

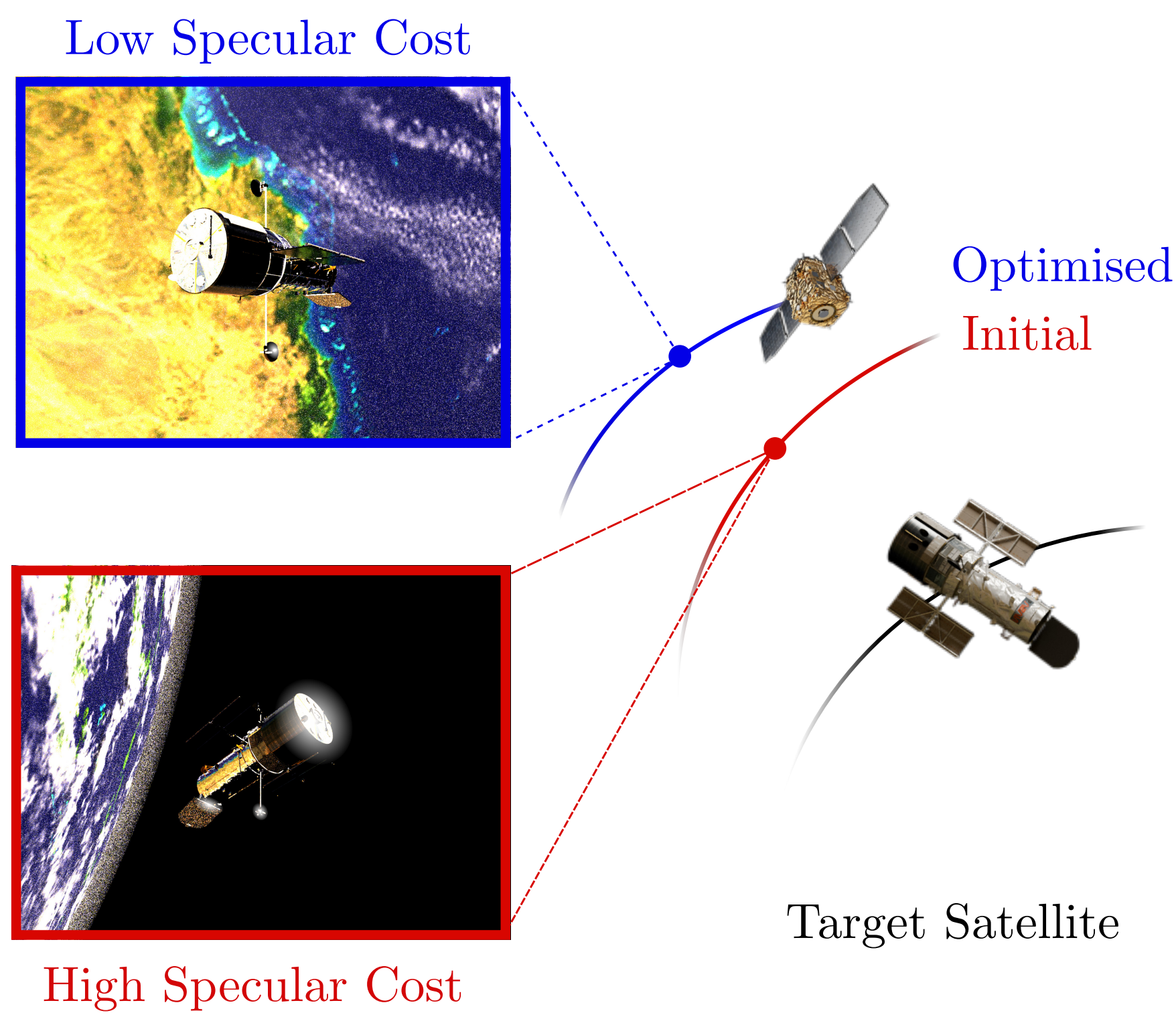
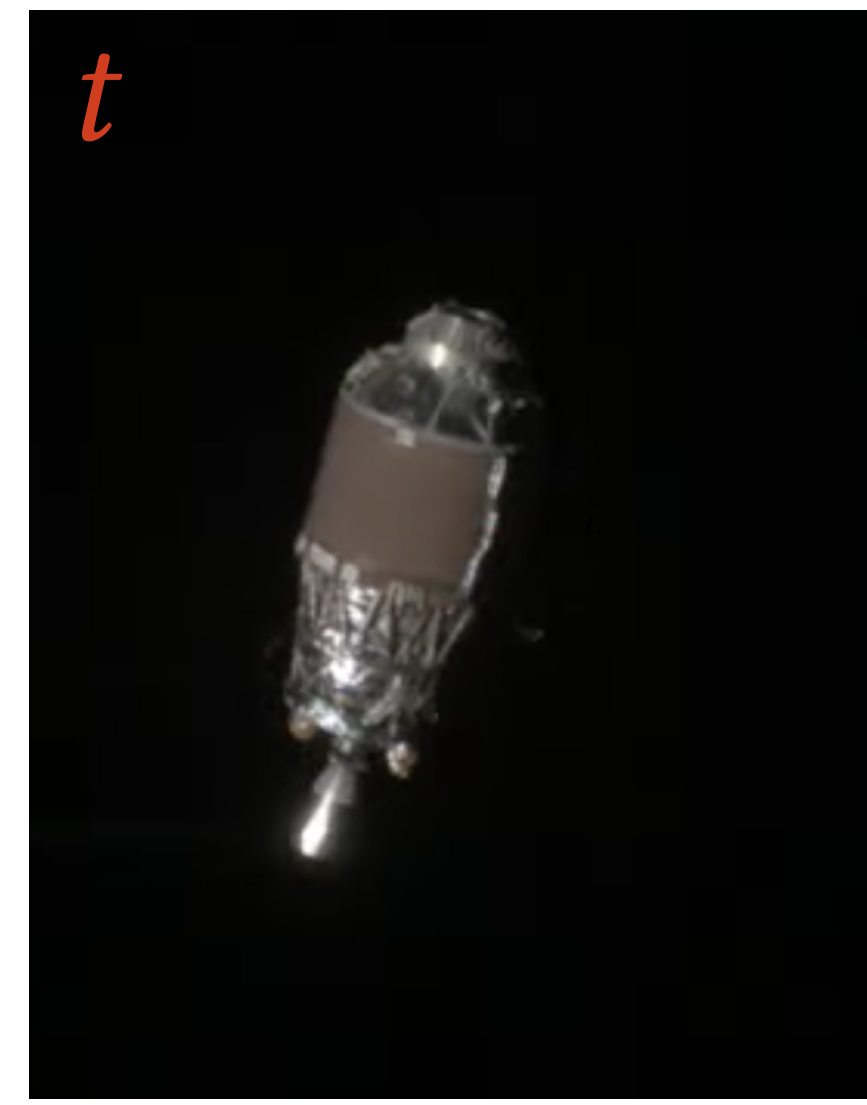
Towards Task-aware Trajectory Optimisation for Satellite Inspection via Differentiable Simulation

