



**Jet Propulsion Laboratory**  
California Institute of Technology

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## **Mars On-site Analytics Information and Computing**

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# Bottom Line Up Front

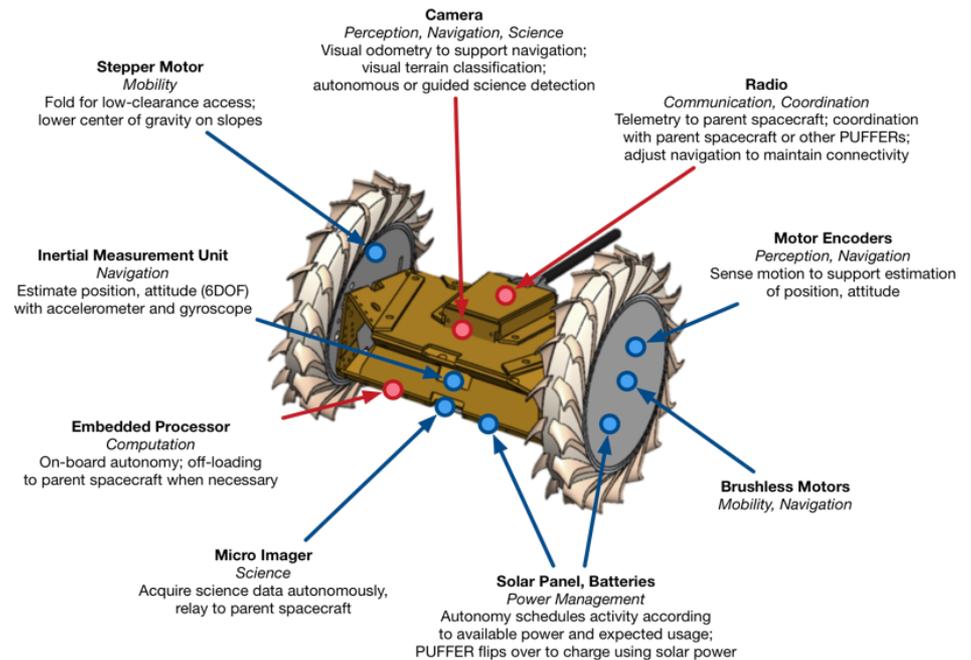
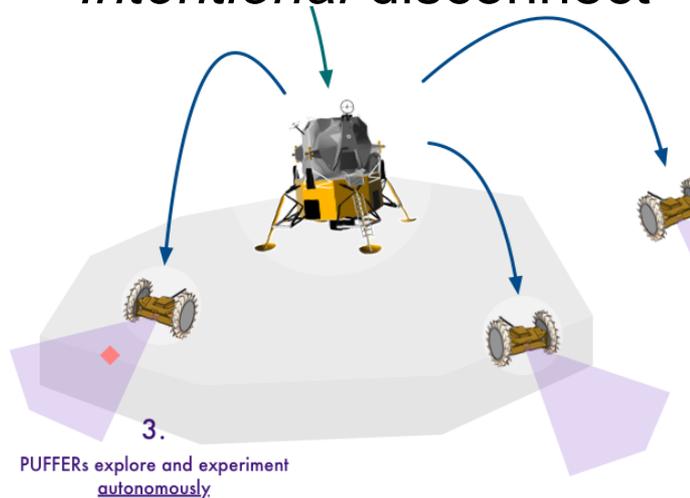
We present a **Mixed Integer Program** which solves for **processing** and **communication** schedules

- on a **heterogeneous network**
- with **time-varying communication** links
- some tasks are **pinned** to some nodes
- some tasks are **optional**
- tasks have dependencies
- tested in a distributed system

