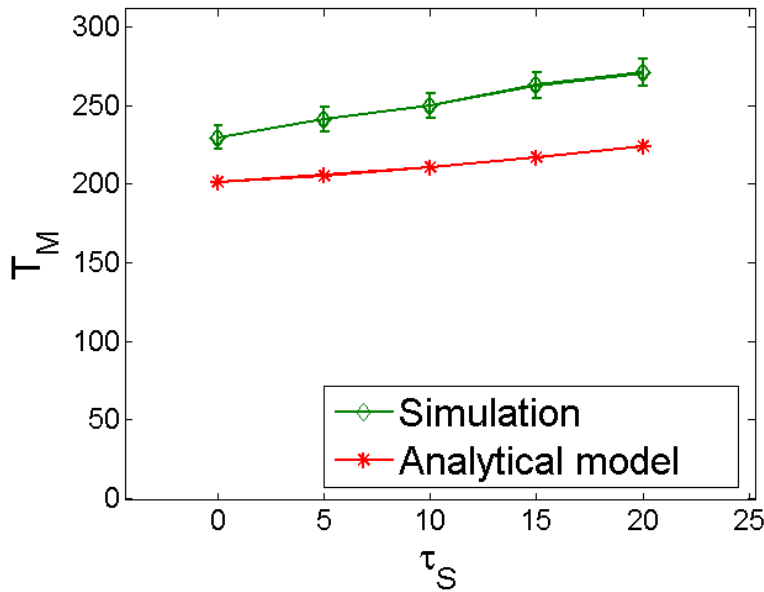
Mean Delivery Delay, T_M , vs. Wait Time, τ_W

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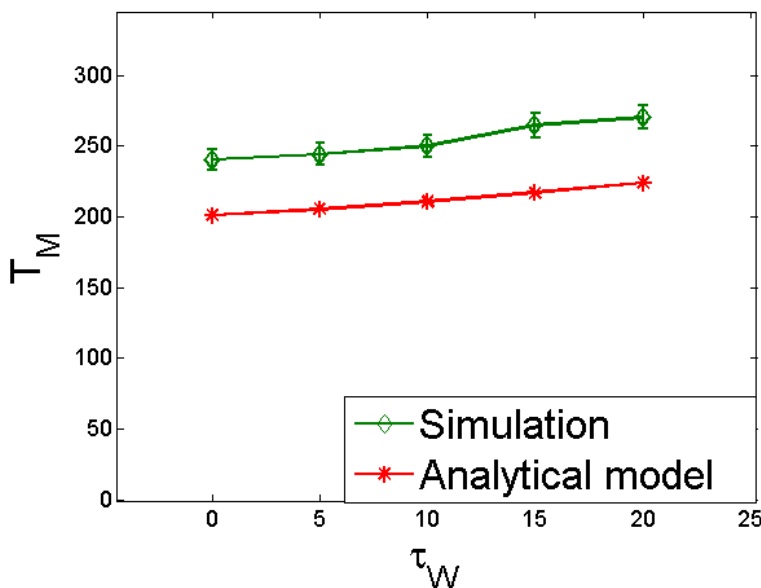
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$M_0 = 20$



Mean Delivery Delay, T_M , vs. Wait Time, τ_W

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Optimization Procedure



Objective

Minimize the mean time to transfer the complete file, i.e., T_M



Optimization over parameters

- M_i = Number of coded packets to be sent
- $\tau_{i,S}$ = Spreading time
- $\tau_{i,W}$ = ACK wait time

$\forall i, i = 1, 2, \dots, M, \forall j, j = 0, 1, \dots, i - 1$

$$\min(T_i) = \frac{\sum_{j=1}^{i-1} P_{ij} \min(T_j) + \tau_i - \int_0^{\tau_i} P_{i0}(t) dt}{1 - P_{ii}(\tau_i)}$$



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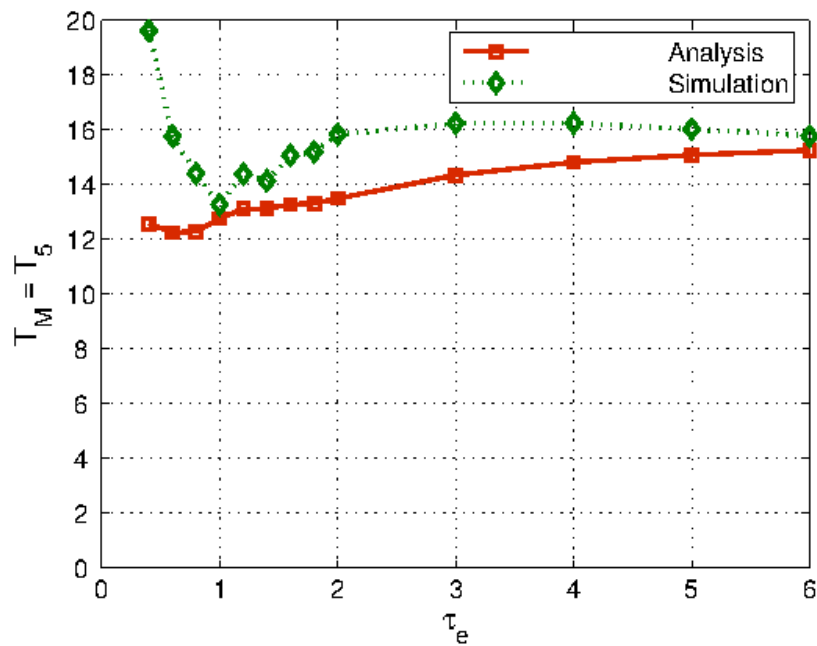
Parameter Setting



- Number of packets to be transferred $M = 5$
- Number of relay nodes $N_0 = 100$
- Inter meeting rate $\beta_s = \beta_d = \beta_r = \beta = 0.05$
- Buffer expiry timeout is varied

We apply **Differential Evolution (DE)** [3] for optimization

[3] R. Storn, K. Price, "Differential evolution - a simple and efficient heuristic for global optimization over continuous spaces," *Journal of Global Optimization*, Vol. 11, pp. 341–359, 1997.



Conclusion



- We proposed a reliable transport framework
 - Random Linear Coding
 - Degree of Freedom (DoF) ACKs
- Derived a fluid-limit model for a single flow
- Optimized the parameters using DE
- Future Work
 - Multiple interacting flows
 - Multiple buffer and buffer management
 - Non-exponential inter-meeting times

Thank You



- Let $M, N_0, \beta_s, \beta_r, \beta_d$ be known
- Compute $M_i, \tau_{i,S}$ and $\tau_{i,W}$ off-line for each i
- At source-relay meeting t_k , compute
 - Spreading timeout $t_k + \tau_{i,S}$
 - Cycle timeout $\tau_i = (M_i/\lambda_s) + \tau_{i,S} + \tau_{i,W}$
 - Store in the header of the coded packet
 - Buffer expiry timeout $t_k + \exp(\beta_e)$
- The relay drops the coded packet at $t_k + \exp(\beta_e)$ or τ_i
- At relay-relay meeting t'_k , copy the coded packet to other relay if $t'_k < t_k + \tau_{i,S}$
- At destination-relay meeting, copy the cycle timeout τ_i to the header of the ACK