

# Probabilistic Investigation of Sensitivities of Advanced Test-Analysis Model Correlation Methods

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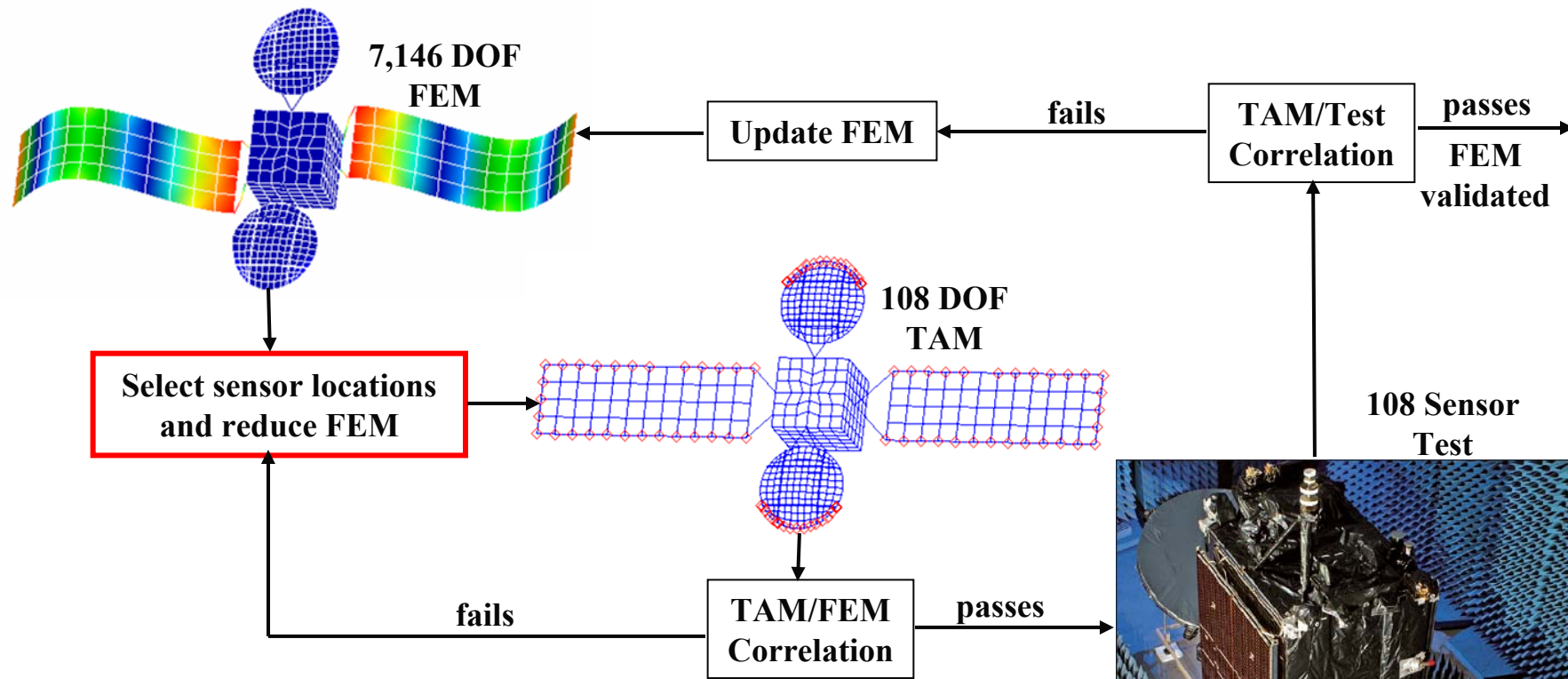
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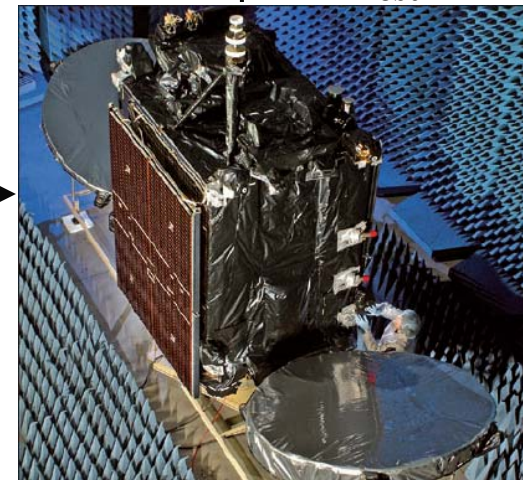


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# Test Analysis Correlation



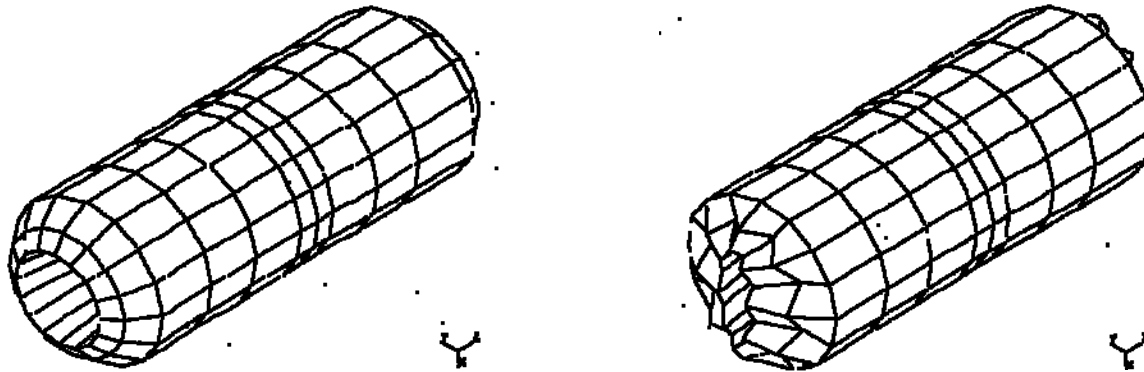
- ❑ FEM mass matrix must be reduced to test degrees of freedom (TAM) in order to compute modal orthogonality.



Orbital Sciences

# The Controversy

- Current FEM reduction algorithms
  - Static TAM: fails for heavy, soft structures. May be difficult to achieve good TAM/FEM correlation



Fundamental FEM propellant mode (left) and fundamental FEM propellant mode predicted by Static TAM (right)

- Improved Reduced Static (IRS) TAM: ill-conditioned under certain circumstances
- Modal TAM: Trivial to achieve perfect TAM/FEM correlation, however it has a reputation of being highly sensitive to experimental or modal-mismatch errors

# Purpose of Research

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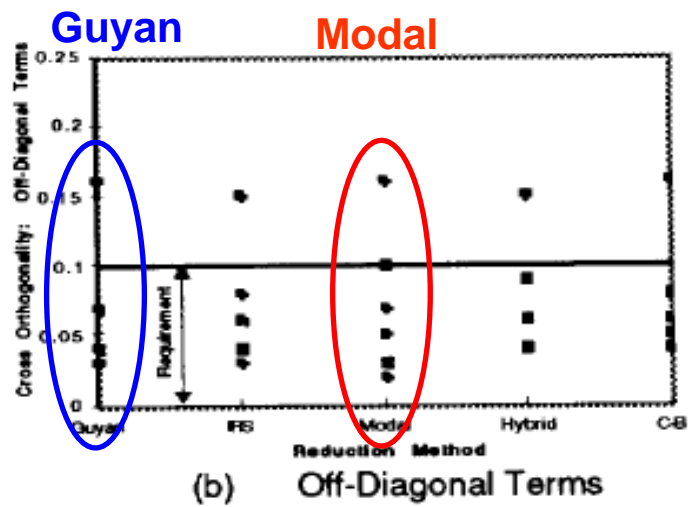
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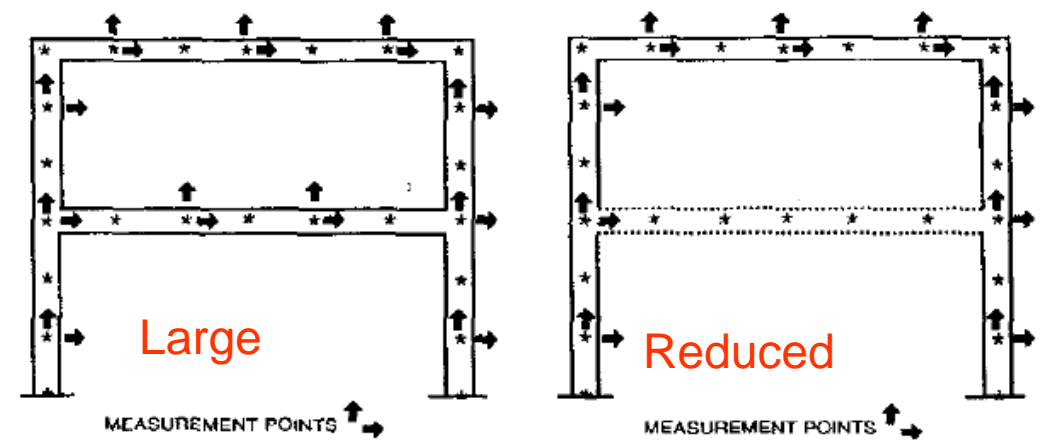
- Study the sensitivity of various TAMs to gain insight into factors that strongly affect sensitivity
- A probabilistic analysis will be used to characterize the effect of measurement errors on TAM sensitivity

