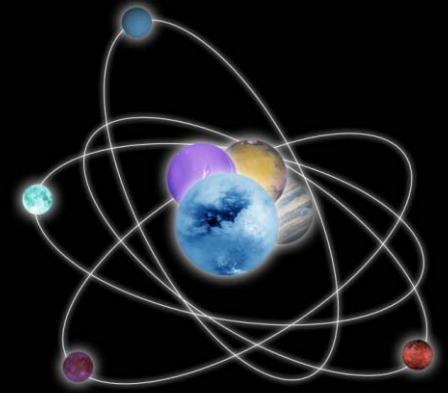




Exoplanet Characterisation Observatory



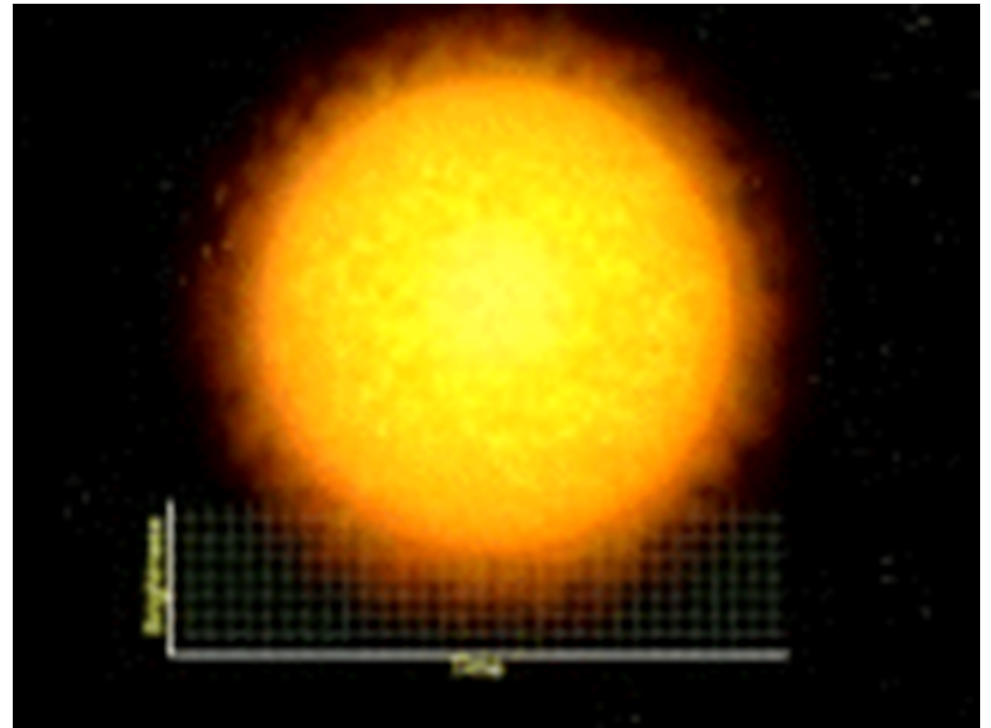
Artificial Intelligence for the EChO Mission Scheduler

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Introduction

- Exoplanet Characterisation Observatory (EChO)
 - ESA M3 mission candidate
 - Currently assessed for an expected launch in 2022
 - It could be the first dedicated mission to investigate the physics and chemistry of Exoplanetary Atmospheres
 - The primary objective is to study the atmospheres of a representative sample of exoplanets (>200) by using the differential technique of transit spectroscopy

