

The Min-entropy of Distributed Wireless Link Scheduling Algorithms under Arbitrary Interference

Dariusz R. Kowalski
Augusta University

Miguel A. Mosteiro
Pace University

Application: the Internet of Things



Vehicle, asset, person & pet monitoring & controlling



Agriculture automation



Energy consumption



Security & surveillance



Building management



Embedded Mobile

Internet of things

Everyday things get connected for smarter tomorrow



M2M & wireless sensor network



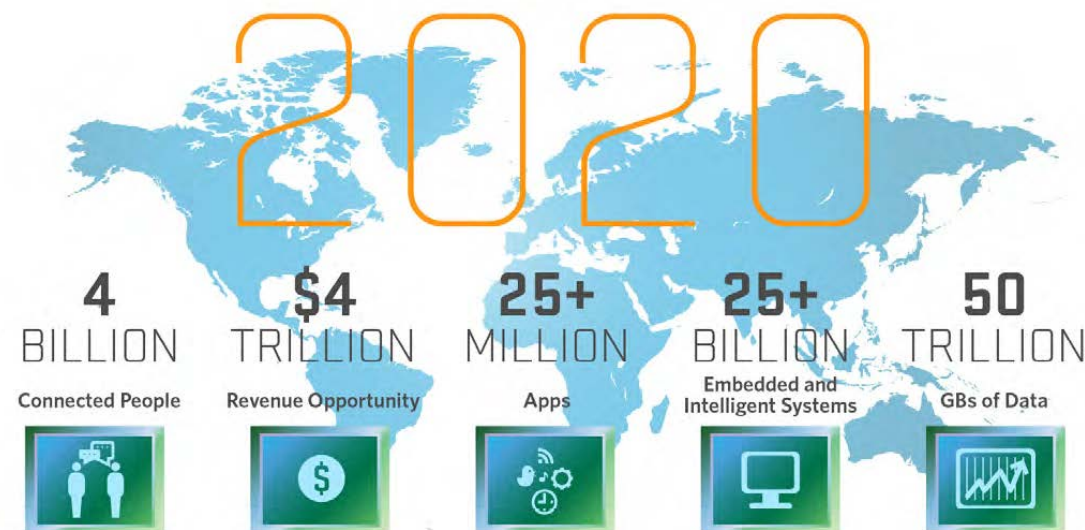
Everyday things



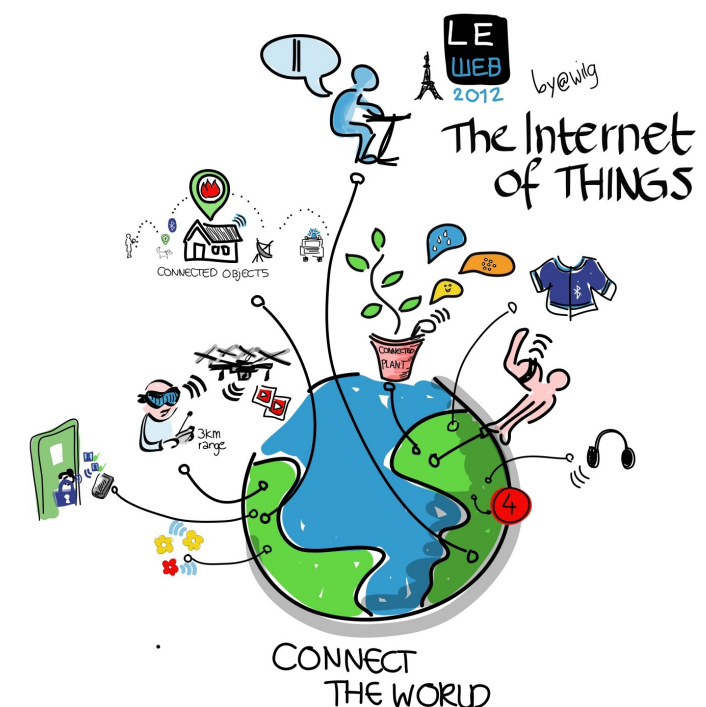
Smart homes & cities



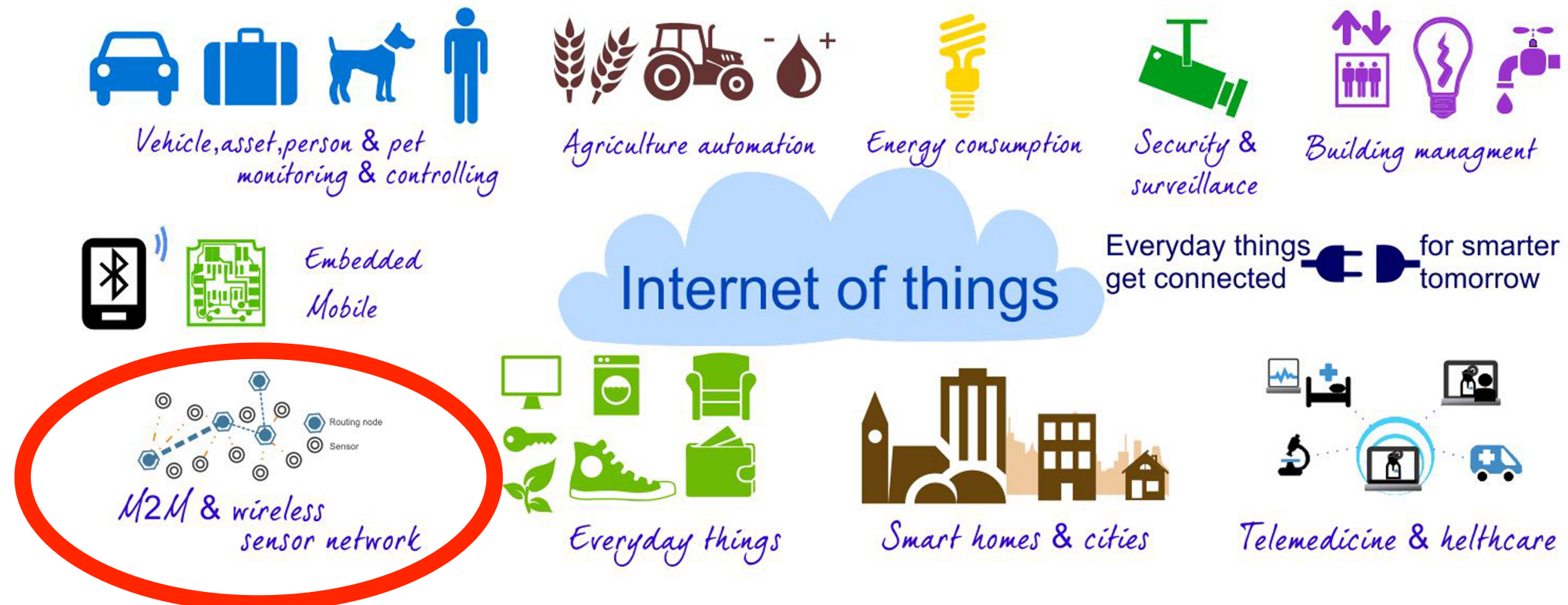
Telemedicine & healthcare



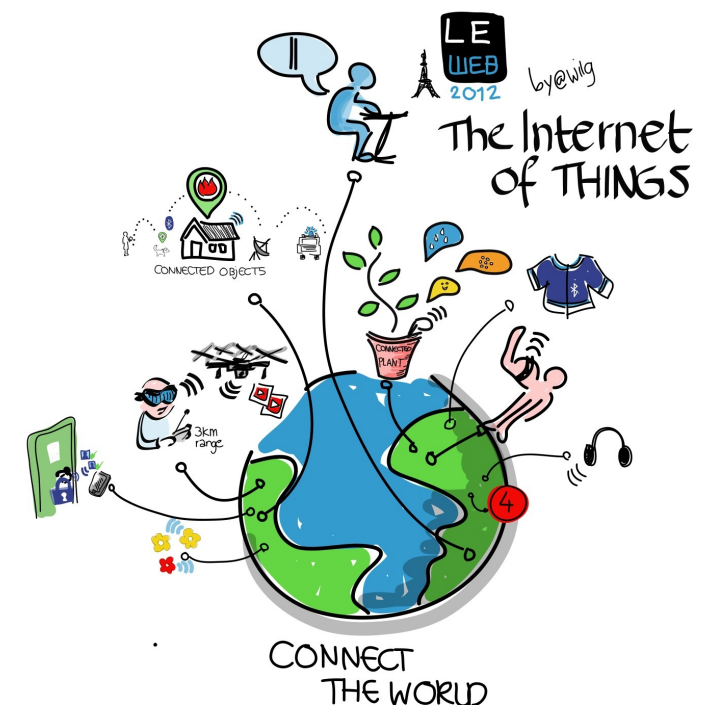
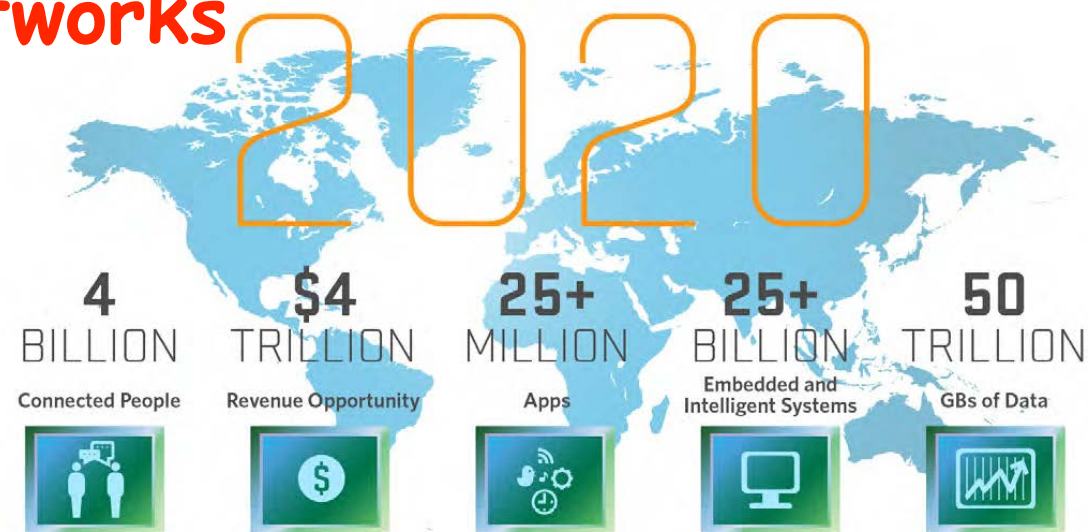
Source: Mario Morales, IDC



