

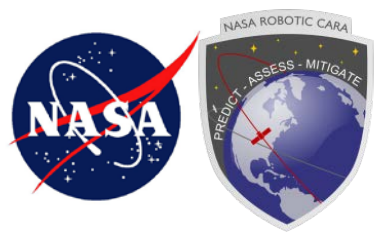
# Conjunction Assessment Risk Analysis



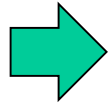
## Implementation Recommendations and Usage Boundaries for the Two-Dimensional Probability of Collision Calculation

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Omitron, Inc.**

**The 2019 AAS/AIAA Astrodynamics Specialist Conference  
Portland, Maine, 2019 August 11-15  
Paper AAS 19-632**



# Agenda and Overview



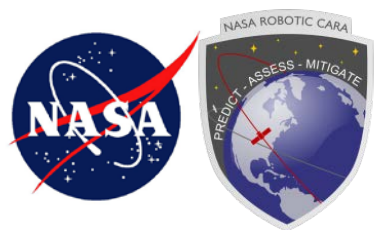
## • Introduction

- Motivation and objectives
- Review latest 2D-Pc vs *Brute Force Monte Carlo* comparison for archived conjunctions
- Review previous discussions of 2D-Pc validity criteria

## • Analysis

- Investigate “offset-from-TCA” variations as an indicator of 2D-Pc inaccuracy
- Develop a diagnostic boundary test to indicate potential large-amplitude 2D-Pc method underestimations

## • Conclusions and Recommendations



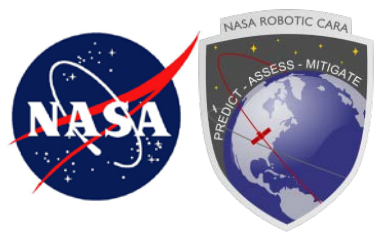
# Motivation and Objectives

- **Motivation** The probability of collision ( $P_c$ ) between two Earth-orbiting satellites can often but not always be approximated adequately using the semi-analytical “2D- $P_c$ ” formulation<sup>1,2,3</sup>
- **Objective** Develop a test to indicate when the 2D- $P_c$  method reliably provides sufficiently accurate  $P_c$  estimates, so that high-fidelity *Brute Force Monte Carlo*<sup>3</sup> (BFMC)  $P_c$  simulations do not have to be executed for all conjunctions

<sup>1</sup>J.L. Foster and H.S. Estes, “A Parametric Analysis of Orbital Debris Collision Probability and Maneuver Rate for Space Vehicles,” NASA/JSC-25898, Aug. 1992.

<sup>2</sup>M.R. Akella and K.T. Alfriend, “The Probability of Collision Between Space Objects,” *Journal of Guidance, Control, and Dynamics*, Vol. 23, No. 5, pp. 769-772, 2000.

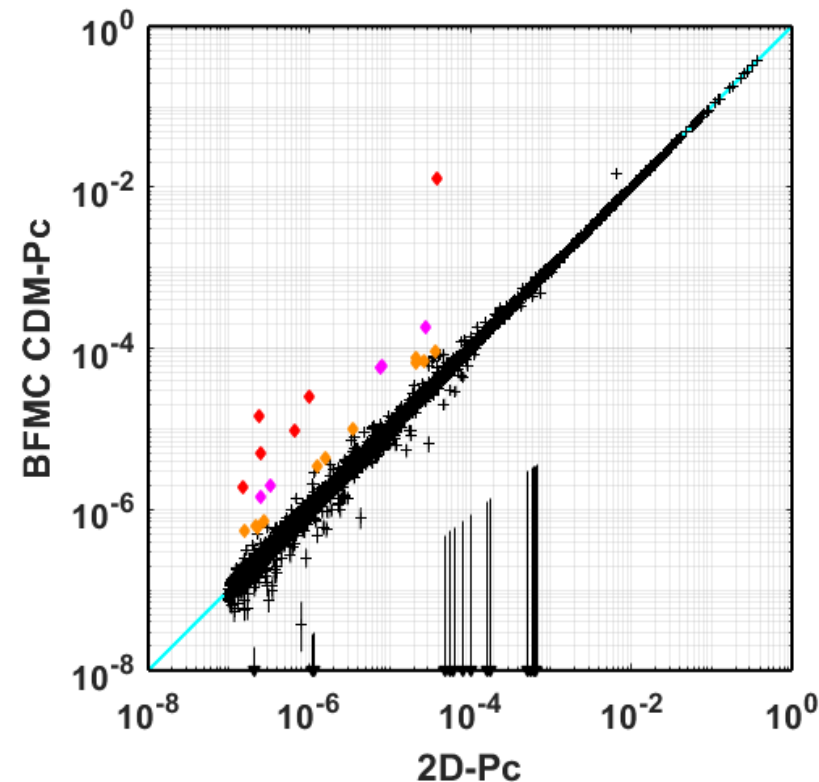
<sup>3</sup>D.Hall *et al* “High-Fidelity Collision Probabilities Estimated Using Brute Force Monte Carlo Simulations” AAS 18-244, Aug. 2018

