



PennState

# Quantifying the Consistency of Uncertainty Propagation Algorithms in Cislunar Space

## MOTIVATION

- Consistently propagate statistical moments in nonlinear systems
- Earth-Moon CR3BP
- Statistical moments: mean and covariance

$$\mu = E[\mathbf{x}] = \int \mathbf{x} p(\mathbf{x}) d\mathbf{x}$$

$$\Sigma = E[(\mathbf{x} - \mu)(\mathbf{x} - \mu)^T] = \frac{1}{N} \sum_i^N (\mathbf{x}_i - \mu)(\mathbf{x}_i - \mu)^T$$

## ALGORITHMS

### Monte Carlo (MC)

- Benchmark algorithm since its creation in the 1940s
- Given an initial distribution, MC randomly samples points
- Independently propagates points
- Increasing the number of points by 100 typically decreases error by 0.1

### Unscented Transform (UT)

- Samples points on primary axes to create a 2<sup>nd</sup>-order accurate estimate
- Points are weighted equally
- Independently propagate points through time

### Conjugate Unscented Transform (CUT)

- Samples points on conjugate axes to create a 4<sup>th</sup>-, 6<sup>th</sup>-, or 8<sup>th</sup>-order accurate estimate
- Used CUT 8 (8<sup>th</sup>-order) in this study
- Points assigned weights to satisfy the constraint equations