# Heterogeneous Network

## Small / Multi-robot systems with intermittent connectivity

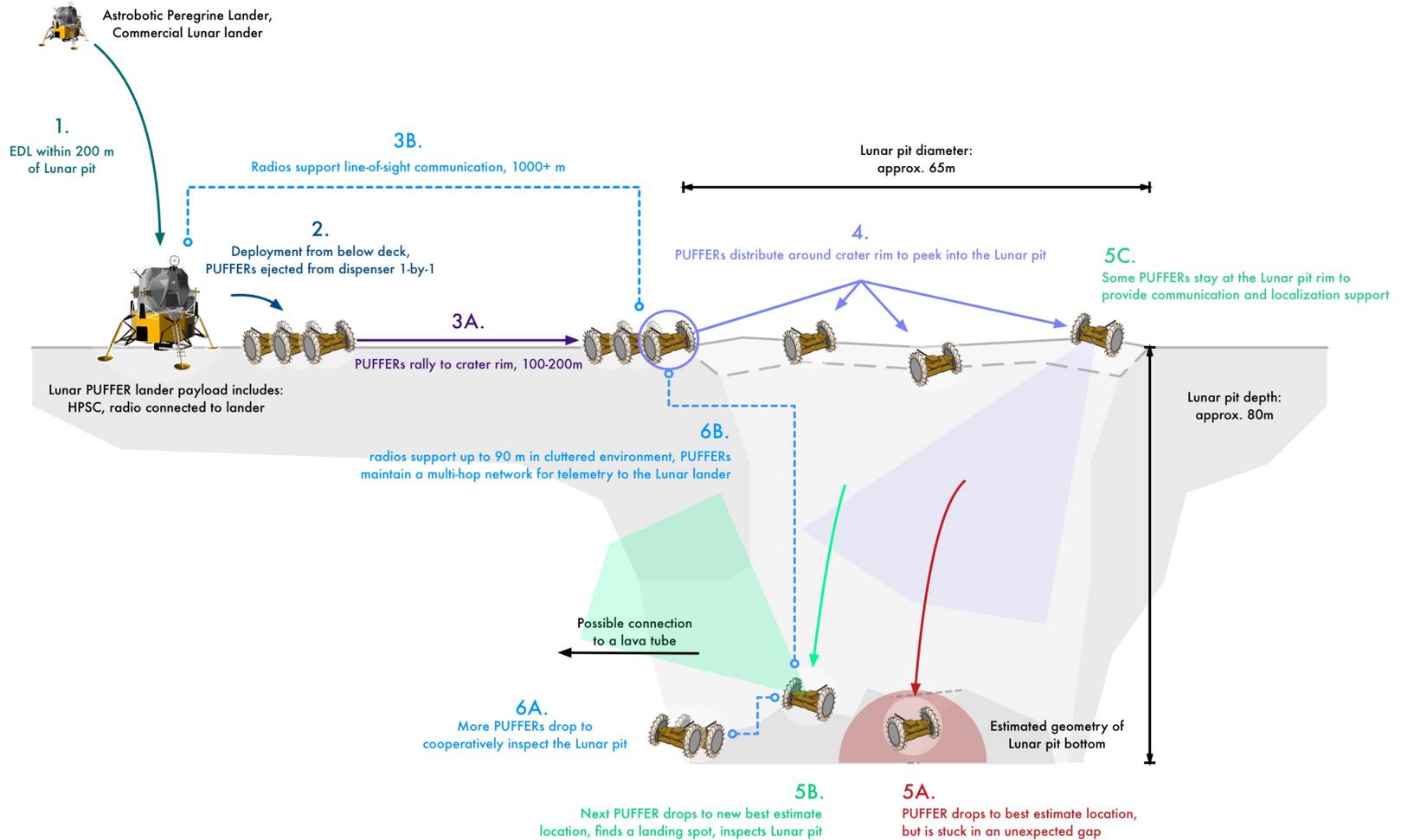
- CPU support nodes
- Network failures
- *Intentional* disconnect



[http://www.kiss.caltech.edu/lectures/2019\\_PUFFER.html](http://www.kiss.caltech.edu/lectures/2019_PUFFER.html)

# Heterogeneous Network

## Small / Multi-robot systems with intermittent connectivity

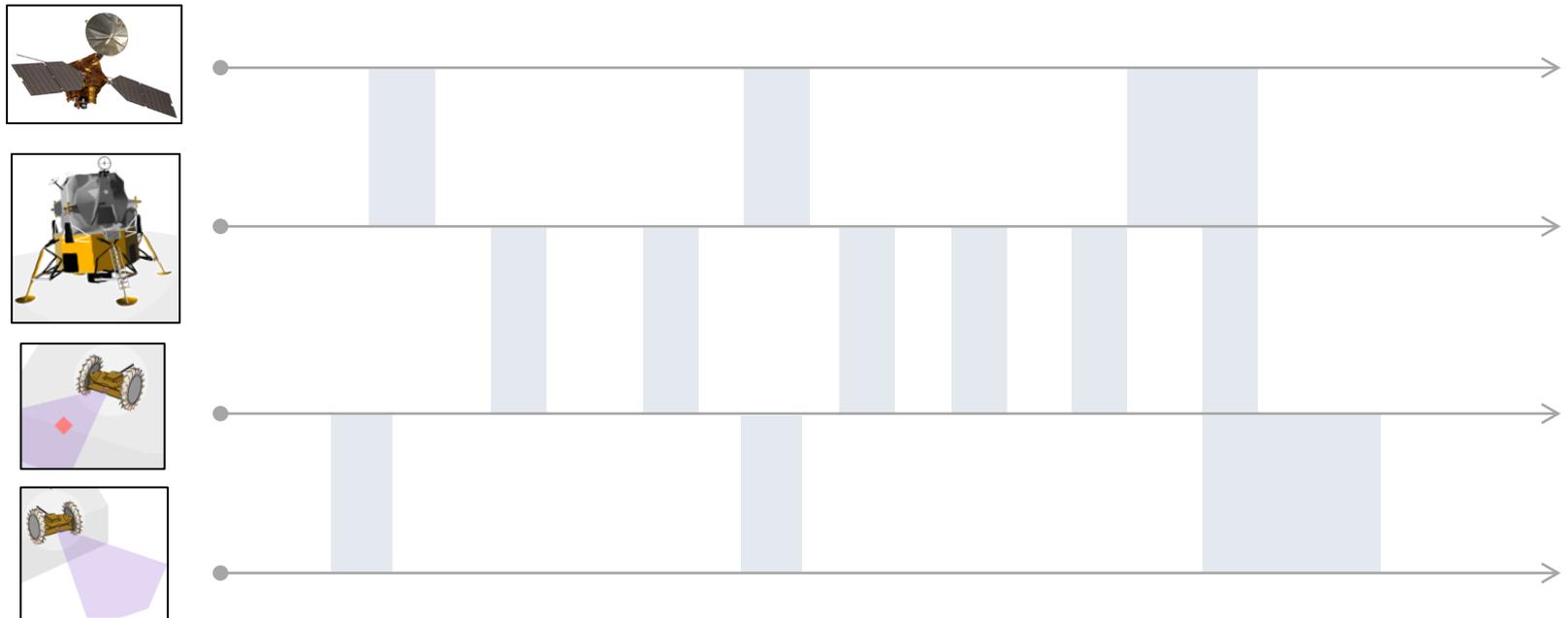


[http://www.kiss.caltech.edu/lectures/2019\\_PUFFER.html](http://www.kiss.caltech.edu/lectures/2019_PUFFER.html)

