

Space-Time Adaptive Processing (STAP) Some Performance Limiting Factors

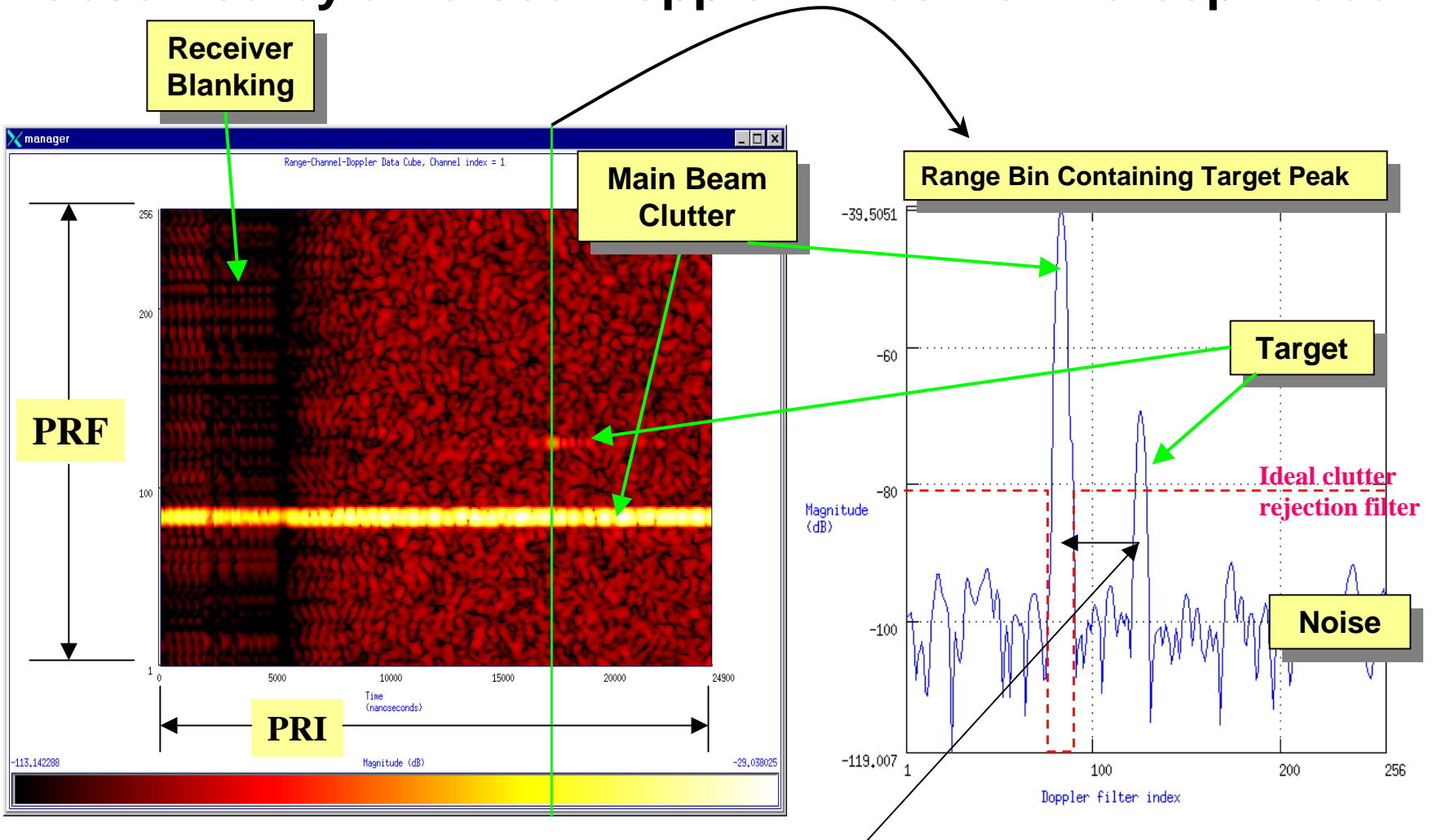
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Agenda

- The Airborne Clutter Environment
- Space-Time Adaptive Processing
 - What is it?
 - Natural Evolution of Radar Signal Process
 - Why Put the Adaptive in Space-Time Processing?
 - Short Answer - Realities, Imperfect Knowledge, Uncertainties and Imperfections
 - Simple case in point is open loop DPCA
 - How is it Implemented?
- Limiting Factors List & Examples
- Current Investigations to Mitigate Limiting Factors

Simple Example of target and interference environment as observed by a Pulsed-Doppler Airborne Intercept Radar

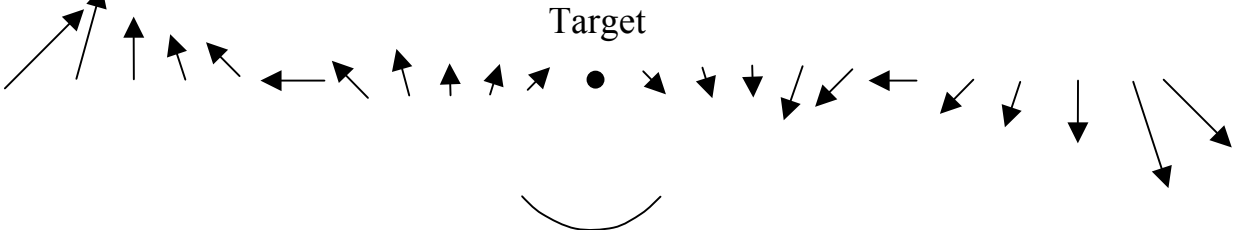
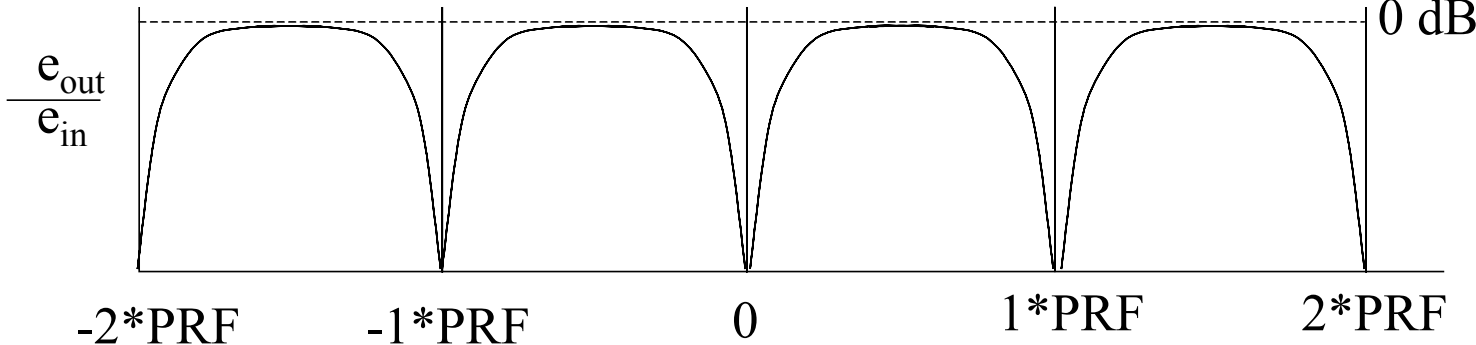
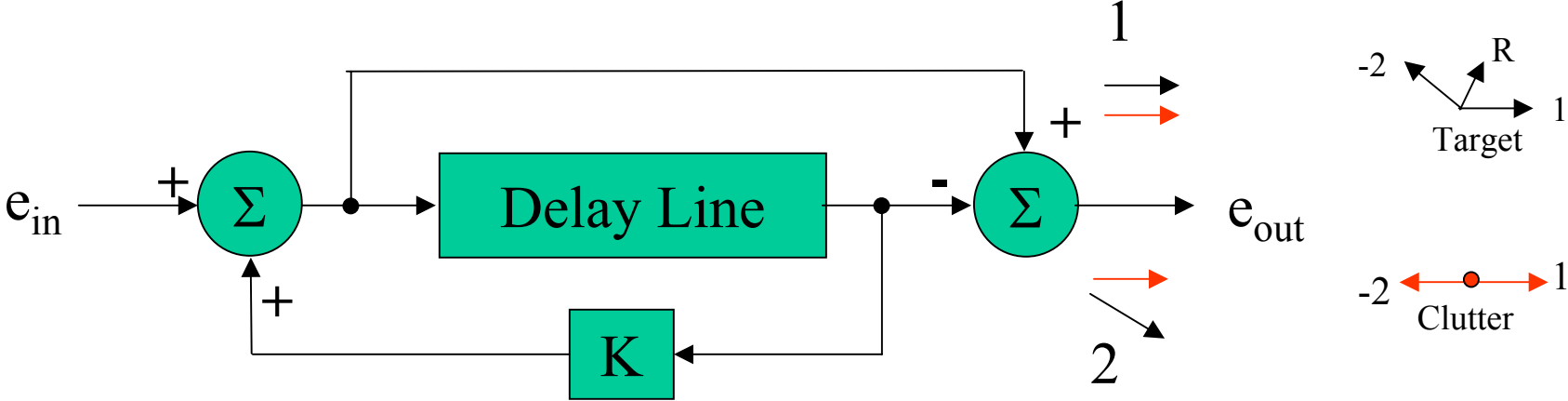