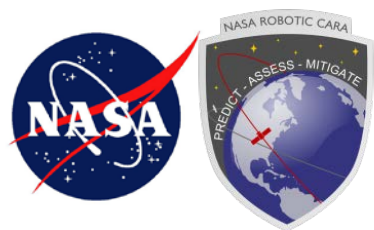


# BFMC-Pc vs 2D-Pc Comparison for Archived Satellite Conjunctions

- **43,595 CARA archive conjunctions**
  - 2017-05-01 to 2018-11-15 with  $2D-Pc \geq 10^{-7}$
- **2D-Pc works well for the vast majority<sup>1</sup>**
  - But there are many more differences between 2D-Pc and BFMC-Pc than expected from random variations
- **2D-Pc significantly underestimates BFMC-Pc for an extremely small (but measurable) fraction of events**
  - $BFMC-Pc/2D-Pc \geq 2.5$  for 22 of the analyzed conjunctions (0.05%)
  - Diamonds show such “large-amplitude” 2D-Pc underestimation failures
  - Most concerning type of 2D-Pc approximation inaccuracies

- +  $CDM-Pc/2D-Pc < 2.5$  (43573 of 43595)
- ◆  $2.5 \leq CDM-Pc/2D-Pc < 5$  (11 = 0.025%)
- ◆  $5 \leq CDM-Pc/2D-Pc < 10$  (5 = 0.011%)
- ◆  $CDM-Pc/2D-Pc \geq 10$  (6 = 0.014%)



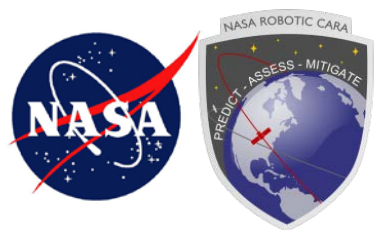


# Why Does 2D-Pc Occasionally Fail?

- **The formulation of the 2D-Pc approximation assumes the following<sup>1,2</sup>**
  1. **At TCA the primary-to-secondary relative position uncertainty distribution can be approximated as Gaussian**
  2. **During the conjunction, the relative satellite trajectories can be approximated as linear**
  3. **During the conjunction, the relative position covariance can be approximated as constant**
- **2D-Pc estimates can be inaccurate if any of these three assumptions are violated sufficiently**

<sup>1</sup>J.L. Foster and H.S. Estes, "A Parametric Analysis of Orbital Debris Collision Probability and Maneuver Rate for Space Vehicles," NASA/JSC-25898, Aug. 1992.

<sup>2</sup>M.R. Akella and K.T. Alfriend, "The Probability of Collision Between Space Objects," *Journal of Guidance, Control, and Dynamics*, Vol. 23, No. 5, pp. 769-772, 2000.