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Motivation & Contributions

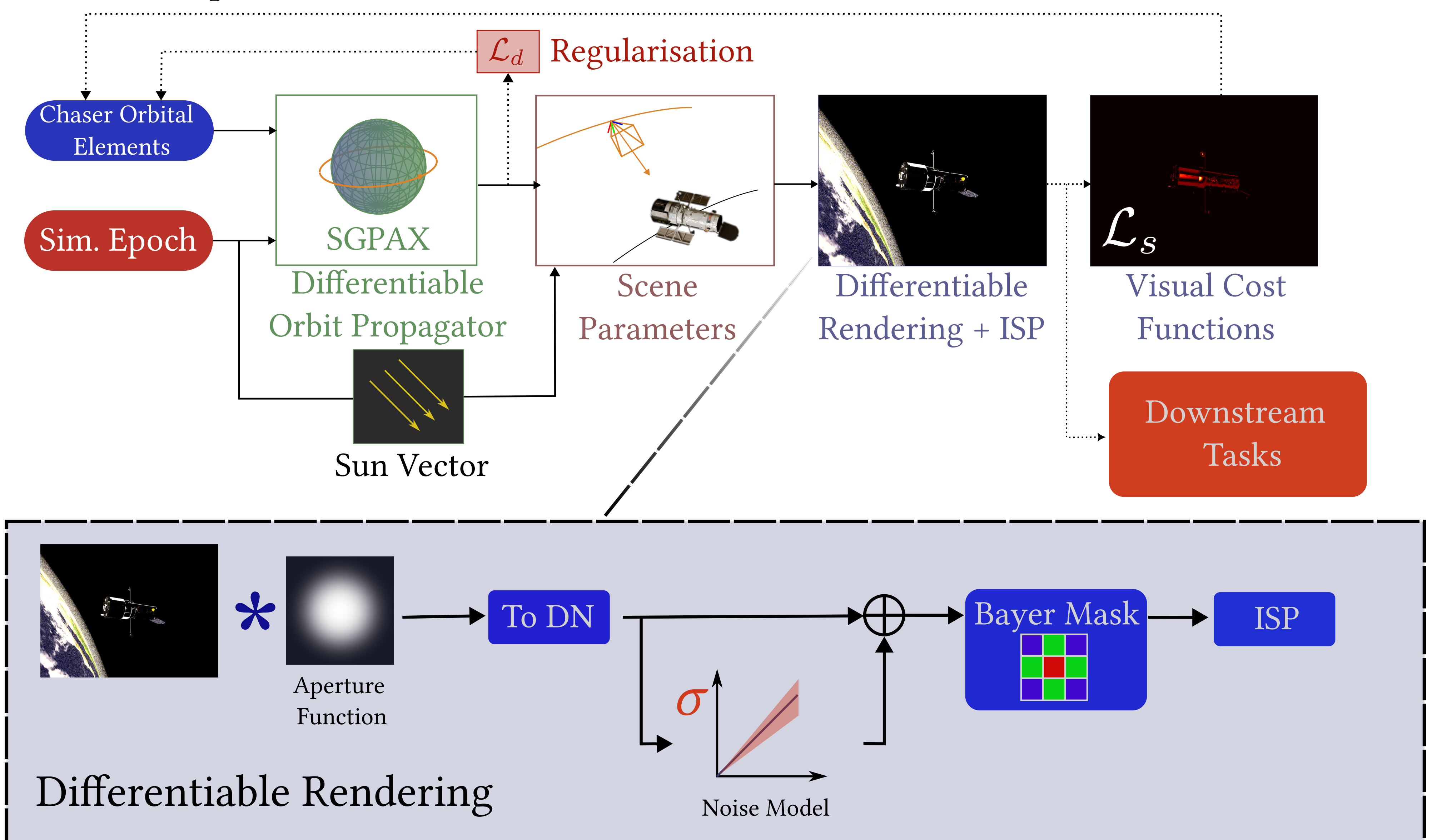
- On-orbit inspection is subject to challenging illumination conditions, e.g. high dynamic range, variable distances
- Reflections from the sun can saturate the sensor, substantially reducing information available to downstream tasks