Application: the Internet of Things

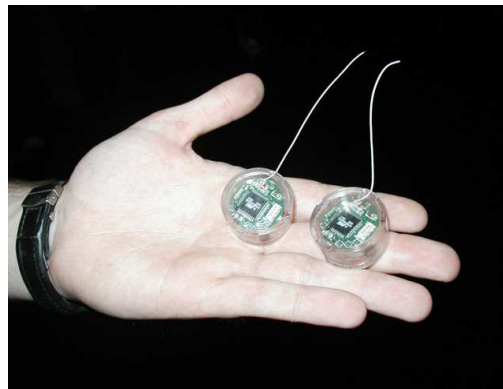


Ad-hoc Wireless Networks



Ad-hoc Wireless Networks

Example: A Sensor Network



Intel Berkeley Research Lab

Capabilities

- processing
- sensing
- communication

Limitations

- range
- memory
- life cycle



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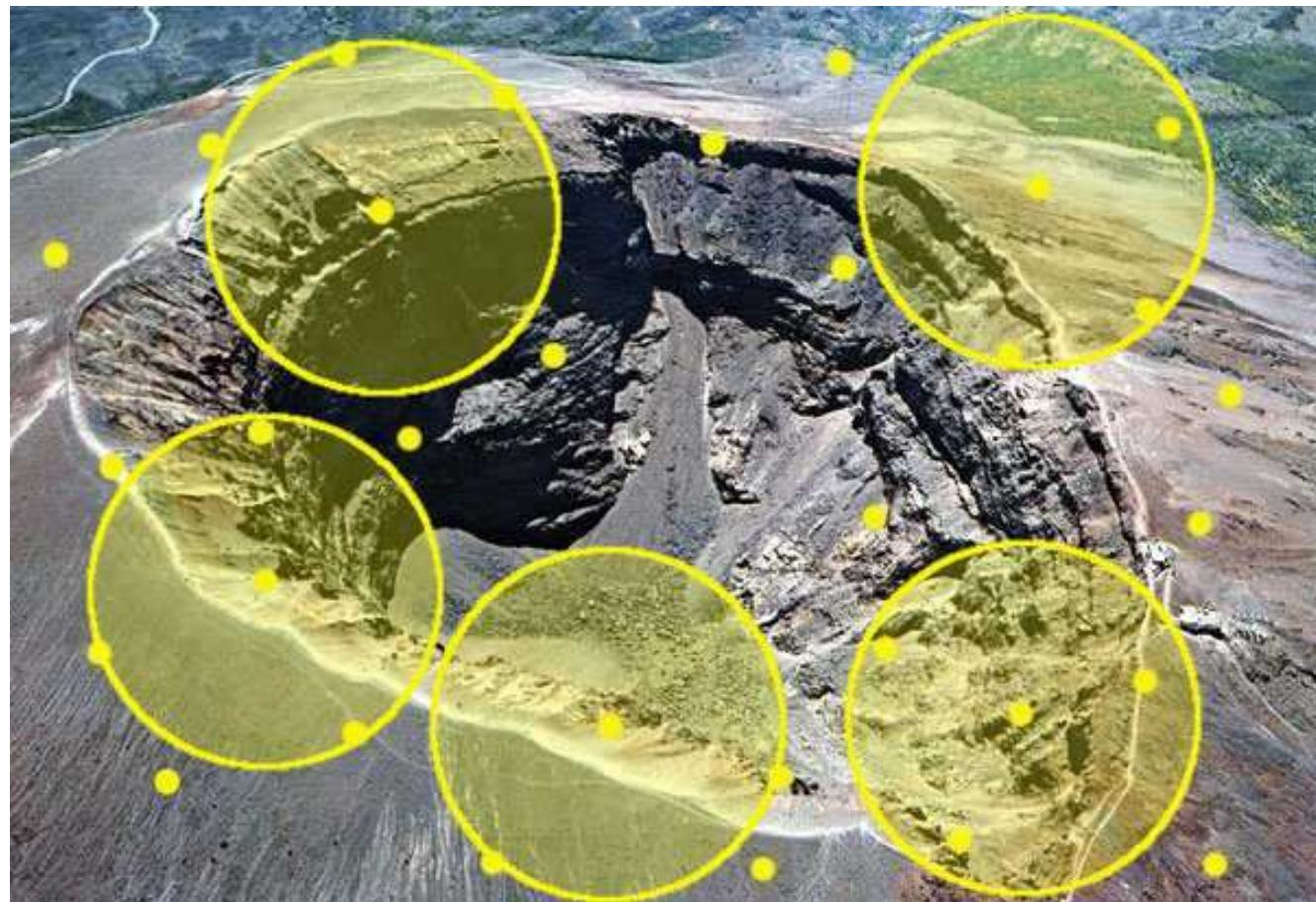
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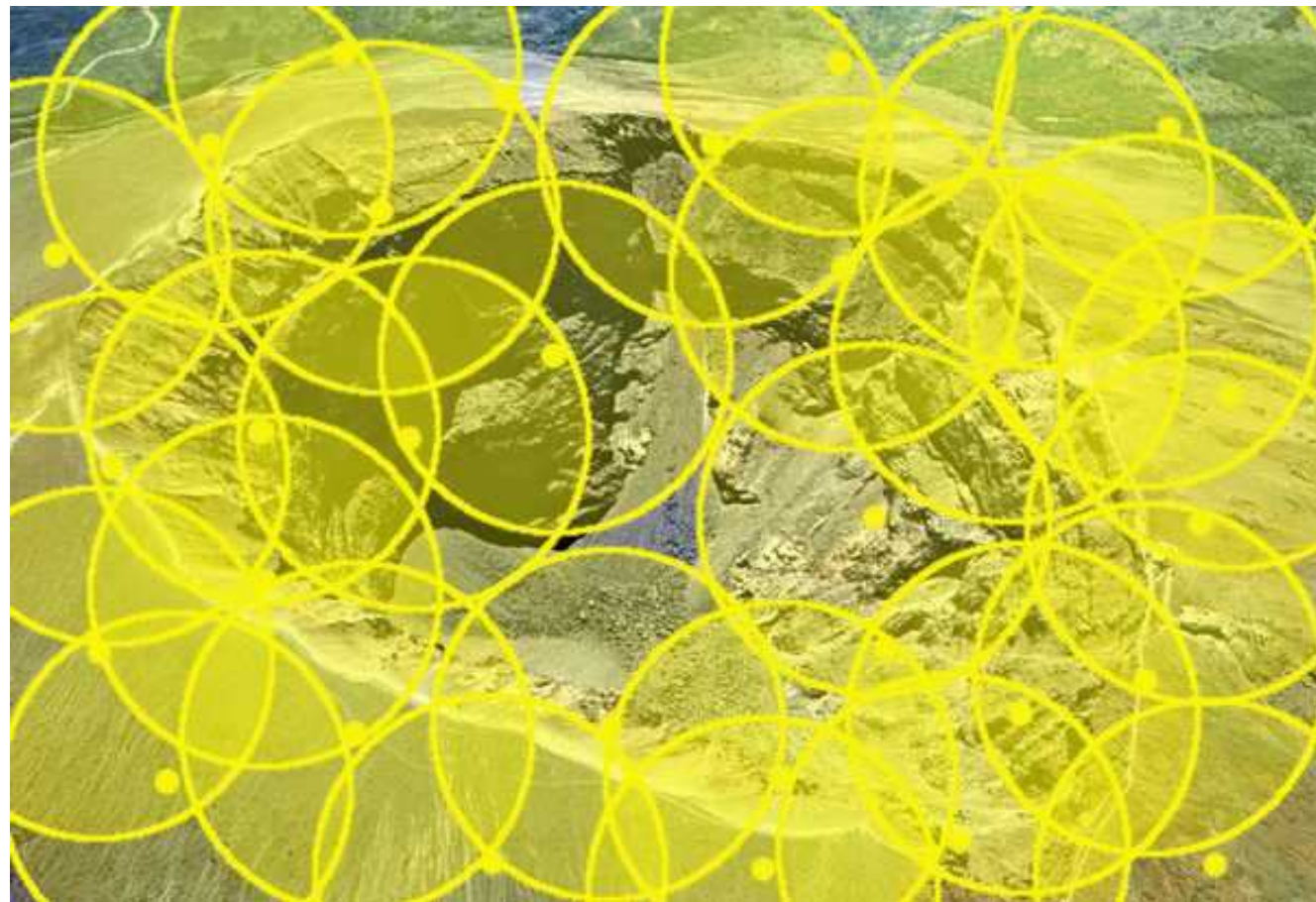
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Models for Wireless Networks

