

CREST: An Opportunistic Forwarding Protocol Based on Conditional Residual Time

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Outline

- 1 Introduction
- 2 Background
- 3 Dataset collection
- 4 Dataset characterization
 - Aggregate inter-contact duration
 - Pairwise inter-contact durations
- 5 CREST protocol
- 6 Performance evaluation
 - Office dataset
 - Conference dataset

Introduction

- Intermittently connected environments (ICE)
 - A fully connected path between source and sink may not always exist
 - Contact schedules of nodes not known in advance
 - E.g. ad-hoc environments without permanent networking infrastructure
- **Opportunistic forwarding protocols**
 - Leverage forwarding opportunities created by intermediate nodes
 - Portable, wireless communication devices embedded in mobile entities (e.g. humans, vehicles)
 - Nodes follow **store and forward** paradigm
 - Tolerant to delays and disruptions
 - **Challenge:** Choosing the best forwarding opportunity based on limited contact information

Related Work

- Focus: **Analytical characterization** of mobility traces
 - Aggregate inter-contact durations (ICD) between human pairs follows power-law distribution[Chaintreau]
 - ICD is dichotomous: power-law followed by exponential decay[Karagiannis][Cai]

Related Work

- Focus: **Analytical characterization** of mobility traces
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- Focus: **Design of protocols** based on different forwarding metrics
 - Flooding, Direct hop:** no forwarding metric
 - MED:** complete future contact schedules, mean expected delay
 - MEED:** mean expected delay
 - PROPHET:** delivery probability
 - SimBet, Bubblerap:** social structure of the network

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- **CREST**
 - Forwarding metric based on characterization of mobility traces
 - Metric based on **conditional residual time**

Collection of Mobility Traces

- **Environment profile**
 - Open research lab environment
 - Mobile workspaces, meetings rooms, cafeteria
 - 4 floors
- **Participant profile**
 - 52 participants, each carrying Ekahau wireless tag
 - Researchers from 2 research groups, student interns
 - Project leaders in business divisions, department managers
 - System administrators, administrative staff
- **Data Logging**
 - Location coordinates: X, Y, floor
 - Timestamp, tag ID, signal quality
 - 30-day traces, 5 second interval
 - Pairs within 5 meters on same floor are considered to be in contact

Dataset Characterization

- Approach
 - Analyze the aggregate ICD of the office dataset
 - Derive bounds for the delay performance of DTN protocols
 - Model the **pairwise ICD** and propose a new link metric
 - Assume data transfer time negligible compared to wait time until next contact

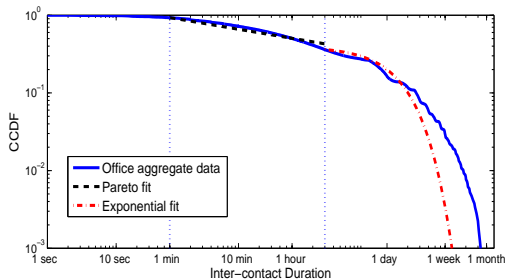
ICD

Time elapsed between two successive contacts of a pair of nodes.

Residual time:

Time remaining until next contact between nodes i and j .

Aggregate Inter-Contact Duration



- CCDF of aggregate ICD for office dataset is dichotomous
- Pareto ($\alpha = 0.1497$) followed by exponential tail ($\lambda = 7.87 * 10^{-6}$)
- Characteristic time = 3 hours

Delay Bounds

Direct hop protocol

- Single hop transmission to destination directly from source
- Mean end-to-end delay for office dataset **35 hours**
 - Provides **upper delay bound** for DTN protocols

Delay Bounds

Direct hop protocol

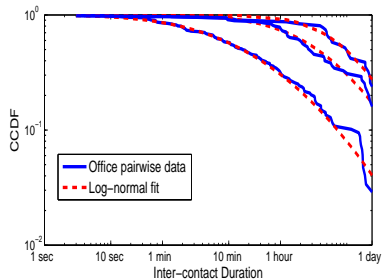
- Single hop transmission to destination directly from source
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Flooding protocol

- Forward copy of message to every node in contact that does not already have a copy
- Mean end-to-end delay for office dataset **4.66 hours**
 - Provides **lower delay bound** for DTN protocols

Delay expression for pareto and exponential cases for both protocols derived in paper

Pairwise Inter-Contact Durations



- Aggregate ICD does not accurately represent contact behavior of different node pairs
- Pairwise ICD provides better basis for link metric
- Most pairwise ICD in office dataset **lognormally** distributed (K-S statistic)
 - Different parameters μ_{ij} and σ_{ij}
 - Means span over three orders of magnitude
 - Contact behavior between individual pairs **not memoryless**

CREST Link Metric

Conditional Residual Time (CRT)

Time remaining before node i and j meet, **conditioned** on the information that they last met t_{ij} time slots ago.