- Optimising for trajectories that are **appearance-aware** can avoid visually challenging conditions in observations
- Optimising alongside downstream tasks (e.g. localisation, pose estimation) can yield informative new task-specific capabilities for proximity operations

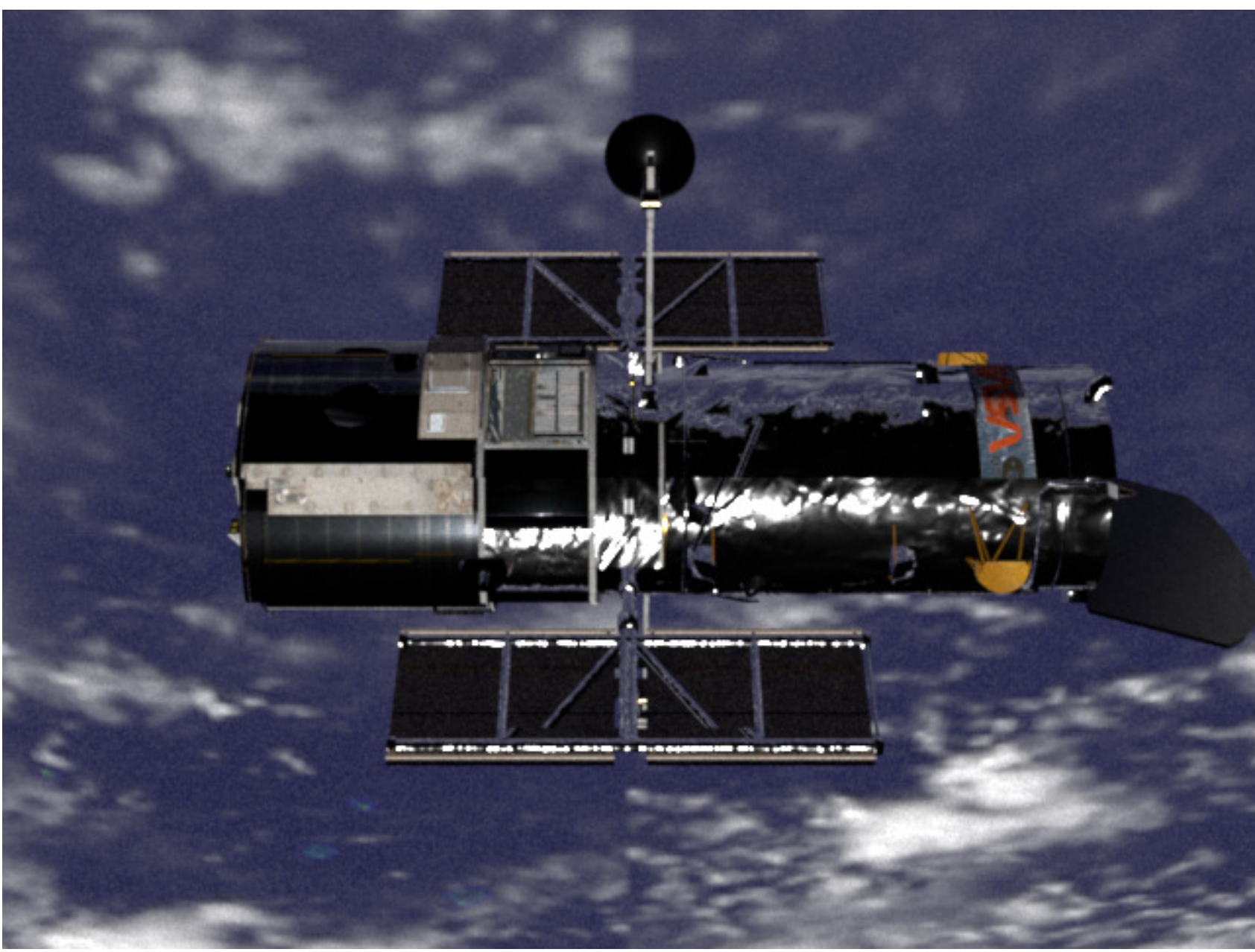
Methodology

- Formulate costs in the **image frame** or at **scene level**
- Flexible to sensing modality e.g. noise models, blur, camera models & types including infrared and polarisation