# Time-varying communication links

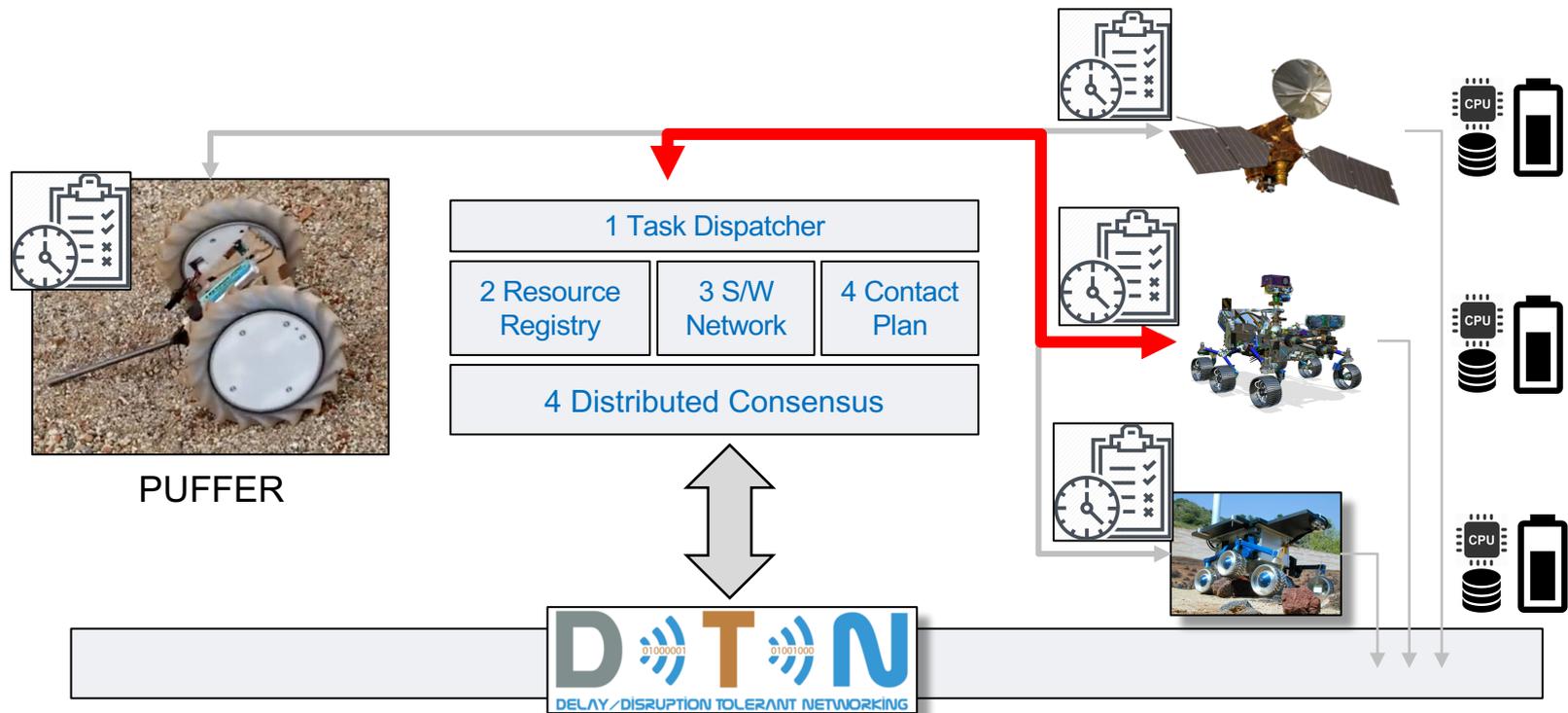
## Delay / Disruption Tolerant Networking (DTN)

