# **Delay Tolerant Networks**

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#### Network's scalability (Quantitatively)

#### Scalability of Mobile Ad Hoc Networks (with respect to N):

It has been shown [Gupta, Kumar 2000] that in mobile ad hoc networks  $\Theta(N)$  successful transmissions can be scheduled simultaneously. I.E., the *network rate* is  $\Theta(N) \Rightarrow \log R / \log N \Rightarrow 1$ . Thus, to be regarded as scalable with respect to network size

$$\Psi_N \le 1$$

For example, for the class of networks considered here (assumptions a.1-a.8)

$$\Psi_{N} = 1.5$$

⇒ networks under study are not scalable w.r.t. to network size

## Network's scalability (Quantitatively)

## Scalability of Mobile Ad Hoc Networks (with respect to N) Delay Tolerant Networks:

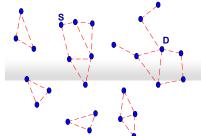
- average path length may be reduced to  $2 (\Theta(1))$  provided that applications can tolerate infinite delivery delays and mobility pattern is random ([Groossglauser&TSE, Infocom 2001])
- thus, network *scalability factor* with respect to network size  $\Psi_N$  is equal to 1. (N nodes X traffic rate X constant path length)

Thus, those ad hoc networks (random mobility and capable of accepting infinitely long delays) are the only class of ad hoc networks that are scalable with respect to network size.

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#### What is different?

- A wireless network that is very sparse and partitioned
  - disconnected clusters of nodes



- Nodes are (highly) mobile making the clusters change often over time
- · No contemporaneous end-to-end path

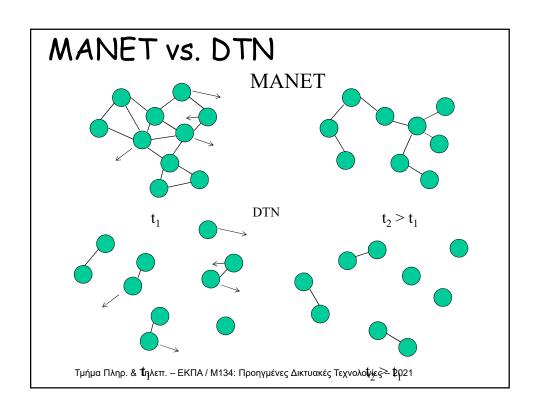
#### Reactive/Proactive approaches would not work

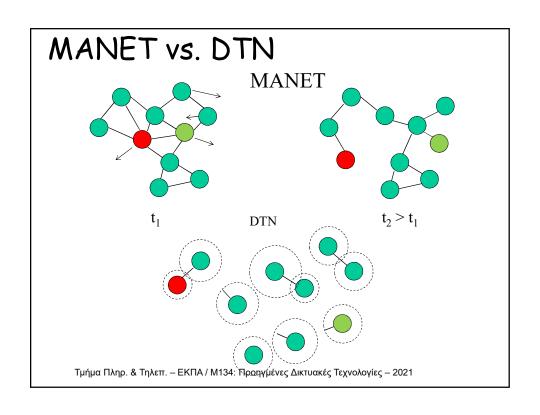
- Reactive Protocols
  - route request cannot reach destination
  - path breaks right after or even while being discovered
- Proactive Protocols
  - will fail to converge
  - flood with topology-update packets

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## A possible approach

- Exploit node mobility to deliver messages
   (Tse et al. exploit mobility to increase capacity)
- A snapshot of connectivity graph is always disconnected.
   Idea: If we overlap many snapshots over time, an end-to-end path will be formed eventually!
- Store-and-forward model of routing:
  - 1. a node stores a message until an appropriate communication opportunity arises
  - 2. a series of independent forwarding decisions (time + next hop) that will eventually bring the packet to its destination





## Choosing A Next Hop

A local and intuitive criterion: A forwarding step is efficient if it reduces the expected distance from destination

usually: reduction of expected distance => reduction of expected hitting time

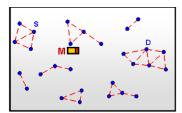


Efficient Routing: Ensure that each forwarding step on the average reduces distance to or hitting time with destination

