

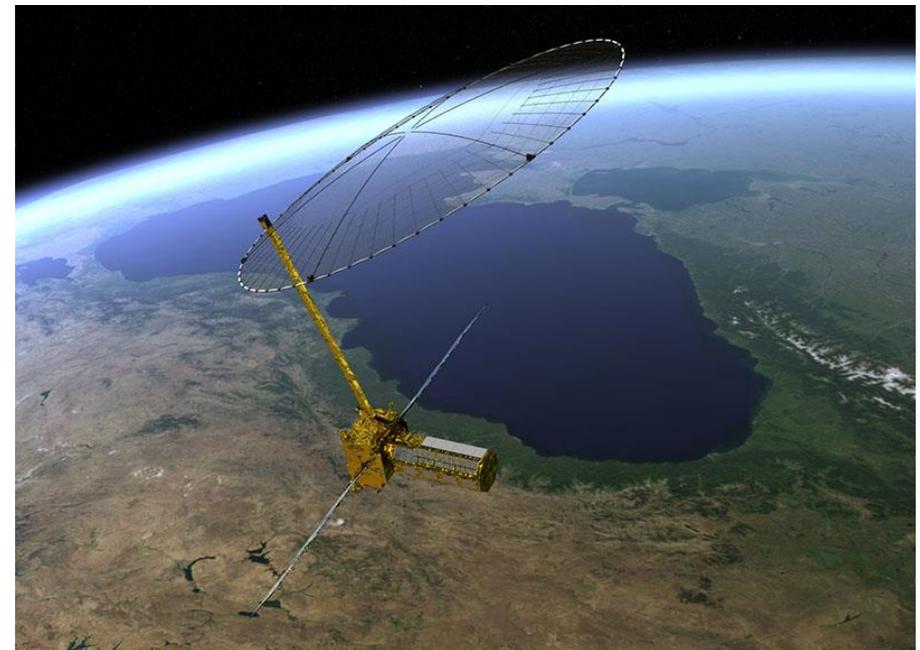


10<sup>TH</sup> INTERNATIONAL WORKSHOP  
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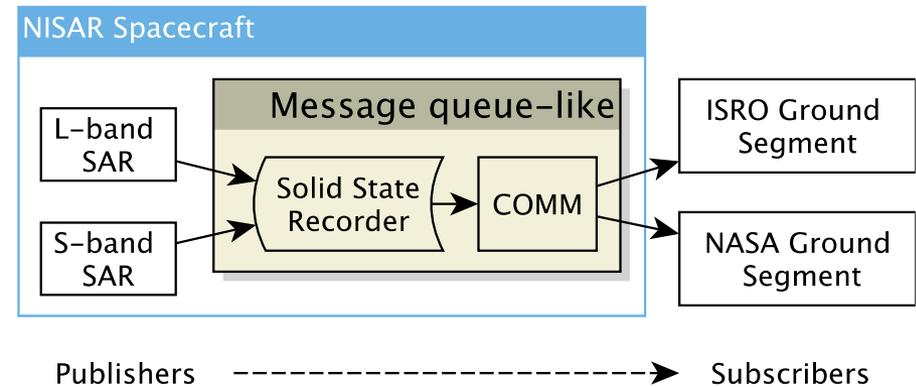
## **Intermediate Fidelity Solid State Recorder Modeling for NISAR**

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- NISAR: NASA-ISRO Synthetic Aperture Radar (SAR) mission
- Science Focus: solid Earth land mass, ice masses and ecosystems
- 747 km Low Earth Orbit
- Three year mission
- Two independent SAR payloads on spacecraft
  - L-band: NASA
  - S-band: ISRO
  - Active jointly or separately
- ISRO bus, operated by ISRO