- Contact plan
- Mobile autonomous agents can share intended motion



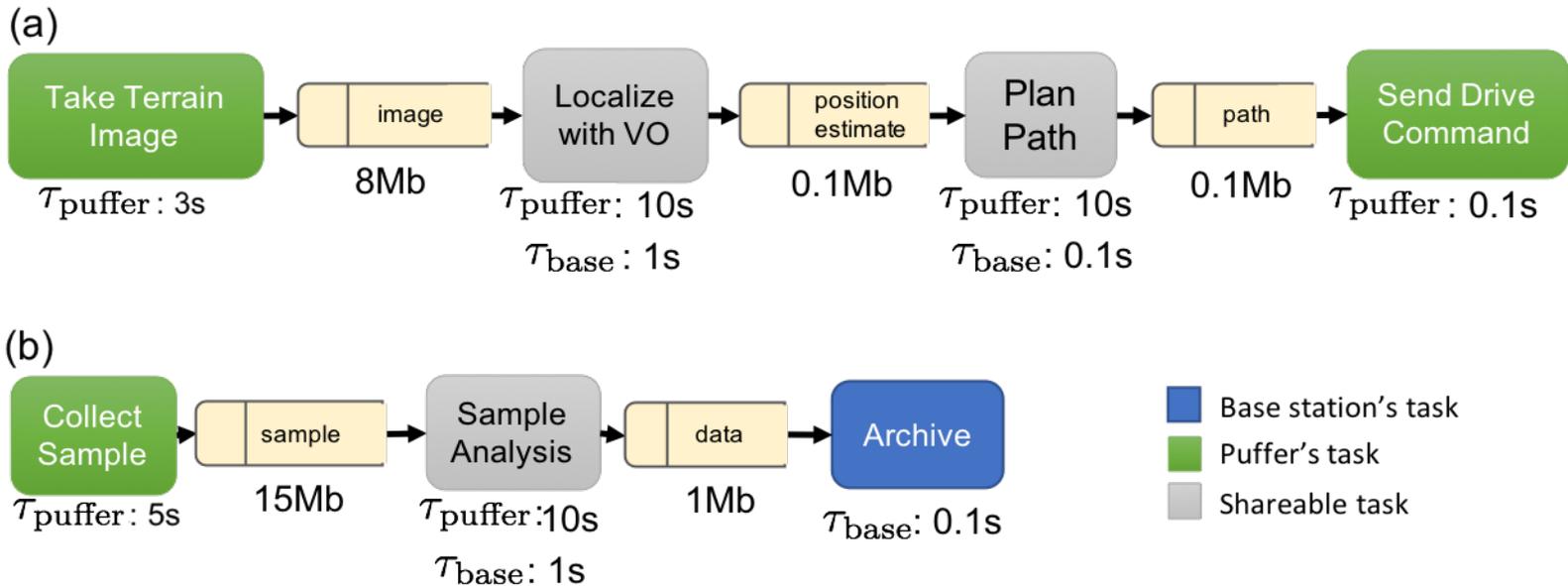
<https://www.nasa.gov/content/dtn>

# Stack Overview



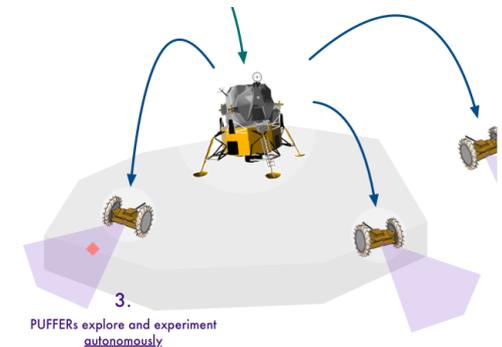
1. Pluggable Distributed Resource Allocator
2. Resource Registry: What tasks, battery, cpu, storage for each nearby node
3. (Ideally) Software Tasks for other nodes
4. All sync'd over the network

# Software Network Models



(a) Housekeeping and (b) Science task chains

- “Archive” is optional, but rewarding



$$\sum_{i=1}^N \sum_{T \in \mathbb{R}} \sum_{c=1}^{C_d^* - \tau_i(T)} \boxed{\begin{array}{|c|c|} \hline \text{Reward} & \text{Agent, task, time} \\ \hline r(T) & X(i, T, c) \\ \hline \end{array}}$$

Max. number of optional tasks completed

$$\sum_{i=1}^N \sum_{c=1}^{C_d^* - \tau_i(T)} X(i, T, c) \leq 1 \quad \forall T \in \mathbb{R} \quad (2a)$$

Optional tasks are performed at most once

$$\sum_{i=1}^N \sum_{c=1}^{C_d^* - \tau_i(T)} X(i, T, c) = 1 \quad \forall T \in \mathbb{T} \setminus \mathbb{R} \quad (2b)$$

All required tasks completed once

$$X(i, T, c) \leq D(i, L, c)$$

$$\forall i \in [1, \dots, N], T \in [1, \dots, M], L \in P_T, c \in [1, \dots, C_d^*] \quad (2c)$$

Only start a task once you have req inputs

$$\sum_{T=1}^M \left[ \sum_{j=1}^N / (C(i, j, T, c) + C(j, i, T, c)) + \sum_{\hat{c}=\max(1, c-\tau_i(T))}^c X(i, T, \hat{c}) \right] \leq 1$$

One thing at a time (cpu, coms, or idle)

$$\forall i \in [1, \dots, N], c \in [1, \dots, C_d^*] \quad (2d)$$

$$D(i, T, c+1) - D(i, T, c) \leq \sum_{\tau=1}^c \sum_{j=1}^N \frac{r_{ji}(c)}{s(T)} C(j, i, T, c) + \sum_{\tau=1}^{c-\tau_i(T)} X(i, T, c)$$

Only have data by calculating or receiving

$$\forall i \in [1, \dots, N], T \in [1, \dots, M], c \in [1, \dots, C_d^* - 1] \quad (2e)$$

$$C(i, j, T, c) \leq D(i, T, c) \quad \forall i, j \in [1, \dots, N], T \in [1, \dots, M], c \in [1, \dots, T] \quad (2f)$$