# Relevant Literature

- ❑ Freed, AM and Flanigan, CC (1990): Modal TAM most sensitive, sensors placed using modal kinetic energy
- ❑ Avitabile, P, Pechinsky, F, and O’Callahan, J (1992): Sensor placement is vital to TAM performance, SEREP and Hybrid perform better than Static TAM for small sensor sets
- ❑ Chung, YT (1998): Sensor placement was not discussed and no significant difference could be seen between the TAMs



Cross Orthogonality of Test Tower (Chung 1998)



Avitabile, P, Pechinsky, F, and O’Callahan, J (1992)

# Relevant Literature

- Gordis, JH (1992), Blesloch, P and Vold, H (2005) :

- Notes ill-conditioning in dynamic reduction equation:

$$\{\phi_{io}\} = -[K_{oo} - \omega_i^2 M_{oo}]^{-1} [K_{oa} - \omega_i^2 M_{oa}] \{\phi_{ia}\}$$

- Proposes that IRS TAM will be ill conditioned if the natural frequencies of the structure with the o-set DOF pinned are similar to the frequencies of the structure of interest.
    - Recently, this theory seems to have been applied to other TAM techniques such as the Modal TAM.

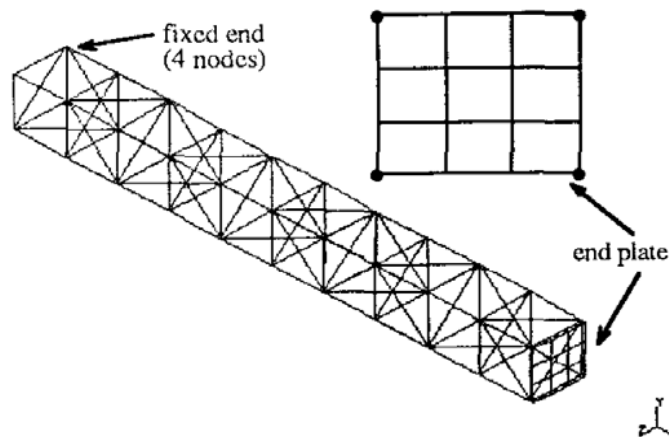


Table 3b. TBT #1 Orthogonality:

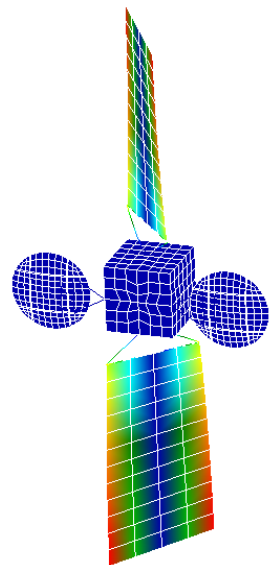
$$\Phi_{test}^T \cdot m_{IRS} \cdot \Phi_{test}$$

	1	2	3	4	5	6	7	8	9
1	100	82	22	-17	8	84	17	58	-45
2		100	-7	-24	4	66	3	65	-43
3			100	16	15	29	31	-19	3
4				100	-1	-8	4	-21	8
5					100	4	4	-2	-4
6						100	30	40	-47
7							100	-13	-3
8								100	-39
9									100

Figure 1. The NASA/Langley 10-Bay Truss.

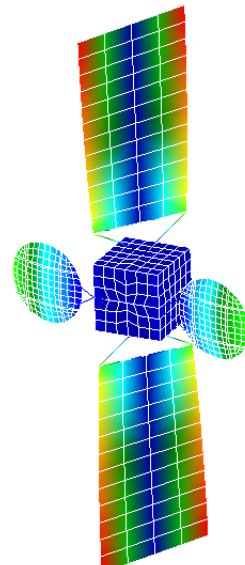
# Model

- Generic Satellite
  - 7,146 DOF
  - Target modes: first 18 consecutive flexible modes (0.3-11.8 Hz)
  - 108 sensors



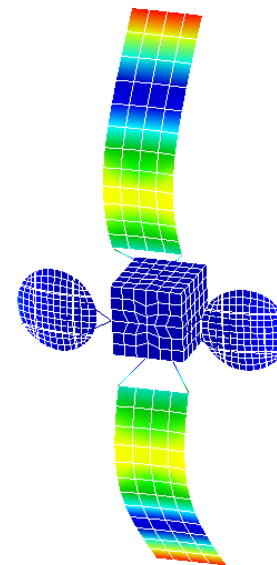
**Target Mode 5**

**2.7 Hz**



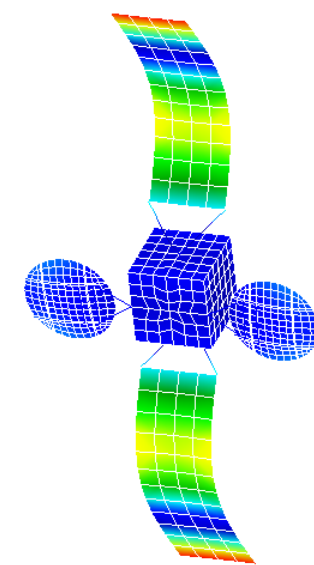
**Target Mode 6**

**2.8 Hz**



**Target Mode 7**

**3.5 Hz**



**Target Mode 8**

**3.7 Hz**

# Test Analysis Models – Static TAM



**a = sensor location**

**o = omitted DOF**

**Eigenvalue problem**

$$-\omega_i^2 \begin{bmatrix} M_{aa} & M_{ao} \\ M_{oa} & M_{oo} \end{bmatrix} \begin{Bmatrix} \phi_{ia} \\ \phi_{io} \end{Bmatrix} + \begin{bmatrix} K_{aa} & K_{ao} \\ K_{oa} & K_{oo} \end{bmatrix} \begin{Bmatrix} \phi_{ia} \\ \phi_{io} \end{Bmatrix} = 0$$

**Lower partition equation**

$$\begin{bmatrix} K_{oa} - \omega_i^2 M_{oa} \end{bmatrix} \begin{Bmatrix} \phi_{ia} \end{Bmatrix} + \begin{bmatrix} K_{oo} - \omega_i^2 M_{oo} \end{bmatrix} \begin{Bmatrix} \phi_{io} \end{Bmatrix} = 0$$

**Neglect the mass of the  
o-set DOF**

$$\begin{Bmatrix} \phi_{io} \end{Bmatrix} = - \begin{bmatrix} K_{oo} - \omega_i^2 M_{oo} \end{bmatrix}^{-1} \begin{bmatrix} K_{oa} - \omega_i^2 M_{oa} \end{bmatrix} \begin{Bmatrix} \phi_{ia} \end{Bmatrix}$$

**Static Transformation Matrix (each  
column represents a constraint mode)**

$$[T_S] = \begin{bmatrix} I \\ -K_{oo}^{-1} K_{oa} \end{bmatrix}$$



# Test Analysis Models – IRS TAM



$$\{\phi_{io}\} = -\left[ K_{oo} - \omega_i^2 M_{oo} \right]^{-1} \left[ K_{oa} - \omega_i^2 M_{oa} \right] \{\phi_{ia}\}$$

Ill-conditioned when  $\omega_i^2$  is near any of the eigenvalues of the  $K_{oo}, M_{oo}$  system