Slow Moving Targets require Fast Transition from Stopband to Passband

Space-Time Adaptive Processing is a Natural Evolution of Radar Signal Process

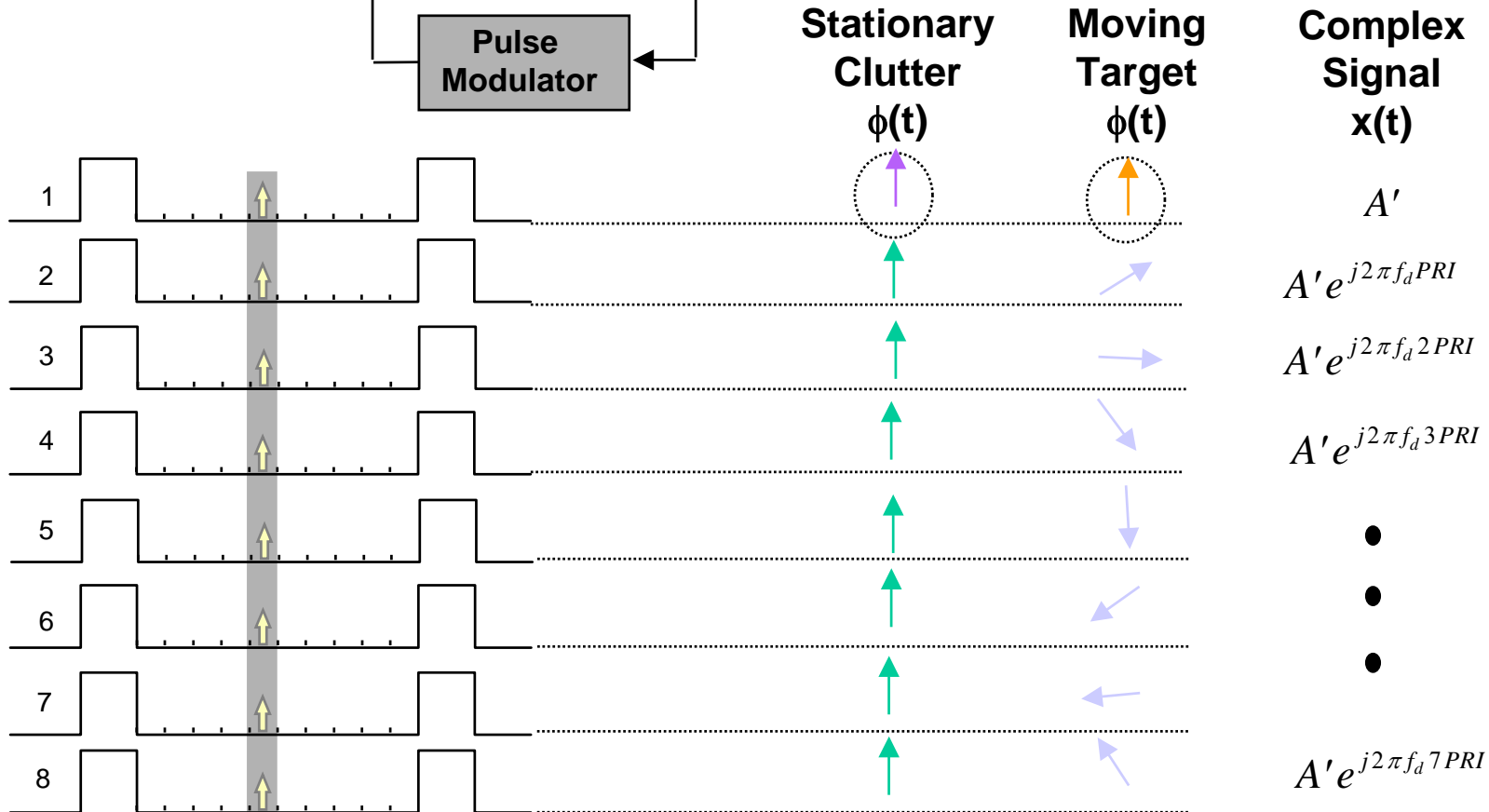
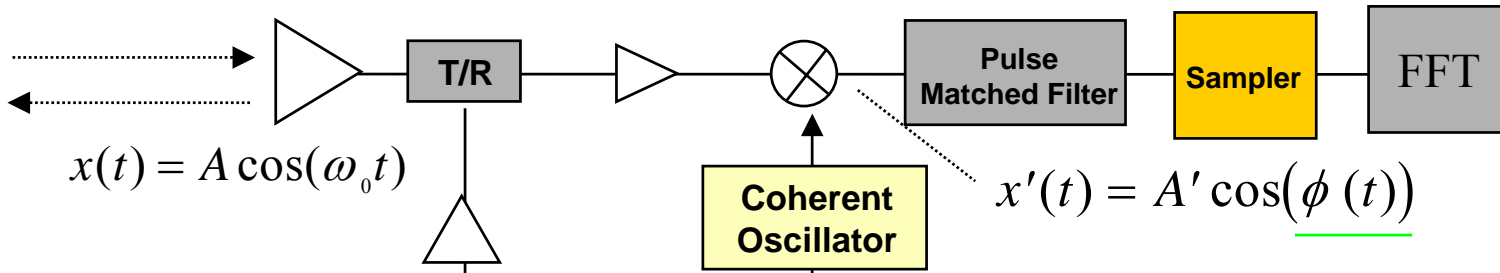
- Time Only Processing - Single Channel
 - MTI Processing
 - Pulse Doppler Processing
- Space Only Processing - Multiple Channel
 - Jammer Cancellation
- Space-Time Processing (Non-Adaptive)
 - Displaced Phase Center Array (DPCA) Processing
 - Simultaneous DPCA
- Space-Time Adaptive Processing
 - Segmented Antenna Co-Aligned with Velocity Vector
 - Arbitrary Antenna Manifolding and Alignment

Simple MTI Radar (Time) Processing

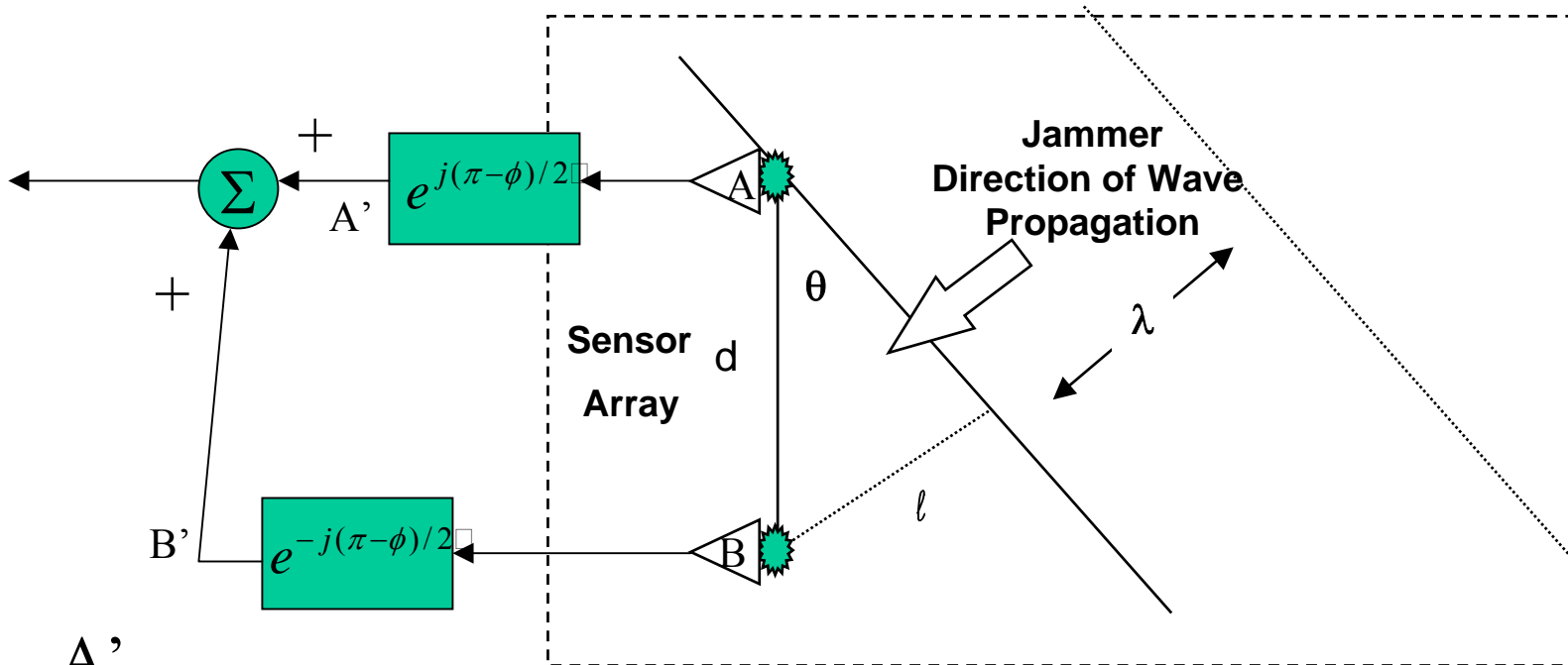


Radar

Pulse Doppler Processing Of Moving Targets (Time)



