

# Delay-Tolerant Networking Modeling and Experimentation

Juan A. Fraire



Unia







### Agenda

## Motivation

- Interplanetary Internet
- Architecture
  - Delay-Tolerant Networking
- Modeling
  - Structures and Algorithms
- Experiments
  - ColdSun and RedMars



#### **Motivation**

#### Interplanetary Internet





CubeSats

Comms performance decreases as the square of the distance

GEO: ~40,000km Mars: ~400,000,000km

100 million times weaker

min 3.1 min

and  $12.5 \min^{owlt}$ 

#### Control Flow? DNS Lookup? Ping?

-	Mercury	Venus	Earth	Mars	Jupiter	Saturn	Uranus	Neptune
A U	0,38	0.72	1.00	1.52	5.21	9.54	19.18	30.11
0	3 min	6 min	8 min	12 min	43 min	1h20	2h40	4h10

Orbiters

Voyager 1: 154 AU, 21:30 hrs. Voyager 2: 128 AU, 17:51 hrs.

NASA's

DSN



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#### **Delay-Tolerant Networking**

Data Handling Approach



[1] Fall, Kevin. "A delay-tolerant network architecture for challenged internets." Proceedings of the 2003 conference on Applications, technologies, architectures, and protocols for computer communications. 2003.

#### **Delay-Tolerant Networking**

Architecture and Protocols

- Core Principles
  - Store-carry-and-forward
  - Reduced end-to-end messaging
- DTN Architecture  $\rightarrow$  Bundle Protocol
  - Persistent storage (!= buffering)
  - Bundle features: blocks, custody, fragmentation, deadline



[1] Scott, Keith, and Scott Burleigh. Bundle protocol specification. No. rfc5050. 2007. and No. rfc 9171. 2022.



CCSDS BPSec

CCSDS LTP CCSDS SABR

#### **Delay-Tolerant Networking**

**Concept of Operation** 

Strongly timedecoupled Planning: computation of the *contact plan* Routing: *path* computation from the contact plan Forwarding: *path* selection and *queuing* 

Path: *when* and to *which* neighbor



[1] Fraire, Juan A., Olivier De Jonckère, and Scott C. Burleigh. "Routing in the space internet: A contact graph routing tutorial." Journal of Network and Computer Applications 174 (2021): 102884.

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Contact

• A contact  $C_{A,B}^{t1,t2}$ 

Possibly variable data rate

- A time interval (t1; t2)
- Data will be transmitted by node A , at a data rate  $R \rightarrow$  volume
- That data will be received by node B, after one-way light time (owlt)
- Contacts are unidirectional
  - $\neq$  forward and return data rates
  - Due to *owlt*, the start time of a contact in one direction is typically not the same in the reverse channel



**Contact Plan** 

Contact plans capture the timeevolving nature of the network









[1] Fraire, Juan A., Olivier De Jonckère, and Scott C. Burleigh. "Routing in the space internet: A contact graph routing tutorial." Journal of Network and Computer Applications 174 (2021): 102884.

Routing

- Multi-Graph
  - Nodes with multiple timed edges
    - Edges E are episodes of contact
    - Vertices V are episodes of data retention
- Contact graph
  - Destination node D, Source node S
    - Edges E are episodes of data retention
    - Vertices V are episodes of contact



# Directed acyclic graph $CG_{DS} = (V; E)$



[1] Fraire, Juan A., Olivier De Jonckère, and Scott C. Burleigh. "Routing in the space internet: A contact graph routing tutorial." Journal of Network and Computer Applications 174 (2021): 102884.

Forwarding

- Candidate route list created
  - Forwarding of local/in-transit bundle



Candidate route metrics

- Best Delivery Time (BDT)
  - Deadline check
- Earliest tx opportunity (ETO)
  - Queue backlog
- Projected arrival time (PAT)
  - Transmission time ∀ R. hops
- Effective volume limit (EVL)
  - Lowest  $EVL \in R.hops$

Candidate list created on a per-bundle basis (uses bundle deadline and size)

#### Congestion

#### Reactive

- Custody transfer
- Forecast warning

#### Proactive

- Topology awareness
- Traffic awareness
  - Contact Plan Slicing [1]
  - AI for traffic prediction



tf<sub>1.3</sub>:10

 $k_4$ 

 $t_{sta} = 30$ 

 $t_{end} = 40$ 

 $t_{\rm dur}{=}10$ 

tf<sub>2.3</sub>:10

 $\mathbf{k}_3$ 

 $t_{sta}=20$ 

 $t_{end} = 30$ 

 $t_{\rm dur}{=}10$ 



Uncertainties

#### $\blacksquare$ Contacts $\rightarrow$ associated probability

- Multi-copy forwarding
- Timing information available from the contact plan
  - Traditional probabilistic routing, such as S&W or PRoPHET work with a simplified timing model (frequency)
- Markov Decision Process (MDP) can provide optimal policies [1]
  - Require efficient search heuristics [2]
  - And AI learning (e.g., Q-Learning) [3]



Markov Decision Process (MDP)

[1] Raverta, Fernando D., et al. "Routing in delay-tolerant networks under uncertain contact plans." Ad Hoc Networks 123 (2021): 102663.