- **Topology Models :**
 - Undirected Graph
 - Unit Disk Graph
 - Time-varying Graph
- **Node Capabilities Models :**
 - Computational Resources
 - Communication Capabilities
 - Weak Sensor Model
- **Interference Models :**
 - Radio Network (RN)
 - Signal to Interference plus Noise Ratio (SINR)
 - **Affectance (AFF)**

Interference Models

Affectance Model [1,2,3]:

$$a((u, v), (x, y))$$

function quantifying interference of communication through link (u, v) on communication through link (x, y) .

- **Collision/success:**

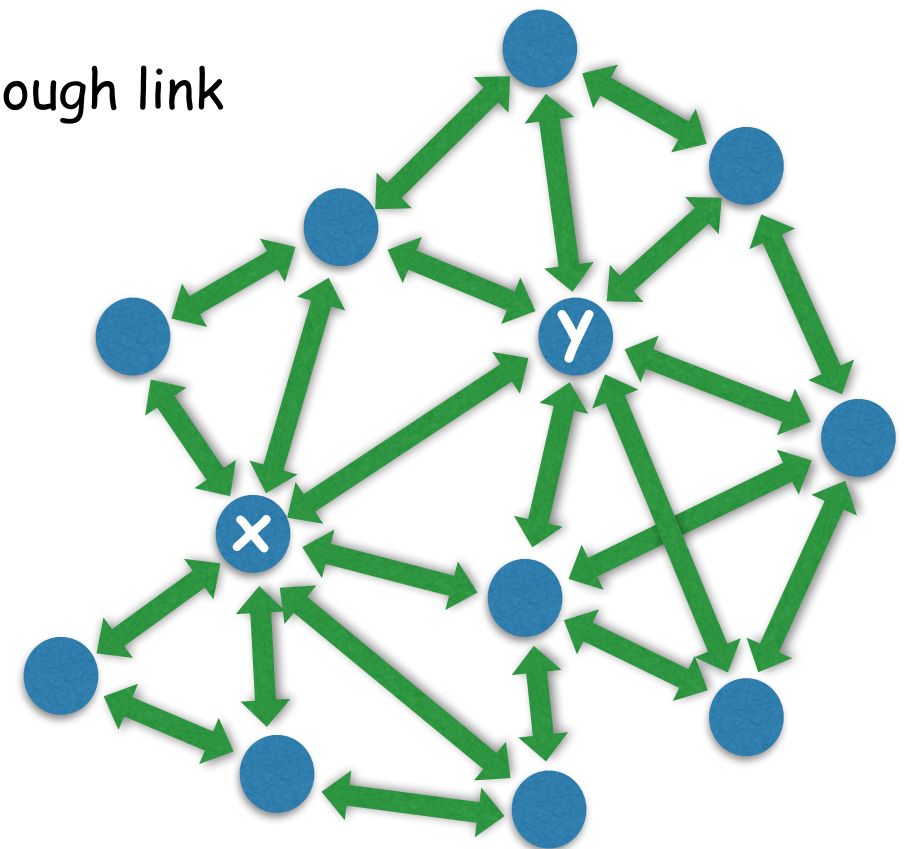