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- CREST uses **median CRT** as link metric
- Computed as $\tilde{t}_{ij} = \bar{F}_{\hat{R}_{(i,j)}}^{-1}(0.5)$

$$\bar{F}_{\hat{R}_{(i,j)}}(t) = \Pr(\hat{R}_{(i,j)} > t \mid T_{(i,j)} > t_{ij})$$

$R(i, j)$: r.v. denoting the CRT between pair (i, j)

$T(i, j)$: ICD of pair (i, j)

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For lognormal pairwise ICD ($T(i, j)$):

$$\tilde{t}_{ij} = \exp\left(\operatorname{erf}^{-1}\left(\frac{1}{2} + \frac{1}{2}\operatorname{erf}\left(\frac{\ln t_{ij} - \mu_{ij}}{\sigma_{ij}\sqrt{2}}\right)\right)\sigma_{ij}\sqrt{2} + \mu_{ij}\right) - t_{ij}. \quad (1)$$

Median CRT

- Lognormal parameters for office dataset:
 - $8.0 \leq \mu_{ij} \leq 11.0$
 - $2.5 \leq \sigma_{ij} \leq 3.5$

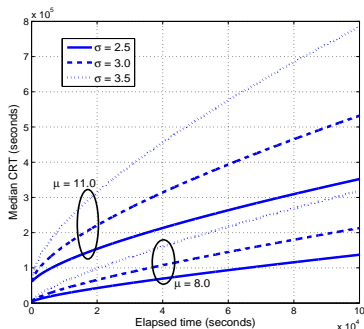
- Behavior of median CRT depends on distribution of ICD

Lognormal (not memoryless):

monotonically increases with time elapsed since last contact (t_{ij})