Jammer Nulling (Space)

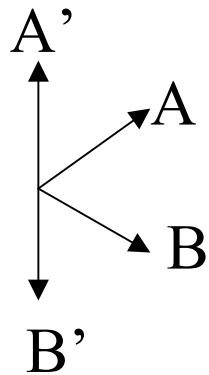


The Path Difference Between Elements Is

$$l = d \sin(\theta)$$

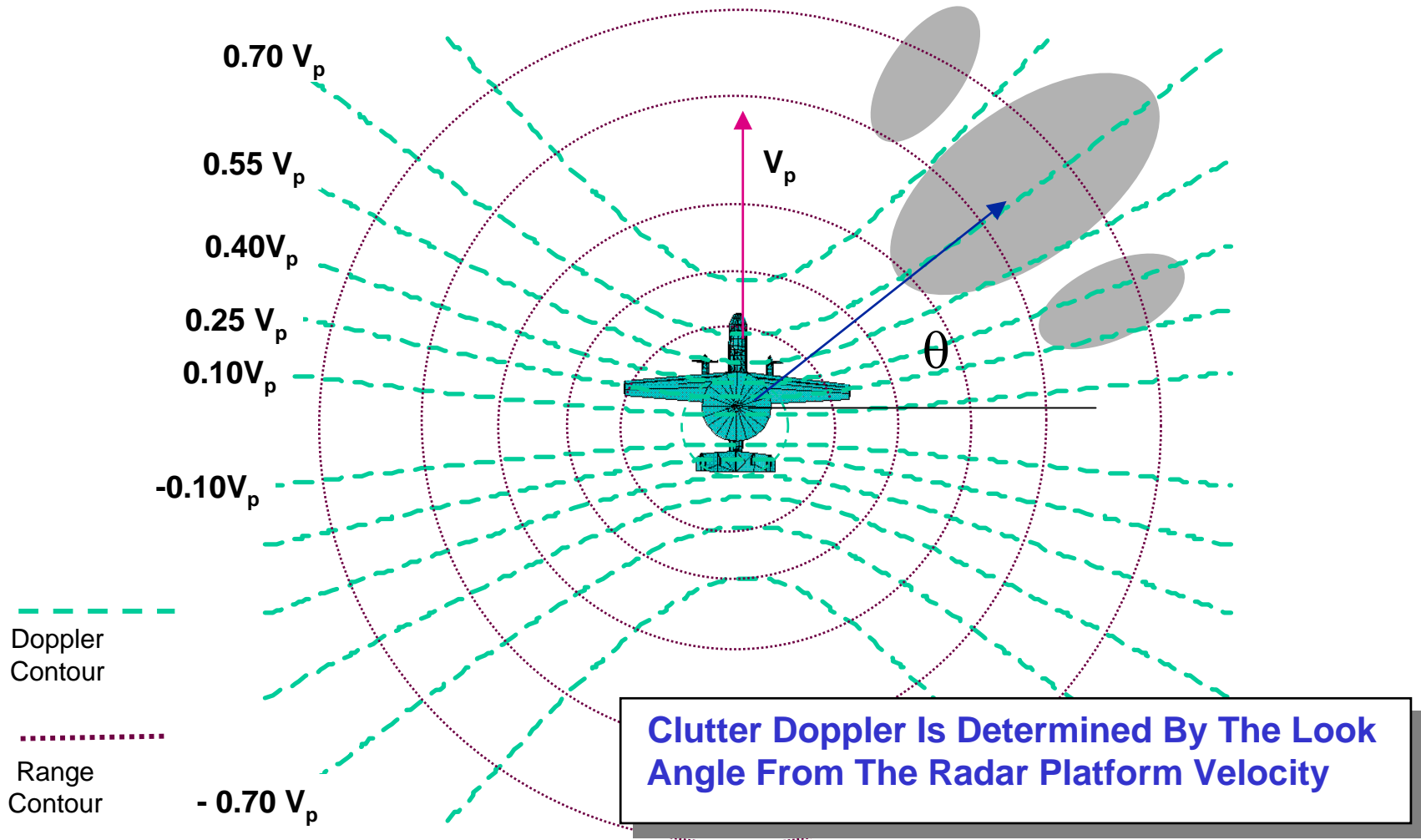
Electrical Phase Difference Between of Jammer's Channels
Signal in Channels A & B As a Result of The Angle of Arrival

$$\phi = -\frac{2\pi}{\lambda} d \sin(\theta)$$



Range, Doppler & Angle of Ground Clutter

$$f_{clutter} = -\frac{2}{\lambda} (\mathbf{V}_p \bullet \mathbf{U}_{p_to_clutter}) \approx -\frac{2}{\lambda} (V_p \times \sin(\theta_{clutter}))$$



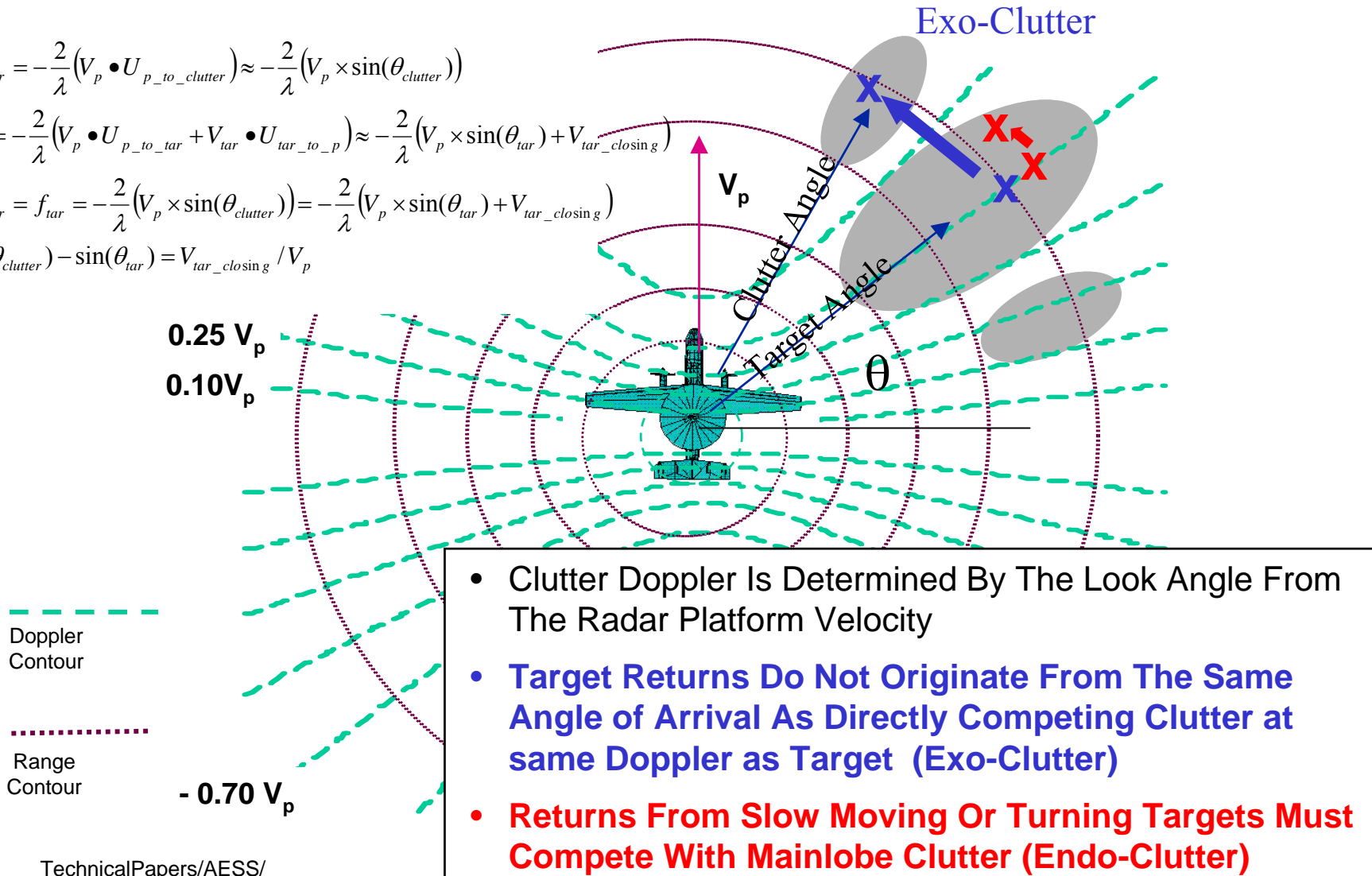
Range, Doppler & Angle of Moving Targets

$$f_{clutter} = -\frac{2}{\lambda}(V_p \bullet U_{p_to_clutter}) \approx -\frac{2}{\lambda}(V_p \times \sin(\theta_{clutter}))$$