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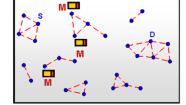
## Single/Multiple Copy

- "Single-Copy": only a single copy of each message exists in the network at any time
- "Multiple-Copy": multiple copies of a message may exist concurrently in the network



Single Copy

- + lower number of transmissions
- + lower contention for shared resources



Multiple Copy + lower delivery delay

- + higher robustness
- ned the state of t

## Epidemic Routing

- Each host maintains a buffer of messages unsent (originated or relayed by it)
- Every time it encounters another host, it exchanges info about the pending packets and after the receiver's reply, it forwards to the latter whatever has not been sent yet
- This process is repeated at every meeting

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## Epidemic Routing - performance

- Expect 100% delivery ratio even under the worst delay case
- In case of no interference (low traffic load, source-destination pairs), it provides the lowest delay
- <u>But!</u> Too much overhead, as it floods the network with copies

## Other approaches

- Direct Transmission
  - Forward message only to its destination (simplest strategy)
  - Its expected delay is an upper bound for every other protocol
- Two-hop Relay
  - Deliver messages to the first n nodes it encounters
  - The relays will deliver the message only to the destination
- Tree-based Flooding
  - Similar to the above (the task of making copies is distributed to other nodes as well, not only the source node)

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## Randomized Routing

 Node A forwards message to node B with probability p. Notice that:

P(B closer to destination D than A)

P(A closer to destination D than B)

yet, because transmission speed is faster than the speed of movement it can be shown that

The randomized policy results in a reduction of the expected hitting time to destination at every step

## Message Ferrying

- Exploit existing or introduce non-randomness in node mobility, to enhance communication in an environment with intermittent or otherwise no connectivity
- Network devices are classified as regular nodes and message ferries (could be devices that move independently of the need for data delivery - like buses, or specific nodes that move according to the need for connectivity)

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## Utility-Based Routing

- · Define an appropriate utility function  $U_A(Y)$  of node A with respect to (destination) node Y.
- Utility-based routing: Node A forwards a message for node D to node B iff:

$$U_B(D) > U_A(D) + U_{th}$$

- Example Utility Function: Define  $U_X(Y)$  based on the timer value  $T_X(Y)$  that node X has regarding (destination) node Y; this could be the time elapsed since node X hit node Y for the last time in the past.
  - e.g.  $U_x(Y)$  = expected hitting time given timer value
- In essence, destination's location gets indirectly logged in a timer upon encounter and nodes' location info gets diffused through mobility process.

## Hybrid Methods...

- Seek phase: If utility around node is low, perform randomized forwarding to quickly search nearby nodes
- Focus phase: When a high utility node (i.e. above a threshold) is discovered, switch to utility-based forwarding
  - look for a good lead to the destination and follow it

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## Oracle-Based, Optimal...

- Assume all nodes trajectories (future movements) are known
- Then, the algorithm picks the sequence of forwarding decisions that minimizes delay
- Note that flooding (multi-copy strategy) has the same delay as this algorithm when there is no contention

## Shortcomings

- Flooding
  - too many transmissions (energy-efficiency concerns)
  - unbounded number of copies per message (scalability issues)
  - under high traffic, high contention for buffer space and bandwidth results in poor performance
- Utility-based
  - high threshold  $U_{th}$ : significant delay increase; source takes a very long time until it finds a good next hop (slow start)
  - low threshold U<sub>th</sub>: degenerates to flooding

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## Efficient Routing: Design Goals

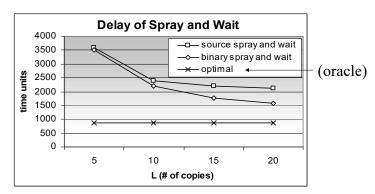
- · Performance goals:
  - ✓ perform significantly fewer transmissions than flooding-based schemes under all conditions
  - ✓ better delay than existing single and multi-copy schemes; close to optimal
- · Additional goals:
  - ✓ scalability: good performance under a wide range of values for various parameters (e.g. number of nodes)
  - ✓ simplicity: require little knowledge about the network

## Spray and Wait

- Source Spray and Wait (Also, 2-hop relaying)
  - Source starts with L copies
  - whenever it encounters a new node, it hands one of the L copies
  - this is the slowest among all (opportunistic) spraying schemes
- Optimal Spray and Wait (Binary)
  - source starts with L copies
  - whenever a node with n > 1 copies finds a new node, it hands half of the copies that it carries
  - The optimal, spreads the L copies faster than any other spraying schemes

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# Spraying Matters!