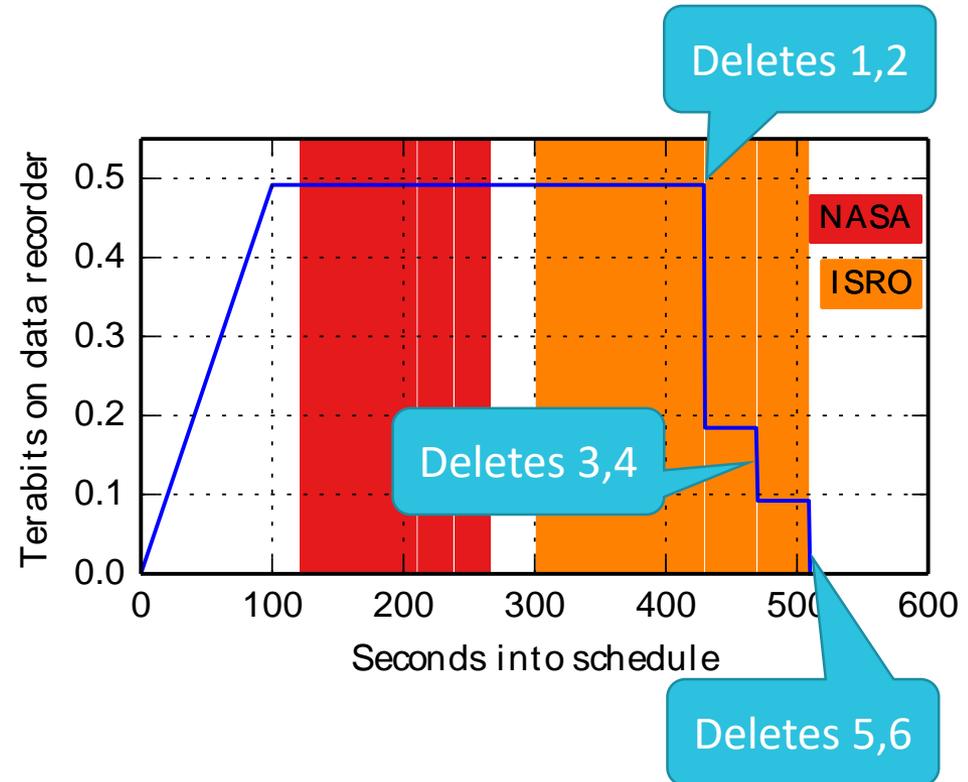


- Data buffered to an on-board recorder before transmission to ground
- ISRO and NASA ground segments are not federated
  - Variable routing polices for data – NASA, ISRO or both
  - Deletes deferred until after playback to the all destinations
- Cannot play back S-band and L-band files at the same time
  - Difficult to predict when a file will be played back
- Two playback priorities (urgent, non-urgent) with preemption



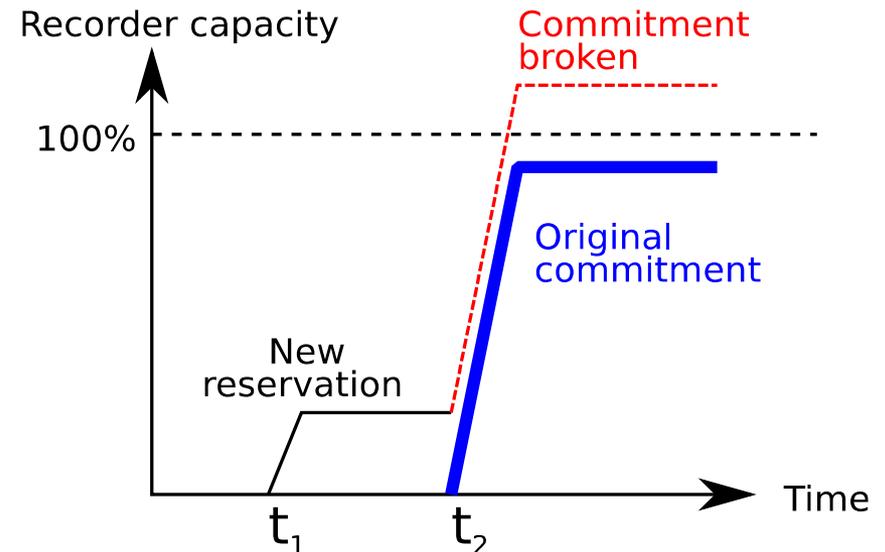
# Discrete File Deletion Example

- 0-100 seconds: 6 files recorded concurrently
- 120-270 seconds: Concurrent playbacks to NASA
  - Cannot delete yet – must also play back to ISRO
- Concurrent playbacks to ISRO
  - 425 seconds: First file deleted
  - 460 seconds: Second file deleted
  - 510 seconds: Third file deleted