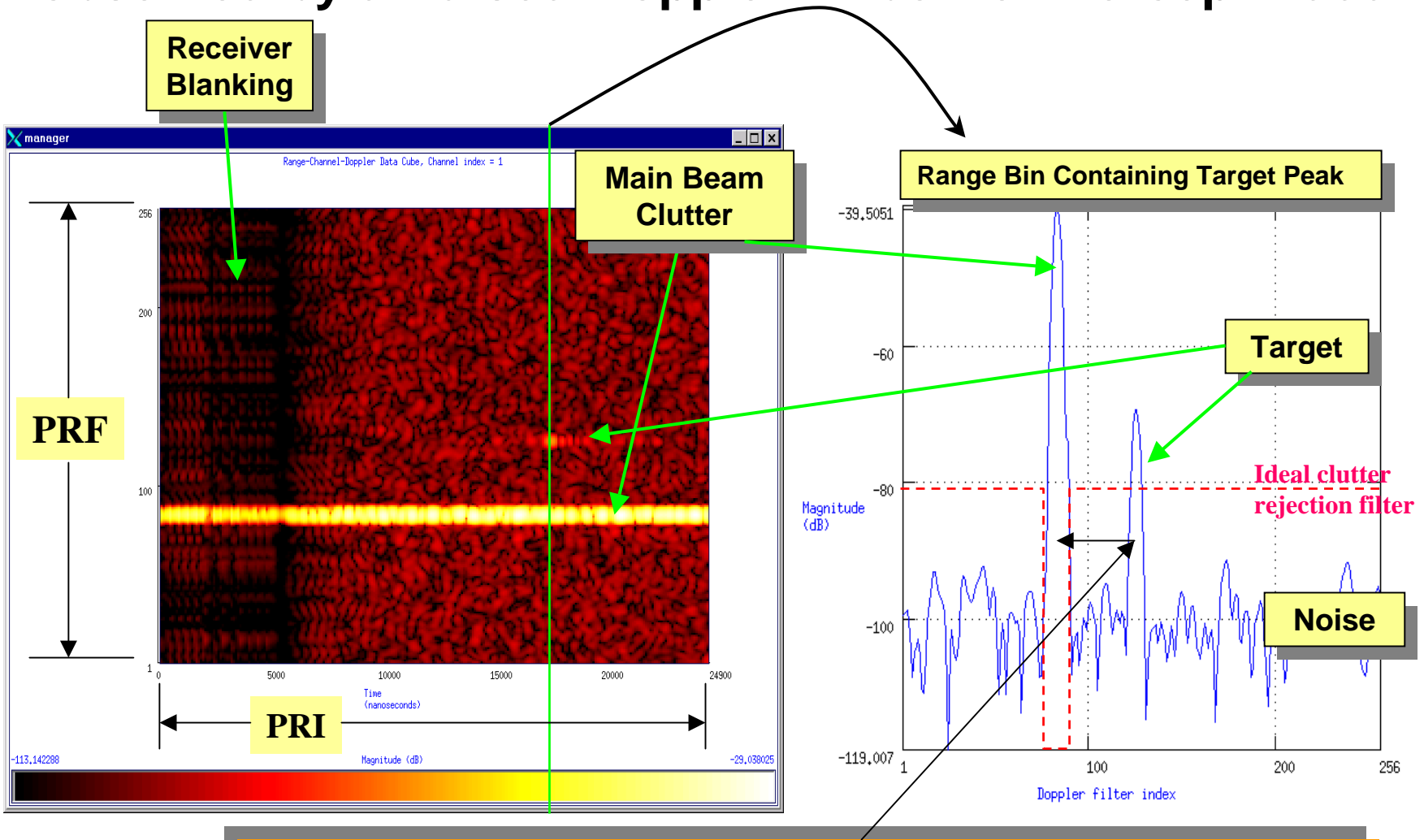
$$f_{tar} = -\frac{2}{\lambda}(V_p \bullet U_{p_to_tar} + V_{tar} \bullet U_{tar_to_p}) \approx -\frac{2}{\lambda}(V_p \times \sin(\theta_{tar}) + V_{tar_closing})$$

$$f_{clutter} = f_{tar} = -\frac{2}{\lambda}(V_p \times \sin(\theta_{clutter})) = -\frac{2}{\lambda}(V_p \times \sin(\theta_{tar}) + V_{tar_closing})$$

$$\sin(\theta_{clutter}) - \sin(\theta_{tar}) = V_{tar_closing} / V_p$$



Simple Example of target and interference environment as observed by a Pulsed-Doppler Airborne Intercept Radar



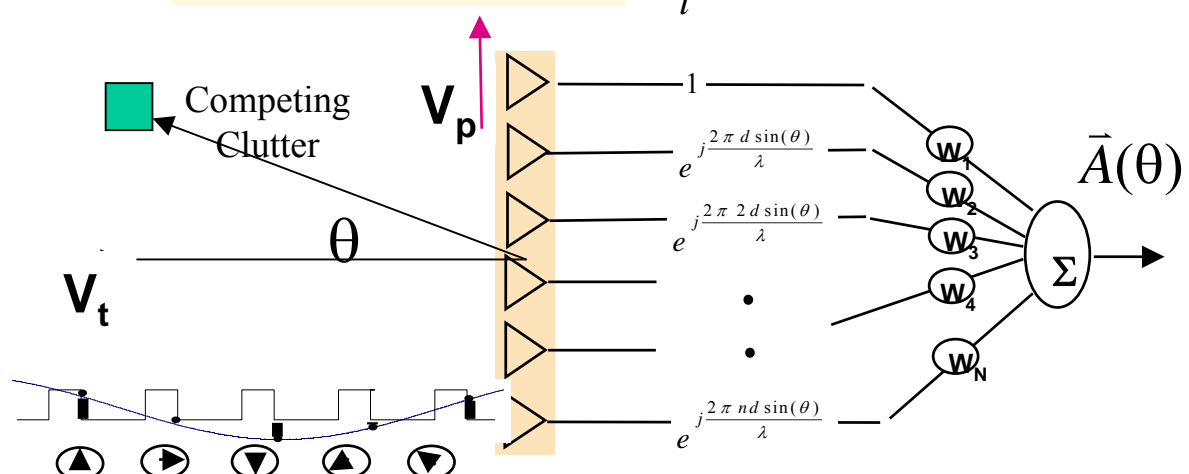
More Clutter Rejection Required With Slower Target

How Space relates to Time (Doppler) in Space-Time Processing (Co-Aligned Array)

Target Signal Vector

$$s_t = x \otimes A^T$$

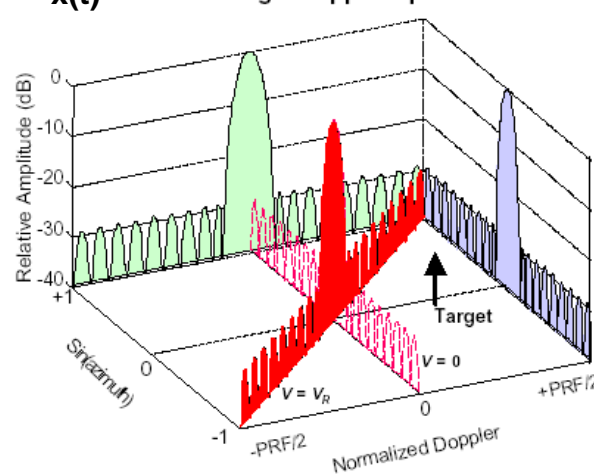
$$A' = \begin{bmatrix} A'e^{j2\pi f_d PRI} \\ A'e^{j2\pi f_d 2PRI} \\ A'e^{j2\pi f_d 3PRI} \\ \vdots \\ A'e^{j2\pi f_d (m-1)PRI} \end{bmatrix}$$



Spatial Steering Vector

Complex Pulsed Signal $x(t)$

2D Angle-Doppler Spectrum



Normalized Doppler $\bar{f}_d = f_d / PRF = f_d PRI = \frac{2V_p \times PRI}{\lambda} \sin \theta_{clutter}$

$$\bar{f}_d = \frac{2V_p \times PRI}{\lambda} \left(\frac{\lambda}{d} \right) \left(\frac{d}{\lambda} \right) \sin \theta_{clutter} = \frac{2V_p \times PRI}{d} \left(\frac{d}{\lambda} \sin \theta_{clutter} \right)$$