- Customisable blur kernels (incl. depth dependent) and image processing

Results



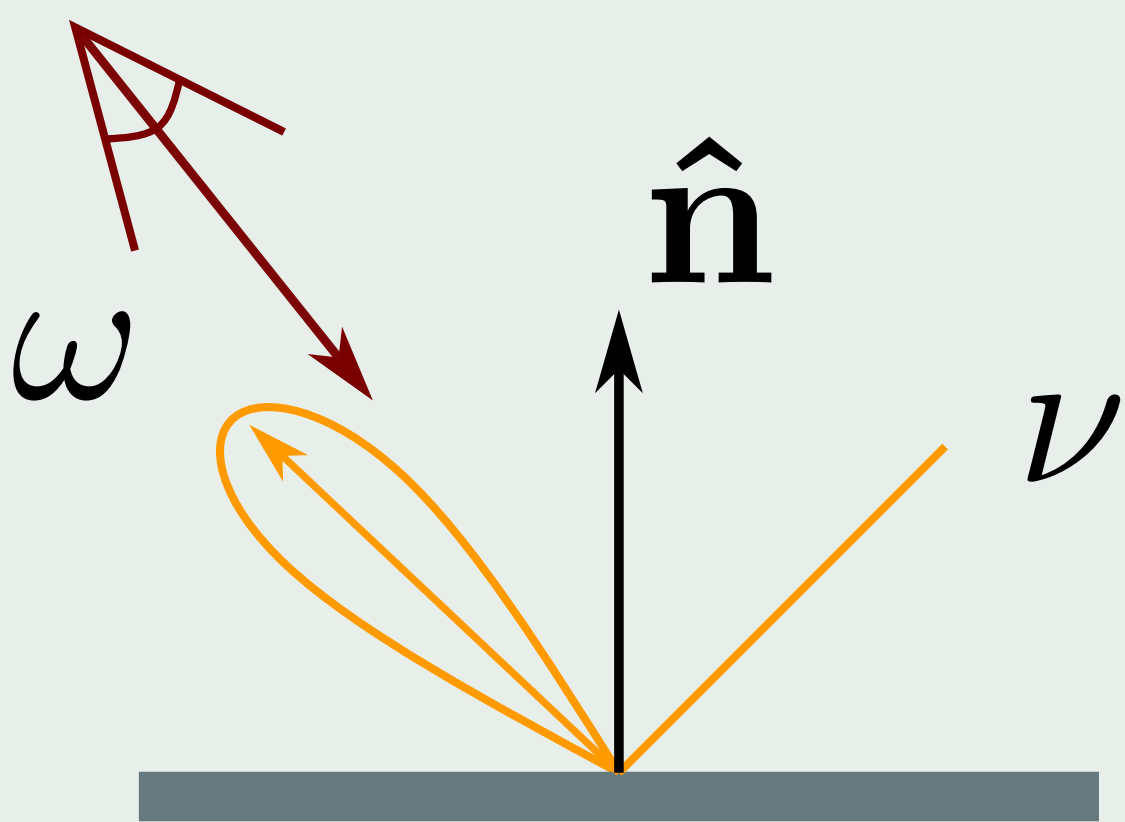
- Photorealistic synthetic data that is end-to-end differentiable and customisable to different 3D models
- Customisable attitude dynamics, on top of differentiable SGP4