Approximate the frequency terms

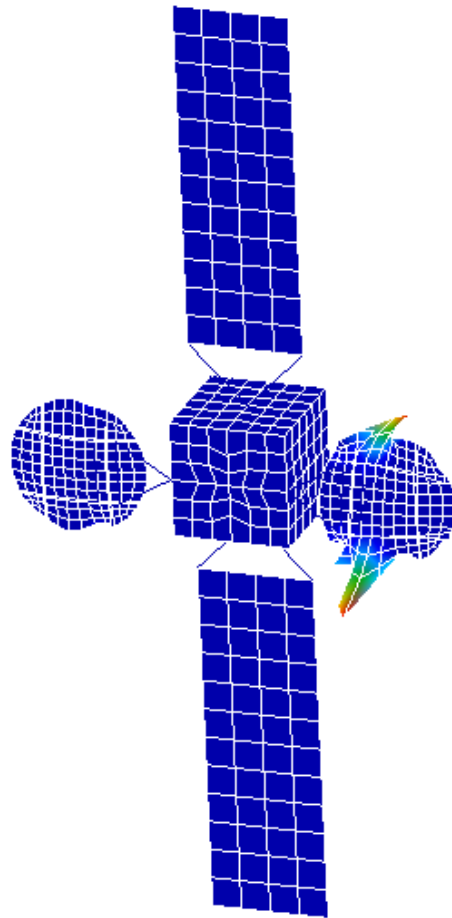
$$\omega_i^2 \{\phi_{ia}\} = \tilde{M}_S \tilde{K}_S^{-1} \{\phi_{ia}\}$$

Calculate the IRS transformation matrix

$$[T_{IRS}] = [T_S] + [T_i]$$

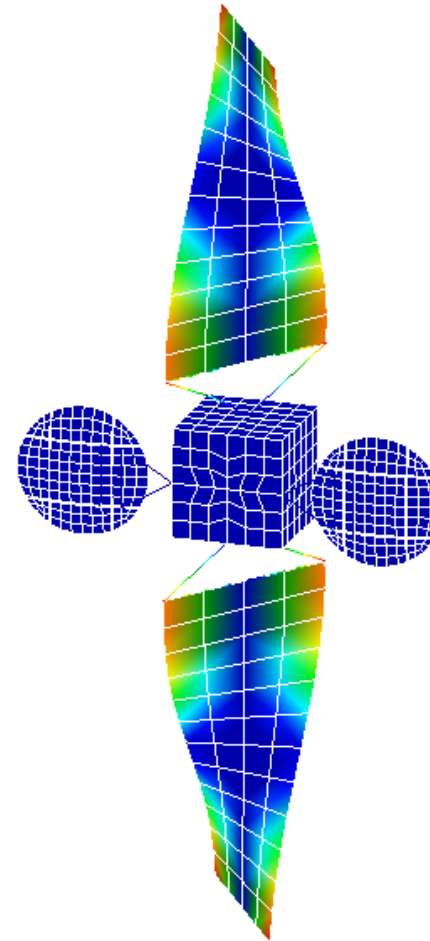
$$[T_i] = - \begin{bmatrix} 0 & 0 \\ 0 & -K_{oo}^{-1} \end{bmatrix} \begin{bmatrix} M_{aa} & M_{ao} \\ M_{oa} & M_{oo} \end{bmatrix} \begin{bmatrix} I \\ -K_{oo}^{-1} K_{oa} \end{bmatrix} \tilde{M}_S^{-1} \tilde{K}_S$$

# Test Analysis Models – IRS TAM



**O-set system Mode 1**

**16.8 Hz**



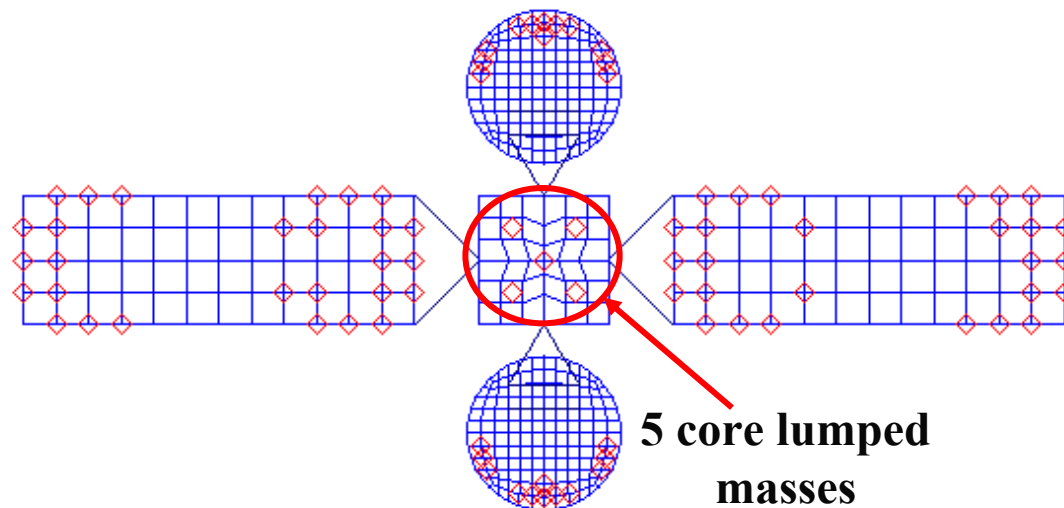
**FEM Target Mode 18**

**11.8 Hz**

# Test Analysis Models – Static and IRS TAM



- ❑ Mass weighted effective independence did not select the lumped masses (the lumped masses were essential to TAM-FEM correlation)
- ❑ Modal kinetic energy applied to all 18 target modes was not sufficient
- ❑ A significant amount of hand selection and engineering judgment was used (modified modal kinetic energy method)



# Test Analysis Models – Modal TAM



**Physical coordinates in terms of modal coordinates**

$$\begin{Bmatrix} x_a \\ x_o \end{Bmatrix} = \begin{bmatrix} \phi_a \\ \phi_o \end{bmatrix} \{q\}$$

**Partitioned Equations**

$$\{x_a\} = [\phi_a] \{q\}$$

$$\{x_o\} = [\phi_o] \{q\}$$

**Solve for modal coordinates in terms of the sensor DOF**

$$\{q\} = [\phi_a^T \phi_a]^{-1} [\phi_a^T] \{x_a\}$$

**Modal transformation matrix**

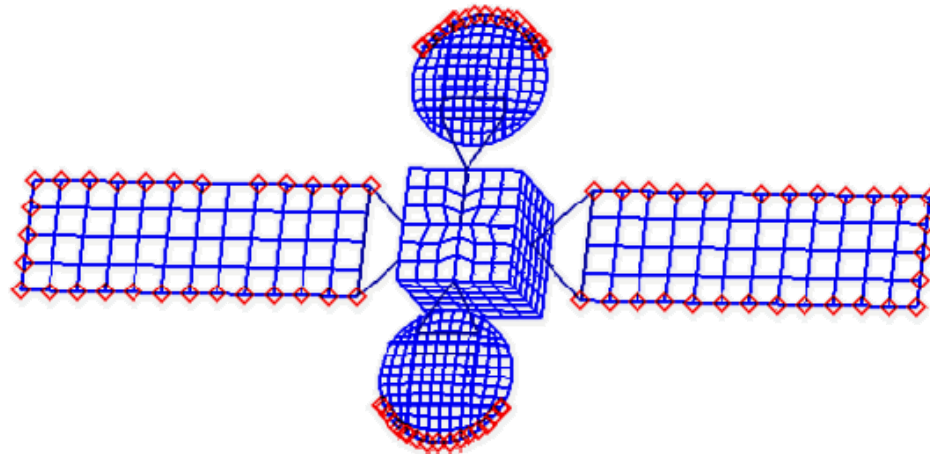
$$[T_M] = \begin{bmatrix} I \\ \phi_o (\phi_a^T \phi_a)^{-1} \phi_a^T \end{bmatrix}$$