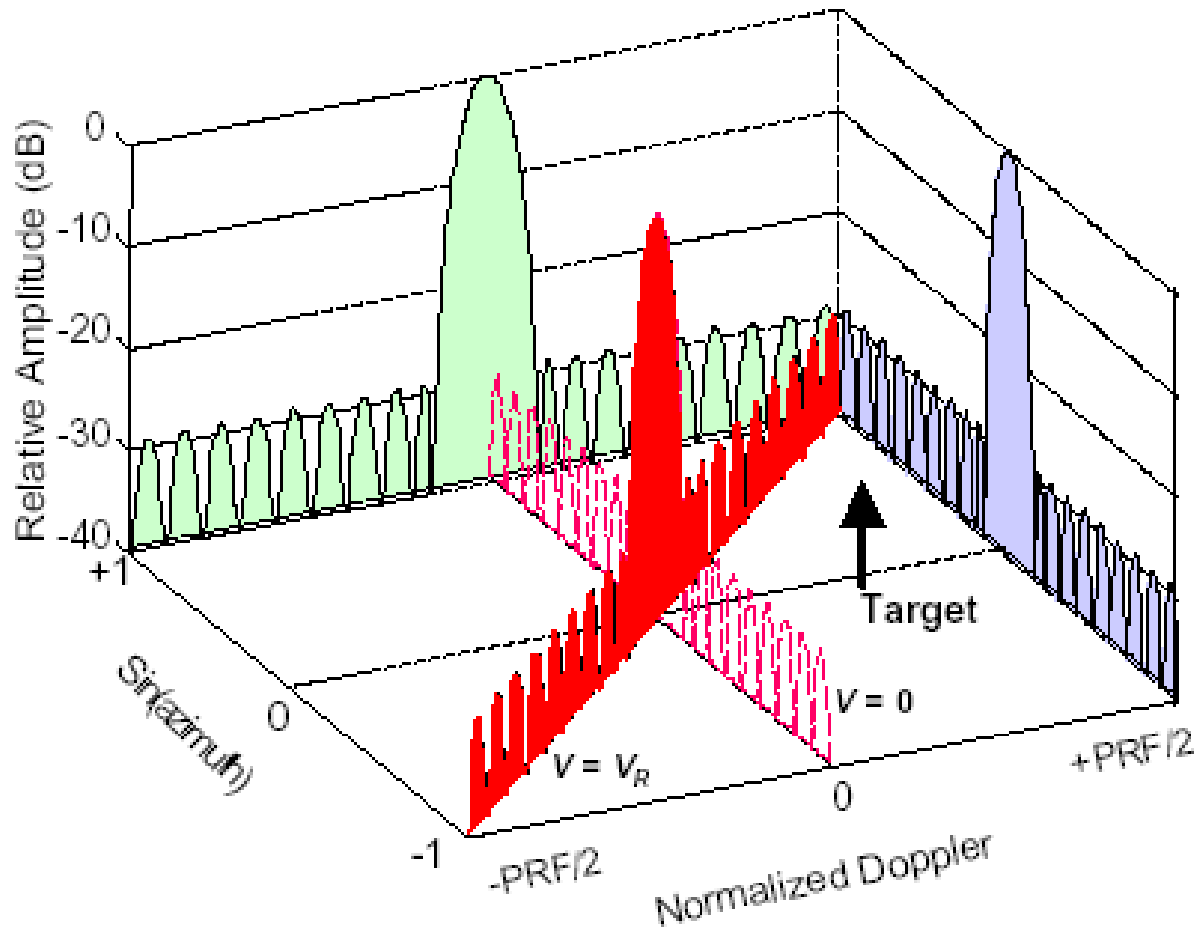
$$\bar{\theta} = \frac{d}{\lambda} \sin(\theta_{clutter}) \text{ (Spatial Frequency Normalized Angle)}$$

$$\beta = \frac{2V \times PRI}{d} \text{ (Slope of the Clutter Ridge = Spatial/Doppler Frequency)}$$

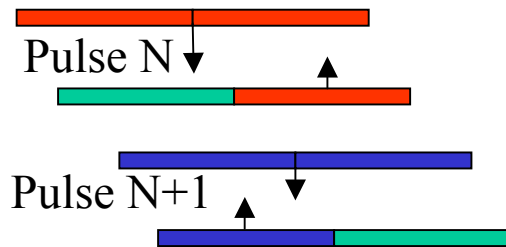
$$\bar{f}_d = \beta \bar{\theta}$$

2 Dimensional Space-Time Filtering

2D Angle-Doppler Spectrum



Full Aperture TX & Segmented RX Aperture DPCA



Pulse	Phase Center Displacement		
	TX	RX	Total
N	0	$V \cdot Tr + d/2$	$V \cdot Tr + d/2$
N+1	$d/2$	$V \cdot Tr$	$V \cdot Tr + d/2$

1. Delay Line Cancellation Processing
2. Cancels clutter from all angles and Dopplers
3. PRF tied to Aircraft Velocity
4. Matched Sub-Arrays & Channels
5. Constraints on Antenna mounting & Aircraft Motion
6. Not satisfying 3 & 4 Degrades Performance

$$\text{Normalized Doppler} = \bar{f}_d = f_d / PRF = f_d PRI = \frac{2V_p \times PRI}{\lambda} \sin \theta_{clutter}$$

$$\bar{f}_d = \frac{2V_p \times PRI}{\lambda} \left(\frac{\lambda}{d} \right) \left(\frac{d}{\lambda} \right) \sin \theta_{clutter} = \frac{2V_p \times PRI}{d} \left(\frac{d}{\lambda} \sin \theta_{clutter} \right)$$

$$\bar{\theta} = \frac{d}{\lambda} \sin(\theta_{clutter}) \quad (\text{Spatial Frequency/Normalized Angle})$$

$$\beta = \frac{2V \times PRI}{d} \quad (\text{Slope of the Clutter Ridge} = \text{Spatial/Doppler Frequency})$$

$$\bar{f}_d = \beta \bar{\theta}$$

$$(\beta = 1 \text{ for DPCA}); \frac{2V \times PRI}{d} = 1; PRF = \frac{2V}{d}$$

Phase Center Displacement during PRI:

$$\text{Displacement} = V \cdot \text{Time} = V \cdot 1 / PRF = V \cdot \frac{d}{2V} = \frac{d}{2}$$

Why Adaptive Processing

- DPCA & Non-Adaptive Space-Time Processing Implementations are limited by:
 - Channel Matching (both spatial and temporal)
 - Errors in the knowledge of Hardware Characteristics
 - Trajectories/Antenna Mounting Limitations
 - Nose Mounted
 - CRAB Angles
- Adaptive Processing
 - Dynamic Compensation Technique
 - Flexible in that it automatically adjusts to the interference environment

Adaptive Processing Math

Target Signal Vector

$$s_t = x(t) \otimes A(n)^T$$

Target Signal Vector

Received Signal Vector

$$\mathbf{x} = \alpha s_t + \mathbf{n}$$

Thermal Noise + Interference

STAP Filter Output

$$y = \mathbf{w}^H \mathbf{x} = \alpha \mathbf{w}^H s_t + \mathbf{w}^H \mathbf{n}$$

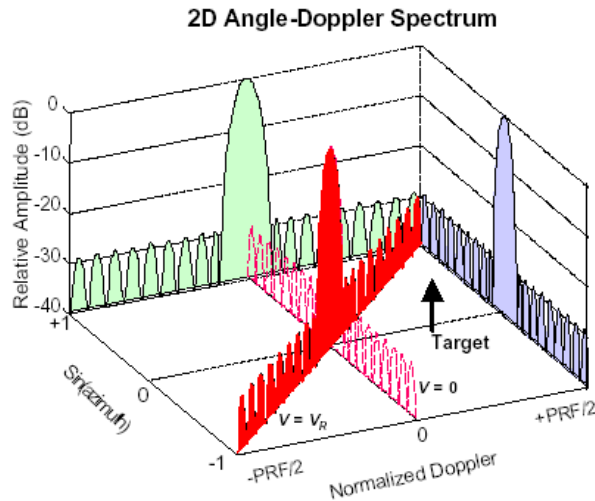
Desired Signal Vector

Constrained STAP Weight Vector*

$$\mathbf{w} = \kappa \tilde{\mathbf{R}}^{-1} \mathbf{s}_d = \frac{\tilde{\mathbf{R}}^{-1} \mathbf{s}_d}{\mathbf{s}_d^H \tilde{\mathbf{R}}^{-1} \mathbf{s}_d}$$