# Chan (2008)<sup>1</sup> Analysis of the Encounter Region for Valid 2D-Pc Estimation

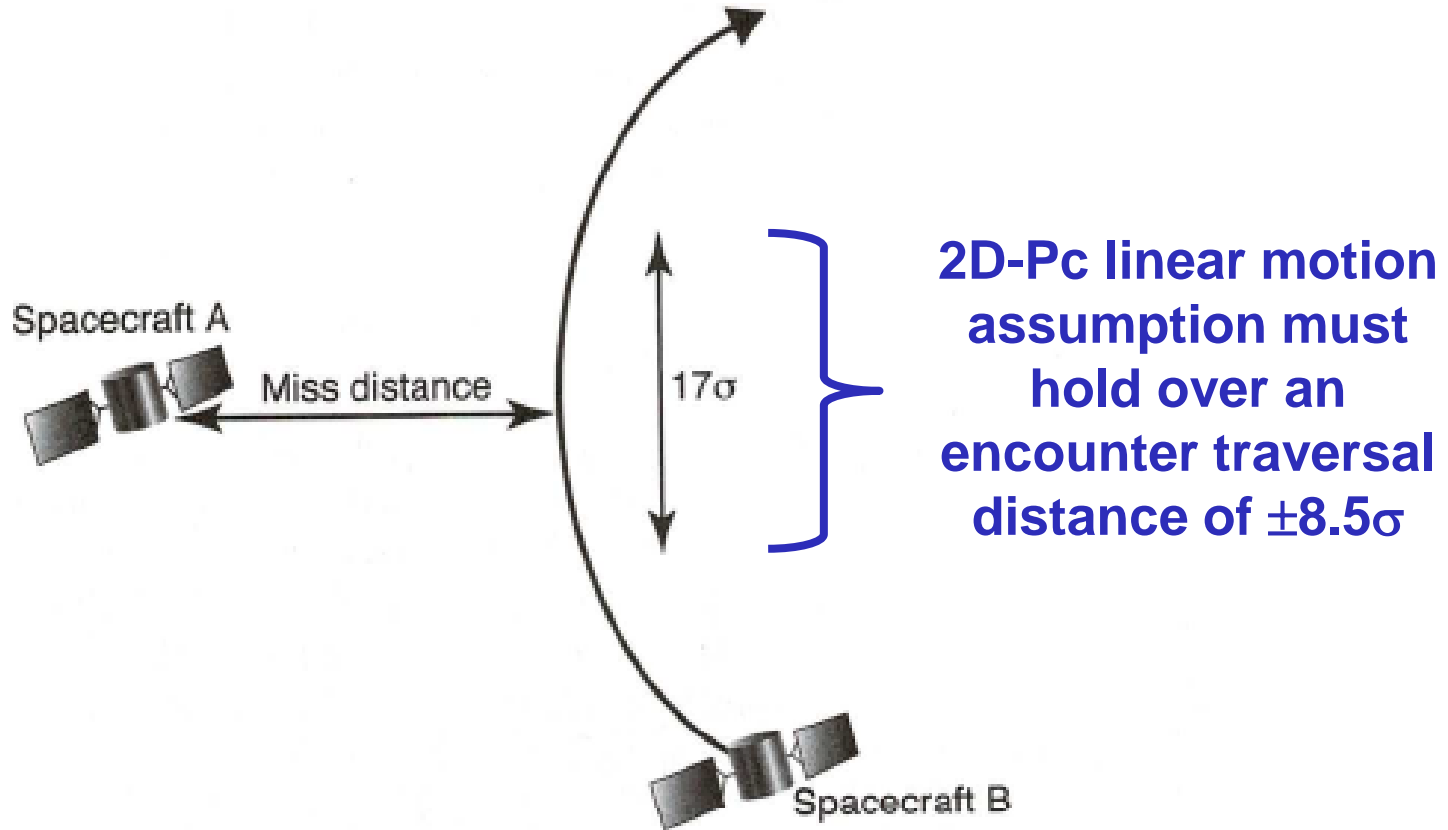
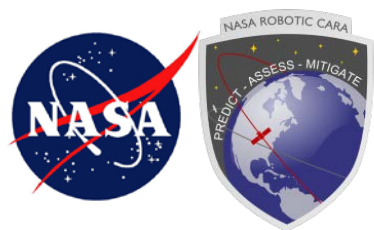
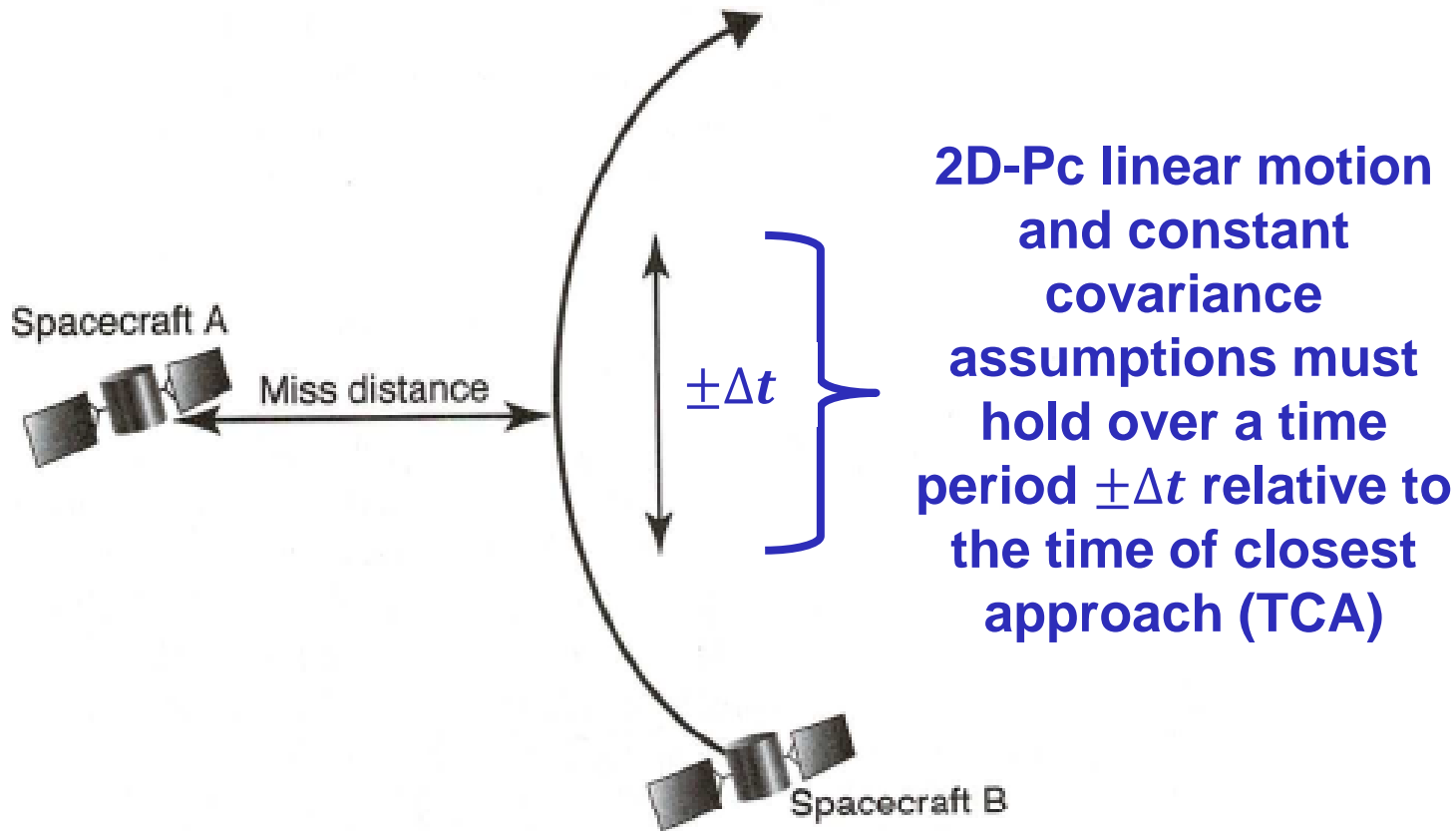


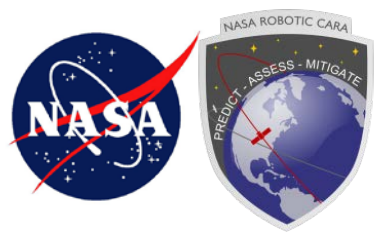
Figure 3.1. Requisite path length for integration. The length must be  $17\sigma$  for the rectilinear approximation to be valid.