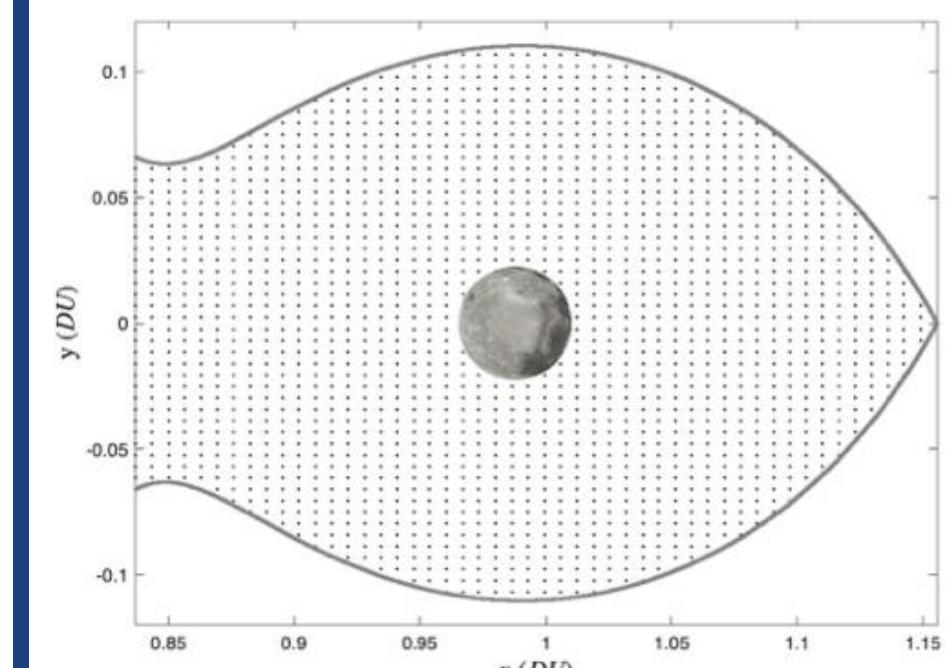
$$1 = \sum_i^N w_i$$

$$\mu = \sum_i^N w_i \mathbf{x}_i$$

$$\Sigma = \sum_i^N w_i (\mathbf{x}_i - \mu)(\mathbf{x}_i - \mu)^T$$

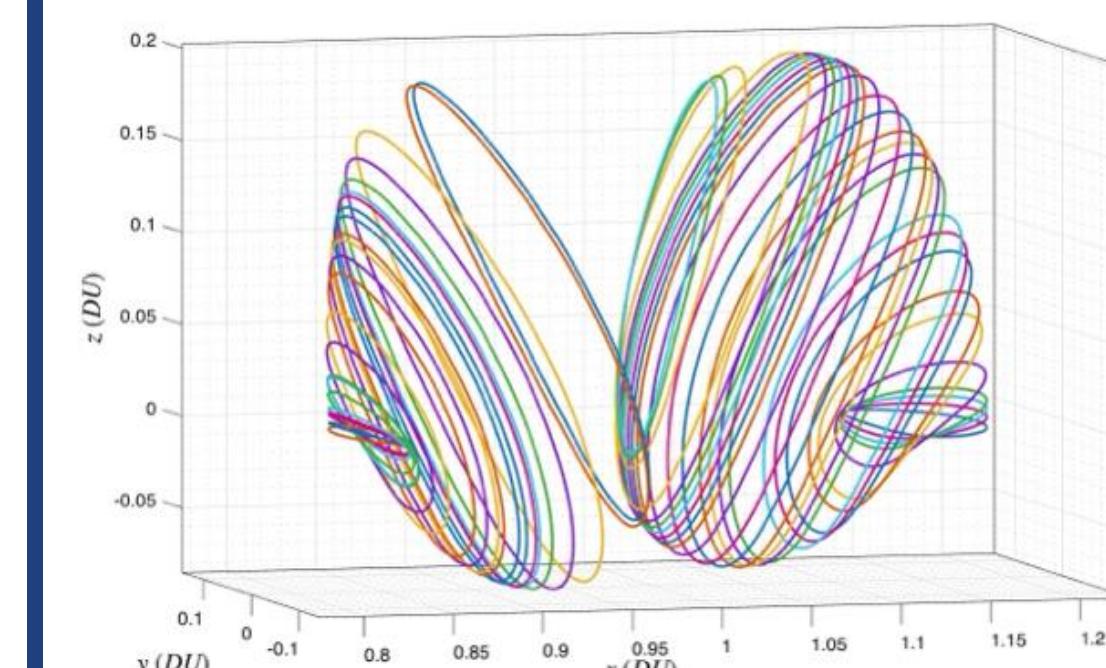
	MC	UT	CUT 8
4 dimensions	100,000	8	161
6 dimensions	100,000	12	745