100x100 network with 100 nodes

- 1. Efficient spraying becomes more important for large L
- 2. Few copies suffice to achieve a delay only 2x the optimal!

#### On the Effects of Cooperation in DTNs

resilience to misbehaviors
or
reconsider protocol efficiency in the presence
of misbehaviors

Reference: http://cgi.di.uoa.gr/~ioannis/publications/2007COMSWARE.pvs.pdf

# Performance of DTN routing

## Investigated w.r.t. the impact of:

- ·Environment characteristics
  - -network size
  - -node density
  - -message spreading rules
- ·Node behaviour
  - -mobility

Assumption: Fully cooperative environment!

#### Consider non-cooperative DTN environment

 The copy is dropped or forwarded with some probability

(simple non-cooperative environment / strategy)

#### 3 routing algorithms are studied in terms of:

- ·Induced delay
- ·Transmission overhead

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## Cooperation in DTNs

Shaped by the willingness (due to node misbehavior), or ability (due to buffer or energy limitations) of the node to participate in spreading.

#### 2 types of cooperation considered:

- -Type I: the node drops the message with probability  $P_{drop}$  (cooperation degree = 1- $P_{drop}$ )
- Type II: the node maintains the copy and forwards it with probability  $P_{forward}$  (cooperation degree =  $P_{forward}$ )

# The 3 routing algorithms

- Epidemic routing: (unlimited copies)
  - ·At each node encounter, all copies are exchanged
  - •Minimum message delivery delay but high buffer occupancy and bandwidth utilization in fully cooperative environments
- •Two-hop routing: (limited copies)
  - •The source forwards one of its copies to the node (with no copy) it encounters
  - •Only the source node forwards copies to others than the destination
- ·Binary spray-and-wait routing (BSW): (limited copies)
  - ·Every one gives half its copies to a node (with no copy) it encounters
  - ·Faster than two-hop relaying when all cooperate

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#### Metrics

- Delay until delivery of the message
- Overhead in terms of number of transmissions
   The Total overhead has two components:
  - •Till delivery: Transmissions required until message delivery
  - Additional: Transmissions wasted after the message delivery, affected by spreading process termination (\*)

## Spreading process termination

The spreading process is <u>naturally terminated</u> if all the potential spreaders of a copy are eventually informed of the message delivery or all copies are already spread.

Expedite natural termination through a <u>delivery</u> <u>notification</u> mechanism, activated upon message delivery: (\*)

- A node that becomes aware of the message delivery becomes as notifier.
- Every node that contacts a notifier is informed of the message delivery and becomes a notifier itself.

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## Protocol sensitivity to cooperation degree

Two checks are used, by comparing performance for a certain degree of cooperation with that achieved

- a. in a fully cooperative environment
- b. in the Fully Cooperative Equivalent (FCE) network (only for Type I)

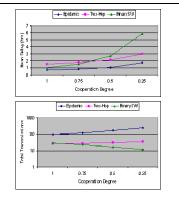
The FCE network of N nodes is defined as a network of N' fully cooperative nodes, where N'=N(1-  $P_{drop}$ ).

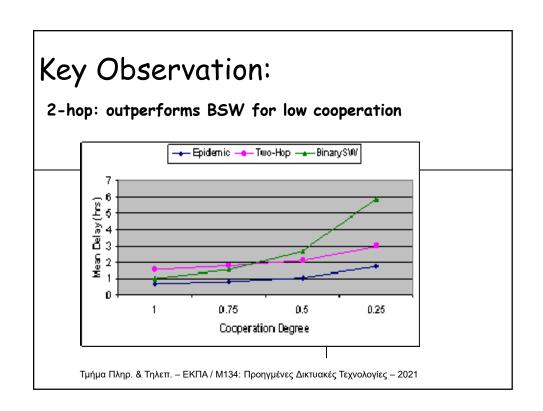
## Non-cooperative environment

Simulations: up to 100 nodes uniformly distributed in  $8 \text{km} \times 8 \text{km}$  area; Mobility: Random Direction Model with a speed of 3 m/sec; Transmission Range: 200 m;