# Coppola (2012)<sup>1</sup> Analysis of the Time Interval for Valid 2D-Pc Estimation



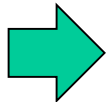
Short-term encounter validity interval:  $\Delta t = \max(|\tau_0|, |\tau_1|, \tau_1 - \tau_0)$



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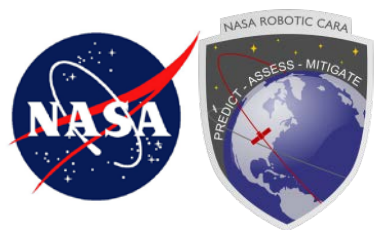


- **Analysis**

- Investigate “offset-from-TCA” variations as an indicator of 2D-Pc inaccuracy
- Develop a diagnostic boundary test to indicate potential large-amplitude 2D-Pc method underestimations

- **Conclusions and Recommendations**





# Offset-from-TCA 2D-Pc Estimates

- Normally, 2D-Pc estimates are calculated using states and covariances at TCA

$$P_{c,0} = P_c(t = 0)$$

- However, 2D-Pc estimates can also be calculated using states and covariances propagated to times offset from TCA

$$P_{c,t} = P_c(t \neq 0)$$

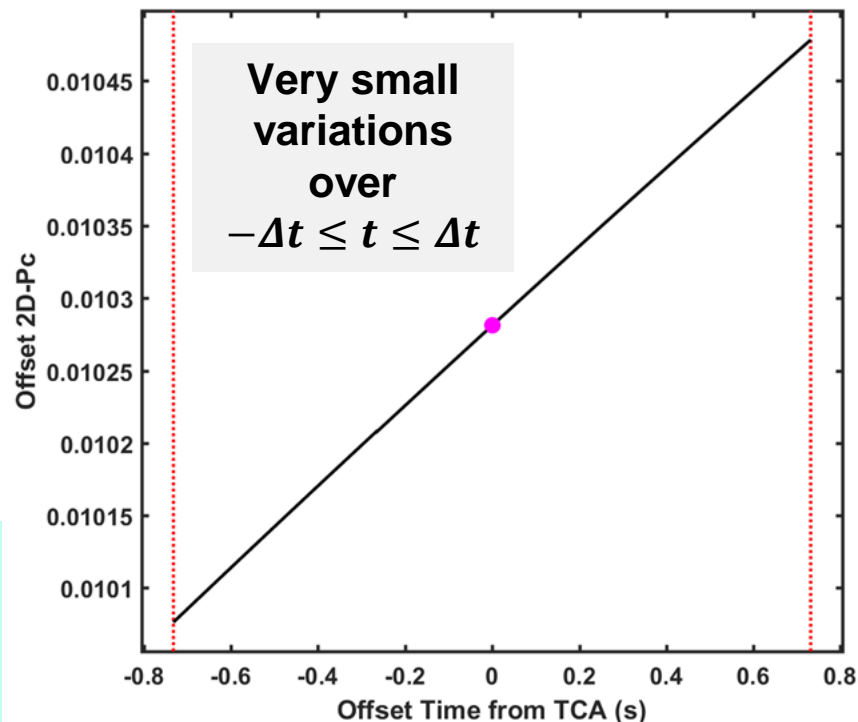
- If the 2D-Pc assumptions are satisfied, then this yields about the same Pc estimates within the validity interval

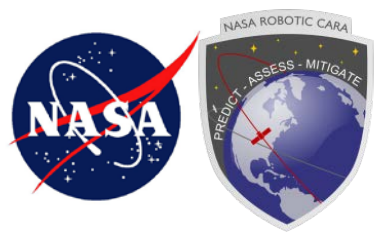
$$P_{c,t} \approx P_{c,0} \quad \text{for} \quad |t| \leq \Delta t$$

**IDEA: Variations in offset-from-TCA estimates could provide an indicator of 2D-Pc inaccuracy (S. Alfano, Nov 2018)**

## Known AQUA conjunction<sup>1</sup> with BFMC-Pc = 2D-Pc

- 2D-Pc calculated at nominal TCA
- 2D-Pc calculated offset from nominal TCA
- ⋯ 2D-Pc assumption validity interval





# Using Offset-from-TCA Variations as an Indicator of Overall 2D-Pc Accuracy

- Offset-from-TCA 2D-Pc variations can be measured using the extrema found during the validity time interval

$$P_c^{max} = \max_{|t| \leq \Delta t} [P_{c,t}] \quad P_c^{min} \text{ similar}$$