## L<sub>1</sub> to L<sub>2</sub> Grid Points



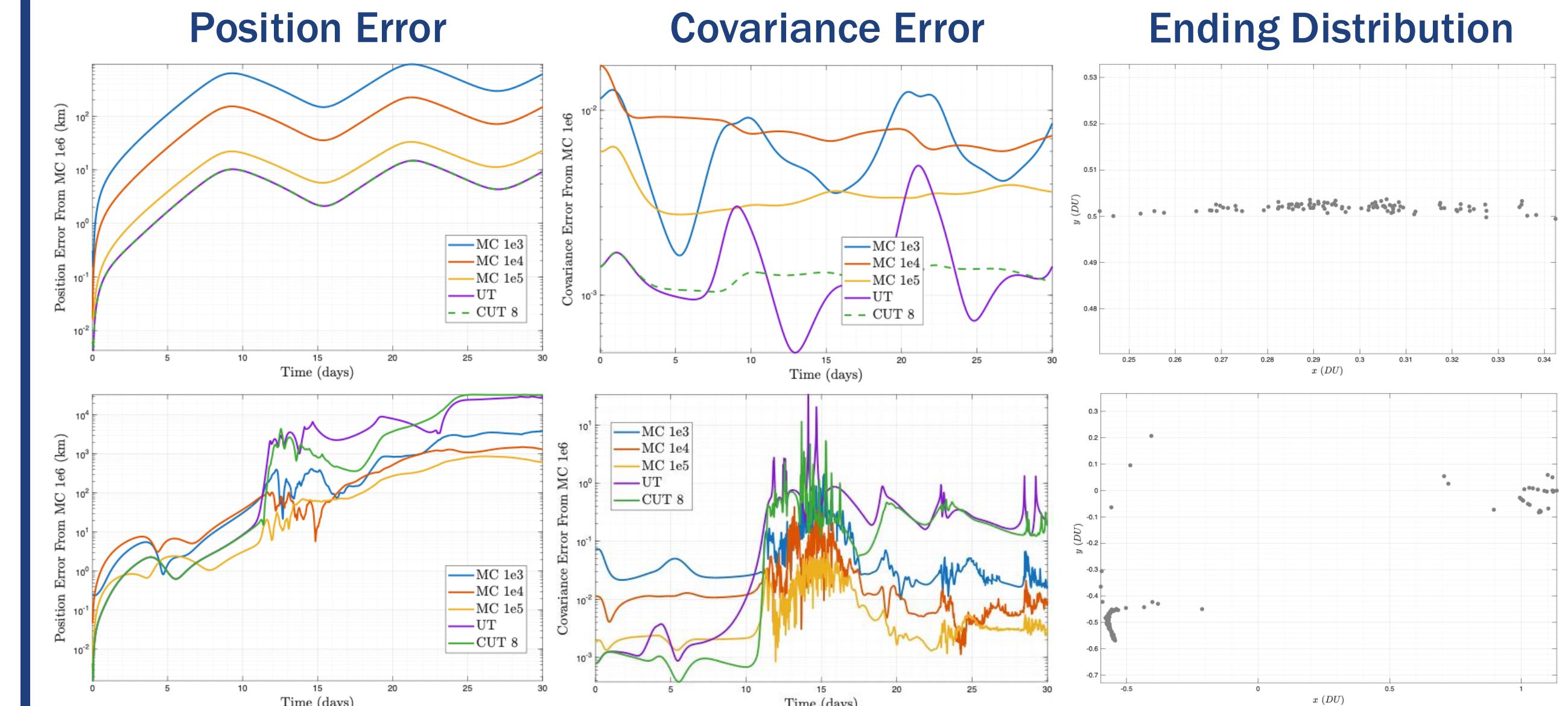
- 1810 grid points between L<sub>1</sub> and L<sub>2</sub>
- Jacobi energy of L<sub>2</sub>
- Perilune initial conditions
- Propagated for 30 days
- 5 km position and 1 m/s velocity deviation
- UT, CUT 8, 100,000 and 1,000,000 MC
- 1,810,000,000 trajectories

## L<sub>1</sub> and L<sub>2</sub> Halo Orbits



- 23 L<sub>1</sub> and 27 L<sub>2</sub> Halo orbits
- Propagated for one time periods
- 5 km position and 0.1 m/s velocity deviation
- UT, CUT 8, 100,000 and 1,000,000 MC