# Test Analysis Models – Modal TAM

- Sensor placement achieved with Effective Independence

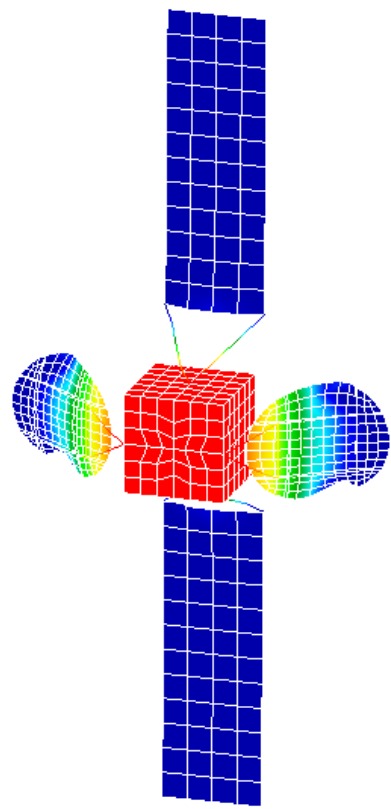
Maximize the determinant of the Fisher information matrix  $\max \|Q\| = \max \|\phi_a^T \phi_a\|$

Effective Independence  $E_{Di} = \phi_a^i Q^{-1} \phi_a^{iT} \quad 0.0 \leq E_{Di} \leq 1.0$



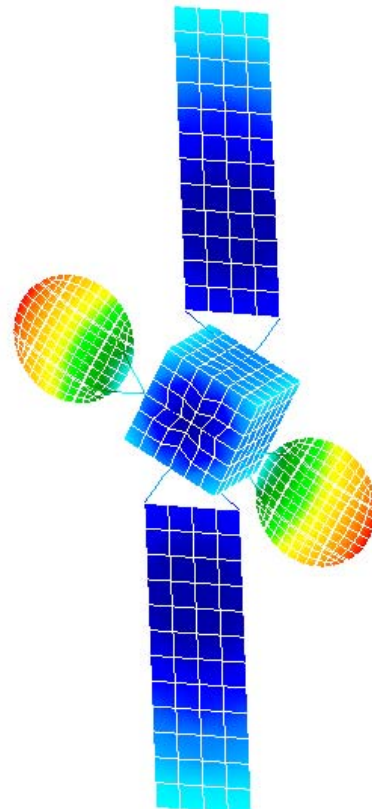
# Test Analysis Models – Modal TAM

Modal TAM o-set frequencies are similar to the FEM frequencies, so the theory of Gordis suggests that this TAM will be sensitive.



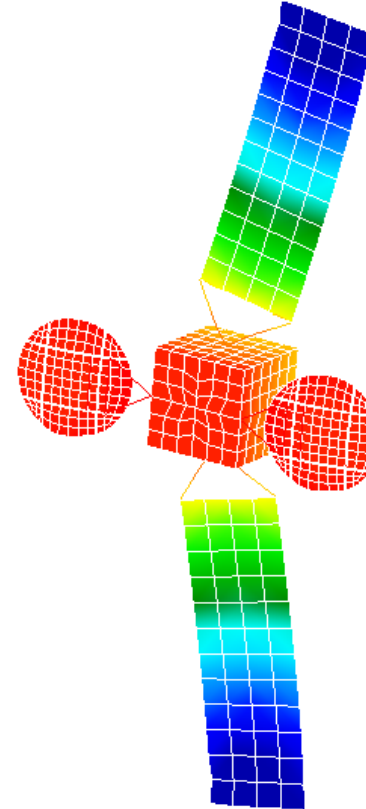
**O-set system Mode 2**

**1.2 Hz**



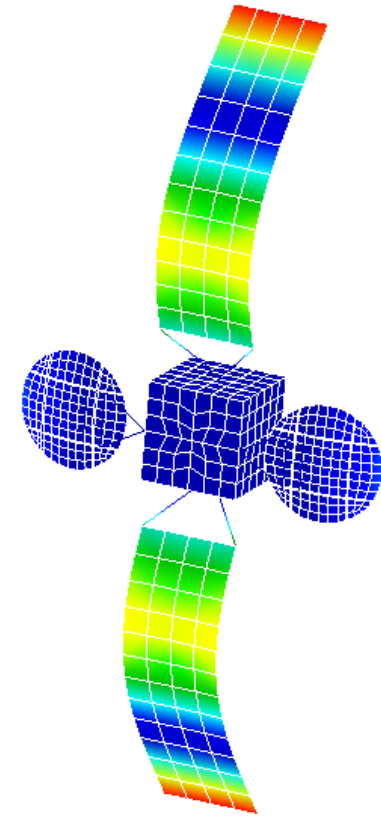
**FEM Target Mode 4**

**1.8 Hz**



**O-set system Mode 5**

**3.2 Hz**



**FEM Target Mode 7**

**3.5 Hz**

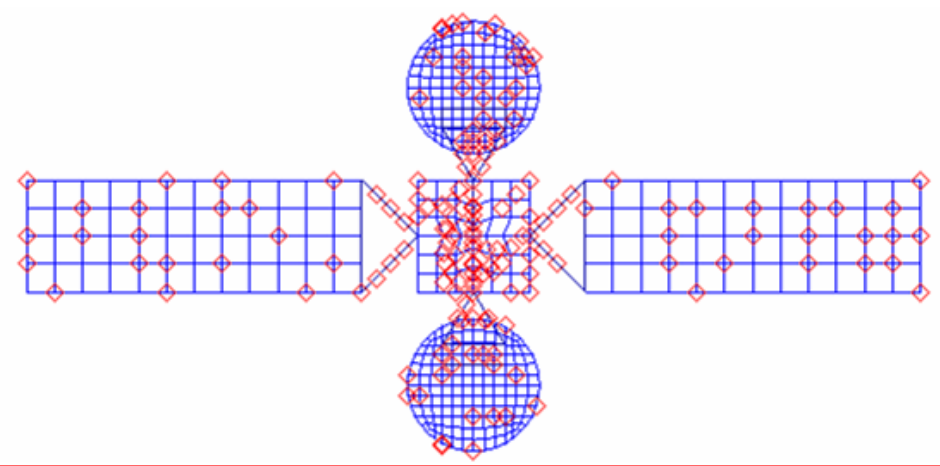
# Test Analysis Models – Modal using Condition Number Sensor Placement

Modal coordinates in terms  
of the sensor DOF

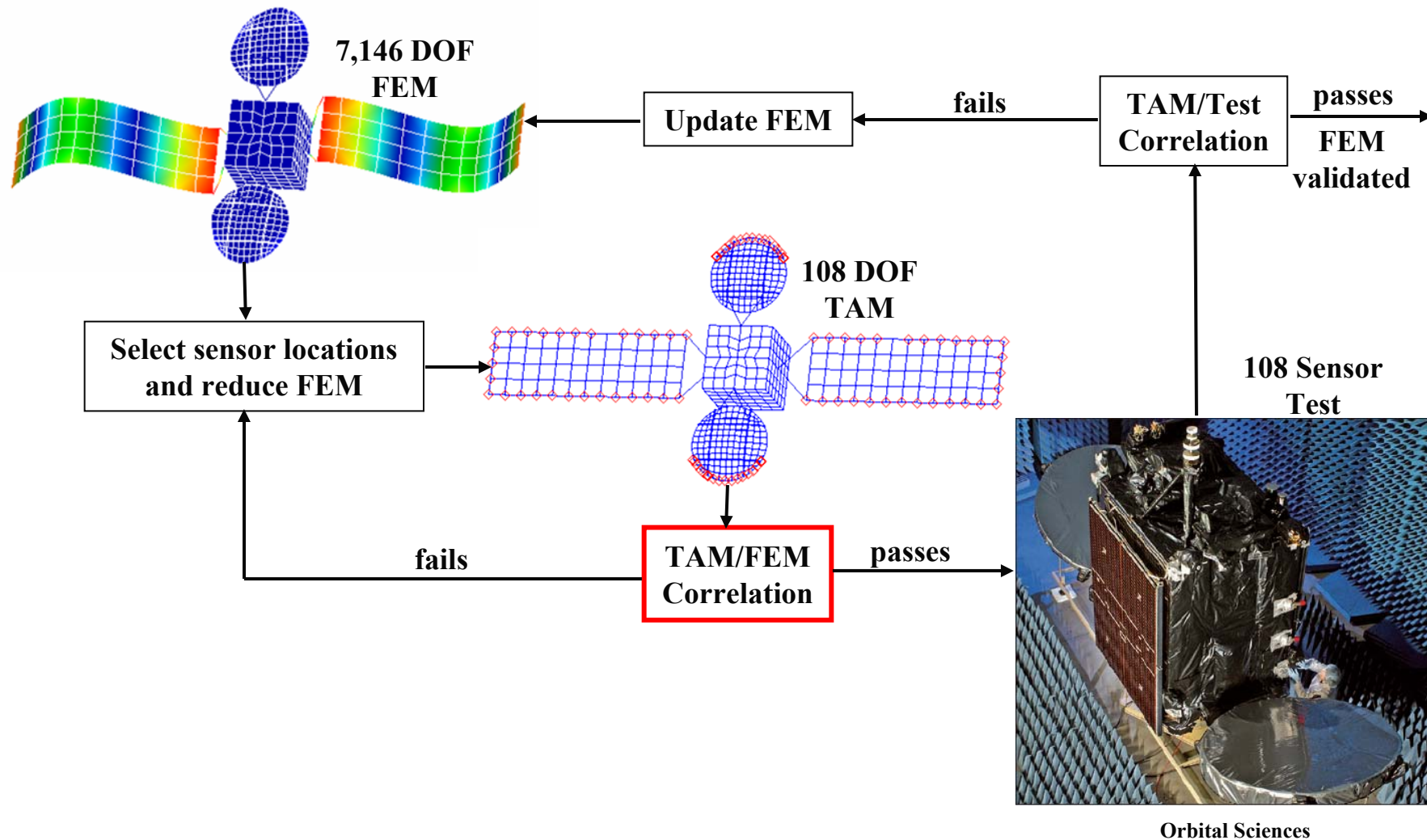
$$\{q\} = \left[ \phi_a^T \phi_a \right]^{-1} \left[ \phi_a^T \right] \{x_a\}$$