- A “variation metric” can be defined as

$$V = \log_{10} [P_c^{max} / P_c^{min}]$$

so that

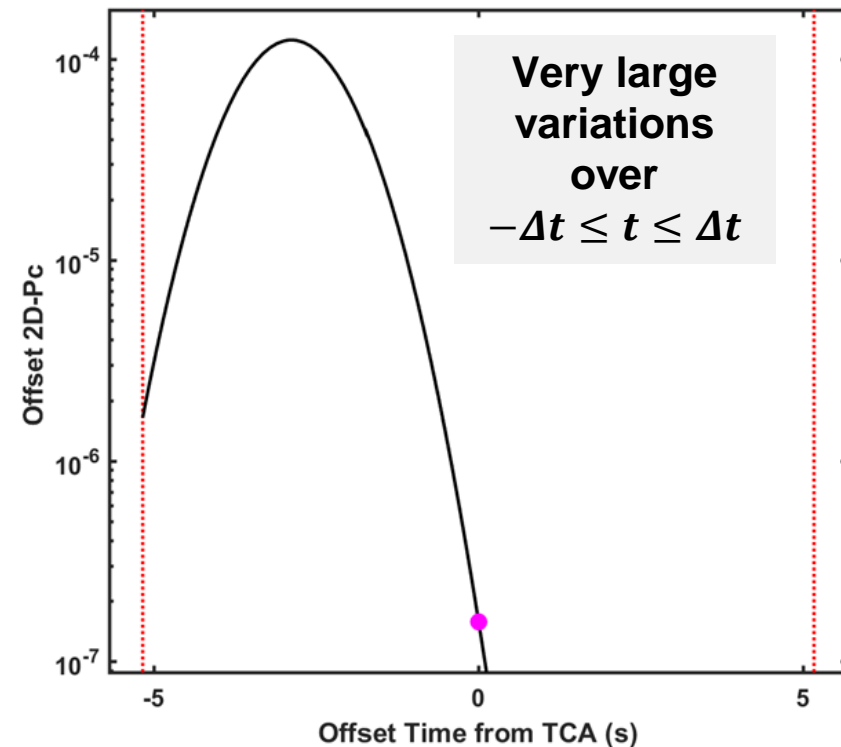
$V \rightarrow 0$  for small variations

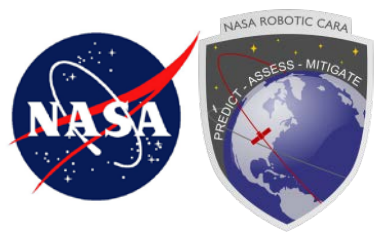
$V \rightarrow \infty$  for large variations

**OBSERVATION: All conjunctions found to have large 2D-Pc underestimation inaccuracies also have large variation metrics,  $V$**

## VAN ALLEN conjunction<sup>1</sup> with BFMC-Pc = 320 × 2D-Pc

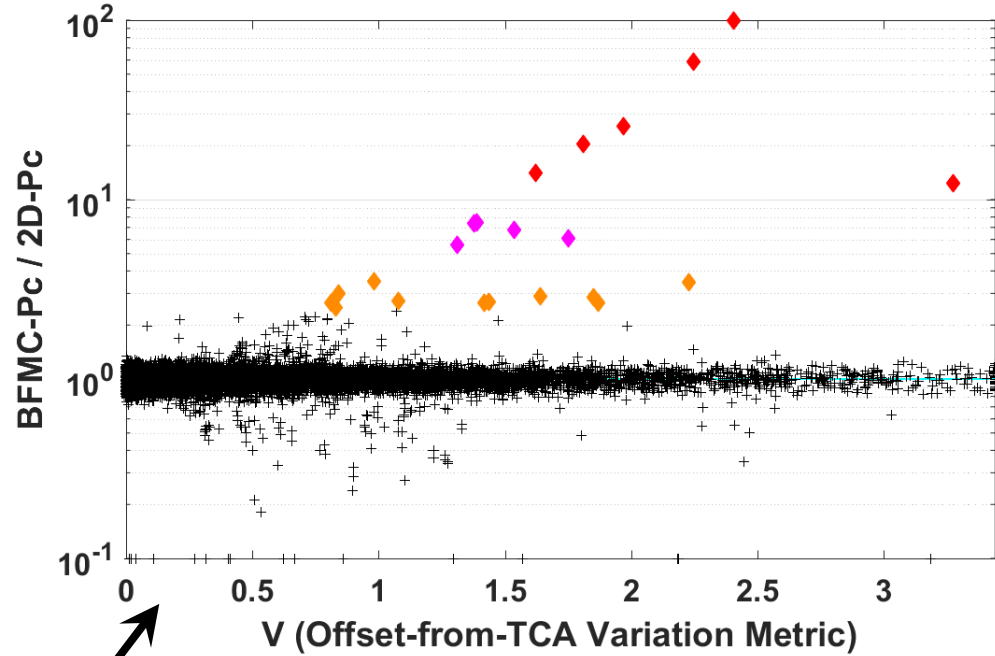
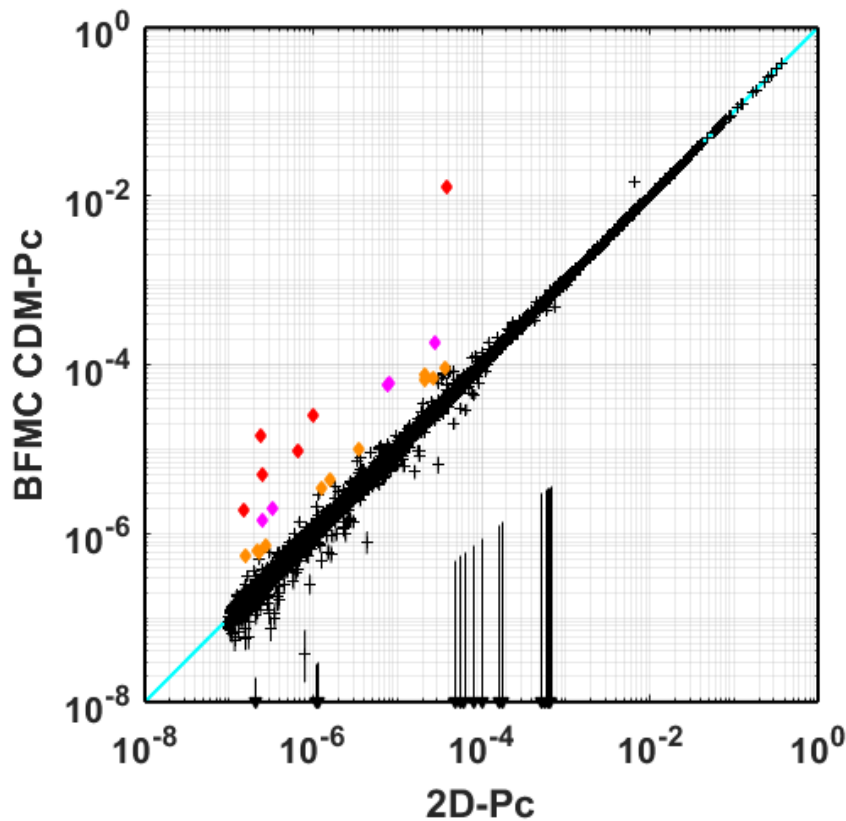
- 2D-Pc calculated at nominal TCA
- 2D-Pc calculated offset from nominal TCA
- ⋯ 2D-Pc assumption validity interval