[2] D'argenio, Pedro R., et al. "Comparing Statistical and Analytical Routing Approaches for DTN" Quantitative Evaluation of Systems: 19th International Conference, QEST 2022, Warsaw, Poland, September 12–16, 2022, Proceedings. Cham: Springer International Publishing, 2022

[3] D'argenio, Pedro R., et al." Comparing Statistical, Analytical, and Learning-Based Routing Approaches for DTNs" ACM Trans. on Modeling and Computer Simulation (TOMACS) (under review)

Scalability

Route computation effort scales with contact plan size and duration



- Operate with *centralized* routing [2]
- Algorithm optimization
  - Spanning tree over multi-graphs (SPSN) [3]
- Topology splitting
  - Inter-Regional Routing (IRR) [4]

Learning models

- Graph Neural Networks (GNN) [5]
  - Goal: reduce on-board computing effort

[4] Alesi, N. Hierarchical inter-regional routing algorithm for interplanetary networks. Master's thesis, School of Engineering and Architecture, Department of Computer Science and Engineering, Bologna, Italy, 2018.

<sup>[1]</sup> Vega, Blas F., and Juan A. Fraire. "Experimental Evaluation of On-Board Contact-Graph Routing Solutions for Future Nano-Satellite Constellations." (2020).

<sup>[2]</sup> Fraire, Juan A., and Elias L. Gasparini. "Centralized and decentralized routing solutions for present and future space information networks." IEEE Network 35.4 (2021): 110-117.

<sup>[3]</sup> De Jonckère, Olivier, and Juan A. Fraire. "A shortest-path tree approach for routing in space networks." China Communications 17.7 (2020): 52-66.

<sup>[5]</sup> M. Olmedo, Juan A. Fraire "Routing in Scalable Delay-Tolerant Space Networks with Graph Neural Networks" International Conference on Embedded Wireless Systems and Networks (EWSN), 2023

Others

- Partial contact plan update (Rachel)
- Al for fragmentation determination (Rachel)

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D3TN

NTEG

- D3TN: Company located in Dresden = and Miami =
- Specialized in networking in *challenged environments* 
  - Vehicular, underwater, and space
- Developer of **JJJTN**[1]
  - Open-source, lightweight DTN implementation
  - POSIX/Linux and STM32 microcontrollers (FreeRTOS)
  - First space-tested BPv7 implementation







#### [1] https://d3tn.com/ud3tn.html - uD3TN features

- Northbound: Straightforward application integration thanks to socket-based (TCP or Unix domain socket) Application Agent Protocol (AAP) interface
- Core: Full compatibility with ipn and dtn EID schemes, neighbor discovery (IPND), Bundle-in-Bundle Encapsulation (BIBE), modular opportunistic-deterministic DTN routing, and BPSec
- Southbound: Supports several Convergence Layer Adapters (CLA) such as CCSDS SPP, MTCP (draft v0), TCPCLv3 (RFC 7242), and TCPCLv4 (\*)

ColdSun



11 14

#### • Underwater to Buoy to Satellite to the Internet

End-to-end data transport with µD3TN ORBCOMM



Acoustic modems

**Optical modems** 







AUV for dynamic data collection (data mule: higher throughput than direct link)







**OPS-SAT** 

- ESA's OPS-SAT: 3U CubeSat launched in Dec 2019
- Goal: demonstrating the RRN concept via a series of experiments
  - From 2020 to present
  - Web browsing, ML services, interoperability, etc.



BPv7

SPP

S-Band

BPv7

SPP

via



**RedMars** 



DTN 1

- Adapt Recursive Inter-Network Architecture (RINA) [1] into DTN
  - Node mobility, function recursivity, etc.











[1] Day, John. Patterns in network architecture. Pearson Education India, 2007.

#### [1] https://en.wikipedia.org/wiki/Lunar\_IceCube

Testing on

going as of

2023



0

MSU

ION 3.7.1

ipn:22

#### **Experiments**

**RedMars** 



NASA JPL ION 3.7.1

ipn:21

Image is based on an image

Flentge (ESA)

from Camilo Malnati and Felix





NTEĞ

D3TN

µD3TN

ipn:33

AAP to

WebSocket

interface

TCP/

WAN

Data scientist

#### Takeaways

Thanks for listening!

#### DTN brings time into the loop

• Adds a new dimension  $\rightarrow$  asks for new modeling and experimental approaches

## Modeling

 ■ Data structures and algorithms are available, but flexibility/scalability are limited → Plenty of improvement and research opportunities ahead

#### Experimentation

Stacks exist, but the reduced application scope hinders large-scale/long-term validation → Developing for terrestrial contexts might be the way

#### Artificial Intelligence

- Sometimes forced in networks where data is predictable and readily available
- The challenge rests more in efficiently using the data (we have time)



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