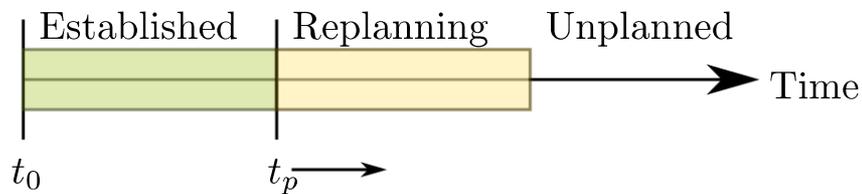
Prior work	How NISAR's needs are different
<p>Piecewise linear integrals in ASPEN Eagle Eye (Knight, Donnellan and Green, 2013) and CLASP (Knight and Hu, 2009).</p>	<p>A free is long and slow – each bit freed as it is played back. NISAR has deferred, instantaneous free events.</p>
<p>Forward dispatch greedy playback scheduling for Mars Express (Cesta et al. 2002)</p> <p>Linear programming solution for playback schedule generation on Mars Express (Righini and Tresoldi 2010)</p>	<p>Mars Express planners choose which buffer to drain when, but cannot change the observation schedule. NISAR planners can change the observation schedule, but not the playback rules.</p>
<p>Discrete fill/drain reservations in Rosetta's max flow model (Rabideau et al. 2016)</p>	<p>Same as Mars Express: NISAR's observation schedule is flexible, but playback policies are fixed behavior.</p>
<p>Soil Moisture Active/Passive (Choi, 2012; Deems, Swan and Weiss, 2012)</p>	<p>SMAP files deleted by ground operators; NISAR autonomously deletes. SMAP has simpler, greedy observation scheduling.</p>

- Insufficient to only consider recorder state at  $t_1$
- Must propagate changes forward (or capacity backward) to check feasibility of a reservation
- Similarly, propagate drain activities (playbacks) for future capacity



# Intermediate Fidelity Recorder Model: Advancing Frontier Forward Dispatch Scheduler

- Use the observation schedule from the piecewise linear model as a starting point
- Simulate execution of the NISAR solid state recorder as a forward dispatch scheduler
- Incremental: place a reservation, retract future playbacks to  $t_p$ , re-simulate future playbacks, evaluate feasibility



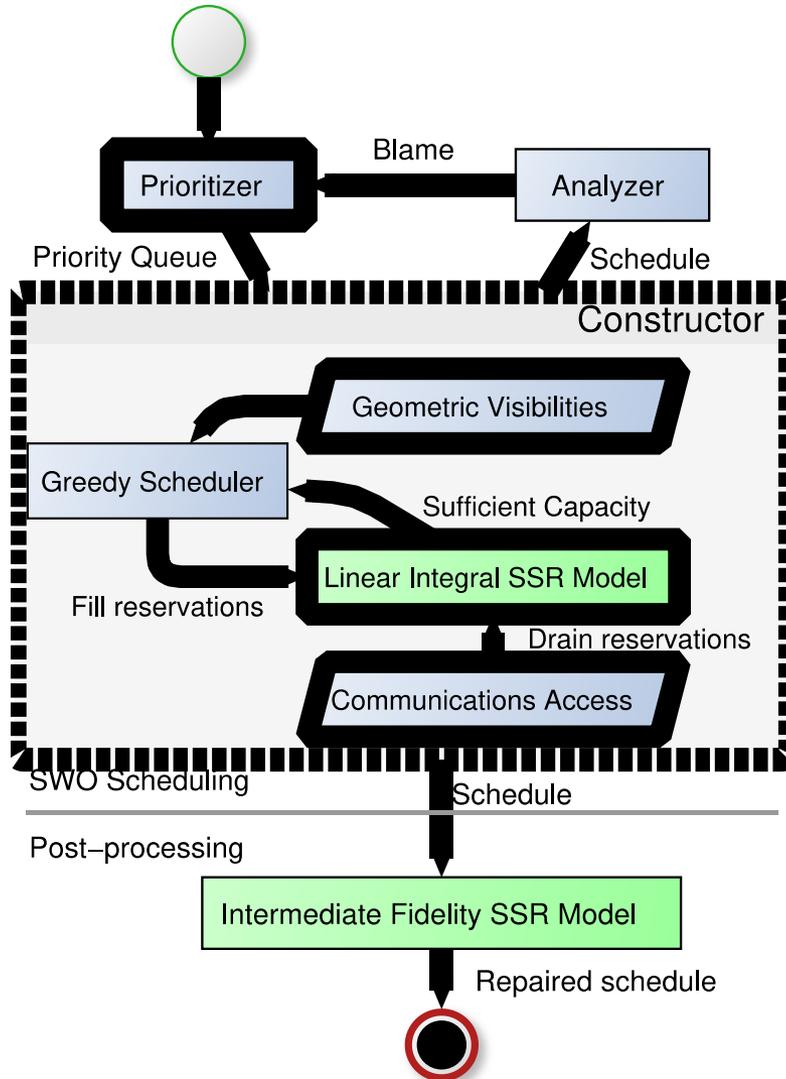
## Algorithm 1 Forward dispatch playback scheduling