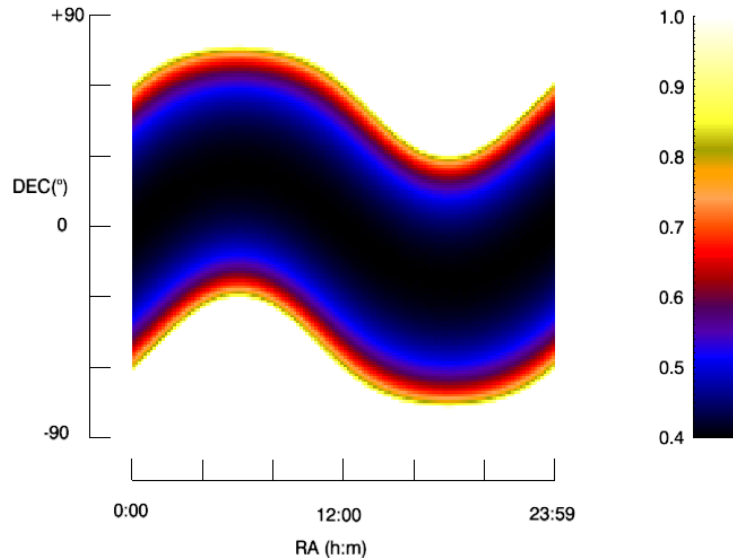


EChO Operation Tasks

- The EChO mission will have to deal with a variety of observation patterns:
 - **Science observations** are the observations of target objects.
 - **Downlink** communication is used for transferring data from the spacecraft to stations on Earth.
 - **Station keeping** operations are defined to keep the spacecraft in the assigned orbit.
 - **Calibration** tasks are associated to science observations.
- Several operation tasks have to be done in fixed slots of time and they involve a temporary stop of the scientific operations

EChO Hard Constraints (I)

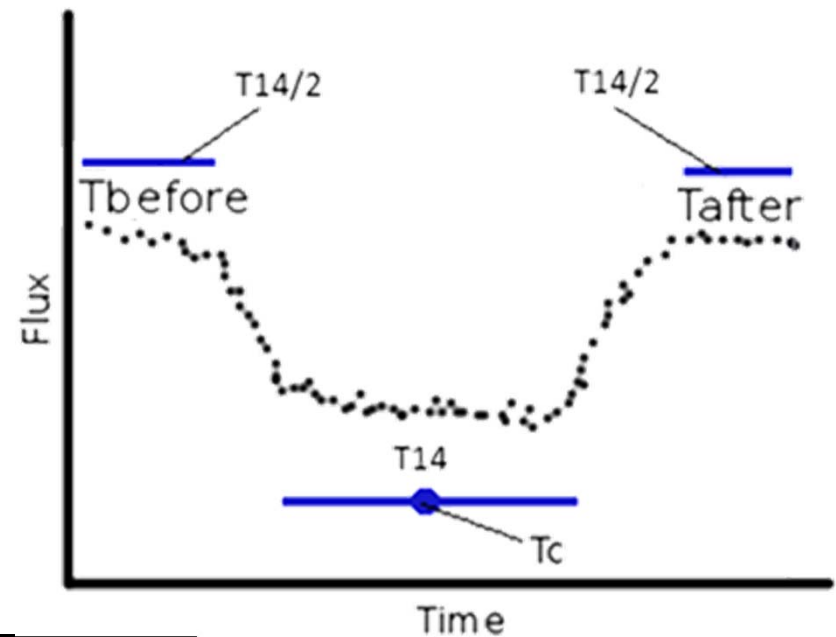
○ Orbital Constraint



○ Transit Constraint (event)

- Event occurrence known (T_c)
- The event duration is known (T_{14})
- Total observation time:

$$T_{14} + T_{\text{before}} + T_{\text{after}} = 2 \cdot T_{14}$$



EChO Hard Constraints (II)

○ Target Completeness Constraint

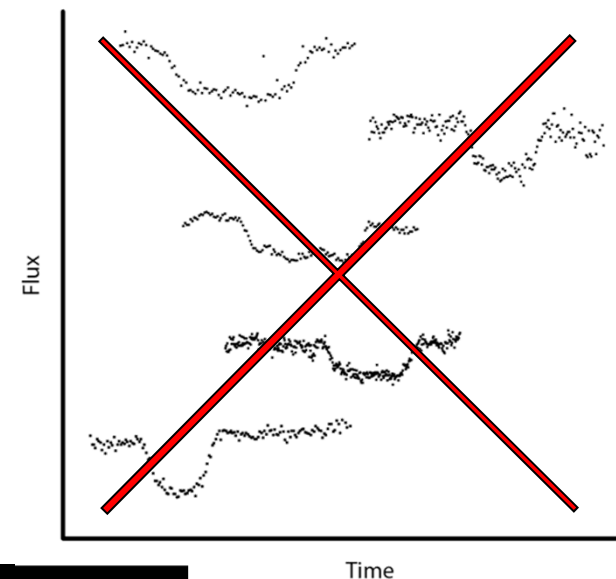
- Each target has to be observed a required number of events
 - Targets observed less than an 80% are not interesting

○ Slewing Constraint

- Pointing to a particular target and acquiring data requires a specific configuration which depends on the slewing speed of the satellite

○ Overlapping Constraint

- Collisions between operation tasks must be solved



EChO Soft Constraints

○ Optimization of Resources

- Observation time of the telescope should be promoted
- Slew time of the telescope should be reduced