For any link (x, y) ,

a transmission from x is received by y at time t
if and only if

» x transmits at time t and

»
$$\sum_{(u,v) \in L(t)} a((u, v), (x, y)) < 1$$

$L(t) \subseteq E$: set of links whose transmitters transmit at time t



[1] Halldórsson and Wattenhofer. ICALP 2009.

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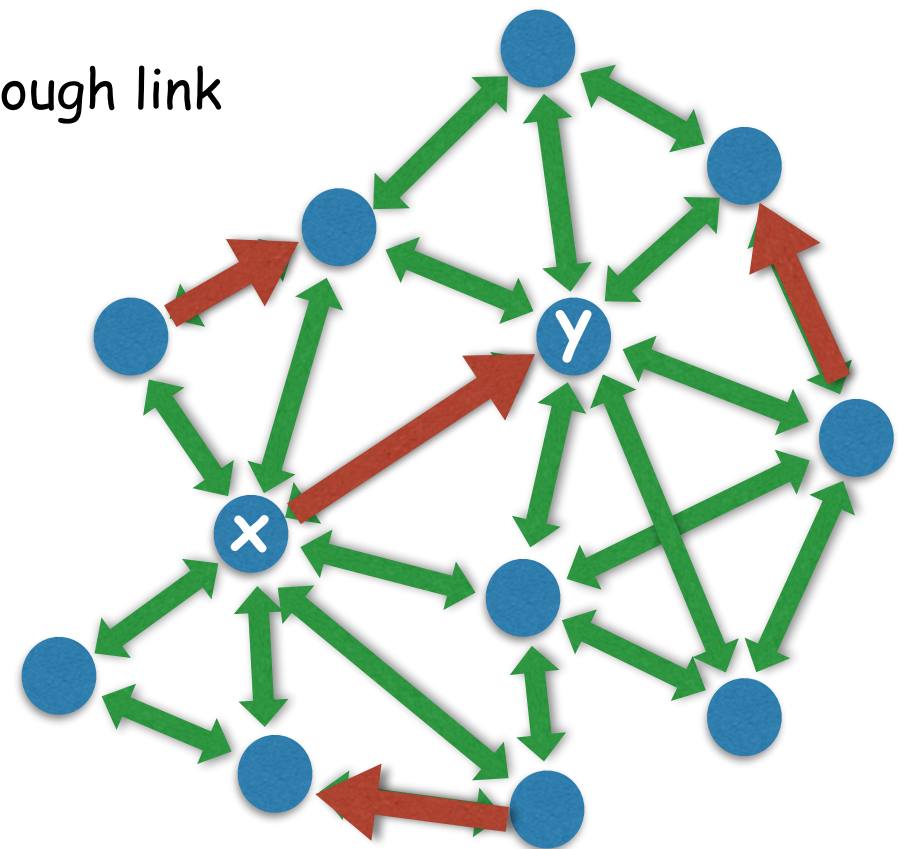
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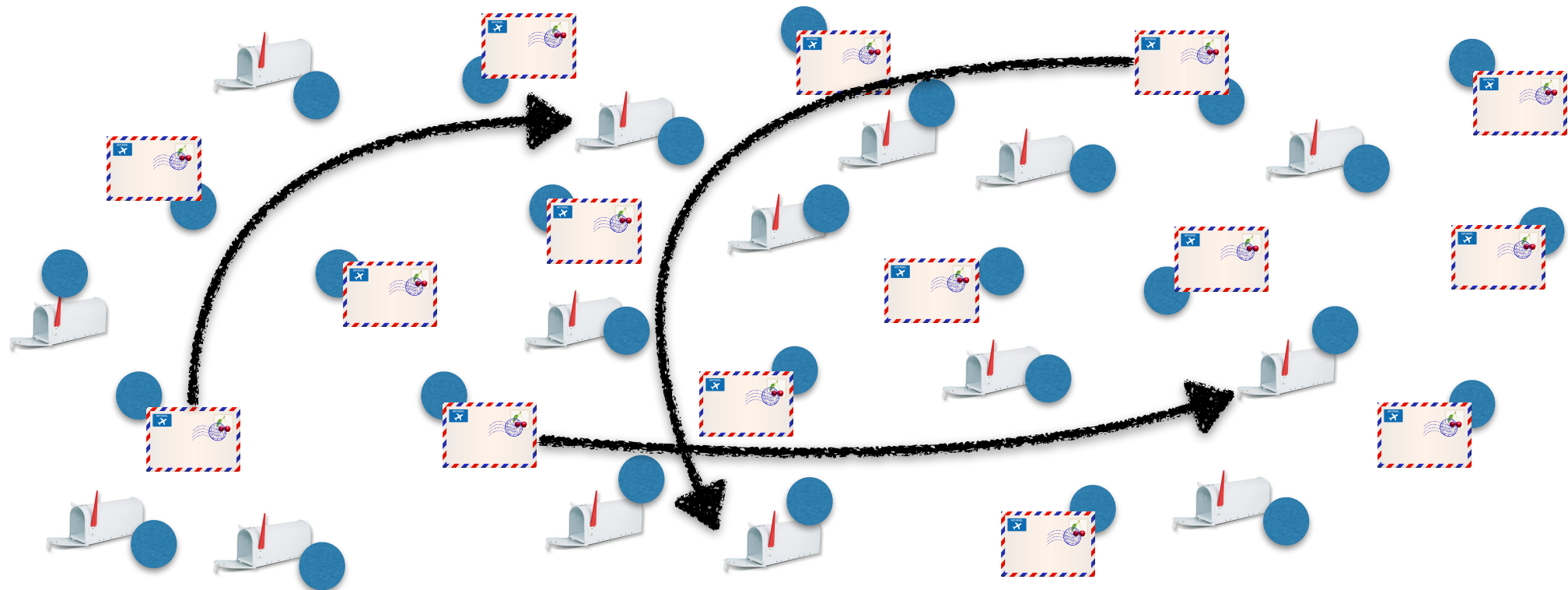
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Link Scheduling Problem