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 $O \leftarrow \text{SORT}(\text{Observations, by time, ascending})$ 
 $t_r \leftarrow t_0$  ▷ Failure rollback limit
 $failed, success \leftarrow \emptyset$ 
for all  $o \in O$  do
     $t_p \leftarrow t_f$  ▷ Propagation start
     $r \leftarrow \text{AGGREGATESIZE}(o)$ 
    if  $\text{RESERVE}(r)$  then ▷ Recorder reservation
         $journal \leftarrow \emptyset$ 
        for all  $c \in o.\text{channels}$  do
             $f \leftarrow \text{GETFILEOROPENNEW}(o, c)$ 
            if  $t_p > f.\text{start}$  then  $t_p \leftarrow f.\text{start}$ 
            end if
             $f.\text{append}(o, c)$ 
             $journal.\text{append}(f, o, c)$ 
        end for
         $\text{ROLLBACKTO}(t_p)$ 
        if  $\text{PROPAGATEDOWNLINKS}(t_p)$  then
             $success.\text{append}()$ 
             $t_r \leftarrow t_p$  ▷ Update failure rollback limit
        else
             $failed.\text{append}(o)$ 
             $\text{ROLLBACK}(journal)$ 
             $\text{ROLLBACKTO}(t_r)$ 
             $\text{PROPAGATEDOWNLINKS}(t_r)$ 
        end if
    else
         $failed.\text{append}(o)$ 
    end if
end for