○ Scientific Return

- Observation of the priority targets should be promoted
- The observation of complete targets should be promoted

EChO Soft Constraints

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- Observation time of the telescope should be promoted
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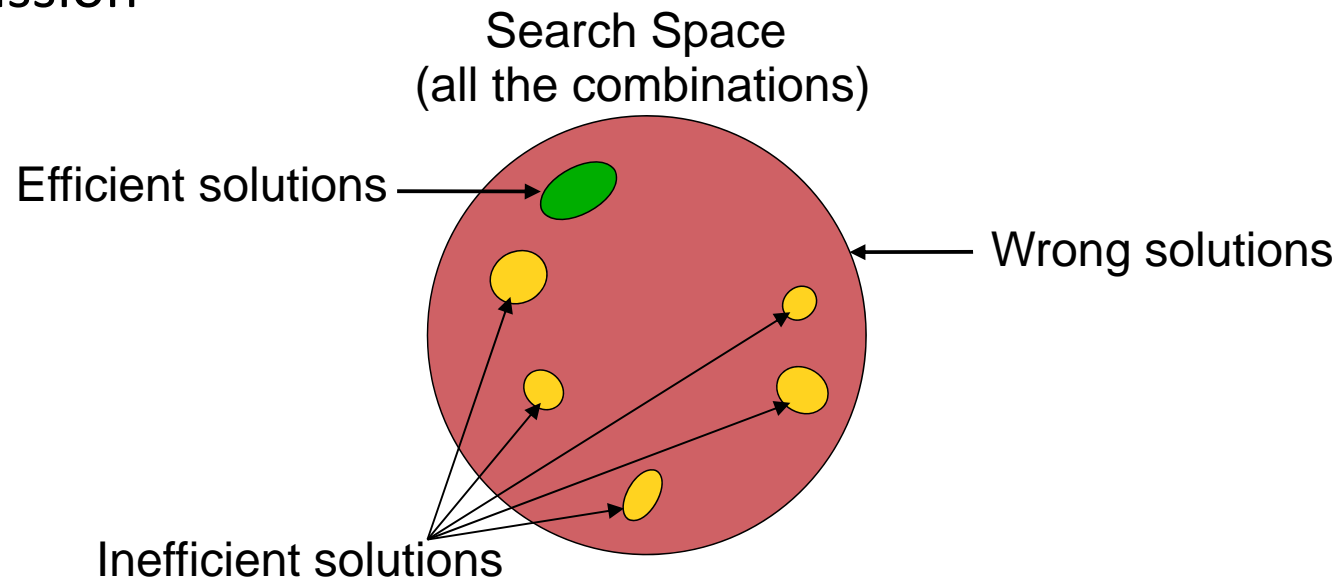
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Mission Objectives

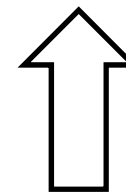
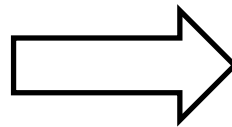
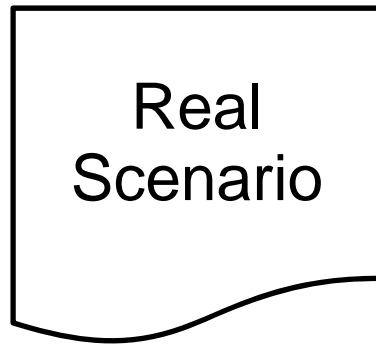
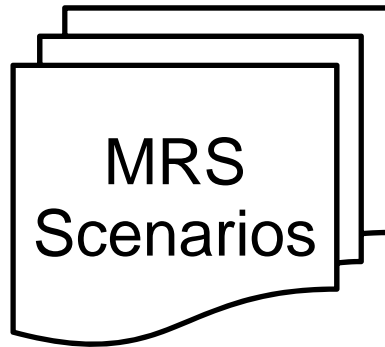
Long Term Mission Planning Tool (LT-MPT)

- Collection of time-critical events for five years of EChO:
 - 200 targets
 - 30 events (observations) per target (average value)
 - Each target can be observed in 500 different windows (average)
 - Number of combinations: $(200 \cdot 25)^{500} \sim 10^{1800}$
- What is an “efficient solution”?
 - A planning solution that highly optimizes the objectives defined in the mission