Solution is more sensitive if the condition  
number of  $\phi_a$ , is large.

Begin with a visualization set, and add sensors that minimize  
the condition number of  $\phi_a$



# Test Analysis Correlation





# Correlation Metrics



## □ Orthogonality

- Criteria:  $0 \leq \text{off diagonal term} \leq 0.1$

$$O = [\phi_{FEM}]^T [\tilde{M}_{TAM}] [\phi_{FEM}]$$

## □ Cross Orthogonality

- Criteria:  $0 \leq \text{off diagonal term} \leq 0.1$

$$0.95 \leq \text{diagonal term} \leq 1.0$$

$$CO = [\phi_{FEM}]^T [\tilde{M}_{TAM}] [\phi_{TAM}]$$

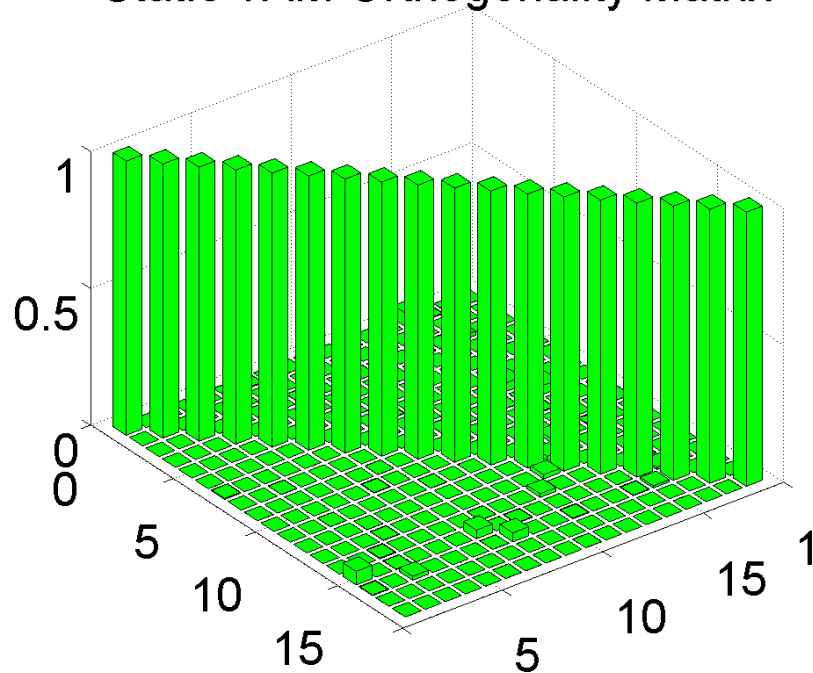
## □ Frequency Comparison

- Criteria:  $f_{error} = \frac{f_{FEM} - f_{TAM}}{f_{FEM}} * 100 \leq 3\%$

# TAM-FEM Correlation

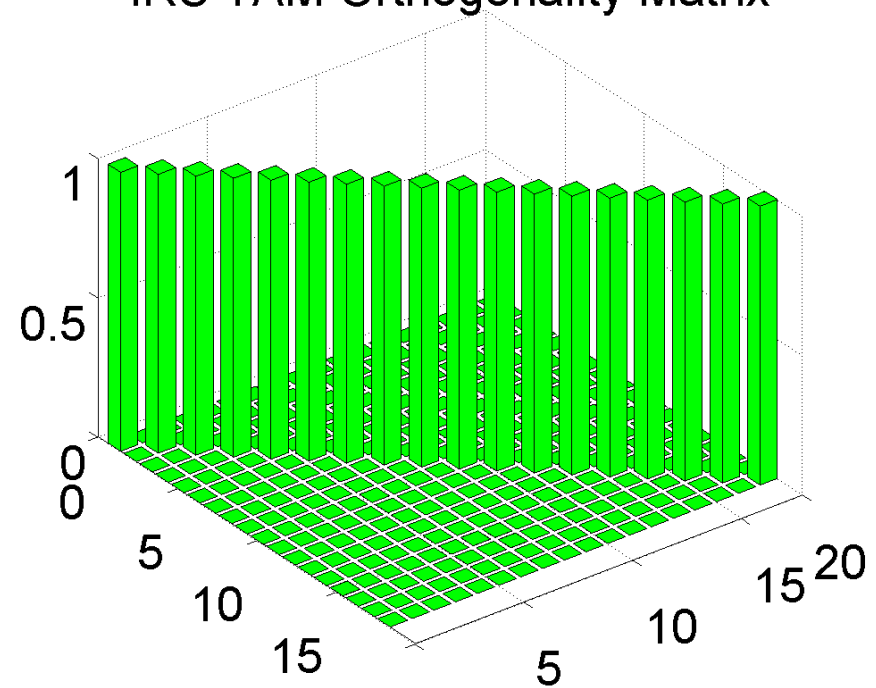


Static TAM Orthogonality Matrix



Max off diagonal term: 0.05

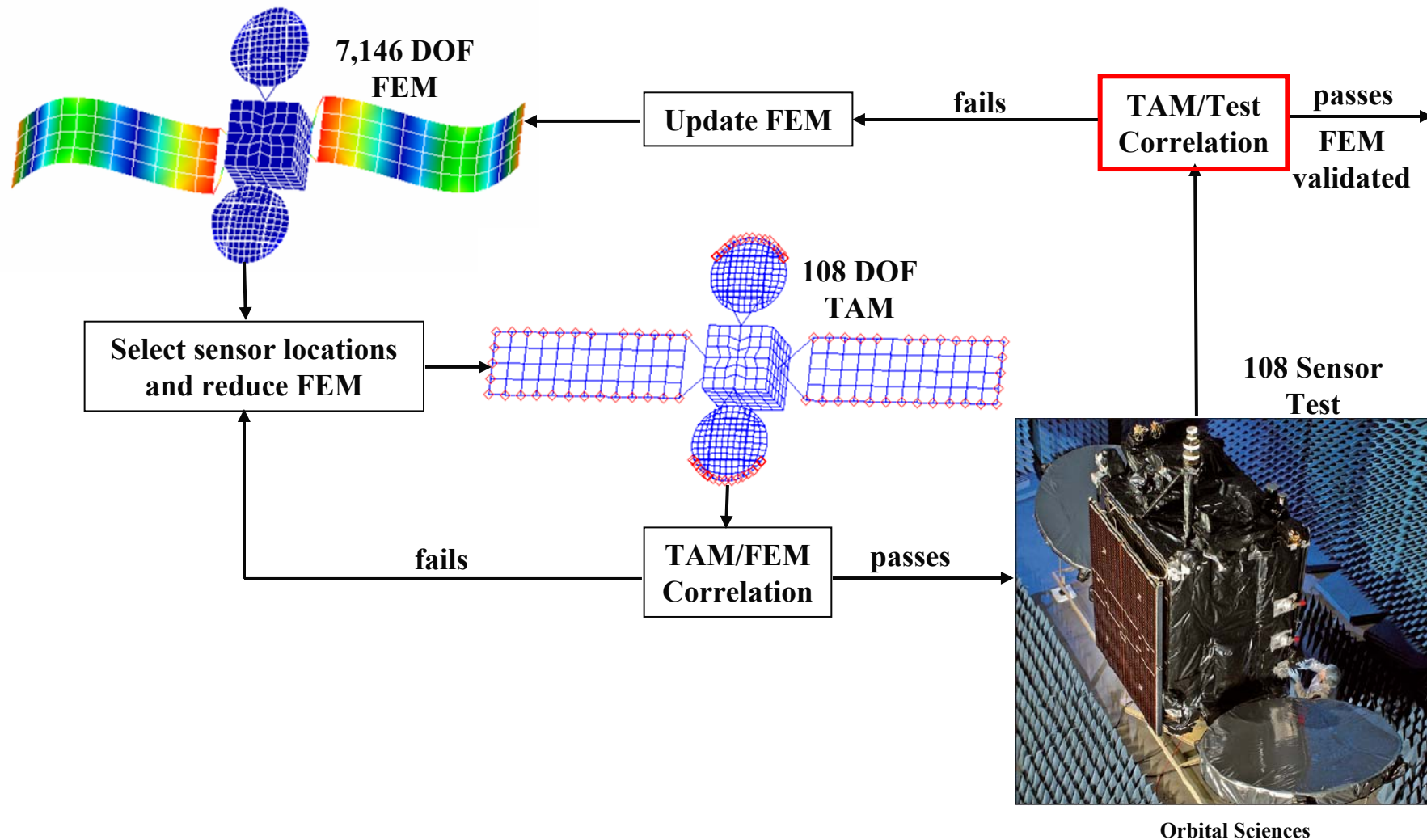
IRS TAM Orthogonality Matrix



Max off diagonal term: 6e-4

**\*Modal TAM always produces perfect orthogonality for TAM-FEM correlation**

# Test Analysis Correlation



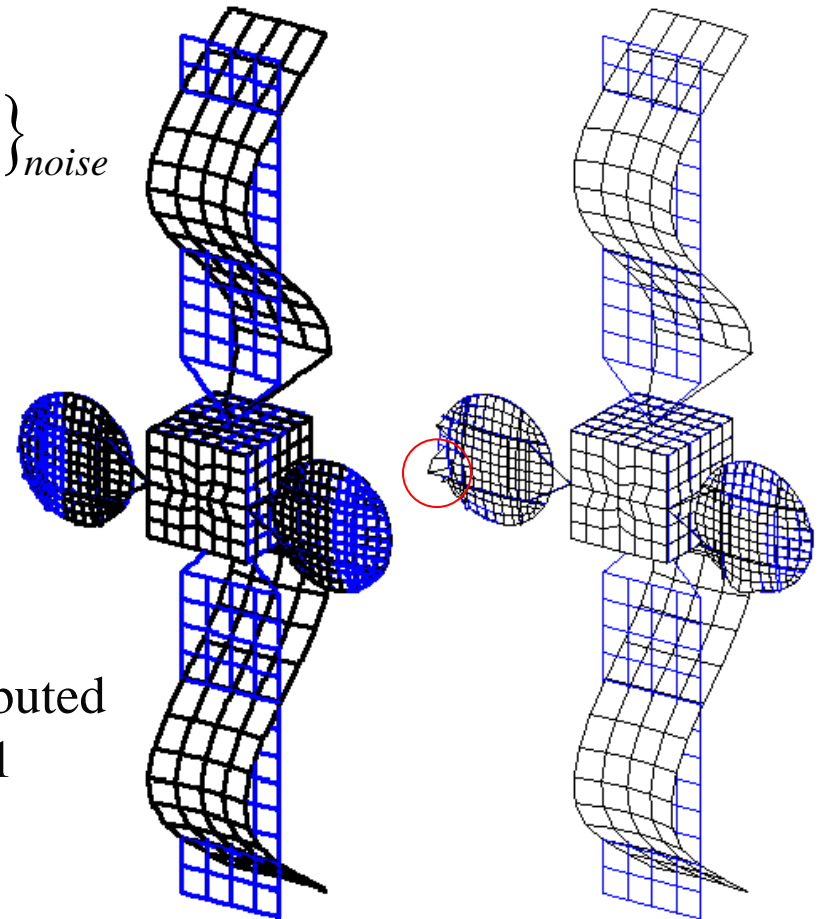