Appearance-aware Optimisation

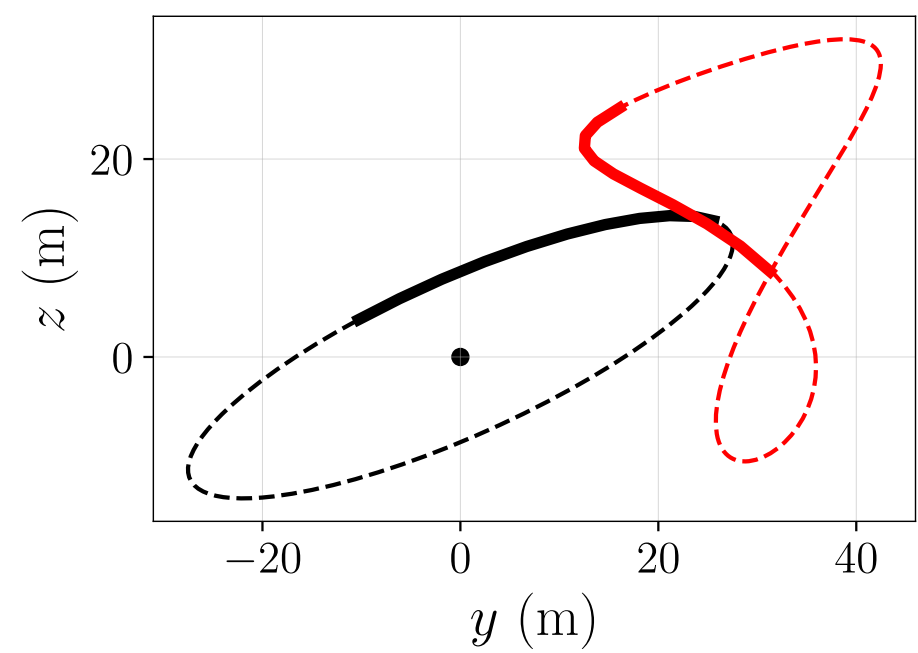
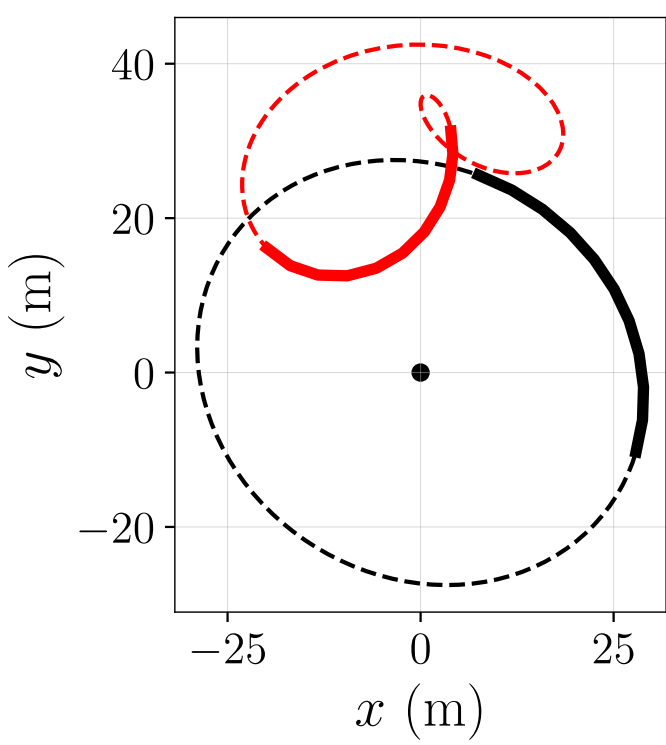
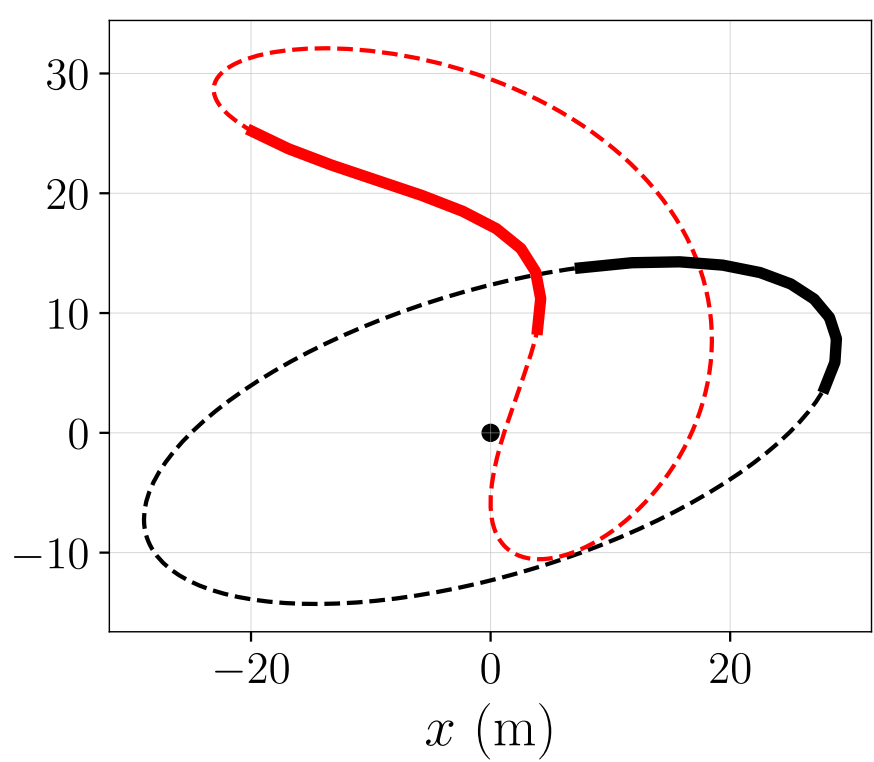