Taper

Interference Covariance Matrix



SINR

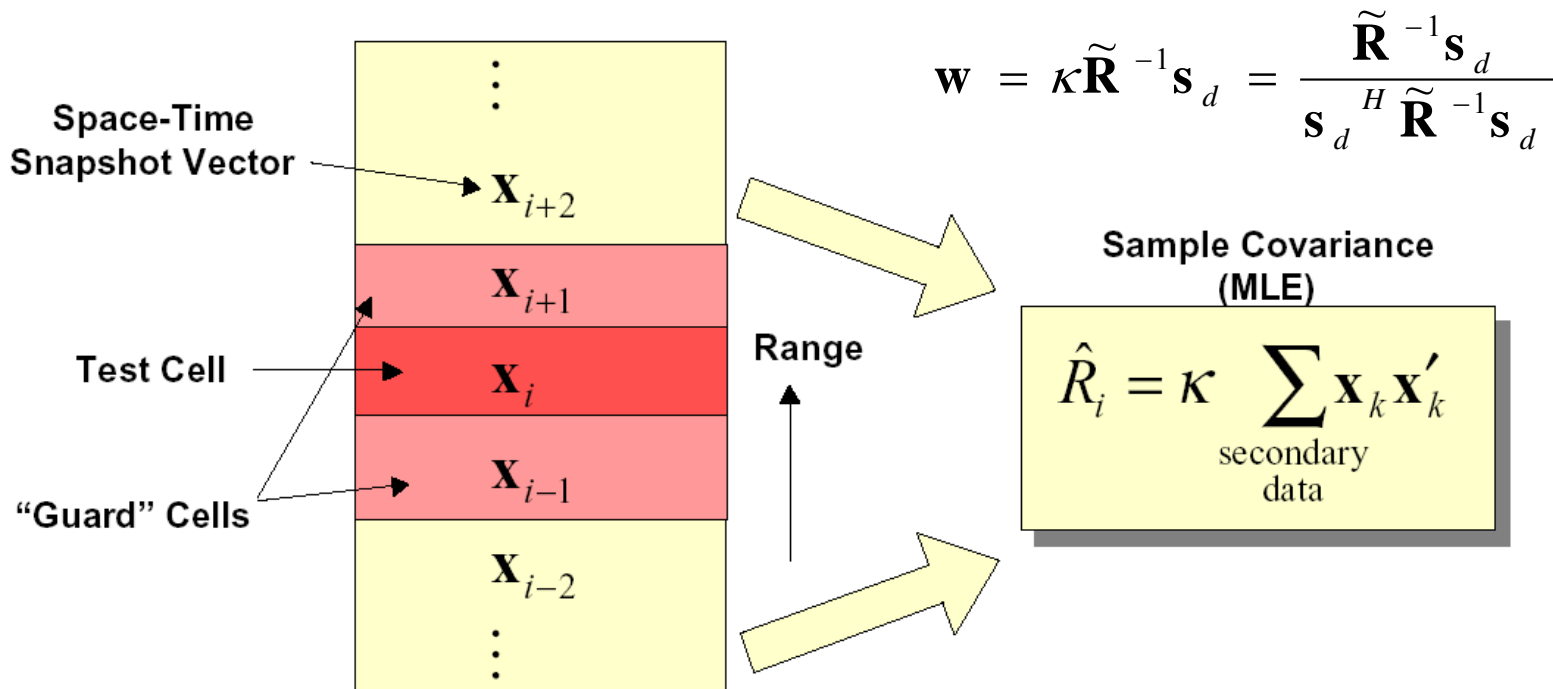
$$SINR_{out} = \frac{P_s}{P_n} = \frac{\alpha^2 |\mathbf{w}^H s_t|^2}{\mathbf{w}^H \mathbf{R} \mathbf{w}}$$

Desired Signal Vector

* Brennan & Reed (1973)

Clutter Covariance Estimation

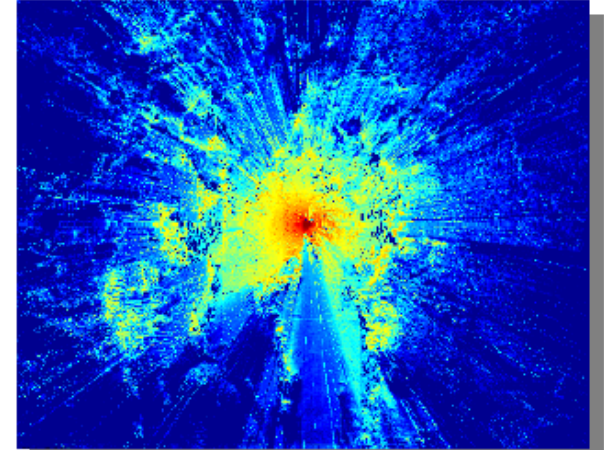
- In practice, the interference covariance matrix is estimated from auxiliary data obtained from surrounding range bins
 - Stationarity/homogeneity assumption required w.r.t. range



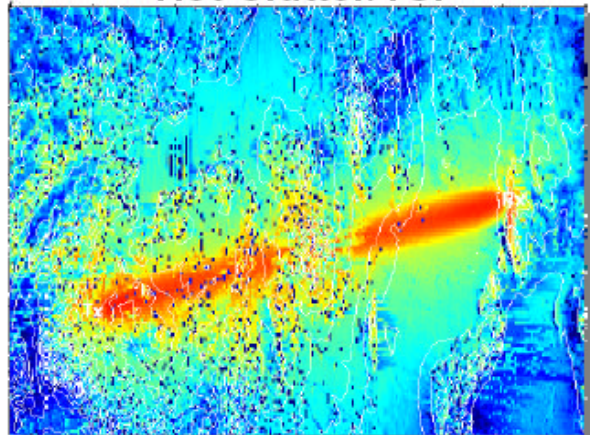
Fundamental Issues in Realizing STAP Potential (R_i)

- **Heterogeneous Clutter**
 - Inhomogeneous land clutter often violates “stationarity” assumption required for covariance estimation
 - Clutter undernulling, poor MDV
- **Large Clutter Discretets**
 - Land clutter is often “spiky”
 - Increased false alarms
- **Air/Ground Traffic Induced Distortions**
 - Strong presence of background traffic in training region can cause target cancellation
 - Reduced MDV (e.g., MCARM data set)
- **Joint Hot & Cold Clutter Cancellation**
 - 3D nature of problem exacerbates adaptive weights

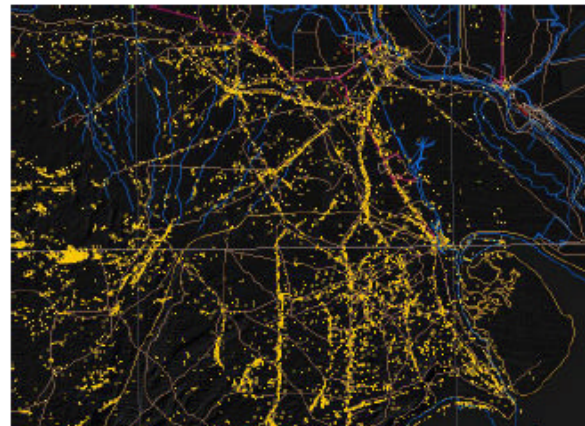
Inhomogeneous Terrain/Clutter



Hot Clutter/TSI



Dense Airborne/Ground Traffic



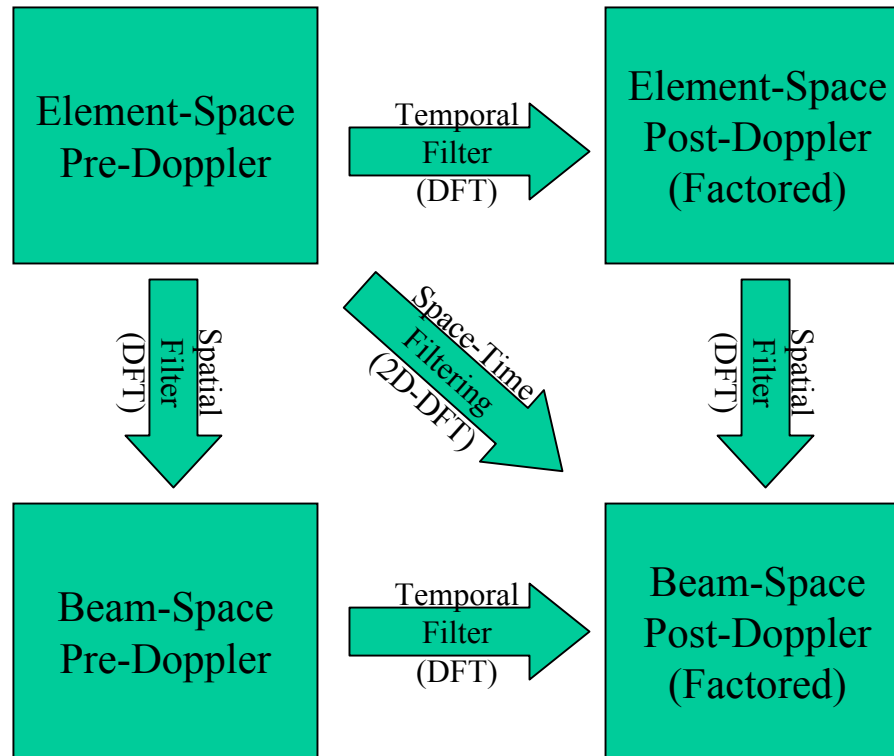
Large Discretets/Urban Clutter



Fundamental Issues in Realizing STAP Potential

- **Interference “Spreading” Mechanisms**
 - Internal clutter motion (ICM)
 - Clutter scintillation
 - Diffuse multipath
 - Transmitter instabilities
 - Antenna “jitter”
 - Bandwidth (dispersion)
 - Antenna “crab”
 - etc.
- **Less useable angle-Doppler**
 - Clutter is spread in angle and Doppler

STAP Integration Into Radar Signal Processing



Bob Hancock

Limiting Factors we will demonstrate

- **Spatial Mismatch between antenna phase centers**
- **Non-Homogeneity**
 - Terrain Shadowing
 - Discretos
 - Backscatter Variations
- **Estimation**
 - Moving Window vs Global
 - Movers in training set
- **Under Nulling / Over Nulling**
- **Internal clutter motion**
- **Mis-alignment between Antenna Center Line and Velocity Vector, i.e. Crabbing**
- **Range Ambiguities**
- **Non Planar Antenna Arrays**
 - Conformal
 - Deformation