# Noise Model and Simulated Test Mode Shapes

$$\{\phi\}_{FEM}^i = \begin{Bmatrix} \phi_1^i \\ \phi_2^i \\ \vdots \\ \phi_{n-1}^i \\ \phi_n^i \end{Bmatrix}$$

Max value  $\rightarrow * 2\% * \{U\} = \{\phi\}_{noise}$

$$\{\phi\}_{Test}^i = \{\phi\}_{noise} + \{\phi\}_{FEM}^i$$

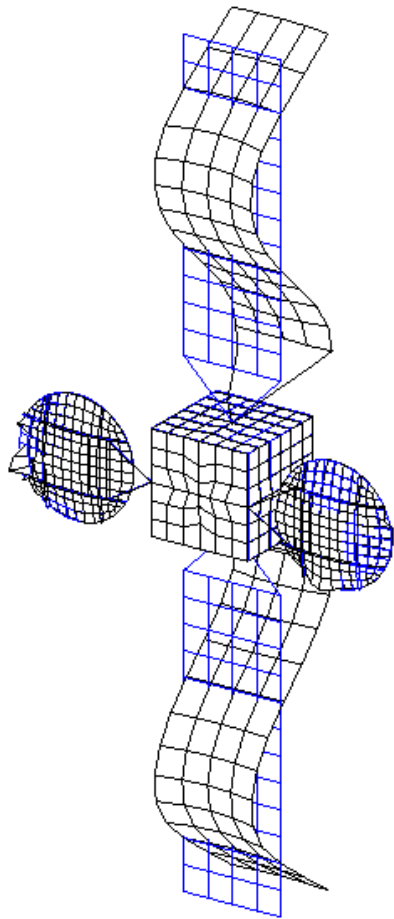
$\{U\} =$  column vector of uniformly distributed random numbers between -1 and 1



**FEM target  
mode 15**

**Test target  
mode 15**

# Noise Model



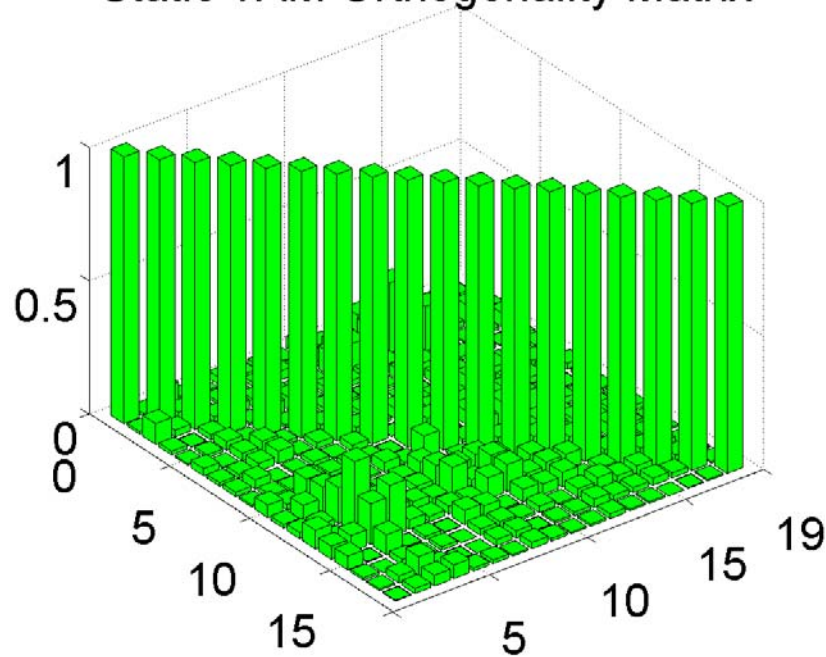
Noise contaminated  
mode shape

- FEM assumed to be perfect
- Noise vector models the net effect of all errors that cause the FEM mode shapes to disagree with the test mode shapes.
  - Noise Distribution: Uniform – no assumption is made about the distribution of noise
  - Noise Amplitude: Sensors with the smallest motion have the largest noise to signal ratio
  - Noise is small on average:  $\pm 2\%$  at sensor locations with the largest motion.