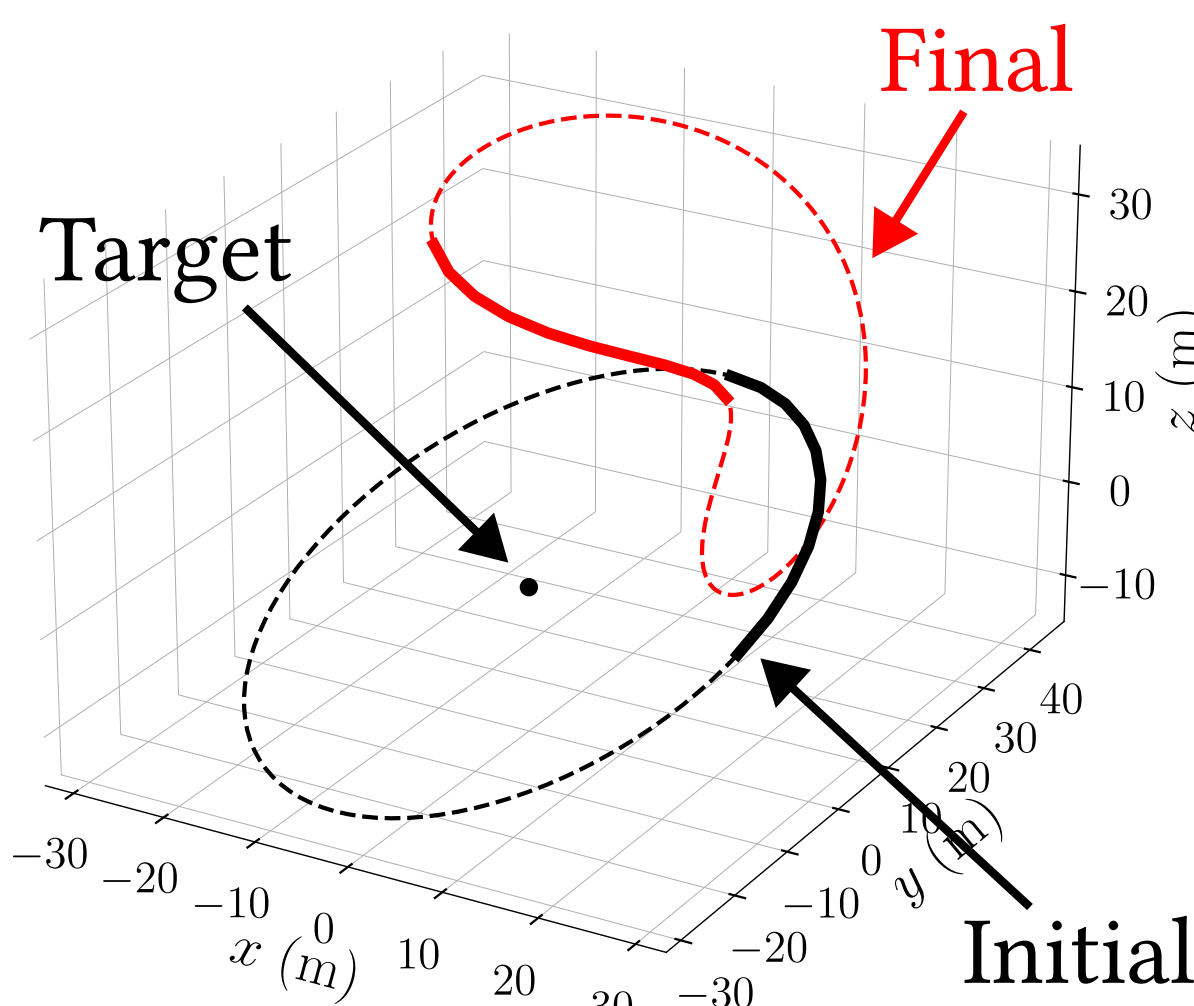
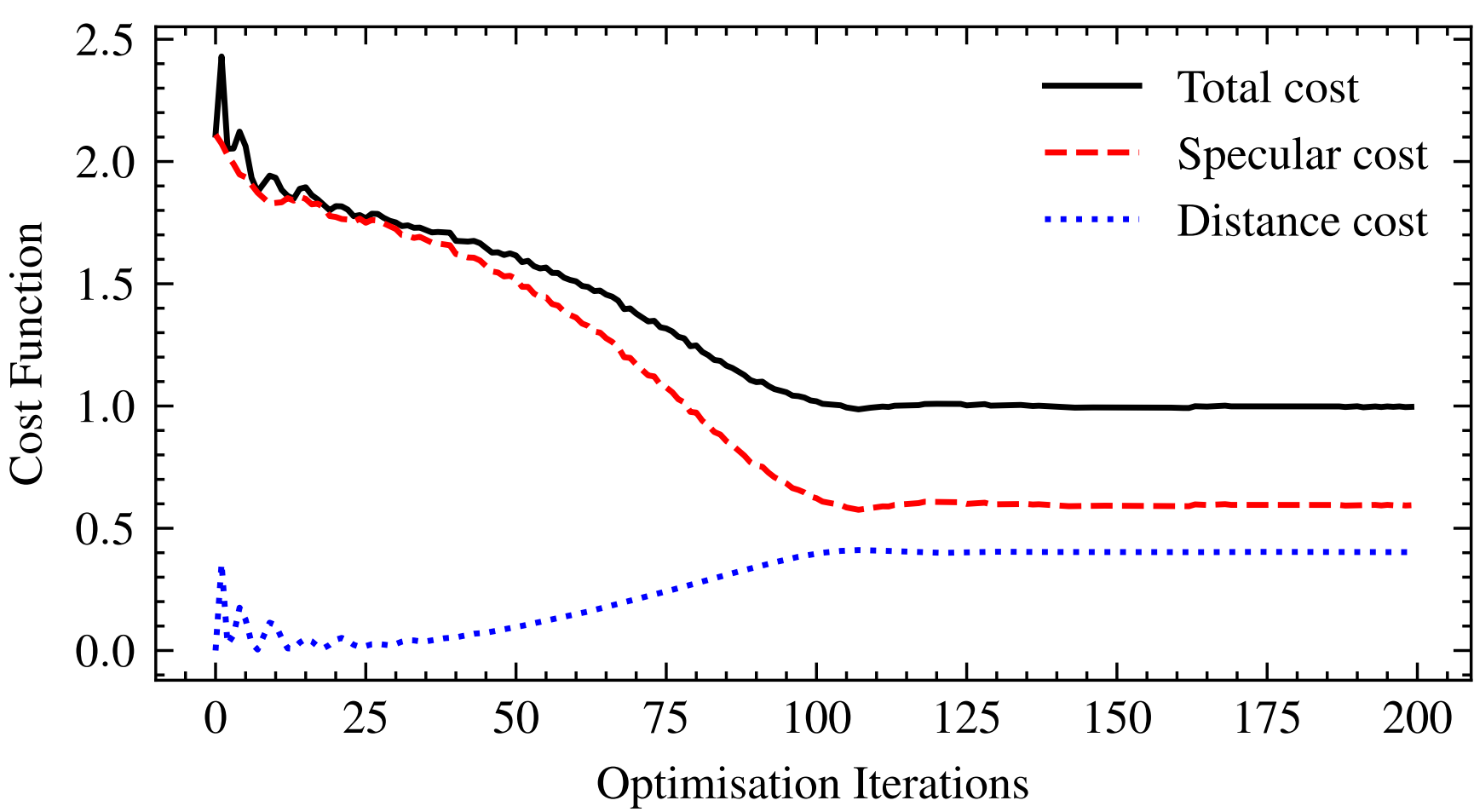
- Apply physics-based cost function to minimise reflection