Exponential (memoryless): residual time independent of t_{ij}

Constant: decreases with t_{ij}



CREST Forwarding Protocol

S

```

EncNodes = nodes currently in
contact with FwdNode;
PossRelays = EncNodes  $\cup$  FwdNode;
foreach node i in PossRelays do
    Compute median CRT  $\tilde{t}_{iD}$ ;
end
NextHopNode = node  $k \in$ 
PossRelays with minimum  $\tilde{t}_{kD}$ ;
if NextHopNode  $\neq$  FwdNode then
    Forward message to
    NextHopNode;
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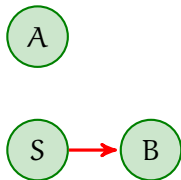
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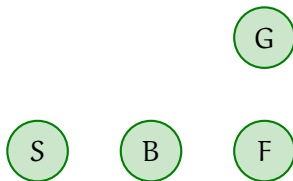
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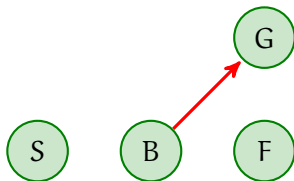
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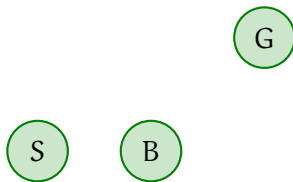
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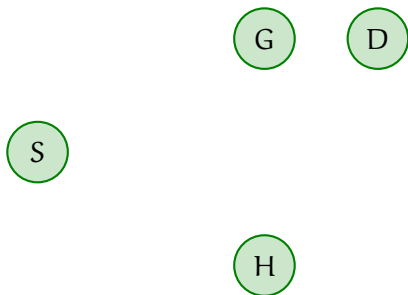

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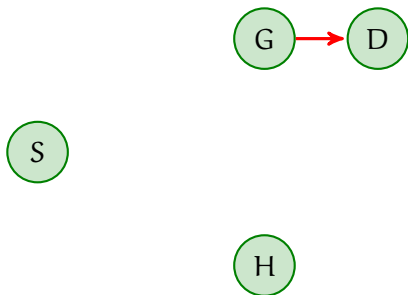
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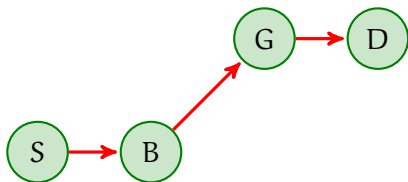
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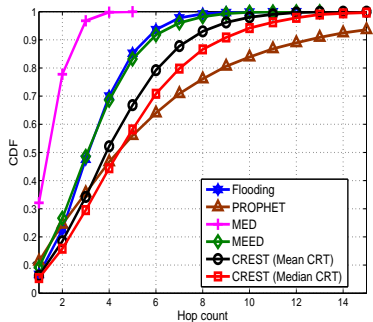
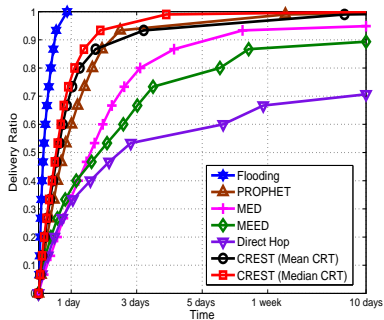
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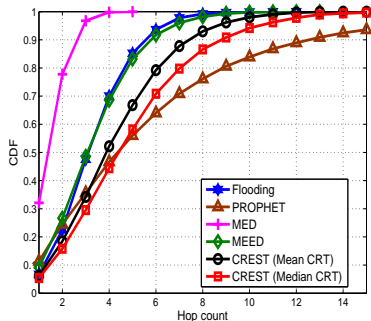
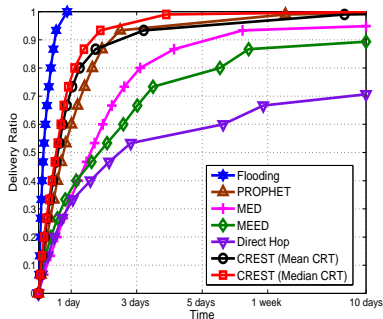
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Office Dataset: Single Copy



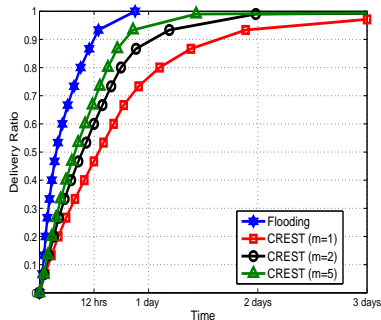
Office Dataset: Single Copy



- **DR within 1 day:** Flooding (100% in 21 hours), **CREST (80%)**, PROPHEM (60%), MEED (36%), MED (34%)
- CREST more adaptive to ICD behavior compared to PROPHEM

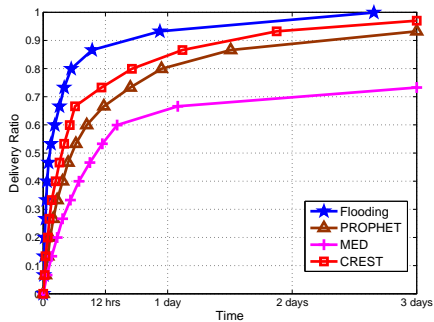
Office Dataset: Multiple Copies

Figure: Can CREST perform as well as Flooding but with fewer message copies?

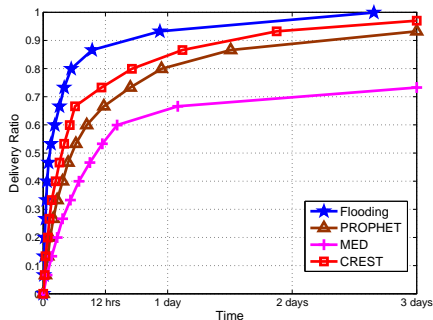


- Source generates m copies
- Delivery ratio improves with m
 - 90% DR: 40 hrs ($m = 1$)
 - 24 hrs ($m = 2$)
 - 18 hrs ($m = 5$)
- Performance stable beyond $m > 5$
- CREST has low overhead
 - CREST: 95% delivery in 21 hrs with $m = 5$
 - Flooding: 100% in 21 hrs with 196 transmissions

Haggle Dataset: Single Copy



Haggle Dataset: Single Copy



Inferences

- Contact data logged by iMotes
- 41 conference participants, 4-day period
- ICD is lognormal
- CREST has lower delay, higher delivery ratio compared to MED, PROPHEX

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- Future work
 - Mobility-based metrics capture transient contact behavior
 - Combine with metrics that capture social structure