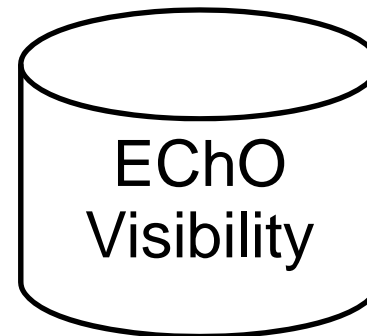


LT-MPT Input

238 targets (≈ 6000 events)

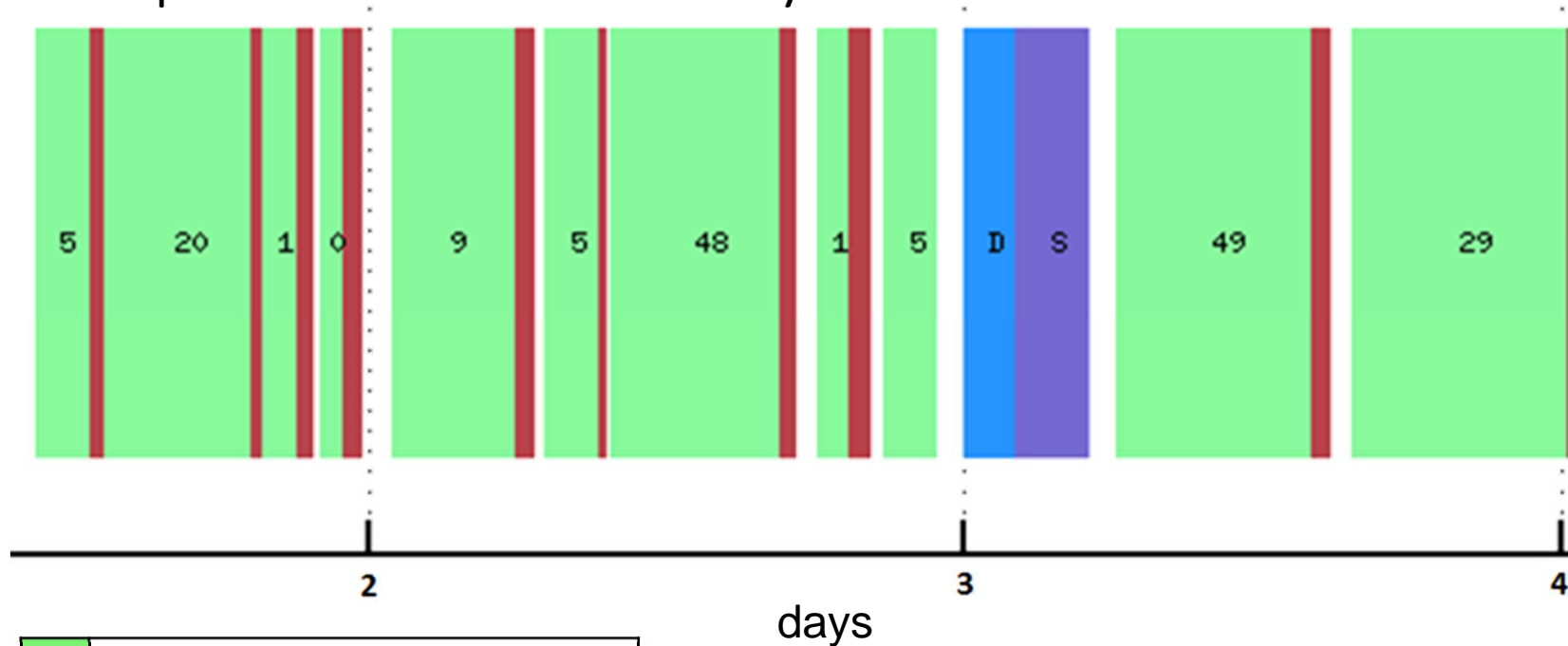


122 targets (≈ 2820 events)



LT-MPT Output

- Long Term Mission Plan (LTMP)
 - Example of a LTMP of a few days



Green	Observation of a target
Red	Slewing between targets
Blue	Downlink
Purple	Station Keeping
White	Gap

LT-MPT Objectives

- Maximize planning efficiency (observing time)
- Maximize scientific return (i.e., the number of completed targets)
 - It is computed with the number of completed targets weighted according the target priority

LT-MPT Design

o Process:

- **Step 0.** Calculate the time windows of each target event
- **Step 1.** Clean up impossible targets
- **Step 2.** Insert downlinks and station keepings minimizing potential conflicts with priority targets
- **Step 3.** Obtain observation planning avoiding overlaps and optimizing the defined objectives
- **Step 4.** Remove observations of incomplete targets (targets observed less than an 80% of their required number of events)
- **Step 5.** Fill gaps with calibrations or new observations

LT-MPT Design

o Process:

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Representation of a LTMP

o Example (3 targets)

Targets to Be Planned																																
<table border="1" style="width: 100%; border-collapse: collapse;"> <thead> <tr> <th colspan="2">Target 1</th> </tr> </thead> <tbody> <tr> <td colspan="2">Number of events: 2</td> </tr> <tr> <td colspan="2">Potential time windows:</td> </tr> <tr> <td style="width: 5%; text-align: center;">1</td> <td>1/3/22 20:53, 1/3 21:48</td> </tr> <tr> <td style="text-align: center;">2</td> <td>5/8/22 07:43, 5/8 08:25</td> </tr> <tr> <td style="text-align: center;">3</td> <td>7/9/22 12:05, 7/9 12:36</td> </tr> </tbody> </table>	Target 1		Number of events: 2		Potential time windows:		1	1/3/22 20:53, 1/3 21:48	2	5/8/22 07:43, 5/8 08:25	3	7/9/22 12:05, 7/9 12:36	<table border="1" style="width: 100%; border-collapse: collapse;"> <thead> <tr> <th colspan="2">Target 2</th> </tr> </thead> <tbody> <tr> <td colspan="2">Number of events: 1</td> </tr> <tr> <td colspan="2">Potential time windows:</td> </tr> <tr> <td style="width: 5%; text-align: center;">1</td> <td>6/2/22 10:26, 1/3 11:04</td> </tr> <tr> <td style="text-align: center;">2</td> <td>7/7/22 20:52, 7/7 21:43</td> </tr> </tbody> </table>	Target 2		Number of events: 1		Potential time windows:		1	6/2/22 10:26, 1/3 11:04	2	7/7/22 20:52, 7/7 21:43	<table border="1" style="width: 100%; border-collapse: collapse;"> <thead> <tr> <th colspan="2">Target 3</th> </tr> </thead> <tbody> <tr> <td colspan="2">Number of events: 1</td> </tr> <tr> <td colspan="2">Potential time windows:</td> </tr> <tr> <td style="width: 5%; text-align: center;">1</td> <td>6/2/22 10:26, 1/3 11:04</td> </tr> </tbody> </table>	Target 3		Number of events: 1		Potential time windows:		1	6/2/22 10:26, 1/3 11:04
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Individual Representation of a Potential Solution					
		1	2	3	4
Solution		3	1	1	-1
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3	7/9/22 12:05, 7/9 12:36	3	7/9/22 12:05, 7/9 12:36	3	

Not assigned

Optimizing the LTMP

- Observations of the targets are planned



- Slew time must be placed for each planned observation



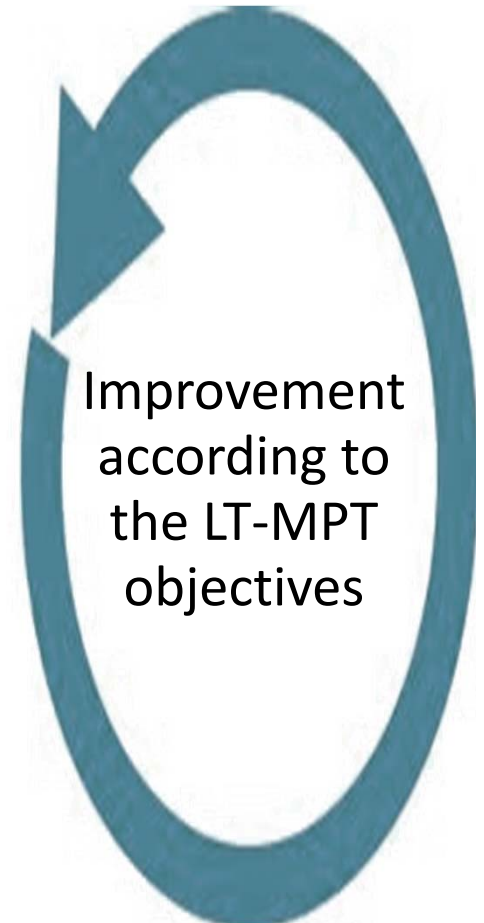
- Conflicts among observations must be removed