$$\omega_r = 2(\nu \cdot \hat{\mathbf{n}})\hat{\mathbf{n}} - \nu$$

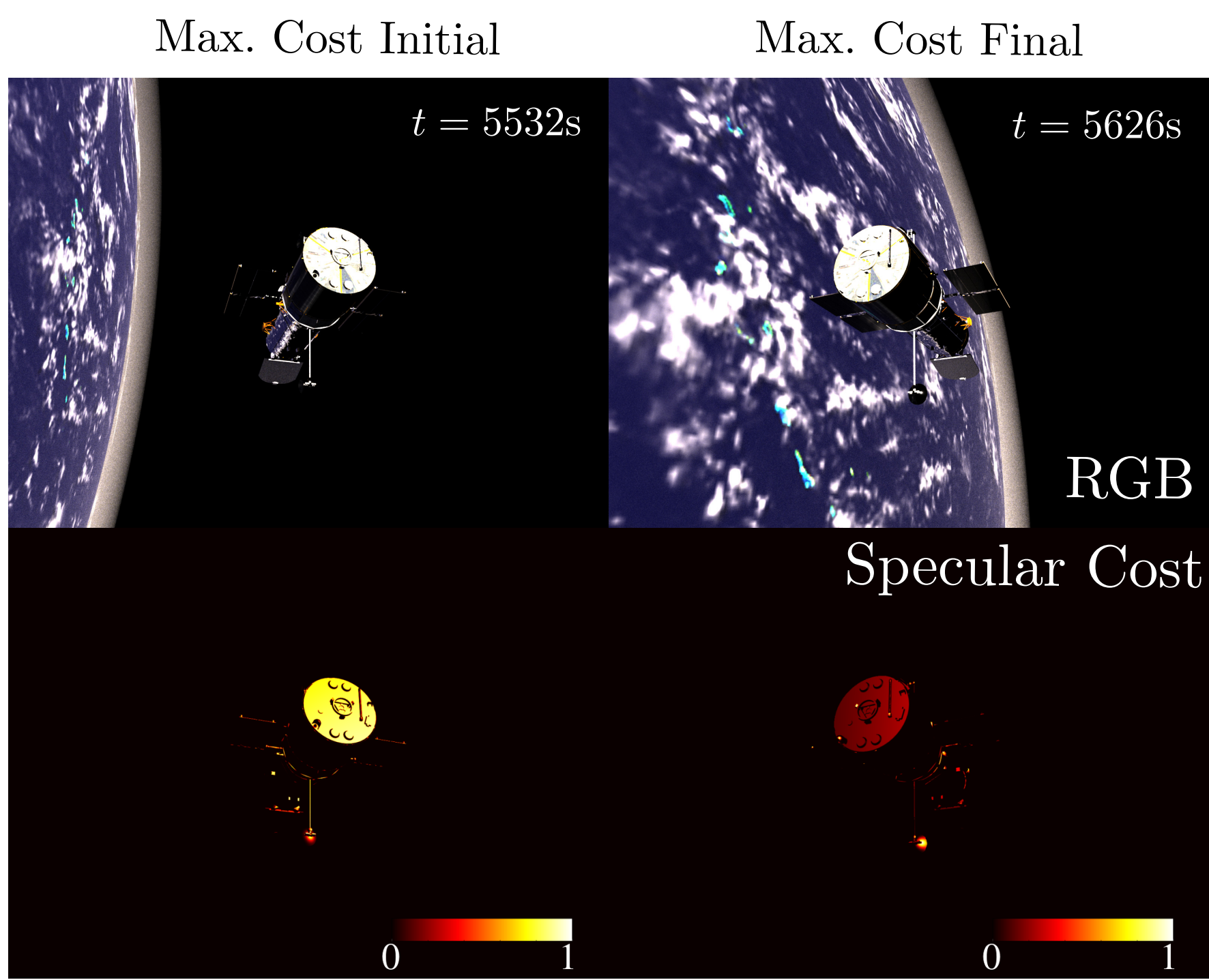
$$\mathcal{L}_s = \frac{\sum_{i,j} M_{i,j} \max(0, \omega_r \cdot \omega)^\alpha}{\sum_{i,j} M_{i,j}}$$



