

# Comparison of Atmosphere Models for Atmospheric Predictions

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28/02/2018, 4th International Space Debris Re-entry Workshop

- Re-entry prediction at ESA:
  - Automated re-entry prediction service via **LASCO** (Lifetime Assessment of Catalogued Objects)
  - Web-based portal: <https://reentry.esoc.esa.int>
  - **IADC** campaigns
- Comparison of 3 **ISO-27852:2016** recommended atmosphere models
- Effects of solar activity proxy forecasts: **SOLMAG**
- Evaluate optimal model combination using ESA re-entry tools
- Data set: re-entered objects since May 2017

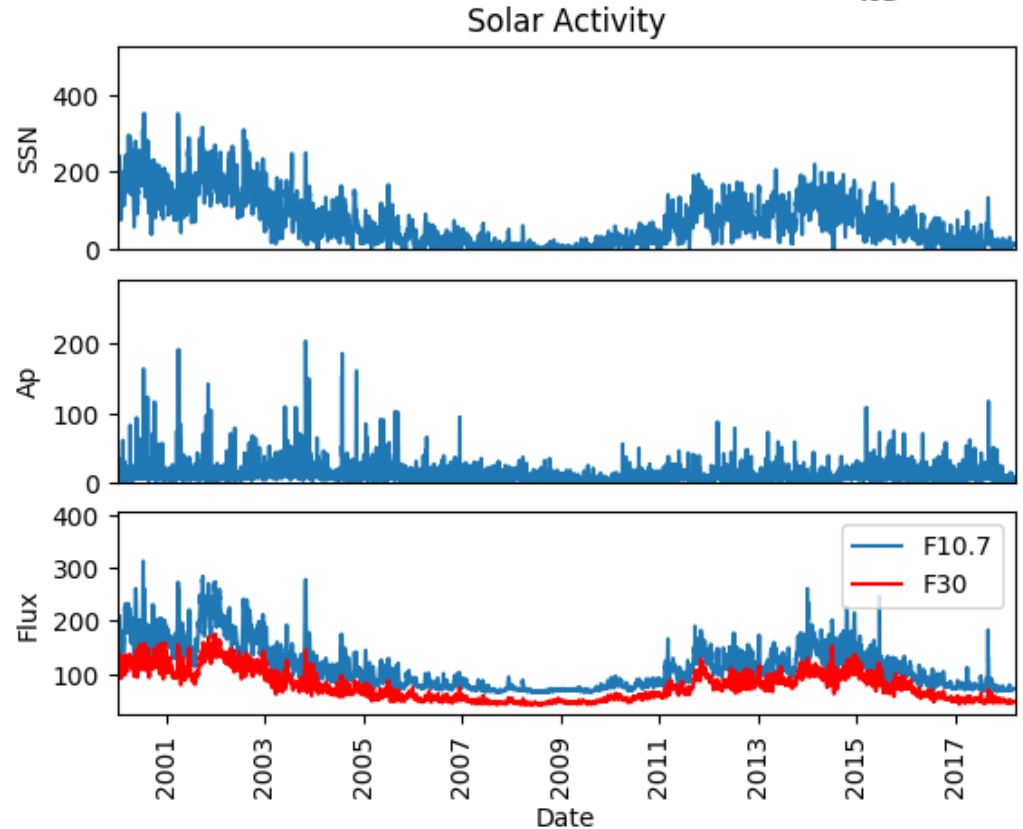
# Atmosphere Models

- [ISO-27852:2016](#) provides list of atmosphere models for estimation of orbit lifetime
- Aim: determine if models show significant differences when applied to lower thermosphere (< [250km](#))

Model	Solar activity proxy index	Geomagnetic activity index Kp
NRLMSISE-00(d)	F10.7	Daily
NRLMSISE-00(h)		8x 3 hour
GOST-2004	F10.7	Daily
DTM-2013	F30	8x 3 hour

# Space Weather

- SOLMAG (Solar and Geomagnetic activity prediction model):
  - Prediction of daily  $A_p$  (for following solar rotation)
  - Very short term (3 days) SIDC expert prediction