Space-Time (DPCA) Example with Airframe Near Field Scattering

DPCA + Doppler Processing

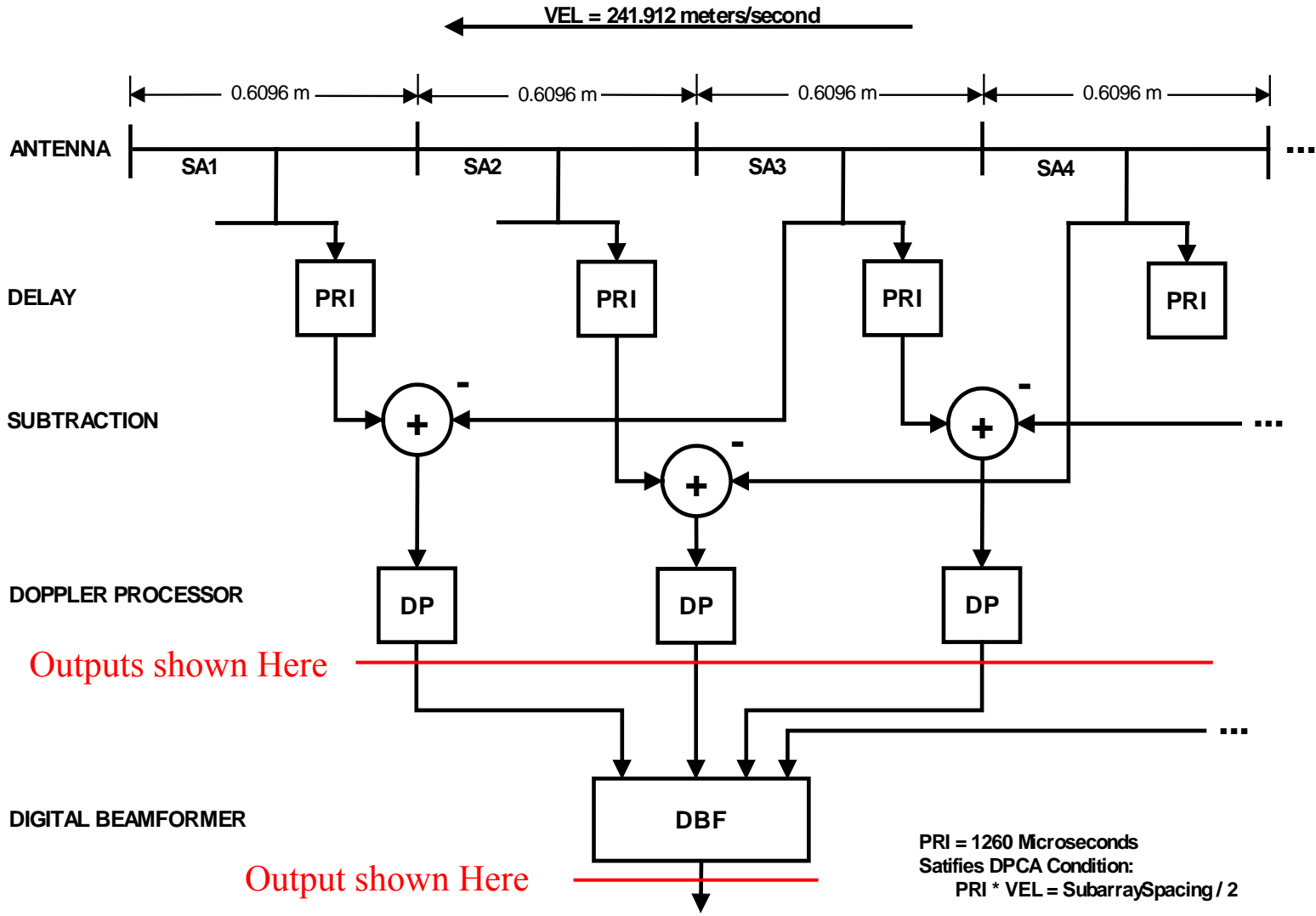
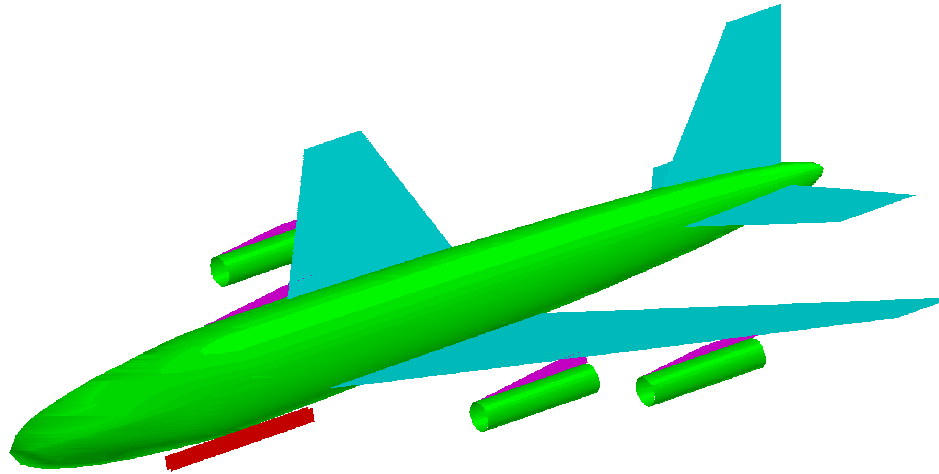
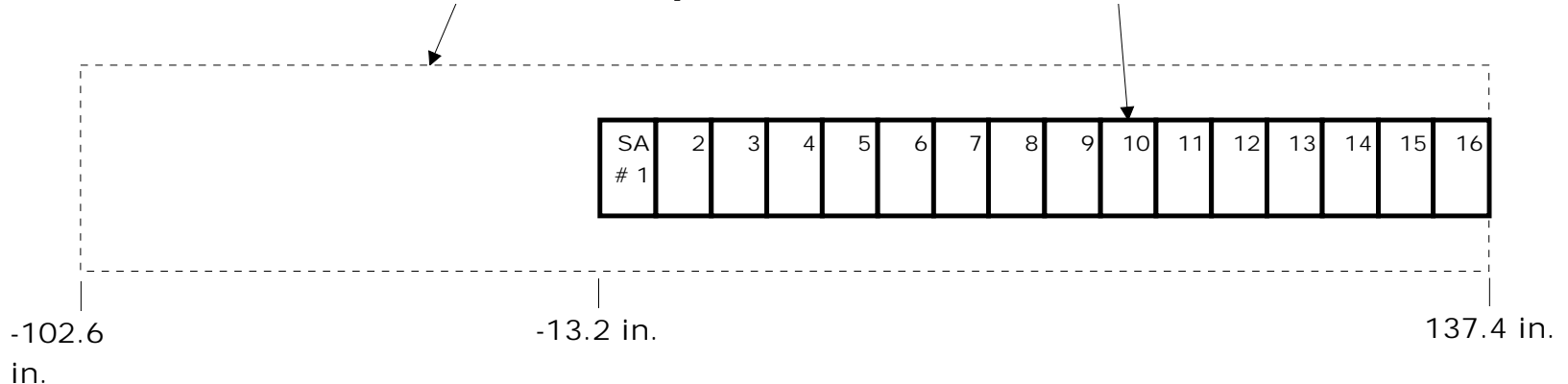


Diagram illustrating the relationship between the current J-Stars Array and the 16 Subaperture Array used in the Example