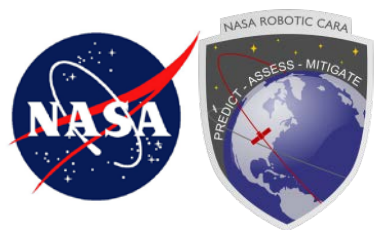


# Distribution of 2D-Pc Underestimates as a Function Offset-from-TCA Variations

- + CDM-Pc/2D-Pc < 2.5 (43573 of 43595)
- ◆ 2.5 ≤ CDM-Pc/2D-Pc < 5 (11 = 0.025%)
- ◆ 5 ≤ CDM-Pc/2D-Pc < 10 (5 = 0.011%)
- ◆ CDM-Pc/2D-Pc ≥ 10 (6 = 0.014%)



**OBSERVATION: All conjunctions found to have large 2D-Pc underestimation inaccuracies also have large variation metrics,  $V$ , but not vice versa**



# Boundary Condition that Isolates 2D-Pc Method Underestimation Failures

- All 2D-Pc underestimations exceeding  $\times 2.5$  occur above a boundary variation metric of

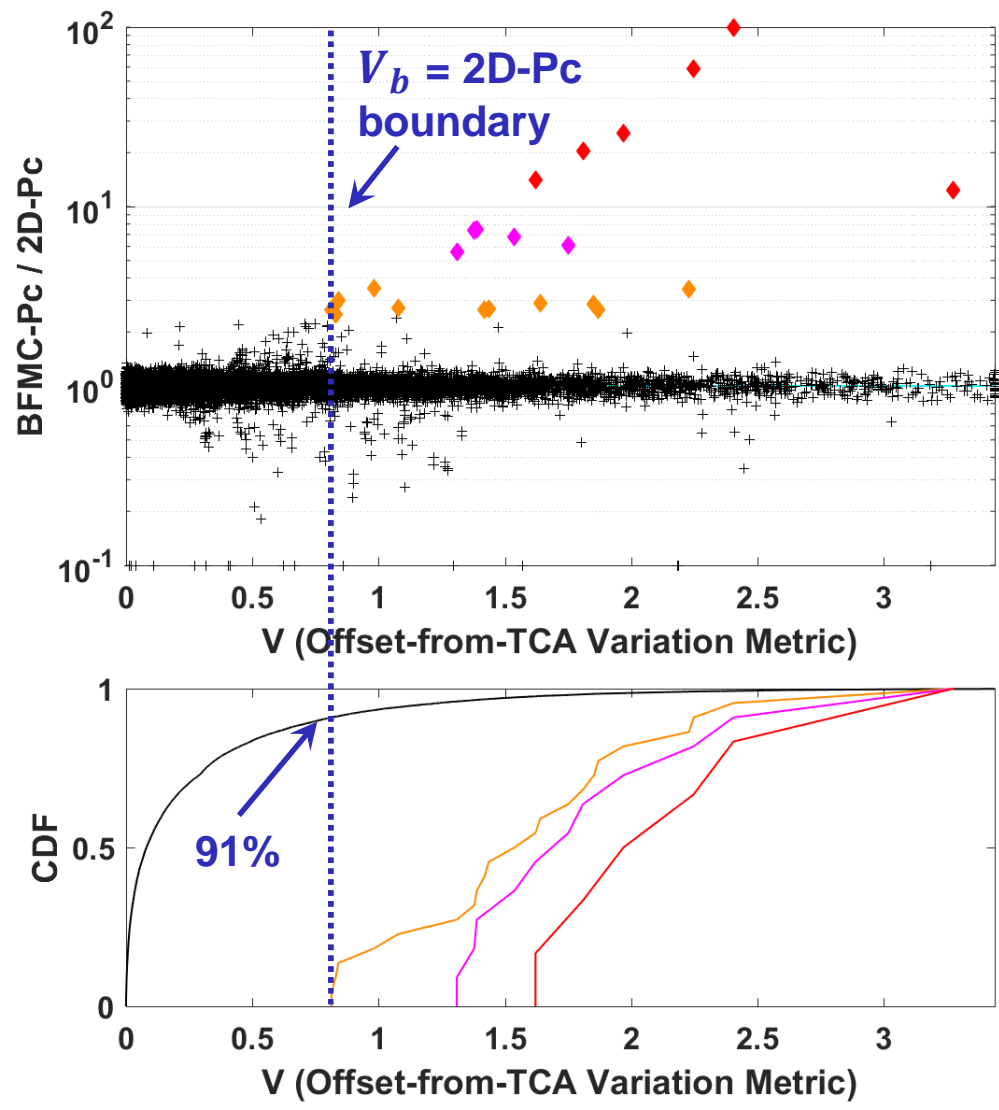
$$V_b = 0.8$$

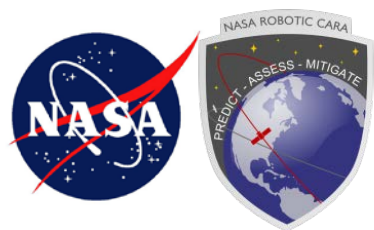
- The majority of events have variation metrics smaller than this boundary value