# Re-entry Prediction Tools



Fit Tool	Bc Fit Method	Data Used
RAPID	fit from sma decay	20 TLEs
		Set Time Span TLEs
		20 TLEs (A posteriori)
RACER (prototype)	fit from L	20 TLEs (A posteriori)

A posteriori: removes uncertainty from SOLMAG predicted solar activity

- 4 atmosphere models
  - 4 lifetime assessment tool combinations
- } 16 combinations

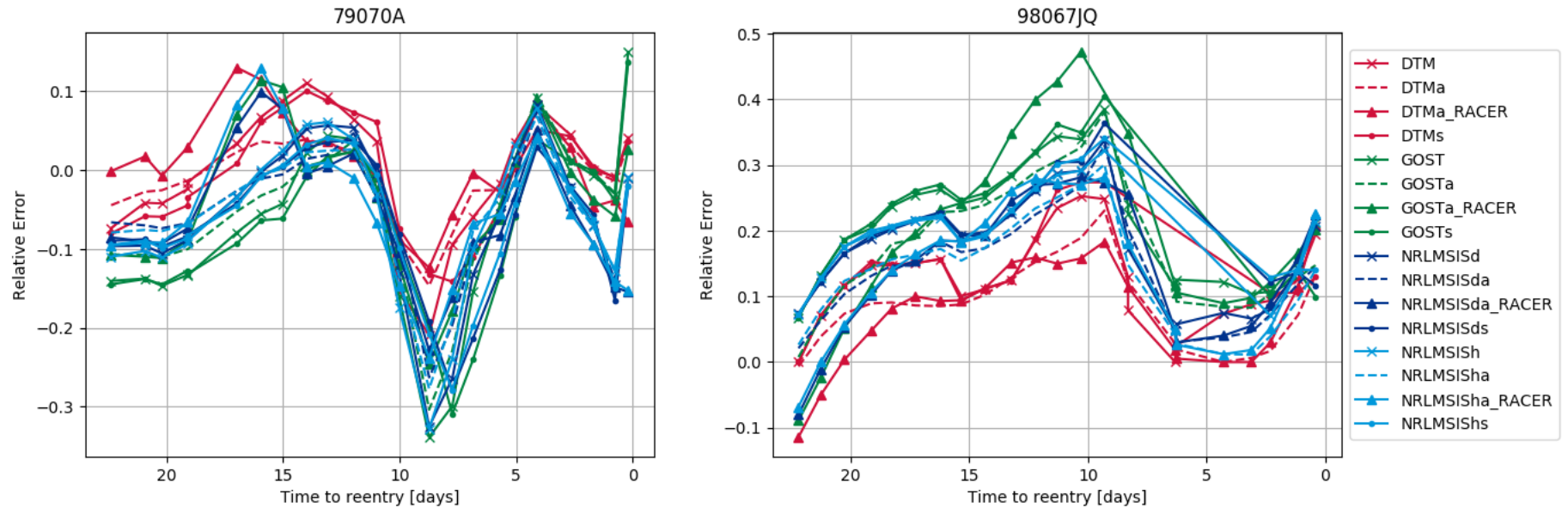


# Relative Error & Object Specific Trends



35 objects with real time prediction service (since May 2017)

14 objects a posteriori (Jan to May 2017)



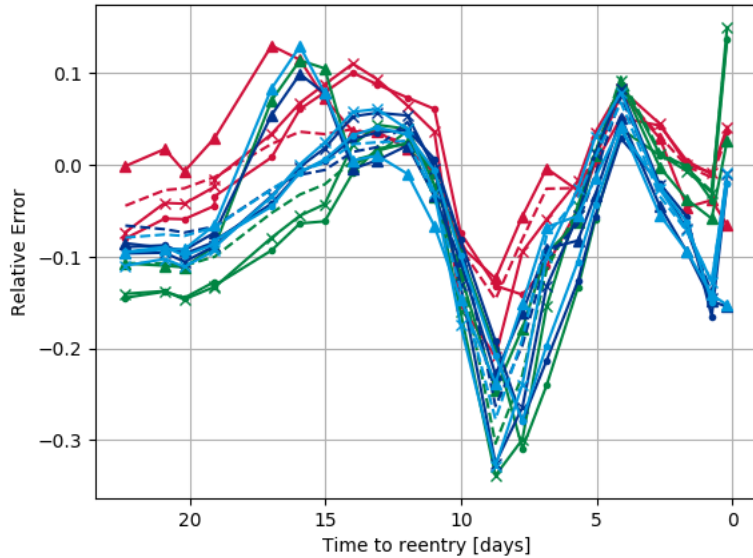
# Relative Error & Object Specific Trends