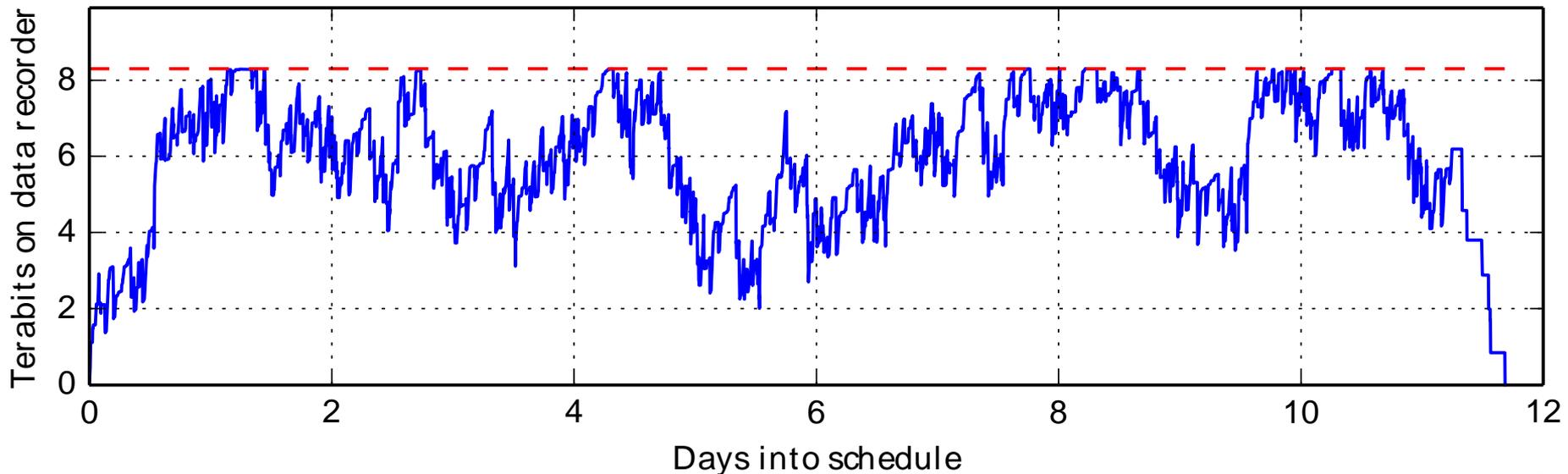
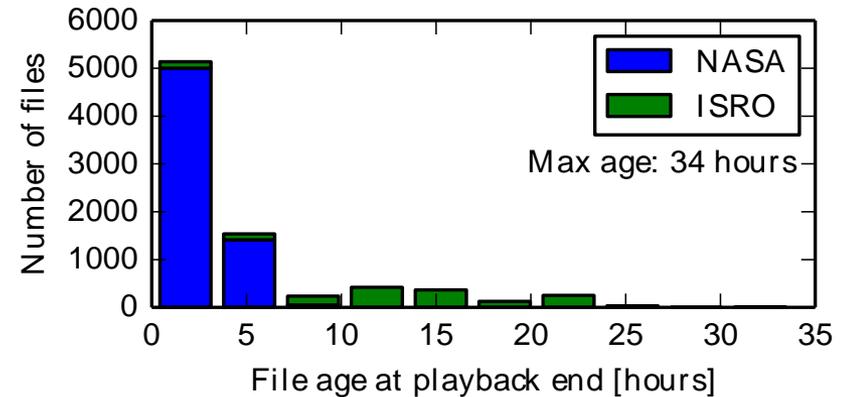
```

# Experiment: How significant are deferred delete effects?

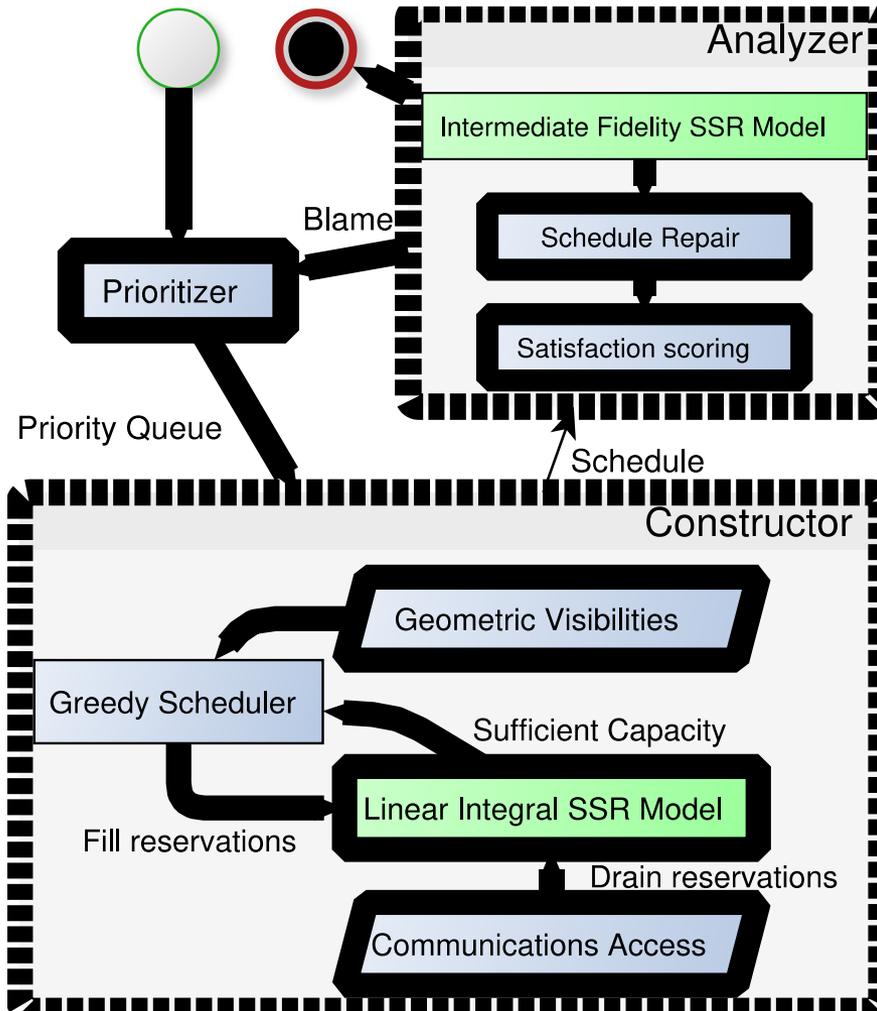


- Produce a schedule using Squeaky Wheel Optimization (Joslin and Clements 1999)
- Schedule in priority order, within geometric visibilities, when sufficient recorder capacity exists (linear integral model)
- Insufficient recorder capacity is a form of schedule saturation; observations that fail to schedule get a priority increase (blame)
- Repair final schedule by removing observations that exceed capacity in the intermediate model
- If repairs are needed, deferred deletes are significant

- Schedule repairs were needed (repaired version below)
- 3.87% (151 of 3902) observations in a 12 day simulation would have exceeded capacity
- Longest file lifespan: 34 hours



# When to use the Intermediate Fidelity Model



- Replanning near the frontier makes the intermediate fidelity model slow
- We chose forward dispatch because it has  $O(n)$  complexity
- Anytime scheduling would have been  $O(n^2)$
- Wrapping anytime scheduling in a loop over multiple opportunities could be  $O(n^4)$
- Recommendation: Use the intermediate fidelity model no more than once per squeaky wheel iteration (in analyzer), in a forward-dispatch manner.

- Consider alternative repair actions
  - Split a file if the fragment could be played/deleted sooner
  - Consider a lower-data rate mode when the recorder is near capacity
- Implement the Rosetta max-flow file model (Rabideau et al. 2016) as a compromise between the linear integral model and the intermediate fidelity model
  - Files reserve their entire space instantaneously
  - File reservations are automatically freed at the last possible final playback end time, assuming no preemption
  - Has the speed of the piecewise linear model with the deferred deletion effects of the intermediate fidelity model
  - Source: one of our paper's anonymous reviewers