- •Epidemic always provides for minimum delivery delay at the expense of significantly more transmissions in all environments.
- •BSW achieves lower delivery delay in fully cooperative environments than two-hop; the rate at which the delivery delay achieved by 2-hop routing increases in non-cooperative environment is lower than that of BSW.
- •The overhead induced by BSW decreases in less cooperative environments contrary

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#### Study of Two-Hop Message Spreading in DTNs

http://cgi.di.uoa.gr/~istavrak/publications/2009ADHOCJournal.pvs.pdf http://cgi.di.uoa.gr/~ioannis/publications/2007WIOPT.pvs.pdf

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## Delay Tolerant Networks

Connectivity established through (low frequency) node encounters



#### DTN message transport

- · Mobility-assisted
- · typically, multiple message spreading is needed

# Some DTN message transport /routing schemes

#### **Epidemic routing:** (unlimited copies)

- · At each node encounter, all copies are exchanged
- Minimum message delivery delay but high buffer occupancy and bandwidth utilization

#### Binary spray-and-wait routing (BSW): (limited copies)

- Every one gives half its copies to a node (with no copy) it encounters
- · Faster than other limited copies schemes

#### **2-hop routing:** (limited copies)

- The source forwards one of its copies to a node (with no copy) it encounters
- · Only the source forwards copies to others than the destination

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#### Focus

# Consider a DTN environment where the source is in full control of message spreading: 2-hop relay

Only the source is allowed to spread the copies.

Intermediate nodes are not allowed to spread a message copy they may have to any node other than the destination. Robustness against intermediate node misbehavior or limitations.

Limits the max number of copies in the network (overhead concern)

Limits the lifetime of copies (overhead or QoS concern)

## Model description

N+1 nodes moving within a square size of  $L^2$ 

Exponential node inter-meeting times (i.e. the time elapsed between two consecutive encounters for a given pair of nodes - fairly accurate in case of  $R \ll L$ , and random waypoint model)

Mean rate of encounters  $\lambda$  for a given node (exp parameter):

 $\lambda = cvR/L^2$ ,

c: constant depending on the mobility model used

v: relative speed

R: communication range L: size of the network area

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#### Source - intermediate node differentiation

Diverse inter-meeting times for the source ( $\lambda$ ) and the other nodes ( $\lambda_o$ )

May capture diverse transmission range (power) or/and speed or even, indirectly, the cooperation degree

The parameters capturing differentiation could be considered as: Non-tunable (e.g., misbehaviour)

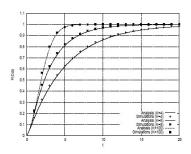
Tunable (e.g., adjustment of transmission range)

## Theory and simulations

Exact analytical expressions for the delivery delay cdf

Derived via Markov Chain formulation and solving the obtained equations

Closeness of simulation with analytical results indicates the validity of the exponential encounter times for nodes moving under the random Waypoint model



Results are shown for:

N=100, K=4, 8, 100,  $\lambda$ =0.08 and  $\lambda$ o=0.04

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## Closed form\* approximation for delay cdf

(\* facilitates parameter selection to achieve a given delay target)

A much simpler expression that approximates fairly accurately the exact one is derived by bounding the accurate cdf (for a specific number of copies  $K \le N$ ) by two cdfs:

the maximum-copy cdf the zero-spreadtime cdf

#### Note:

A general approach to bounding performance amounts to modifying the operation of the protocol in 2 ways, such that:

- (1) the auxiliary protocol 1 yields a worse performance than the real protocol
- (2) the auxiliary protocol 2 yields a better performance than the real protocol.