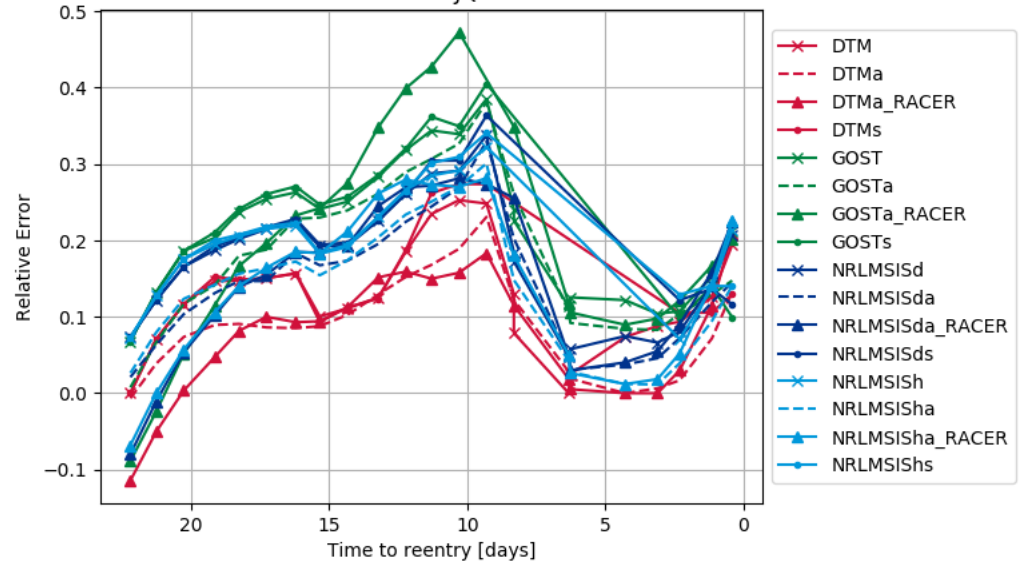
Relative error = (predicted - reference re-entry epoch)/remaining time