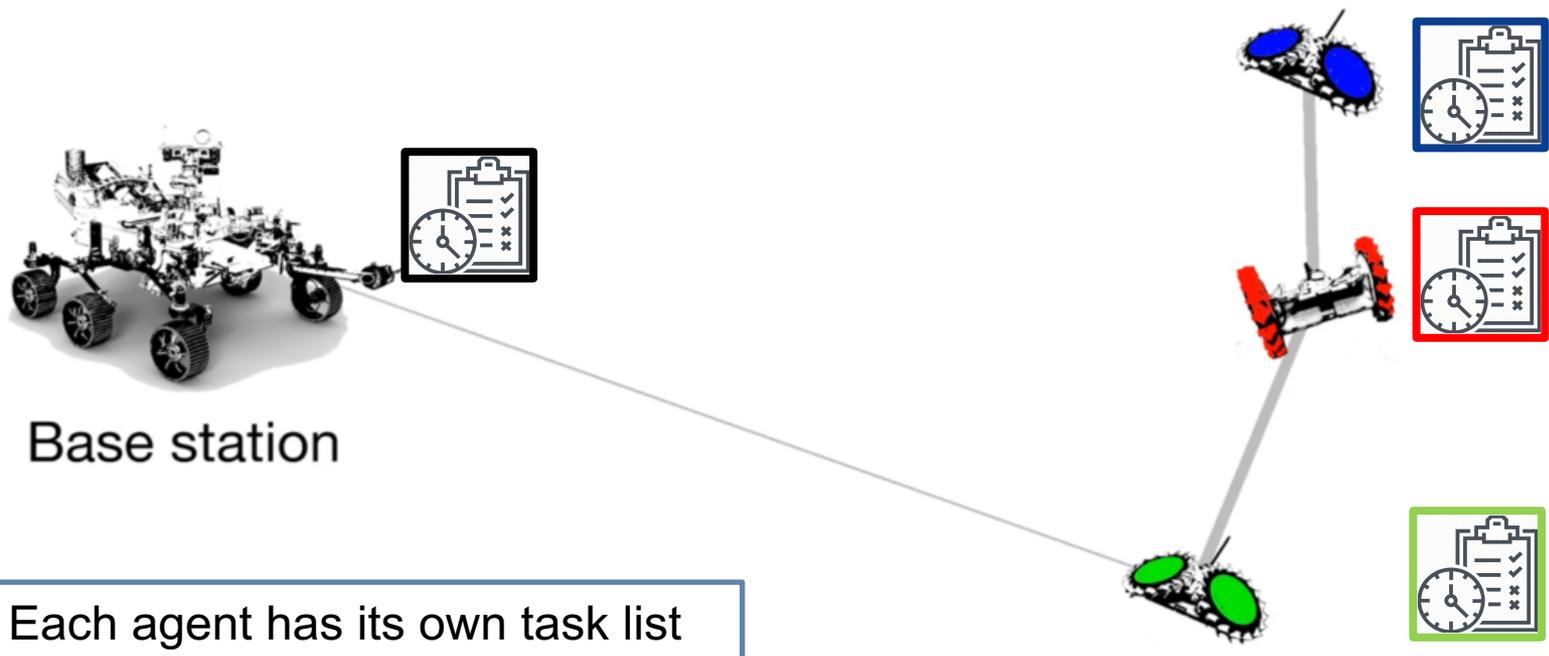
Only communicate what you have

$$D(i, T, 1) = 0 \quad \forall i \in [1, \dots, N], T \in [1, \dots, M] \quad (2g)$$

Start with no data

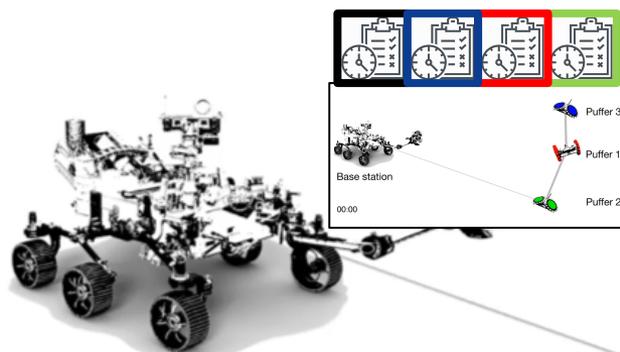
# A word about distributed implementation

- Gossip, Plan, Act
- Caveat: consensus is hard, and we do require it



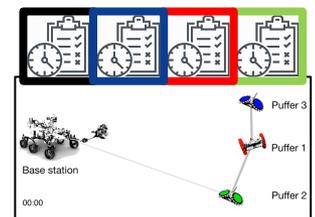
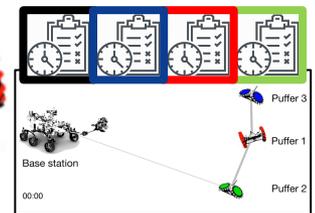
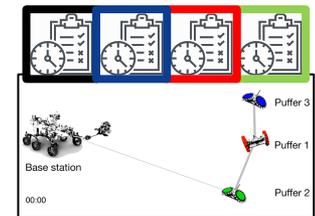
# A word about implementation

- Gossip, Plan, Act
- Caveat: consensus is hard, and we do require it
- *Mostly static task sets are best*