# TAM-Test Correlation Results (1 case of Random Noise)

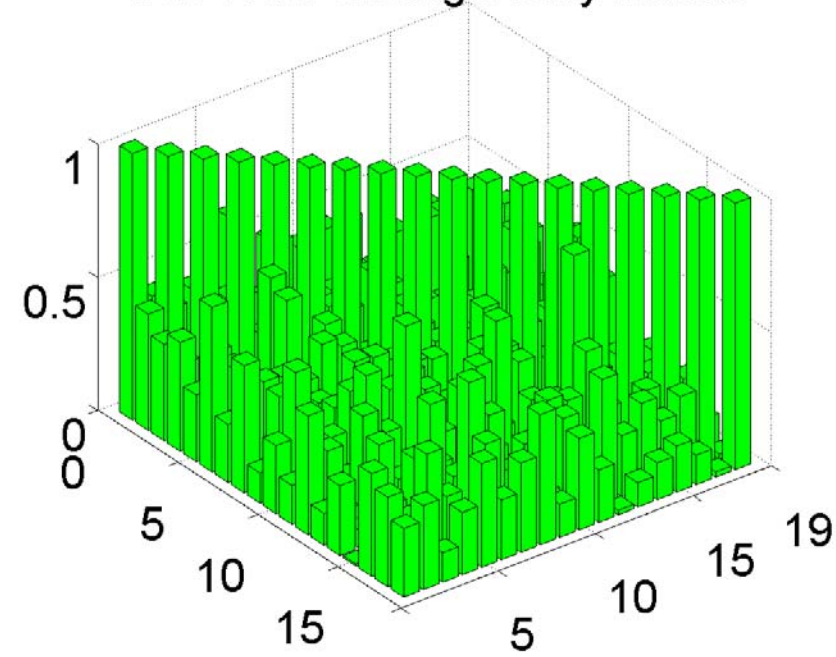


Static TAM Orthogonality Matrix



**Max off diagonal term: 0.27**

IRS TAM Orthogonality Matrix

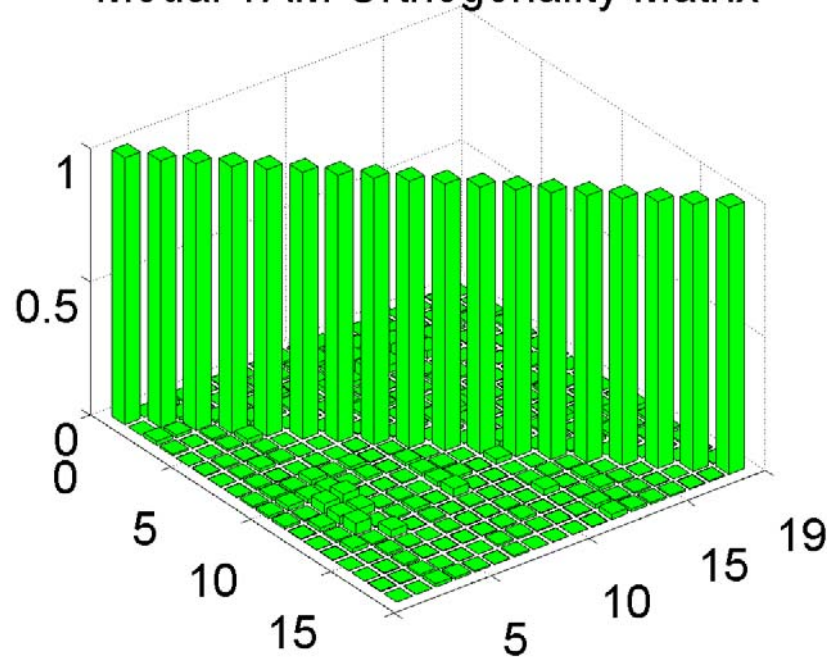


**Max off diagonal term: 0.79**

# TAM-Test Correlation Results (1 case of Random Noise)

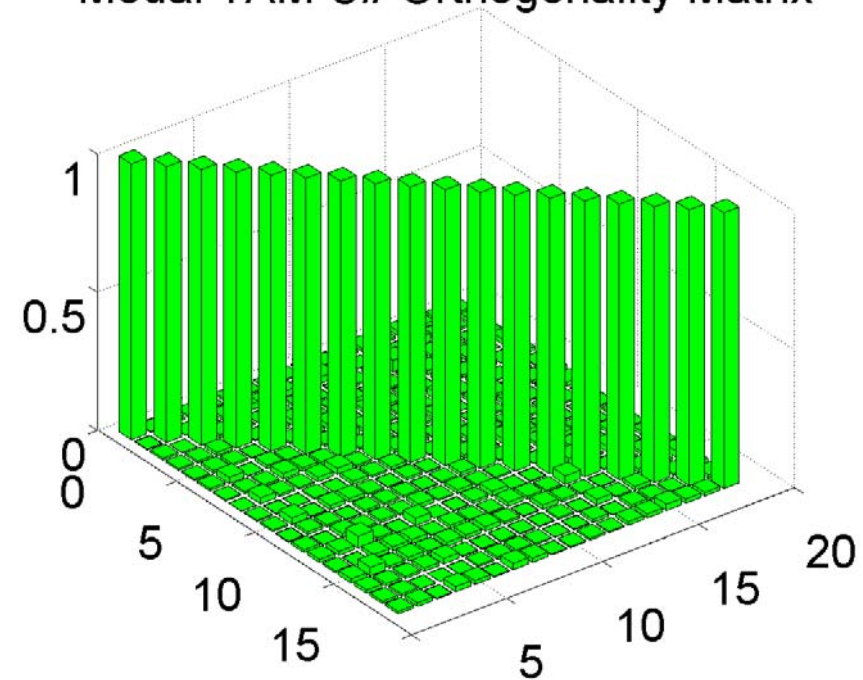


Modal TAM Orthogonality Matrix



**Max off diagonal term: 0.05**

Modal TAM C# Orthogonality Matrix



**Max off diagonal term: 0.04**

# Monte Carlo Simulation

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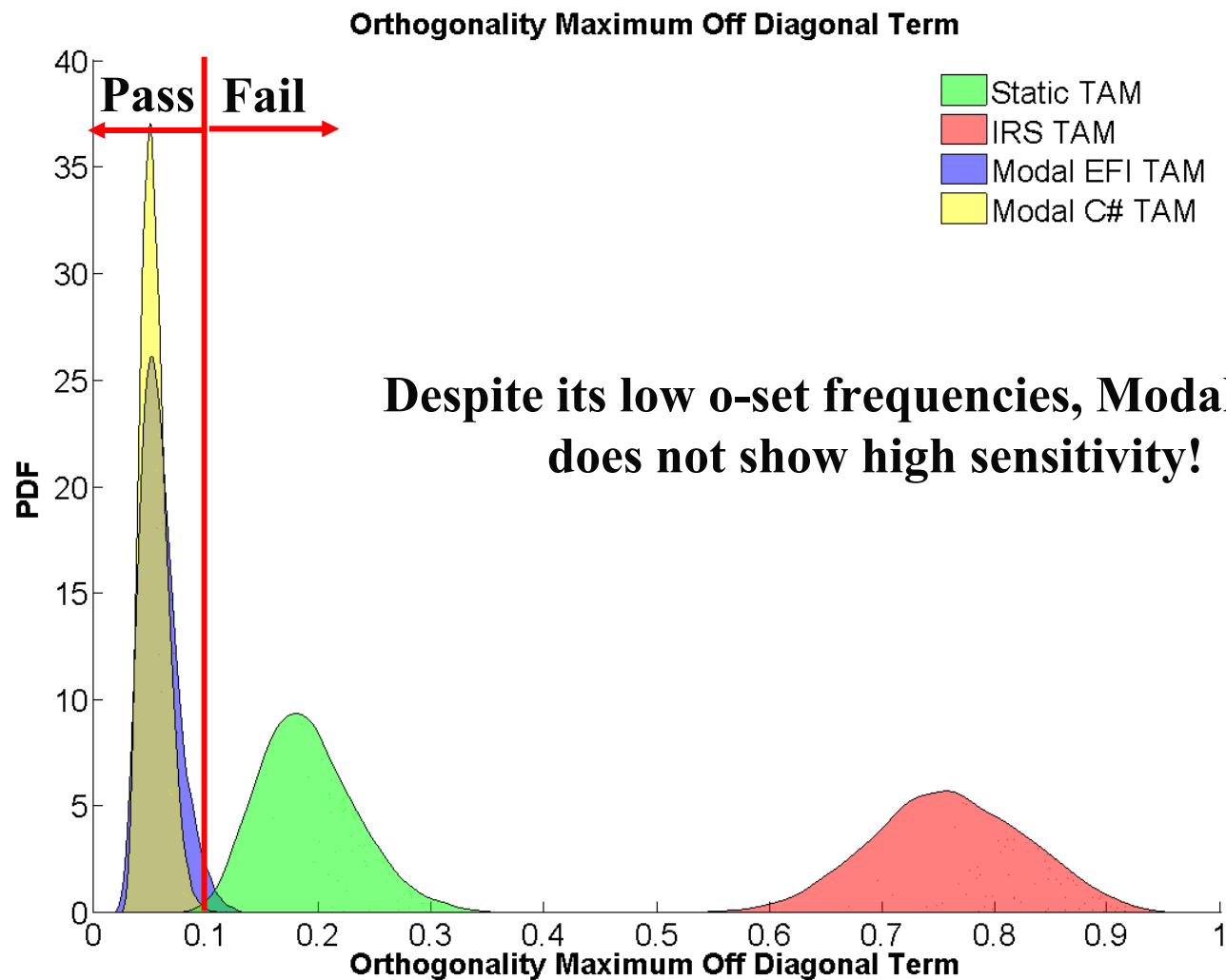
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- Thus far, TAM-Test correlation has been studied using only one noise profile
  - Random noise added in 10,000 iterations
  - Orthogonality computed for each iteration
  - Maximum off-diagonal term of orthogonality was stored
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# TAM-Test Correlation Results



# TAM-Test Correlation Results

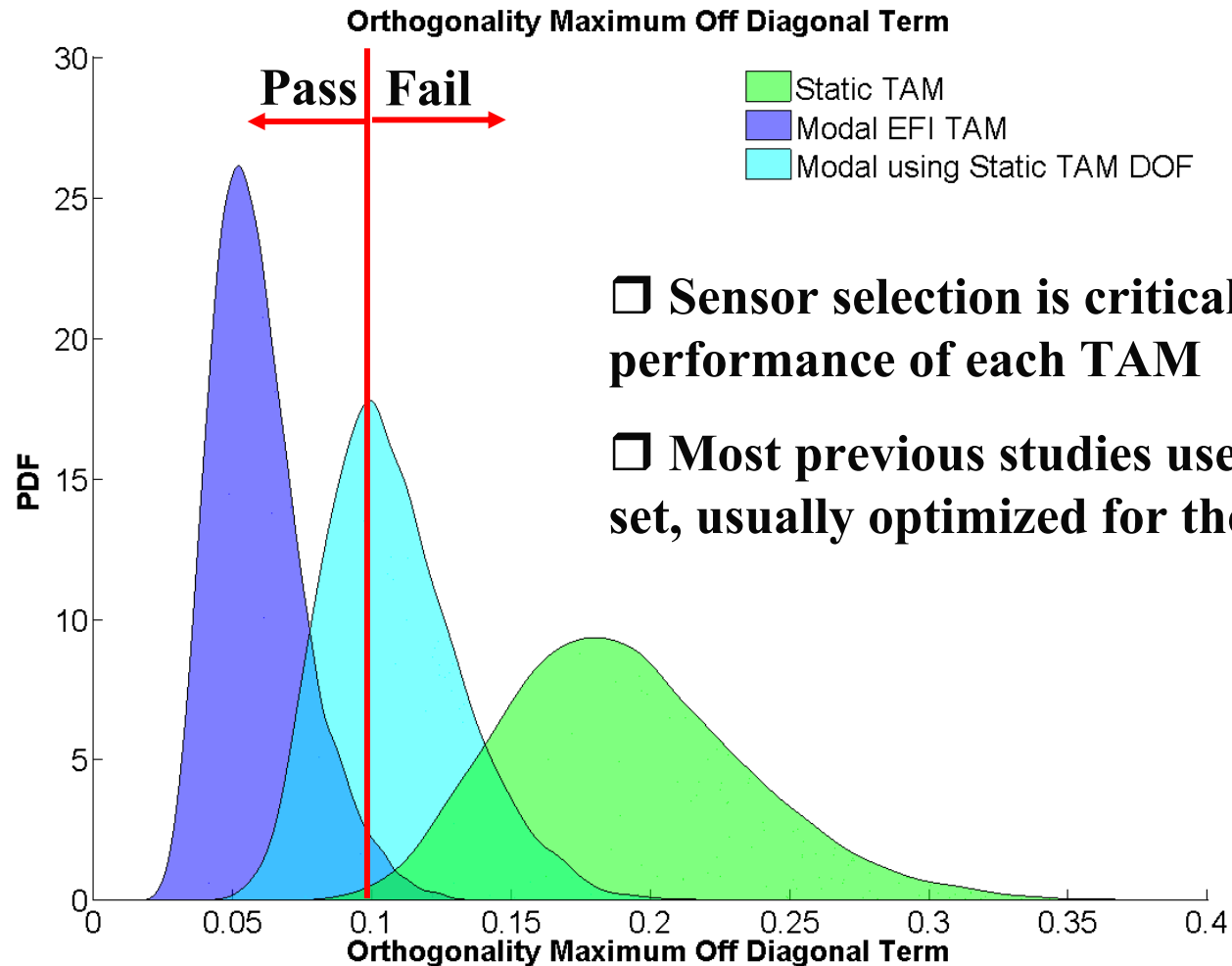
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- ❑ If Orthogonality  $> 0.1$  one might
    - ❑ Refine FEM before exiting test
    - ❑ Repeat test and/or look for errors
    - ❑ Update the FEM
  - ❑ In this case, the FEM was perfect (errors in test modes were purely random)
  - ❑ Note: The specific ranking of different TAM methods may depend on:
    - ❑ The structure of interest
    - ❑ The characteristics of the noise
    - ❑ Systematic errors between the test and FEM
- 
-

# TAM-Test Correlation Results



Sensor selection is critical to the performance of each TAM