Space-track.org

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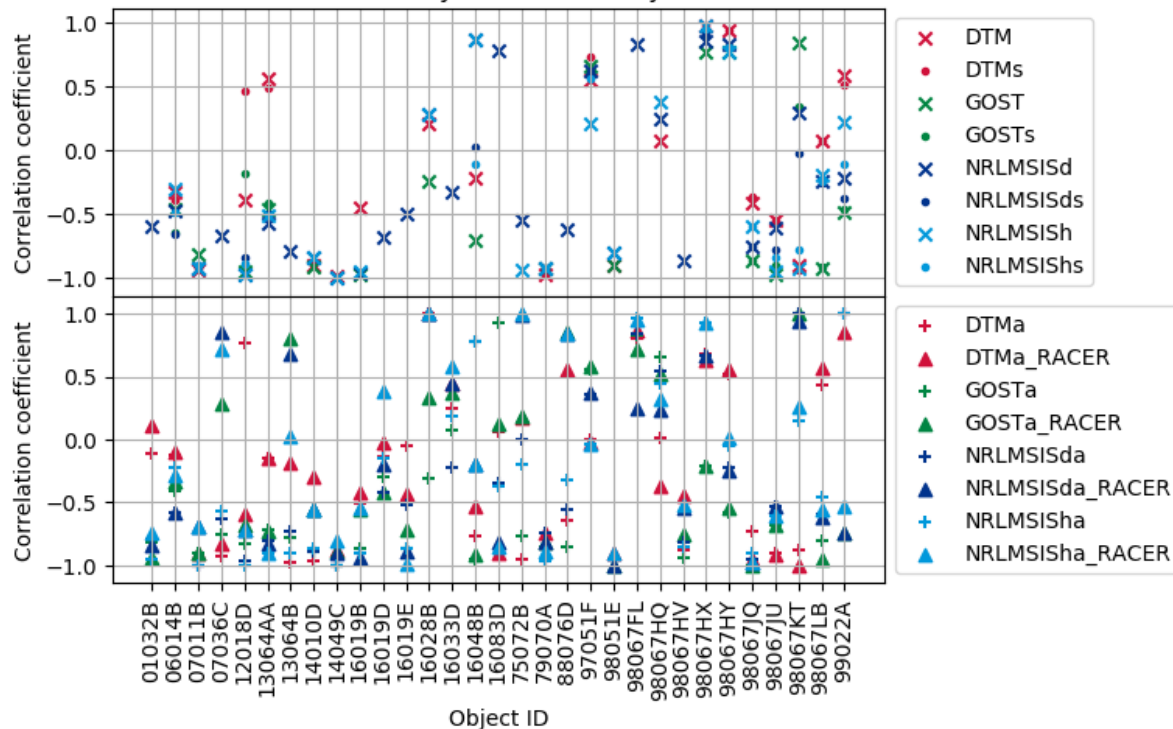
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# Relative Error & Object Specific Trends

Correlation between relative error & time to reentry.  
28-14 days before reentry.



- Group according to solar rotation period
- No trend in correlation between objects



For model comparison:  
Remove object specific trends



Relative Model Error (RME)

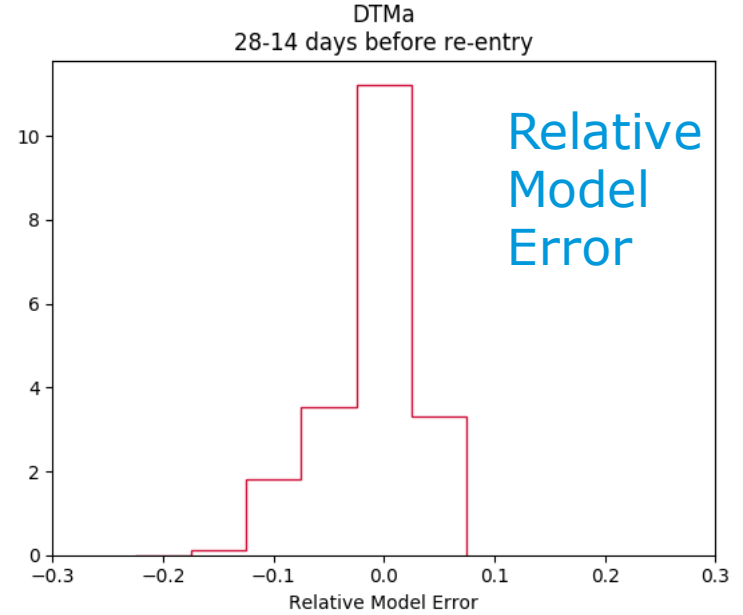
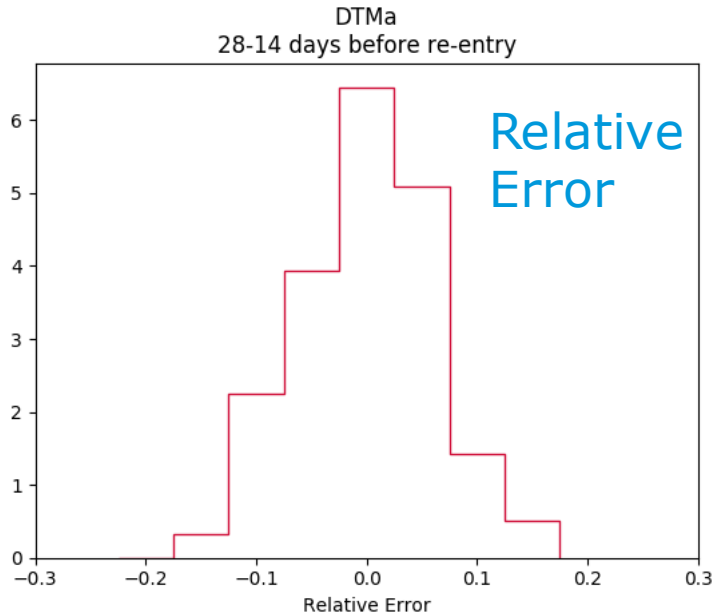