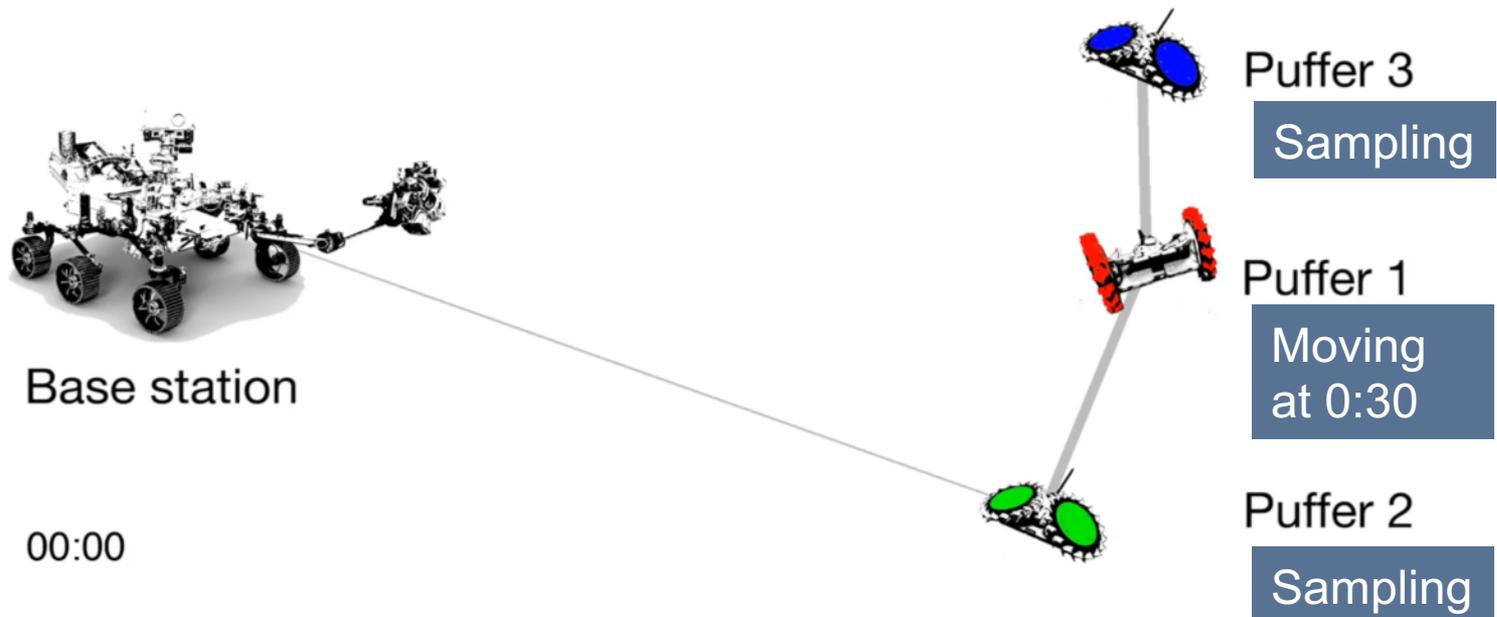
Base station

Every agent knows all tasks and network states



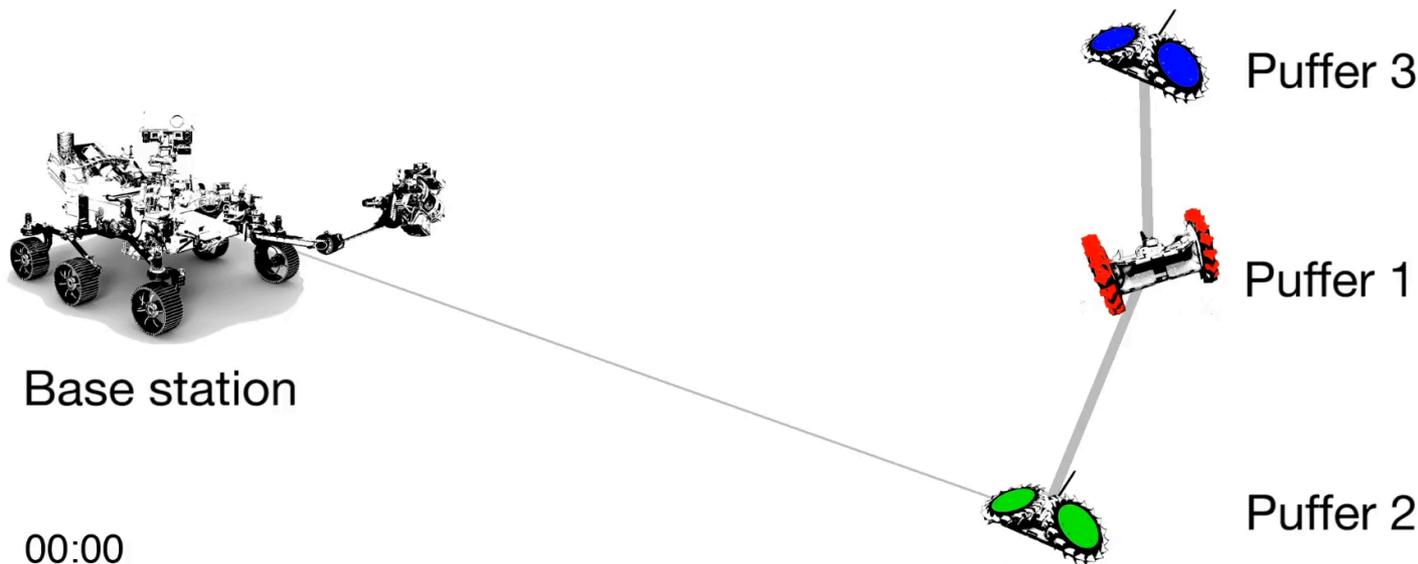
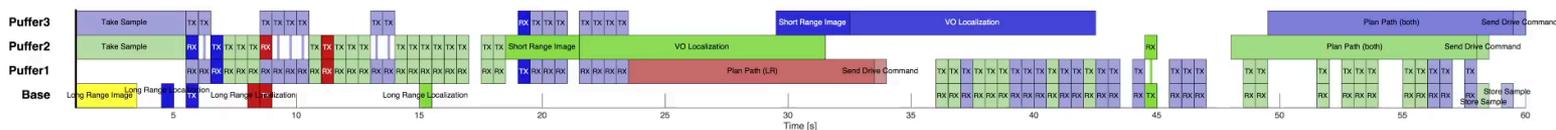
# Example Solution