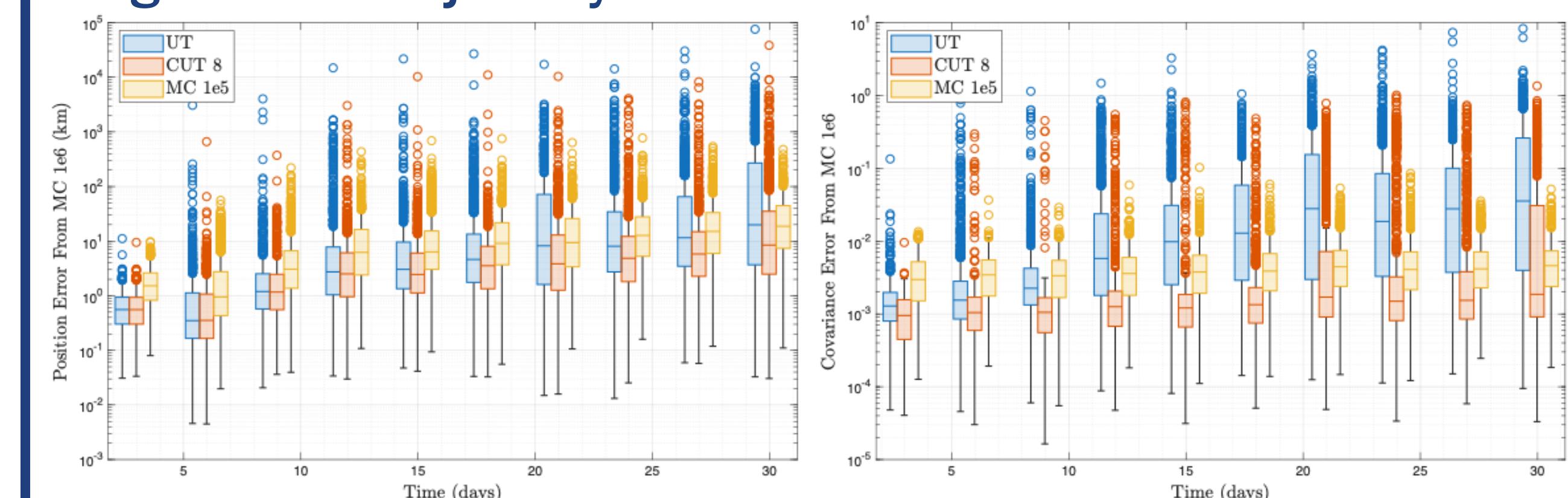
## Individual Grid Points: 10 and 500



## Multi-Modal Problem

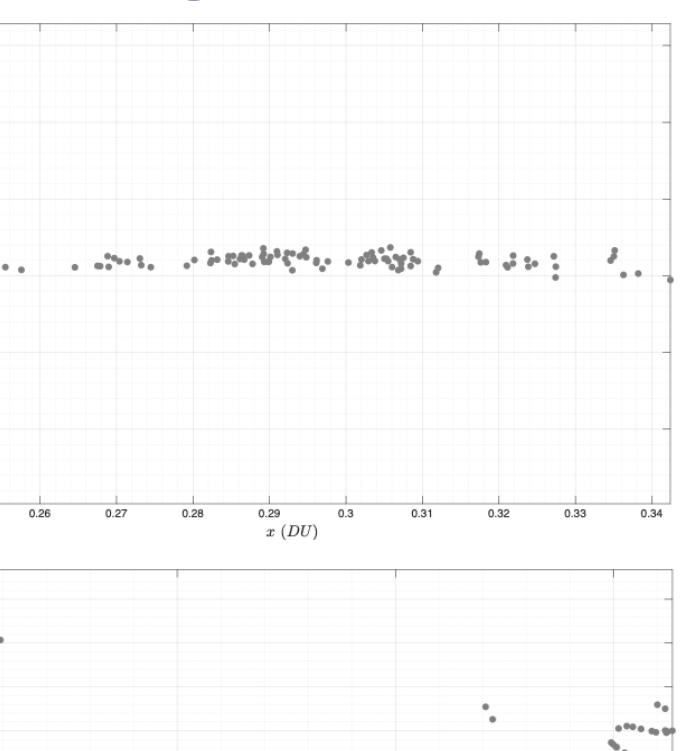
When the distribution becomes multi-modal, statistical moments break down. Trajectories became multi-modal after propagating through the Moon or escaping the L<sub>2</sub> gateway. UT and CUT 8 perform badly for these trajectories.