- Consider applying a configuration space to the linear integral model's capacity so that its schedules do not require a repair by the intermediate fidelity model

- Discrete deletion effects are non-negligible: treating the recorder as a continuous drain device can produce infeasible schedules
- Intermediate fidelity model is too slow for use in every observation scheduling decision, but fast enough to evaluate a schedule once per squeaky wheel iteration
- Applying a configuration space the linear integral model or replacing it with a worst case file lifespan reservation may be sufficient to keep the output schedules feasible



## Acknowledgements

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- The authors would like to thank the reviewers for their constructive feedback.





**Questions?**

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## Backup

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- Downlink propagation algorithm
- References

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## Algorithm 2 Propagating downlinks

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function PROPAGATEDOWNLINKS( $t_p$ )
  for all  $g \in$  ground segments do
     $t \leftarrow t_p$ 
     $W \leftarrow$  GATHERDOWNLINKS( $g, t_p$ )
    repeat
       $W \leftarrow W.intersectWith(t, W.end)$ 
       $f \leftarrow g.queue.front()$   $\triangleright$  Next file
       $t \leftarrow$  FINDNEXTSTART( $g, t, f, W$ )
       $finished, t_{end} \leftarrow$  PLAY( $g, t, f, W$ )
      if  $finished$  then
         $g.queue.pop()$ 
        if PLAYEDTOALLRECIPIENTS( $f$ ) then
           $recorder.unreserve(f.size, t_{end})$ 
        end if
      end if
    until  $g.queue$  empty or  $W$  empty or  $t \geq t_f$ 
  end for
  return  $recorder.hasNoViolations()$ 
end function

```

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- Returning false means that there is still a data recorder oversubscription that was not corrected by propagating all downlinks at or after  $t_p$

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