## Data Mule



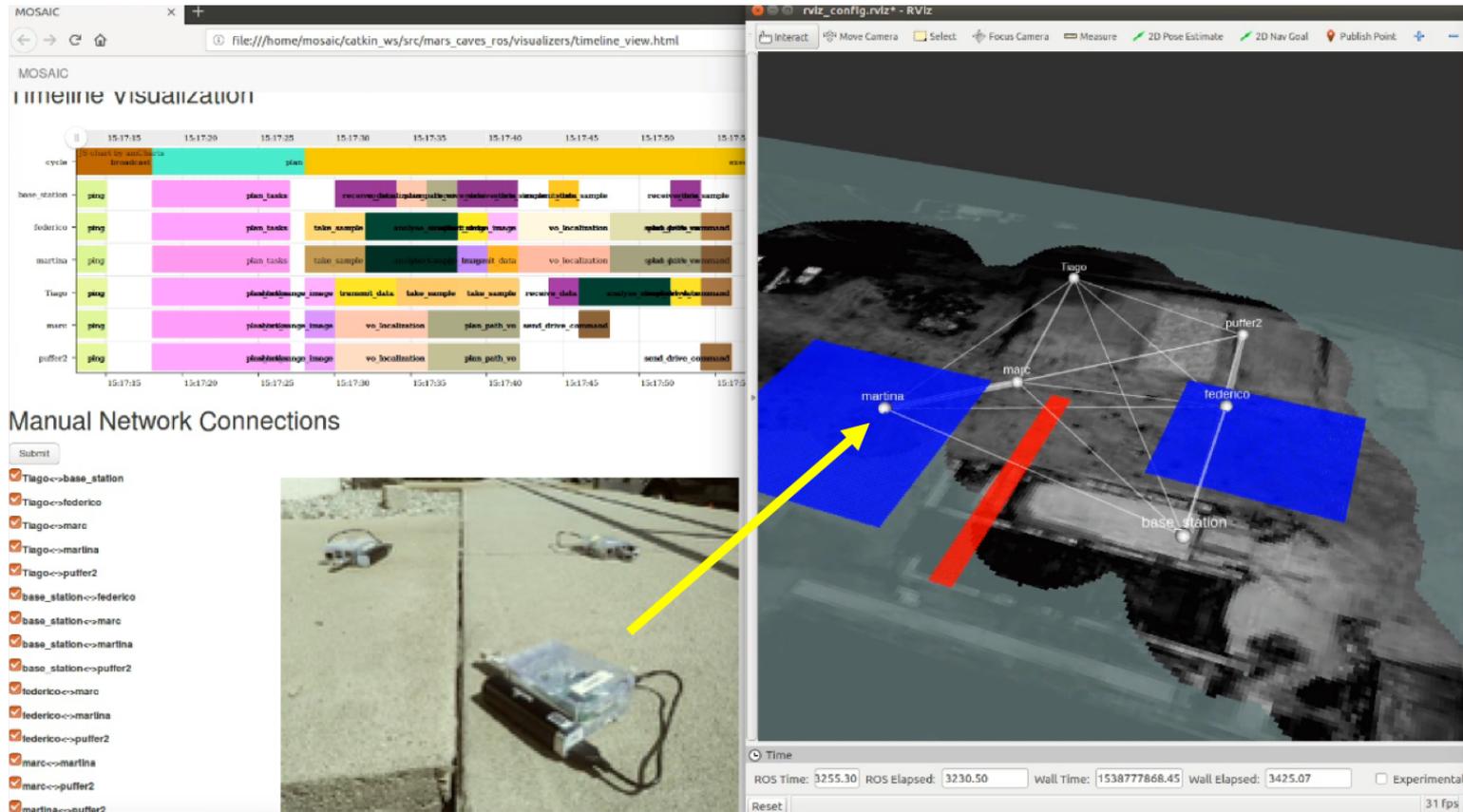
# Example Solution

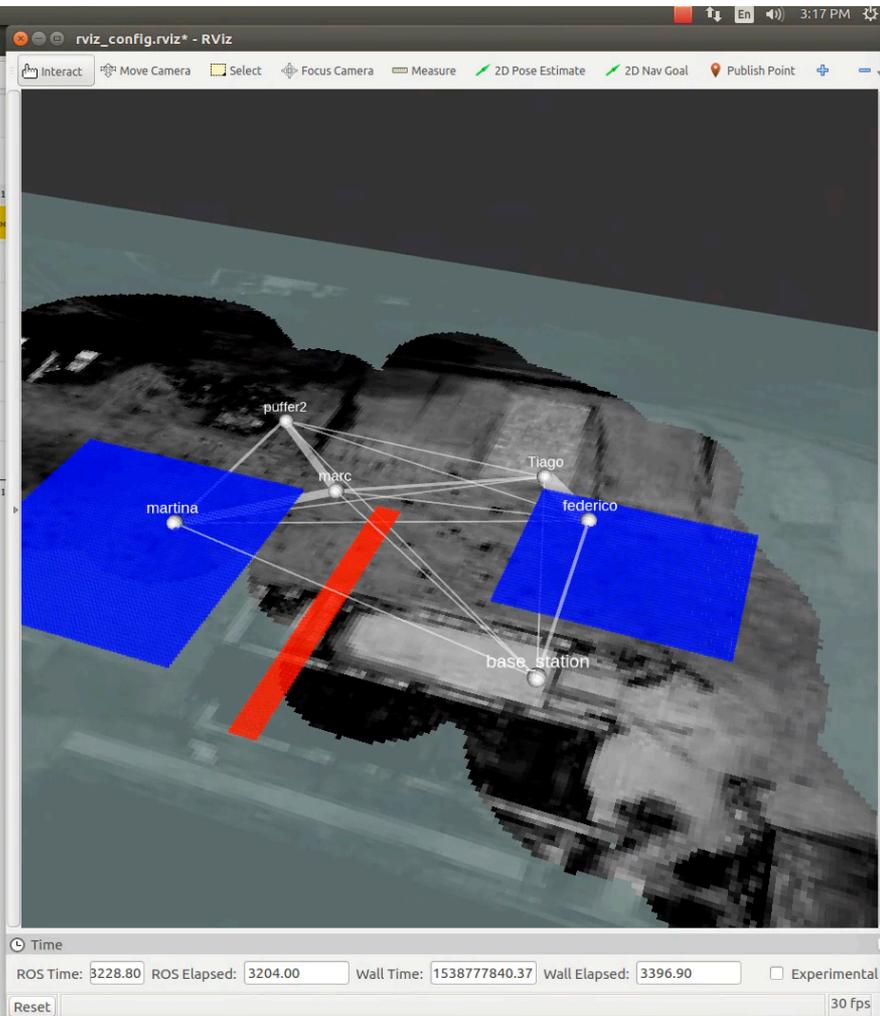
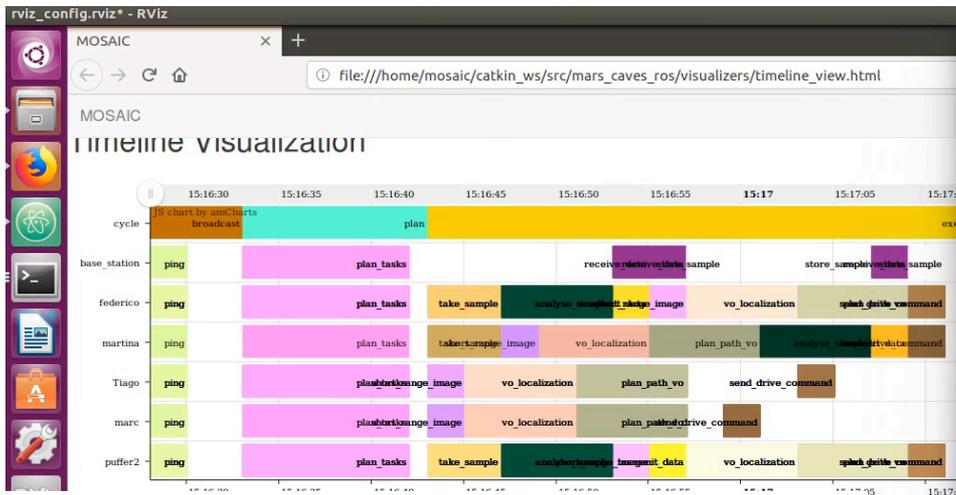
## Data Mule