# Relative Model Error

Express prediction accuracy via a delta relative error between the methods

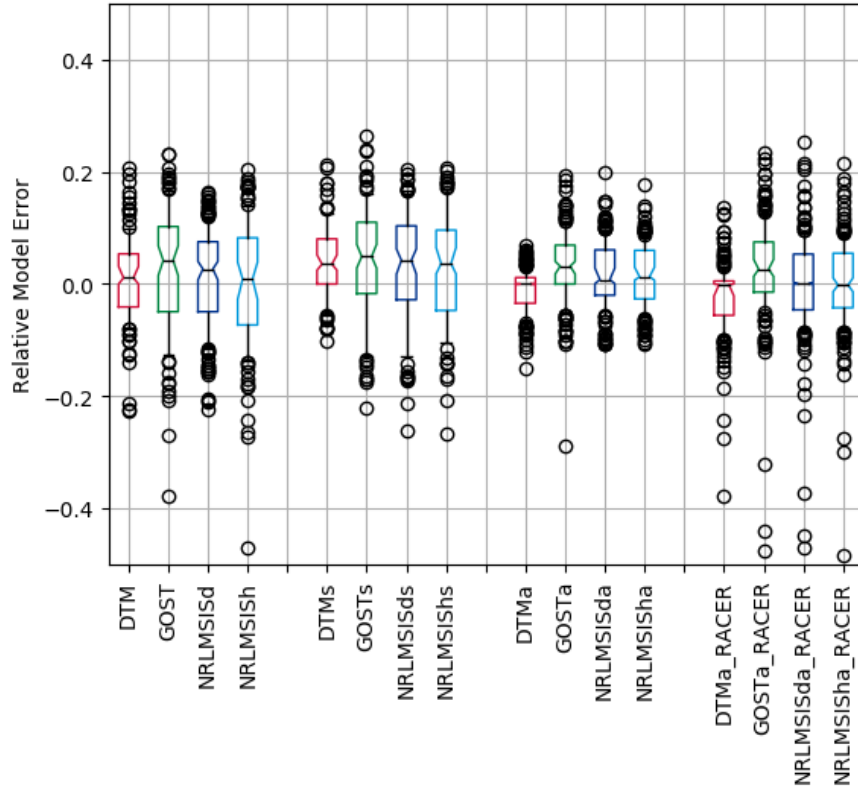
→ best performing model has centralised tendency

Empirical distribution:



# Relative Model Error

28-14 days before reentry



Statistical comparison to distinguish an optimal method:

**Kruskal-Wallis (KW) H-test:**

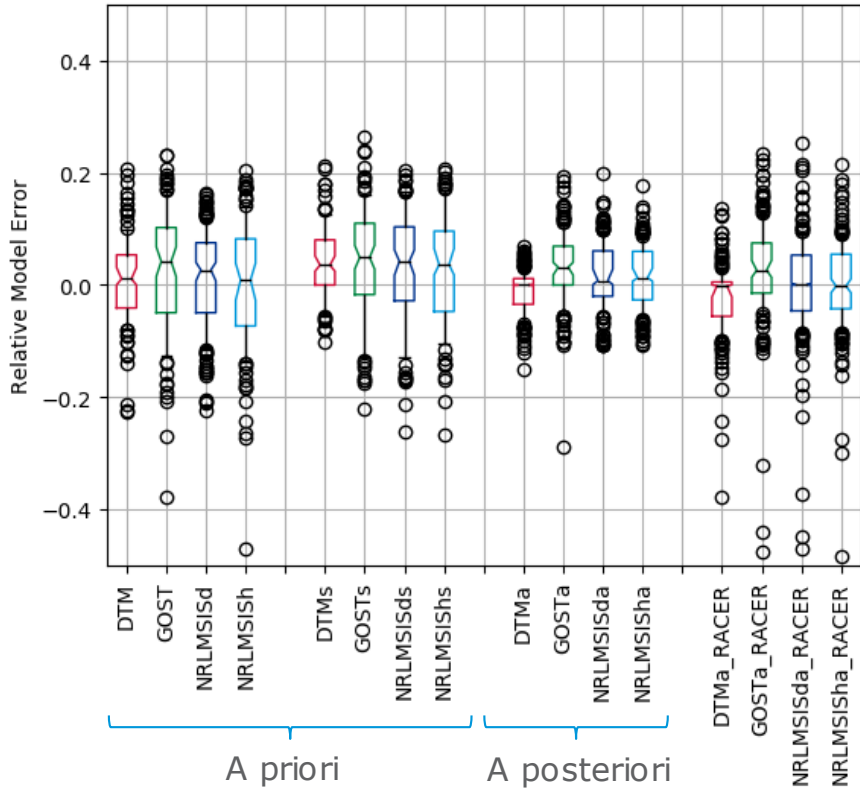
- Non-parametric rank test
- Null hypothesis: population median of all the groups are equal

**Kolmogorov-Smirnov (KS) test:**

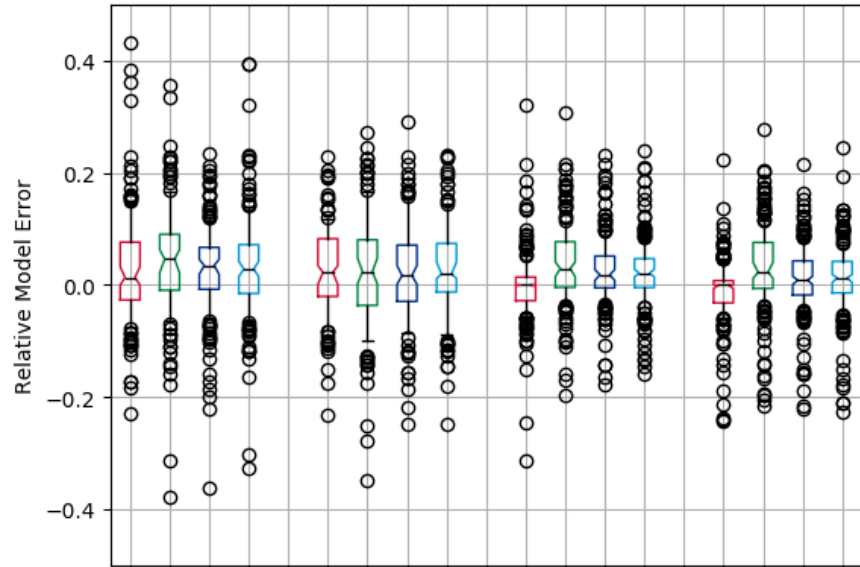
- Null hypothesis: 2 independent samples drawn from same continuous distribution