## Single-Mode Trajectory Performance

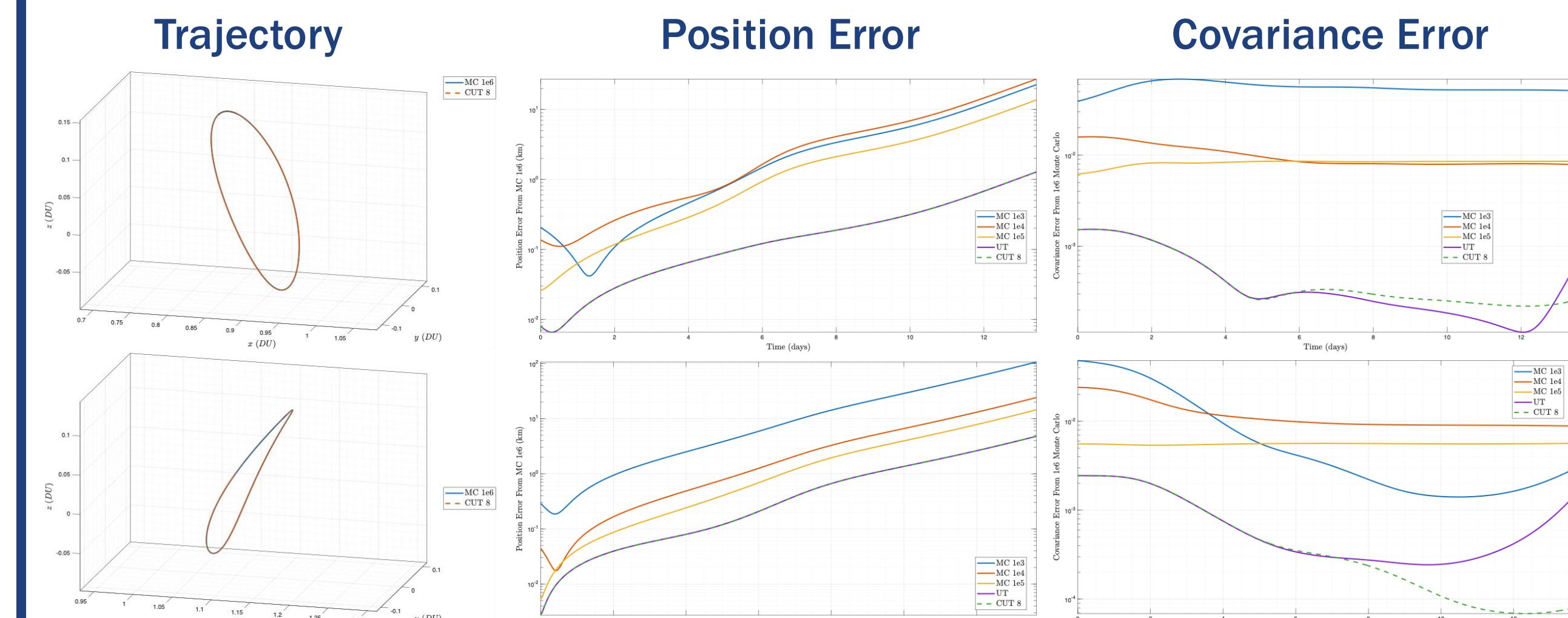


For single-mode trajectories, CUT 8 outperforms 100,000-point MC simulation for most trajectories in estimation of both mean and covariance. UT and CUT 8 are prone to outliers.