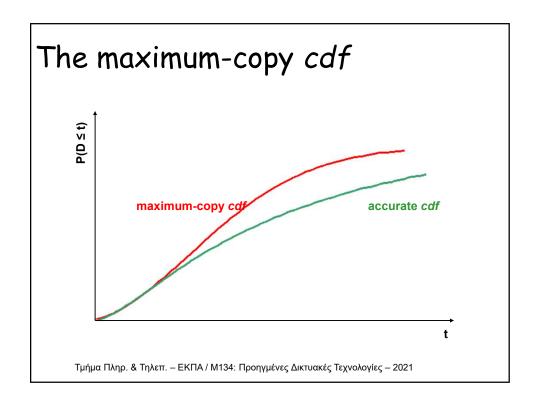
And the analysis of the auxiliary protocols is simple.

## The maximum-copy cdf

It refers to a modified algorithm where the number of copies employed in the network equals the number of nodes (K=N):

$$[\mathbf{P}(\mathbf{D} \leq \mathbf{t})] \qquad Q_N(t) = 1 - e^{-\lambda N t} \left( 1 + \frac{\lambda}{\lambda_d} \left( e^{\lambda_d t} - 1 \right) \right)^{N-1}$$

The modified algorithm has exactly the same behaviour until the first K copies are spread in the network. Afterwards, the performance is enhanced due to the advantage of the surplus copies (N-K)



## The zero-spreadtime cdf

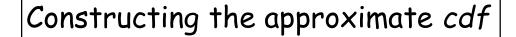
It refers to a modified algorithm where all K copies are instantly spread in the network

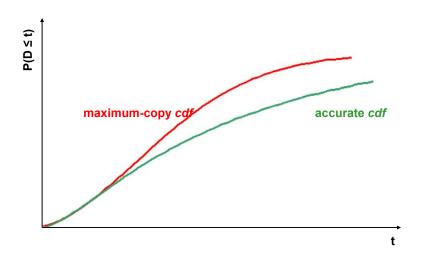
[P(D 
$$\leq$$
 t) ] 
$$Q_{\vec{K}}(t) = 1 - e^{-(\lambda + \lambda_o(K-1))t}$$

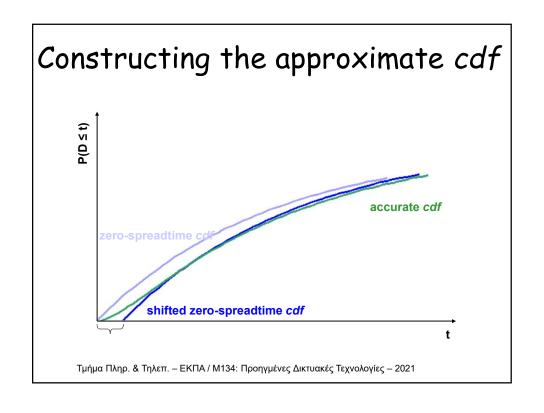
The modified algorithm has identical behavior with the original after the original has spread all K copies. Better performance for small t, converging to the original one for large t.

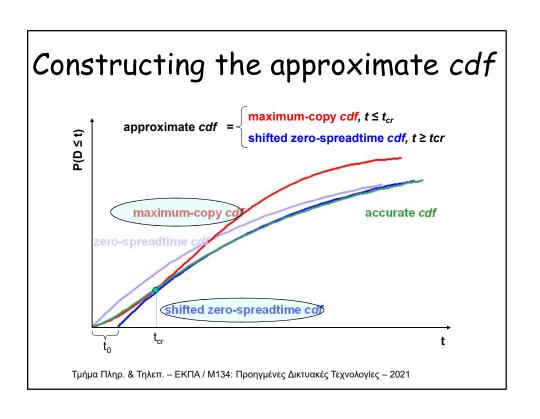
It is expected and indeed observed that when this cdf is shifted by some  $t_o$  so as to be tangent (at some time  $t_{cr}$ ) to the maximum-copy one (and this occurs at some time  $t_{cr}$ ), the part of the cdf from  $t_{cr}$  and afterwards approximates accurately the original cdf

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# The approximate cdf

Thus, the approximate expression may be defined as a two-part function:

the maximum-copy cdf until  $t_{cr}$ 

the shifted zero-spreadtime one after  $t_{\it cr}$ 

$$\hat{Q}_K(t) = \left\{ \begin{array}{l} Q_N(t) = 1 - e^{-\lambda Nt} \left(1 + \frac{\lambda}{\lambda_d} \left(e^{\lambda_d t} - 1\right)\right)^{N-1}, \\ 0 \leq t \leq t_{cr}; \\ Q_{\hat{K}}(t - t_0) = 1 - e^{-(\lambda + \lambda_o(K-1))(t - t_0)}, \\ t \geq t_{cr}, \end{array} \right.$$