- **Scenario :**
 - n network nodes called **senders**
 - n network nodes called **receivers**
 - each sender holds a **message** to be delivered to some receiver
 - each (sender,receiver,message) called a **request**
 - successful delivery of a message called a **realization** of the request



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 - n network nodes called **receivers**
 - each sender holds a **message** to be delivered to some receiver
 - each (sender,receiver,message) called a **request**
 - successful delivery of a message called a **realization** of the request
- **Conditions :**
 - realization implemented through wireless communication
 - ⇒ **affectance** among concurrent attempts of realization
 - ⇒ concurrent attempts may fail
 - unique node ID's, unknown to other nodes
 - time slotted in **rounds** of communication
- **Goal :**
 - realize all requests

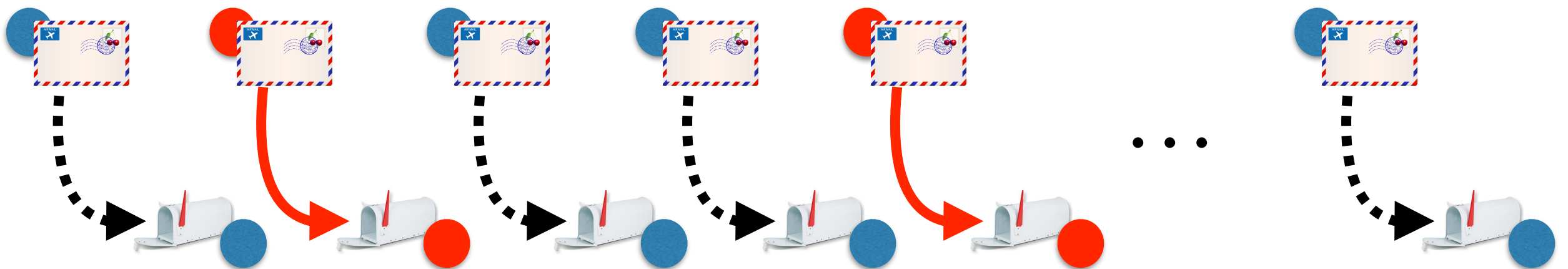
Link Scheduling Problem

- **Input :**
 - set L of n requests
- **Output :**
 - **transmissions schedule** to realize all requests under **arbitrary** affectance