ν Sun Zenith Angle
 ω View Angle
 $\hat{\mathbf{n}}$ Surface Normal



Satellite	Approach	$d = 30\text{m}$		$d = 150\text{m}$	
		Sat. % $\downarrow$	MR $\uparrow$	Sat. % $\downarrow$	MR $\uparrow$
HST	Initial	26.0	0.759	30.8	0.716
	∂ LITE (Ours)	20.5	0.861	12.5	0.732
Sentinel-6	Initial	1.20	0.583	1.69	0.95
	∂ LITE (Ours)	0.04	0.632	1.07	$\dagger$ 0.235
CloudSat	Initial	5.76	0.614	5.52	0.934
	∂ LITE (Ours)	2.72	0.801	$\star$ 5.61	0.974

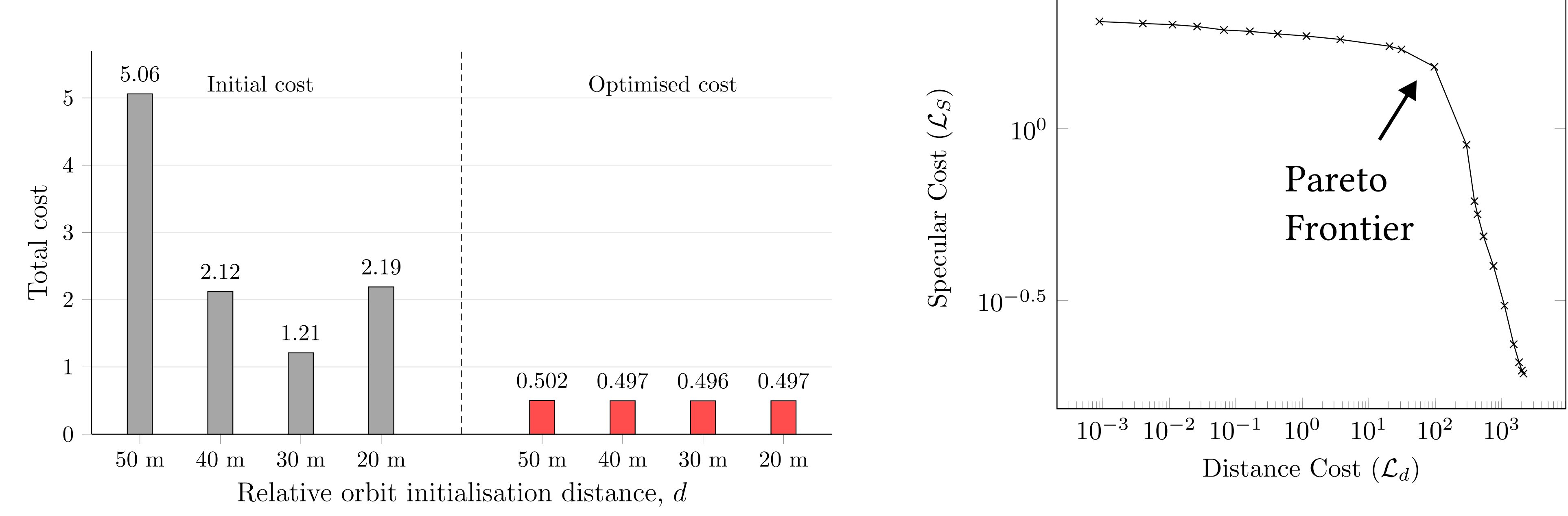


- Achieve appearance-aware trajectories that are non-obvious and substantially improve imaging quality

- Not passively stable, but cheap to correct (small deviation from initialisation)

- Guaranteed local minima that are robust to initialisation

Sensitivity Analysis



Task Specific Capabilities

- Localisation
- Relative navigation
- 3D Reconstruction

- Fine-tune networks under image processing, varying lighting and materials (e.g. pose determination)
- Benchmark other sensor measurements + reconstruction algorithms (e.g. polarisation)

Rendered Image

Pose Estimation Network

- Multi-satellite/multi-pass inspection + teaming

- Optimising coverage vs. quality of data

Not seen

Seen

Opt.

Conclusions & Future Work

- Leverage differentiable pipeline for downstream applications
 - Different sensor configurations, e.g. stereo
 - Multi-satellite capture and teaming simulations
- + we anticipate more!**

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Project Page

Jack Naylor

Lab Website