# Relative Model Error

28-14 days before reentry



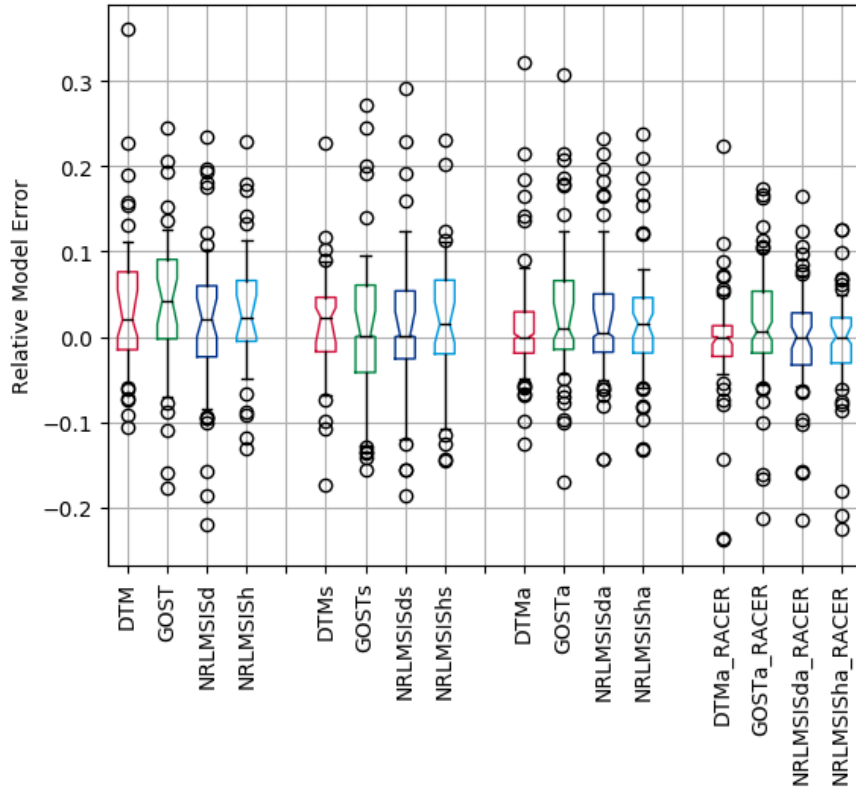
14-0 days before reentry



- A priori models not differentiable
- **DTM** differentiable from a posteriori
- Same KW & KS output (with  $\alpha = 0.01$ )

# Relative Model Error: Close to re-entry

5-0 days before reentry



5-0 days before re-entry:

- KW: no groups or pairs discernible
- KS: no pairs disprove null except DTMa & NRLMSISha (level of  $\alpha = 0.05$ )

3-0 days before re-entry:

- No optimal method discerned

# Conclusions & Summary



- Comparison of 3 ISO-27852:2016 atmosphere models
- **16 combinations** of atmosphere models, solar activity proxies & observed data
- Real-time analysis limited to **35 re-entered objects** since May 2017

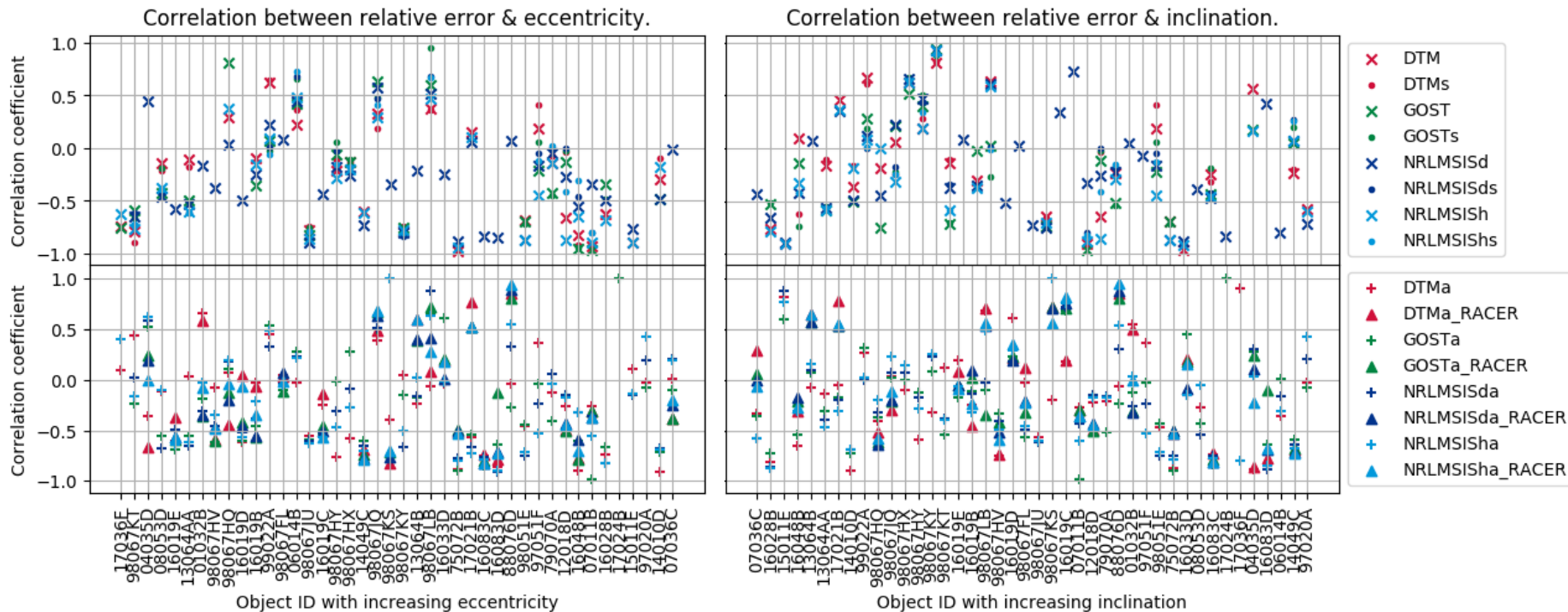
Statistical analysis using scaled relative error:

- A priori methods (using SOLMAG predicted space weather): no best method
- **A posteriori** (using known space weather): **DTM-2013** optimal atmosphere model for 28-3 days before re-entry
- Close to re-entry (5/3-0 days before): no optimal atmosphere model



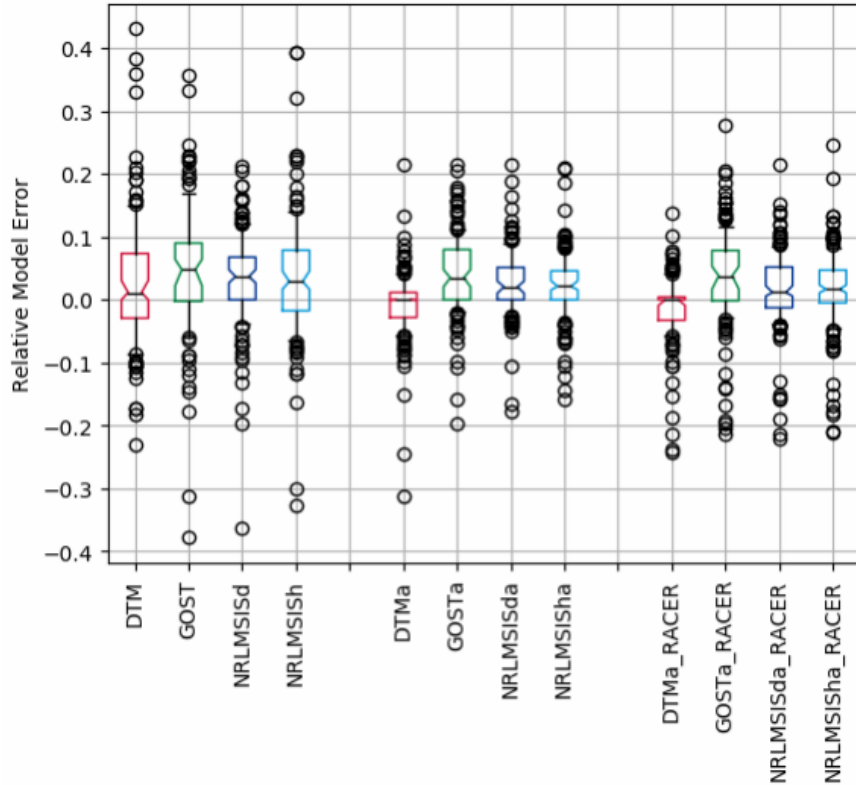
# Additional Slides: eccentricity & inclination

Effect of orbit type on correlation:



# Additional Slides: 14-3 days before re-entry

14-3 days before reentry



KW:

GOSTa may be differentiated from

NRLMSISd/h (level of  $\alpha = 0.05$ )

Otherwise same outcomes as 28-14

(better than 14-0)

KS:

Some 20TLE differentiation

All RAPID & RACER a posteriori

differentiable (except NRLMSIS pair)