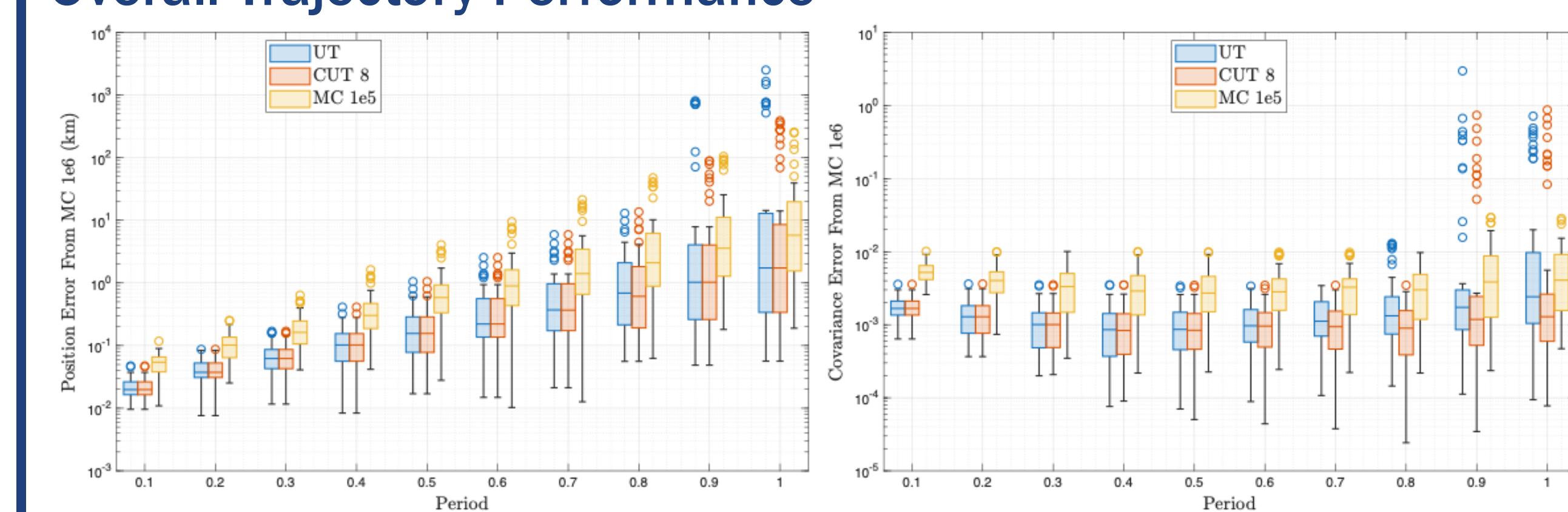
## Ending Distribution



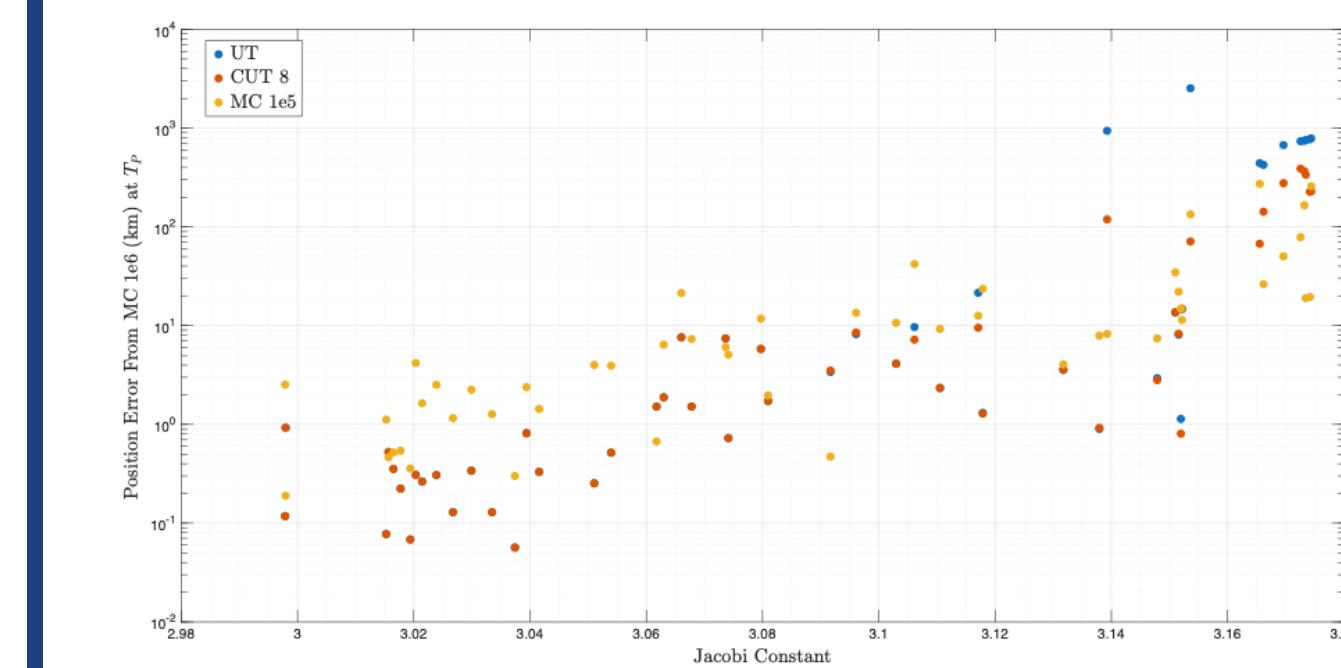
## Individual Halo Orbits:



## Overall Trajectory Performance



## Variation with Jacobi Constant



Over 1 period, both UT and CUT 8 provide better estimates than 100,000-point MC. The difference between UT and CUT 8 is noticed in the covariance. The position error at one time period increased with Jacobi constant.