Most previous studies used the same sensor set, usually optimized for the Static TAM

# Predicting Standard Deviation



- Recently, we have developed formulas to analytically predict sensitivity of a TAM based on simple metrics
- For example, for the noise model used in this study:

$$O_{ij} = [\phi_i + n_i]^T [\tilde{M}_{TAM}] [\phi_i + n_i] \quad n_i = \text{noise}$$

$$\sigma(O_{ij}) = \sqrt{\sum_m (\tilde{M}_{TAM} \phi_j)^2 \sigma_i^2 + \sum_m (\phi_i^T \tilde{M}_{TAM})^2 \sigma_j^2 + \sum_m \sum_n (\tilde{M}_{TAM})_{mn}^2 \sigma_i \sigma_j}$$

	Maximum Orthogonality Off-Diagonal	
	Predicted STD	Actual STD
<b>Static</b>	0.03	0.03
<b>Modal EFI</b>	0.009	0.01
<b>Modal C#TAM</b>	0.006	0.006
<b>Modal with Static DOF</b>	0.02	0.02

# Conclusions and Future Work

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## □ Conclusions

- IRS TAM was ill-conditioned, as predicted by Gordis
- Modal TAM did not show high sensitivity even though its o-set frequencies were near those of the target modes
- Probabilistic analysis more fully explains TAM sensitivity
  - One can even predict the sensitivity of the TAMs analytically given the TAM Mass matrix, mode shapes and noise model.

## □ Future Work

- Develop more accurate noise models
  - Study the effect of systematic mismatch between FEM and test due to modeling errors.
    - May need the Hybrid TAM in these cases
  - Apply these methods to other physical systems, analytically and experimentally.
    - Investigate systems with non-consecutive target modes
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