- Potential solution (hard constraints are respected)



- Improvement of the LTMP (additional observations can be planned)



Optimizing the LTMP

- Observations of the targets are planned



- Slew time must be placed for each planned observation



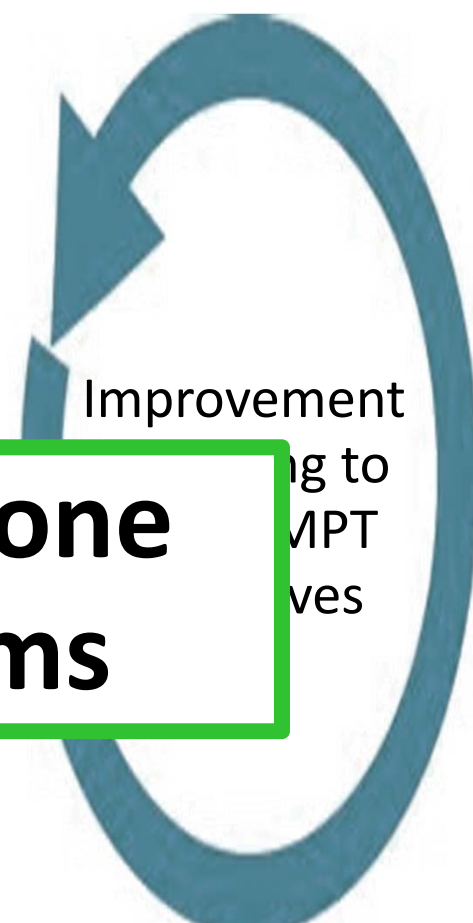
- Con

Optimization process done with Genetic Algorithms

- Potential solution (hard constraints are respected)



- Improvement of the LTMP (additional observations can be planned)



Test Bench Configuration

- 10 MRS scenarios and 1 real sample scenario
 - MRS: 238 targets (\approx 6000 events)
 - Real: 122 targets (\approx 2820 events)
 - Executed 100 times with different random seeds
- Long Term Mission Plan (five years, 2022-2026)
- 520 Downlinks (2 hours / 3.5 days \pm flexibility)
- 65 Station Keepings (8 hours / 28 days \pm flexibility)
- Slew time between targets
 - Slew speed of 45 degrees per 10 minutes plus a flat 5-minute overhead
- No calibrations considered

Result Summary

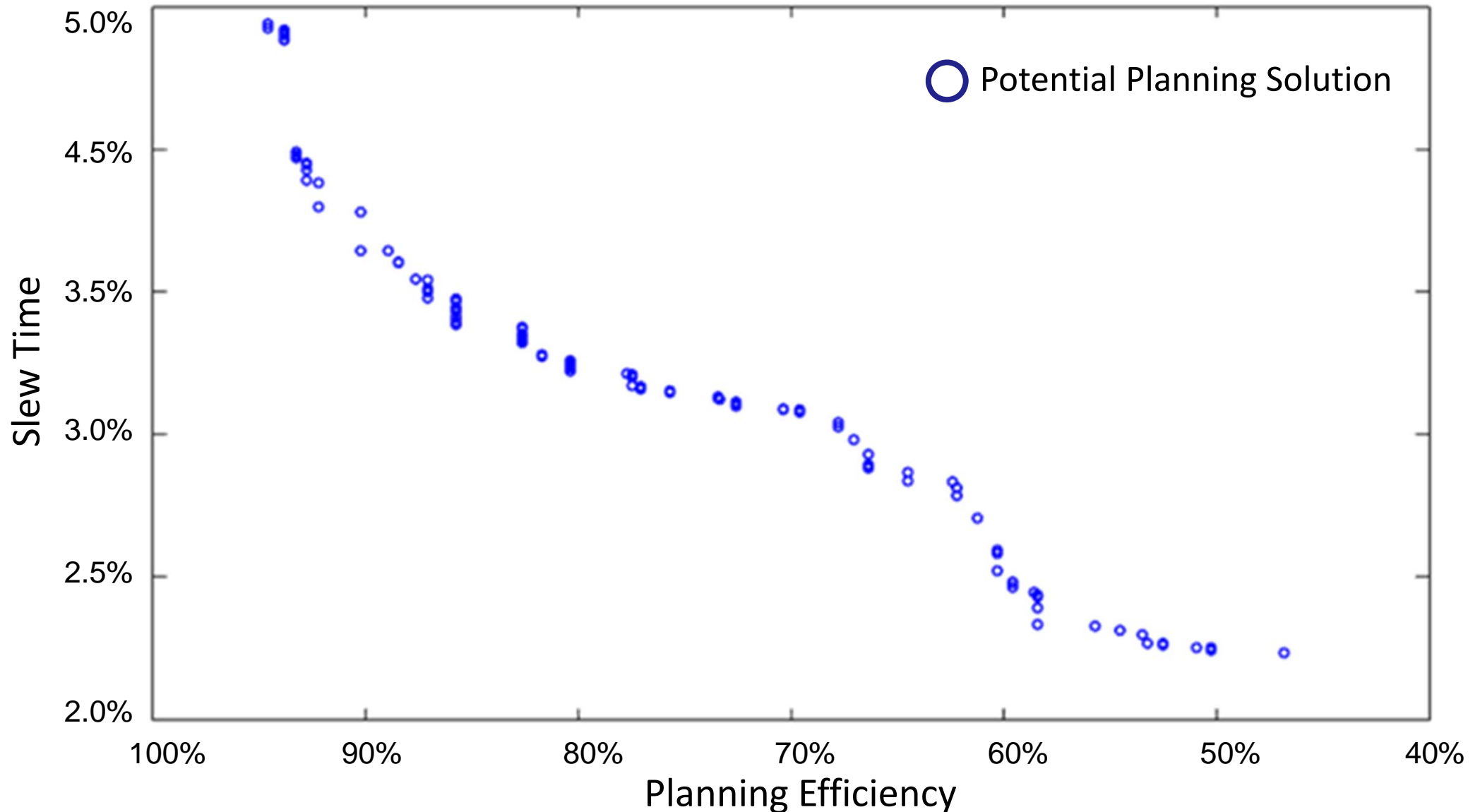
- MRS Scenarios and Real Scenario (computational cost \approx 45 minutes *)
 - 100 trials for each scenario
 - Usable Science Time: 31671 hours