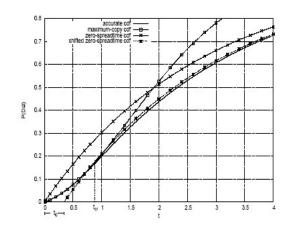
where:  $\lambda_d = \lambda - \lambda_o$ ,

 $t_{o}$  is the time shift of the zero-spreadtime cdf needed to be tangent to the maximum-copy one

 $t_{cr}$  is the contact point of the above cdfs

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# Results for the approximate cdf



For the case of N=100, K=8,  $\lambda$ =0.08 and  $\lambda_{o}$ =0.04:

## Solving design problems

The approximation may be used in order to obtain closed form solutions to design problem where the exact analysis allows only for a numerical solution

For instance, the value of  $\underline{K}$  to achieve a specific delivery ratio  $\underline{Q}_{\underline{d}}$  within a specific delay bound  $\underline{t}$  may be estimated:

$$\begin{split} K_{approx} &= \frac{-\lambda_d(N + (N-2)(N+1)\lambda t)}{\lambda_o(N-2\lambda t)} \\ &+ \frac{\lambda(N + (N(N-1)-1)\lambda t + \ln{(1-Q_d)})) \pm \sqrt{C}}{\lambda_o(N-2\lambda t)}, \end{split}$$

where C is a function of the network parameters. The positive value that fulfills the condition  $t_{o} \le t_{cr}$  should be selected

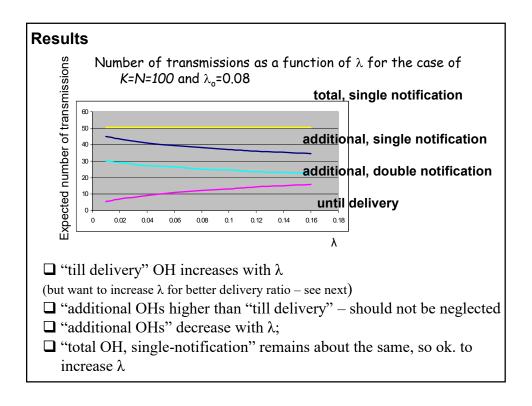
## Calculation of the overhead

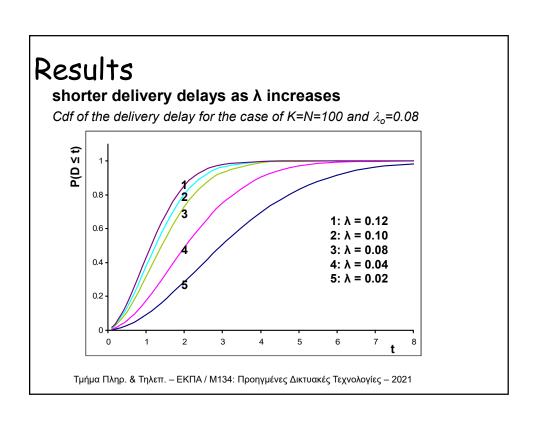
In DTNs is typically measured in terms of the number of transmissions induced **until the message delivery** to the destination (or dropped if time constrained)

Here, we also measure the additional overhead induced until the spreading process is actually terminated (the source node becomes aware of the message delivery through some notification mechanism) Here, the additional overhead is calculated for two distinct cases:

Until the source meets the destination (single notification)
Until it meets either the destination or the intermediate node that delivered the message to the destination (double notification)

Besides the number of transmissions, energy overhead considerations are introduced for the case of a network of nodes that employ different transmission powers.





#### SUMMARY and Contributions

cdf of message delivery delay - delivery ratio

Consideration and calculation of the overhead not only until the message delivery but also until the message spreading is actually terminated.

Differentiation between the source and intermediate nodes, capturing the effects of a more realistic, generally heterogeneous DTN environment, in terms of: transmission power, speed, cooperation degree, etc.