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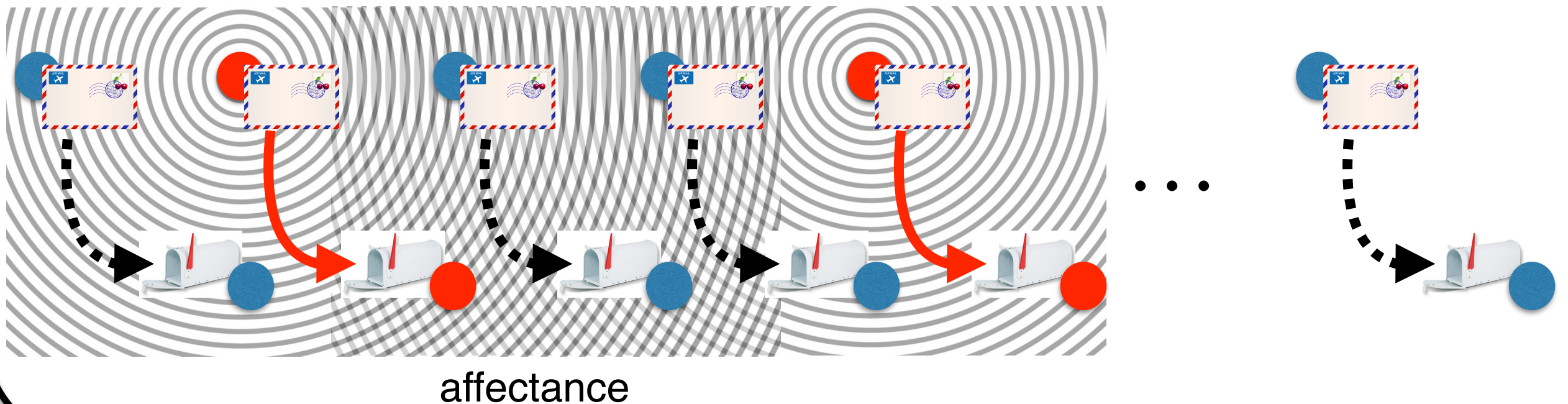
e.g. realization attempts (transmissions) in round t :



Link Scheduling Problem

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Protocols Studied

- **Algorithms :**
 - **distributed**: each (sender,receiver) run their own algorithm, no centralized entity, ignoring messages from any other nodes
 - **non-adaptive**, except for switching off after realization. That is, requests are not aware of other realizations, and there are no control messages other than acknowledgements (to the transmitter only).
 - **deterministic** and **randomized**
- **Information available :**
 - each node knows only n and its own ID

Protocols Studied

- **Performance metrics :**
 - **length of schedule**: number of rounds to realize all requests
 - per request **min-entropy** . That is, the number of bits needed by the random variables used by the local algorithm used by each request.

both given as functions of n and the **maximum average affectance** [1]:

$$A(L) = \max_{L' \subseteq L} \left\{ \frac{1}{|L'|} \sum_{(u,v) \in L'} \sum_{(x,y) \in L'} a((u,v), (x,y)) \right\}$$

Previous Work

Distributed	Acks	Bound	power assignment p	Reference
No	No	$\frac{ALG}{OPT} \leq 12\lceil 2\tau^\alpha \rceil^2$	uniform	ICALP'09 [1]:Thm 3
Yes	No	$O(I(L) \log n)$ <i>whp</i>	$p(\ell) = cd(\ell)^\alpha$	TCS'11 [3]:Thm 5
No	Yes	$O(I(L) + \log^2 n)$ <i>whp</i>	$p(\ell) = cd(\ell)^\alpha$	TCS'11 [3]:Thm 8
(*)	No	$\Omega(I(L))$	linear	TCS'11 [3]:Thm 1
(*)	No	$\Omega\left(\frac{I(L)}{\log \frac{d_{\max}}{d_{\min}} \log n}\right)$	general	TCS'11 [3]:Thm 2
(*)	No	$\Omega\left(\frac{I(L)}{\log \frac{d_{\max}}{d_{\min}}}\right)$	general	TCS'11 [3]:Thm 4
Yes	Yes	$O(\bar{A}(L, p) \log n)$ <i>whp</i>	monotonic	DISC'10 [4]:Thm 6
(*)	Yes	$\Omega\left(\frac{\bar{A}(L, p)}{\log n}\right)$	monotonic	DISC'10 [4]:Thm 10

K-V closest work,
for SINR acks

TABLE I

PREVIOUS BOUNDS FOR LINK SCHEDULING UNDER LESS GENERAL MODELS OF INTERFERENCE.

$$\tau = 2 + \max\left\{2, \left(2^6 3\beta^{\frac{\alpha-1}{\alpha-2}}\right)^{1/\alpha}\right\};$$

MEASURE OF INTERFERENCE $I(L) = \max_{w \in V} \sum_{(u,v) \in L} \min\{1, d(u,v)^\alpha / d(u,w)^\alpha\}$;

$\bar{A}(L, p)$ IS $A(L)$ FOR SINR WITH POWER ASSIGNMENT p ;

MONOTONIC POWER ASSIGNMENT: (1) $d(\ell) \leq d(\ell') \Rightarrow p(\ell) \leq p(\ell')$ AND $\frac{p(\ell)}{d(\ell)^\alpha} \geq \frac{p(\ell')}{d(\ell')^\alpha}$, AND (2) $\frac{p(\ell)}{d(\ell)^\alpha} \geq 2\beta N$.

(*) LOWER BOUNDS ON SCHEDULE LENGTH ARE BASED ON GEOMETRY AND INTERFERENCE, REGARDLESS OF ALGORITHMS.

Contribution

- We study Distributed Wireless Link Scheduling (DWLS) protocols that run under arbitrary interference.
- We present a novel combinatorial structure of polynomial size that guarantees that every request is realized.
- We present 3 DWLS protocols that trade schedule length for min-entropy.
- We present an affectance characteristic that takes into account acknowledgments' implementation.