Scenario	Total Input Time	Planning Efficiency	Slew Time	Events Planned	Targets Completed
MRS 0	27925 hours	85.21% \pm 0.98	4.86% \pm 0.04	91.69% \pm 0.54	95.84% \pm 0.34
MRS 1	25778 hours	92.02% \pm 0.74	4.66% \pm 0.04	95.09% \pm 0.60	97.75% \pm 0.37
MRS 2	26734 hours	83.73% \pm 0.90	4.58% \pm 0.06	88.98% \pm 0.78	96.75% \pm 0.25
MRS 3	29378 hours	76.77% \pm 1.47	4.58% \pm 0.11	82.76% \pm 1.36	94.06% \pm 0.64
MRS 4	26321 hours	90.93% \pm 0.94	4.86% \pm 0.04	94.01% \pm 0.64	97.93% \pm 0.40
MRS 5	27557 hours	84.98% \pm 1.32	4.66% \pm 0.07	89.65% \pm 1.03	96.67% \pm 0.32
MRS 6	26902 hours	87.41% \pm 0.92	4.62% \pm 0.02	93.04% \pm 0.35	96.95% \pm 0.35
MRS 7	25954 hours	87.56% \pm 0.83	4.53% \pm 0.03	92.81% \pm 0.36	96.85% \pm 0.36
MRS 8	24839 hours	91.83% \pm 0.98	4.71% \pm 0.05	94.91% \pm 0.59	98.56% \pm 0.21
MRS 9	26337 hours	87.72% \pm 1.40	4.83% \pm 0.07	91.81% \pm 1.12	97.63% \pm 0.43
Real	17392 hours	98.57% \pm 0.02	2.00% \pm 0.01	98.78% \pm 0.01	100.00% \pm 0.00