$V \leq V_b$  for 91% of events

$V > V_b$  for 9% of events

**2D-Pc Boundary Test:**  
 If  $V > V_b$  then 2D-Pc *could* underestimate the true Pc by a factor of 2.5 or more





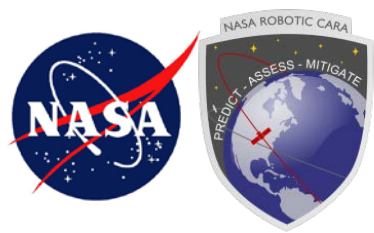
# 2D-Pc Boundary Test Missed Detection Frequencies

## Includes all analyzed data

| Number of 2D-Pc Underestimate Missed Detections<br>(among 43,595 conjunctions with 2D-Pc $\geq 1e-7$<br>occurring 2016-10-01 to 2019-01-22) |      |                              |     |     |     |      |
|---|------|------------------------------|-----|-----|-----|------|
|   |      | 2D-Pc Underestimation Factor |     |     |     |      |
|   |      | 2.0                          | 2.5 | 3.0 | 5.0 | 10.0 |
| Fraction Calculated with BFMC (%)   | 0.0  | 34                           | 22  | 14  | 11  | 6    |
|   | 1.0  | 30                           | 18  | 10  | 8   | 3    |
|   | 2.0  | 26                           | 14  | 8   | 6   | 1    |
|   | 3.0  | 22                           | 10  | 5   | 3   | 0    |
|   | 5.0  | 16                           | 5   | 1   | 0   | 0    |
|   | 10.0 | 7                            | 0   | 0   | 0   | 0    |
|   | 15.0 | 2                            | 0   | 0   | 0   | 0    |
|   | 20.0 | 1                            | 0   | 0   | 0   | 0    |
|   | 30.0 | 1                            | 0   | 0   | 0   | 0    |
|   | 40.0 | 0                            | 0   | 0   | 0   | 0    |
|   | 50.0 | 0                            | 0   | 0   | 0   | 0    |
| No missed detections in this data set   |      |                              |     |     |     |      |
| Missed detection fraction $\leq 1e-4$   |      |                              |     |     |     |      |
| Missed detection fraction $> 1e-4$  |      |                              |     |     |     |      |

## Includes only BFMC-Pc $\geq 10^{-5}$

| Number of 2D-Pc Underestimate Missed Detections<br>(among 43,595 conjunctions with 2D-Pc $\geq 1e-7$<br>occurring 2016-10-01 to 2019-01-22) |      |                              |     |     |     |      |
|---|------|------------------------------|-----|-----|-----|------|
|   |      | 2D-Pc Underestimation Factor |     |     |     |      |
|   |      | 2.0                          | 2.5 | 3.0 | 5.0 | 10.0 |
| Fraction Calculated with BFMC (%)   | 0.0  | 16                           | 10  | 8   | 6   | 3    |
|   | 1.0  | 14                           | 8   | 6   | 4   | 1    |
|   | 2.0  | 13                           | 7   | 5   | 3   | 0    |
|   | 3.0  | 12                           | 6   | 4   | 2   | 0    |
|   | 5.0  | 10                           | 4   | 2   | 0   | 0    |
|   | 10.0 | 6                            | 0   | 0   | 0   | 0    |
|   | 15.0 | 1                            | 0   | 0   | 0   | 0    |
|   | 20.0 | 0                            | 0   | 0   | 0   | 0    |
|   | 30.0 | 0                            | 0   | 0   | 0   | 0    |
|   | 40.0 | 0                            | 0   | 0   | 0   | 0    |
|   | 50.0 | 0                            | 0   | 0   | 0   | 0    |
| No missed detections in this data set   |      |                              |     |     |     |      |
| Missed detection fraction $\leq 1e-4$   |      |                              |     |     |     |      |
| Missed detection fraction $> 1e-4$  |      |                              |     |     |     |      |



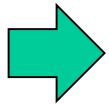
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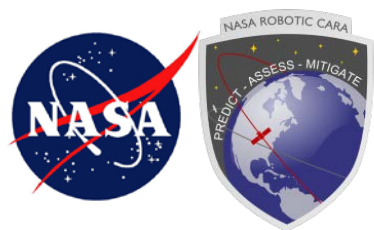
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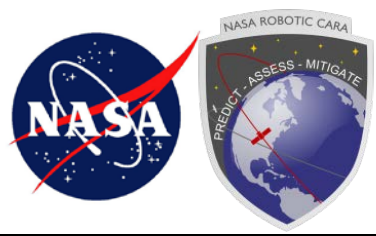