Our Results

Matches our new
lower bound up to
polylog

Same as K-V upper
bound

	Schedule length	Min-entropy per request
Deterministic	$O(\min\{\mathbb{A}^2 \log^3 n, n\})$	0
Randomized	$O(\mathbb{A} \log n)$	$O(\log \mathbb{A} \log n)$
Parameterized	$O(\min\{(\mathbb{A}^2/W) \log^3 n, n\})$	$O(\log W \log n)$

but K-V has
 $O(\bar{A} \log \bar{A} \log n)$
min-entropy

$$W \leq \mathbb{A}$$

$$\mathbb{A} = A(L) + A(L^*)$$

L^* : set of reversed requests

Deterministic DWLS

- Algorithmic core: combinatorial structure we call (n, \mathcal{A}) -Affectance-Direct-Link-Scheduler (AFF-DLS):

For affectance threshold \mathcal{A} , an (n, \mathcal{A}) -AFF-DLS is

a family of subsets $S_1, S_2, \dots, S_\tau \subseteq L$ such that

for every request $(v_i, v_j) \in L$ such that $\sum_{(v_x, v_y) \in L} a((v_x, v_y), (v_i, v_j)) \leq \mathcal{A}$,

there exists $t \leq \tau$ such that $\sum_{(v_x, v_y) \in S_t} a((v_x, v_y), (v_i, v_j)) \leq 1$.

- We show how each node can construct locally an AFF-DLS of length $4\mathcal{A}^2 [\log_{\mathcal{A}} n]^2$ in poly time.

Deterministic DWLS

In a nutshell:

For each $i = 1, 2, \dots$ until realized

For $\log n$ times

Use a $(n, 2^i)$ -Aff-DLS to decide
when to transmit

If acknowledgement is received

Stop

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Algorithm 1: Deterministic DWLS algorithm for each request (s, r) . Given locally pre-computed $(n, 2^i)$ -AFF-DLS, for $i = 1, \dots, \frac{1}{2} \log \frac{n}{\log^2 n}$, as in Corollary 2. S_t denotes t -th set in current $(n, 2^i)$ -AFF-DLS.

```
1  $s$  gets active,  $r$  gets passive
2 for  $i = 1, 2, \dots, \frac{1}{2} \log \frac{n}{\log^2 n}$  do
3     /* Phase  $i$ : */
4     for  $j = 1, 2, \dots, \log n$  do
5         /* Sub-phase  $j$  of phase  $i$ : */
6         /* Part 1: packets */
7         for  $t = 1, 2, \dots, \text{length}[(n, 2^i)\text{-AFF-DLS}]$  do
8             if  $s$  is active and  $s \in S_t$  then
9                  $s$  transmits packet to  $r$ 
10                if  $r$  not active and gets packet from  $s$ 
11                    then
12                         $r$  becomes active
13                /* Part 2: acknowledgments */
14                for  $t = 1, 2, \dots, \text{length}[(n, 2^i)\text{-AFF-DLS}]$  do
15                    if  $r$  is active and  $r \in S_t$  then
16                         $r$  transmits acknowledgement to  $s$ 
17                    if  $s$  receives acknowledgment from  $r$  then
18                         $s$  gets acknowledged
19                /* Part 3: successful stops */
20                for  $t = 1, 2, \dots, \text{length}[(n, 2^i)\text{-AFF-DLS}]$  do
21                    if  $s$  is acknowledged and  $s \in S_t$  then
22                         $s$  transmits stop to  $r$ 
23                    if  $r$  receives stop from  $s$  then
24                         $r$  stops
25                if  $s$  is acknowledged then
26                     $s$  stops
27                 $r$  becomes passive
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Deterministic DWLS

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Performance:

- $O(\min\{A^2 \log^3 n, n\})$ rounds

- Min-entropy: 0

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Randomized DWLS

In a nutshell (acks and A given for clarity):

For each window of $W \geq A$ rounds

Choose uniformly at random a round to transmit

If acknowledgement is received

Stop

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Algorithm 2: Randomized DWLS algorithm for each request (v, w) . The window size W is a parameter.

```
/* Algorithm for sender  $v$  */
1  $i \leftarrow 0$ 
2  $\delta \leftarrow$  integer chosen in  $[1, W]$  uniformly at random
3 for each round  $t = 1, 2, \dots$  do
4   if  $t = iW + \delta$  then
5     transmit to  $w$ 
6     if acknowledgement is received from  $w$  then
7       stop
7   if  $t \equiv 0 \pmod{W}$  then
8      $i++$ 
9      $\delta \leftarrow$  integer chosen in  $[1, W]$  uniformly at random
/* Algorithm for receiver  $w$  */
10 for each round  $t = 1, 2, \dots$  do
11   if transmission from  $v$  is received then
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Acks given and A known for clarity.

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Performance: whp

- $O(A \log n)$ rounds

- Min-entropy: $O(\log A \log n)$

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Trading Time for Min-entropy

In a nutshell: Consider windows composed of $W \leq A$ sub-windows.

Each sub-window composed of W' rounds.

For each window

Choose uniformly at random a sub-window

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Performance: whp

- $O(\min\{(A^2/W)\log^3 n, n\})$ rounds

- Min-entropy: $O(\log W \log n)$

where $W \leq A$

Open Problems

Matches our new lower bound up to polylog

Same as K-V upper bound

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but K-V has
 $O(\bar{A} \log \bar{A} \log n)$
 min-entropy

- reduce polylog factors?
- time-entropy lower bounds?

$$W \leq \mathbb{A}$$

$$\mathbb{A} = A(L) + A(L^*)$$

L^* : set of reversed requests

Thank you!

Miguel A. Mosteiro
Pace University
mmosteiro@pace.edu

Return to Zero



EEWeb.com