* CPU Intel® Core™2 Duo Processor E6600 2.40 GHz with 6GB of RAM

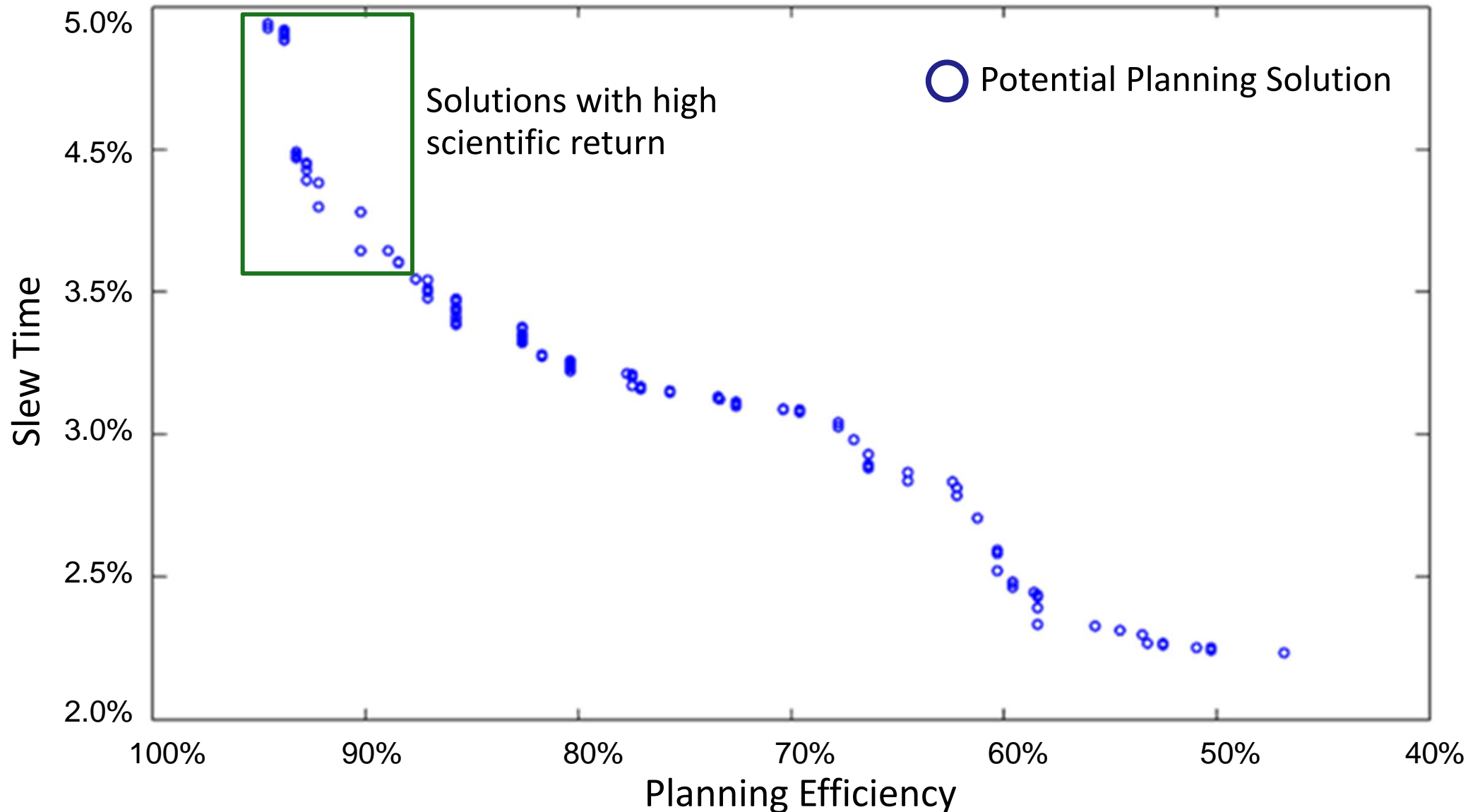
Why Slew Time Reduction Is Not Promoted?

- Multiobjective Genetic Algorithm (NSGA-II)



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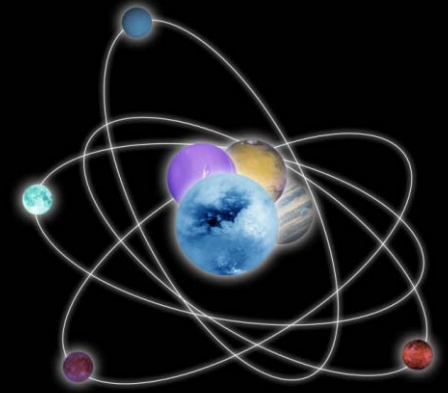


Summary

- Robust and stable planning tool
 - Similar results on different scenarios
 - High planning efficiency (around 90%)
 - Almost all the targets can be completed (observed >80% of events)
 - Reasonable computational cost
- Slew time cannot be reduced without affecting the efficiency
 - A multiobjective algorithm based on minimizing the slew time and maximizing the planning efficiency has been analyzed with no real gain
- Further work
 - Interactive visualization tool
 - How to generalize the planning tool for other missions?



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