# Field Tests (Video Preview)

## Fully Distributed Systems





System operated for 3 hours

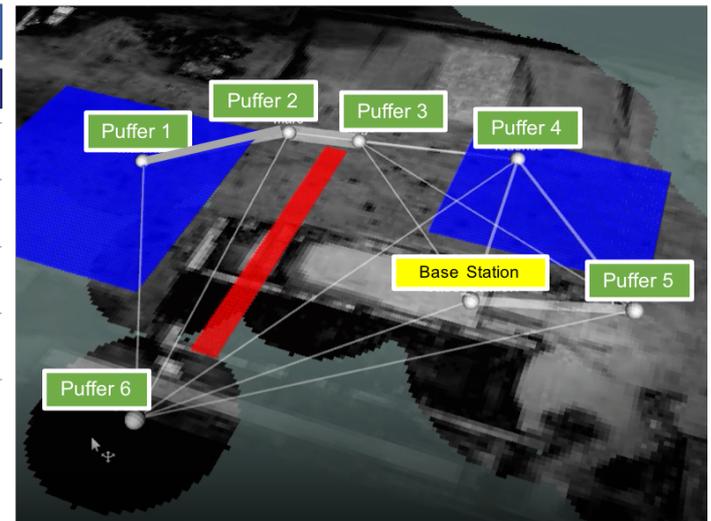
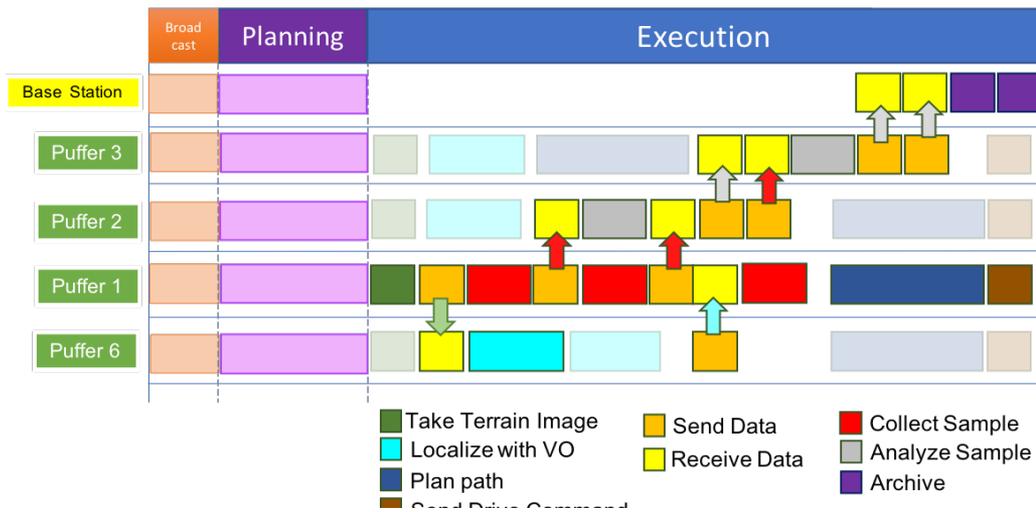
Example code / solutions at:

<https://github.com/nasa/mosaic>

Please stop by the demo this evening to see this live!

- Session B, Desk 9

# Field Tests (Callout)



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# Bottom Line

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Showed

- Emergent data mules, assembly lines in distributed system

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- Session B, Desk 9



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[jpl.nasa.gov](https://jpl.nasa.gov)

# Backup

## High Performance Spaceflight Computing

Trim Video to  
about 13s

- Rad-Hard “Laptop like” performance going forward
- Other indicators: MarCO, Mars Heli
- Scalable computing / power requirements

Image from  
GCD slides

<https://ntrs.nasa.gov/archive/nasa/casi.ntrs.nasa.gov/20180007636.pdf>