- **Conclusions and Recommendations**



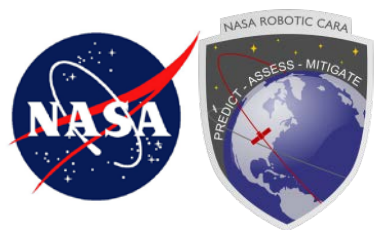
# Conclusions and Recommendations

- A diagnostic boundary test can be used to identify potential 2D-Pc method underestimation failures
  - Analysis based on a set of ~44,000 CARA conjunctions analyzed using *Brute Force Monte Carlo* simulations to establish truth Pc values
  - Boundary test uses the amplitude of “offset-from-TCA” variations as an indicator of accuracy in the 2D-Pc approximation
  - The test identifies all large-amplitude 2D-Pc underestimations detected to date, with a high false-alarm rate
- **RECOMMENDATIONS: For future conjunctions with  $2D-Pc \geq 10^{-7}$** 
  - **HIGH PRIORITY:** Estimate BFMC-fidelity Pc values for the **10% of events** with the largest offset-from-TCA variation metrics
  - **MEDIUM PRIORITY:** Estimate BFMC-fidelity Pc values for the **20% of events** with the largest offset-from-TCA variation metrics
  - **LOW PRIORITY:** Estimate BFMC-fidelity Pc values for **all events**



# Backup Slides





# Using Offset-from-TCA Variations as an Indicator of 2D-Pc Underestimation

- The variation metric introduced previously

$$V = \log_{10} [P_c^{max} / P_c^{min}]$$

was developed to indicate any 2D-Pc inaccuracies, both underestimates and overestimates

- A slightly different metric works somewhat better for indicating underestimates alone

$$V = \log_{10} [P_c^{max} / P_c^{mid}]$$

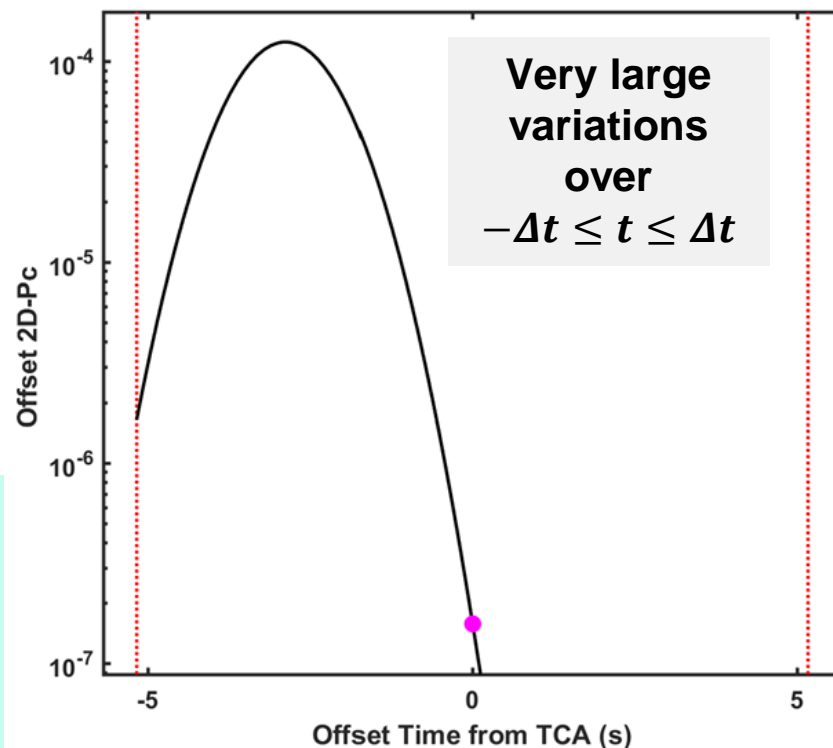
with

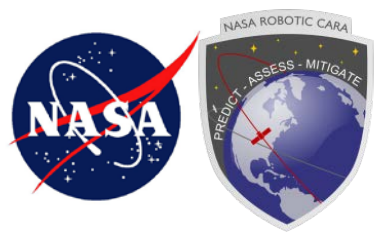
$$P_c^{mid} = (P_{c,0} + P_c^{min}) / 2$$

This analysis focuses on using this metric to establish a “2D-Pc validity boundary” within which no large-amplitude 2D-Pc underestimates exist

## VAN ALLEN conjunction<sup>1</sup> with BFMC-Pc = 320 × 2D-Pc

- 2D-Pc calculated at nominal TCA
- 2D-Pc calculated offset from nominal TCA
- ⋯ 2D-Pc assumption validity interval





# Offset Variations for Other Likely 2D-Pc Failures (from SSPAT Low Relative Velocity Project Data Set)

**Long Duration Conjunction:**  
 $N_{min} = 2$       $\Delta t / T_{orb} = 0.94$

**Repeating Conjunction**  
 $N_{min} = 4$       $\Delta t / T_{orb} = 2.4$

- 2D-Pc calculated at nominal TCA
- 2D-Pc calculated offset from nominal TCA
- ⋯ 2D-Pc assumption validity interval
- - - Minimum primary or secondary orbital period

- 2D-Pc calculated at nominal TCA
- 2D-Pc calculated offset from nominal TCA
- ⋯ 2D-Pc assumption validity interval
- - - Minimum primary or secondary orbital period

*Offset-from-TCA Variations*

39208\_conj\_39357\_20170407\_172814\_20170407\_000821  
 TCA 2D-Pc = 0.176986  
 $0.0293214 \leq \text{Offset 2D-Pc} \leq 0.186428$

*Offset-from-TCA Variations*

39208\_conj\_39357\_20170408\_014633\_20170406\_155951  
 TCA 2D-Pc = 0.0909318  
 $0.0477594 \leq \text{Offset 2D-Pc} \leq 0.127747$