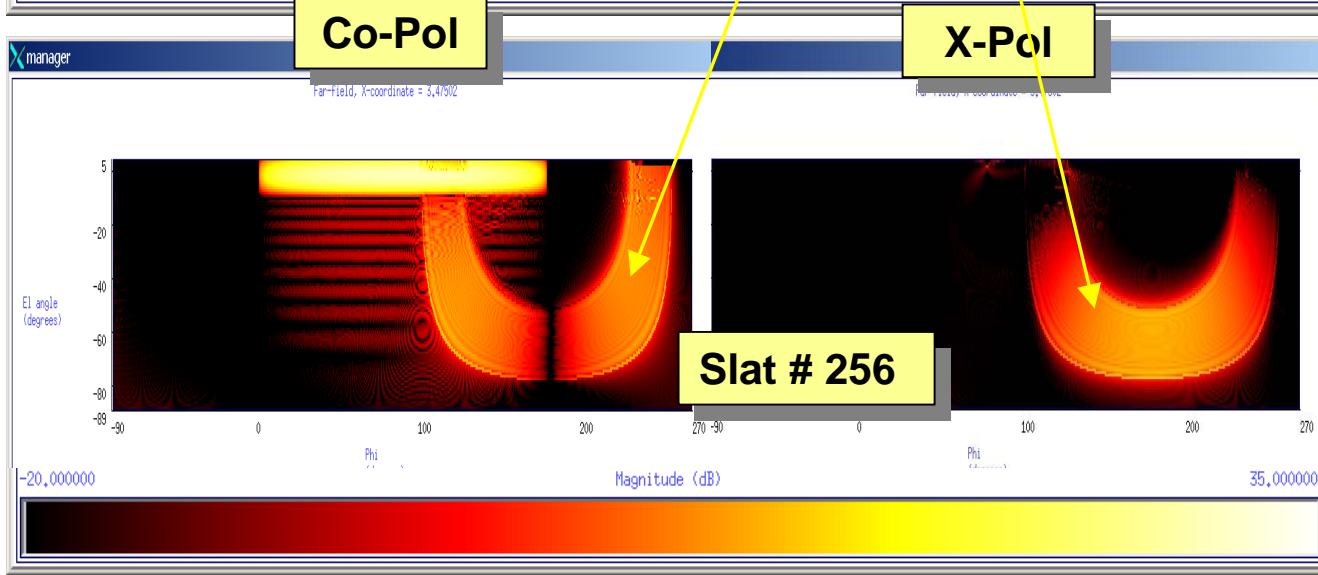
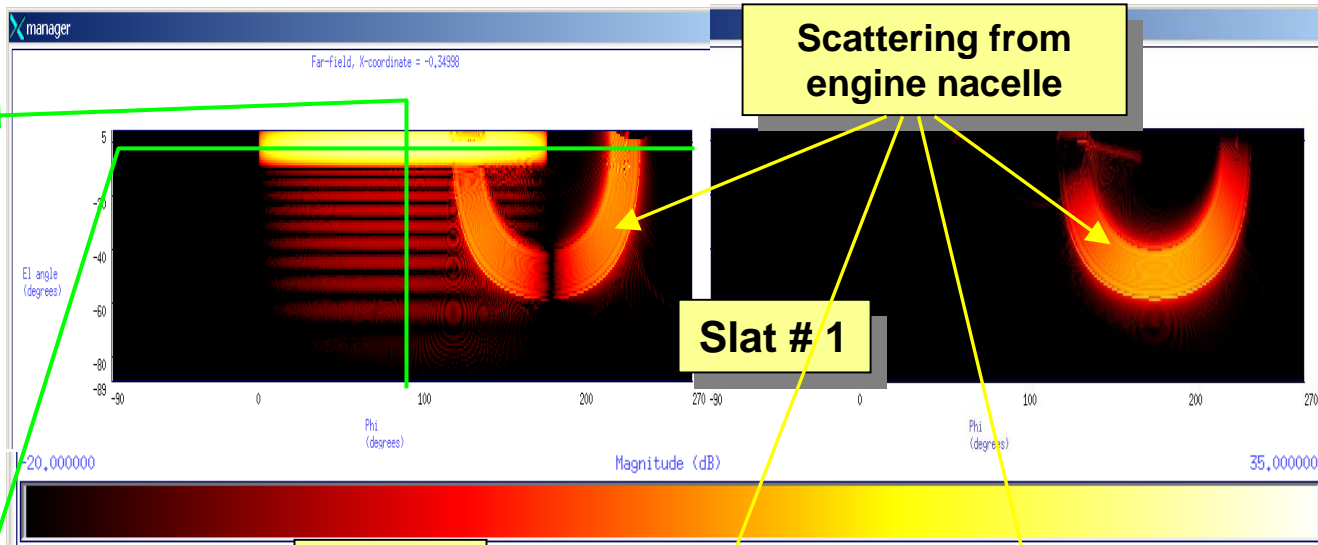
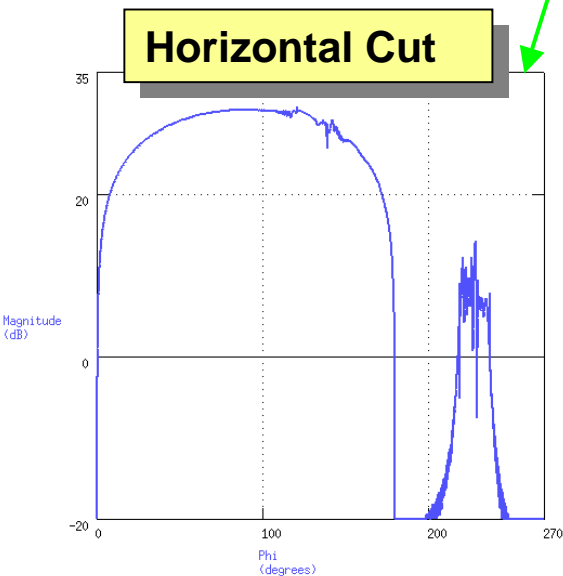
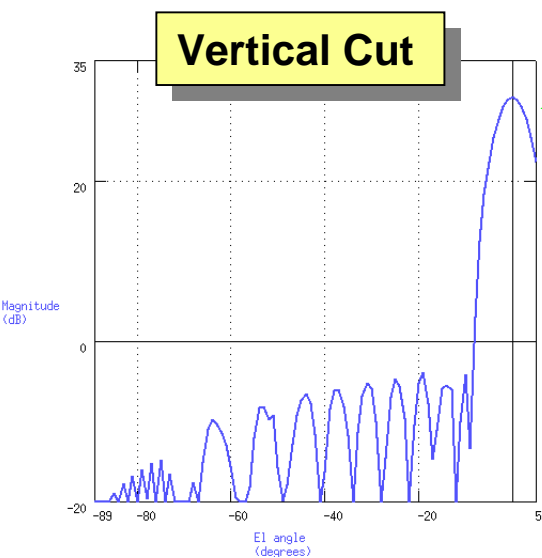
J-STARS Antenna Envelope

16 Sub-Aperture Antenna Array

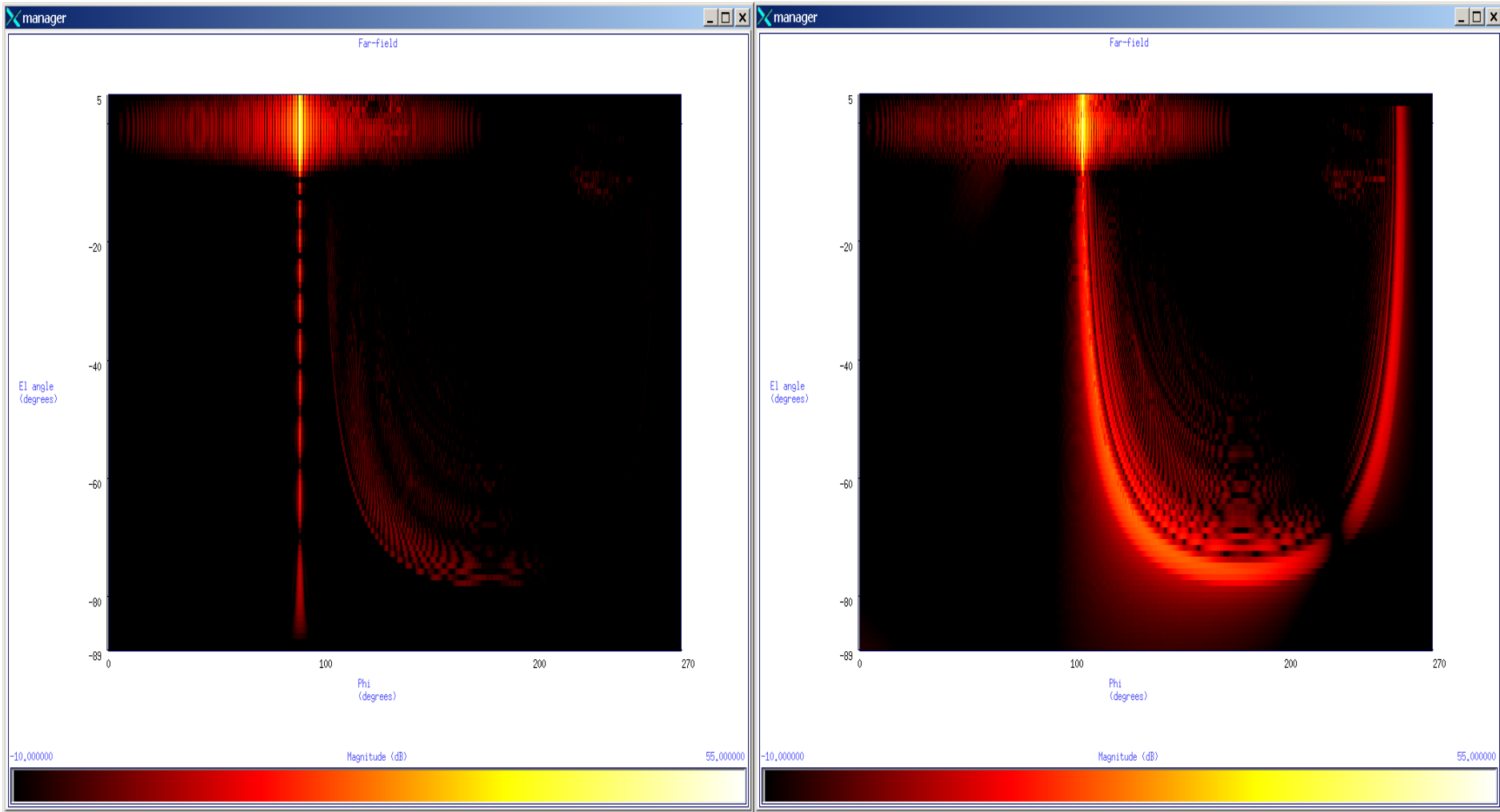


FRONT EDGE OF ENGINE NACELLE @ 218 IN.

Far-Field from Column Subarrays (Slats) at Front and Rear of Array



Tx Antenna Patterns at Az = 0 and 15 Deg.

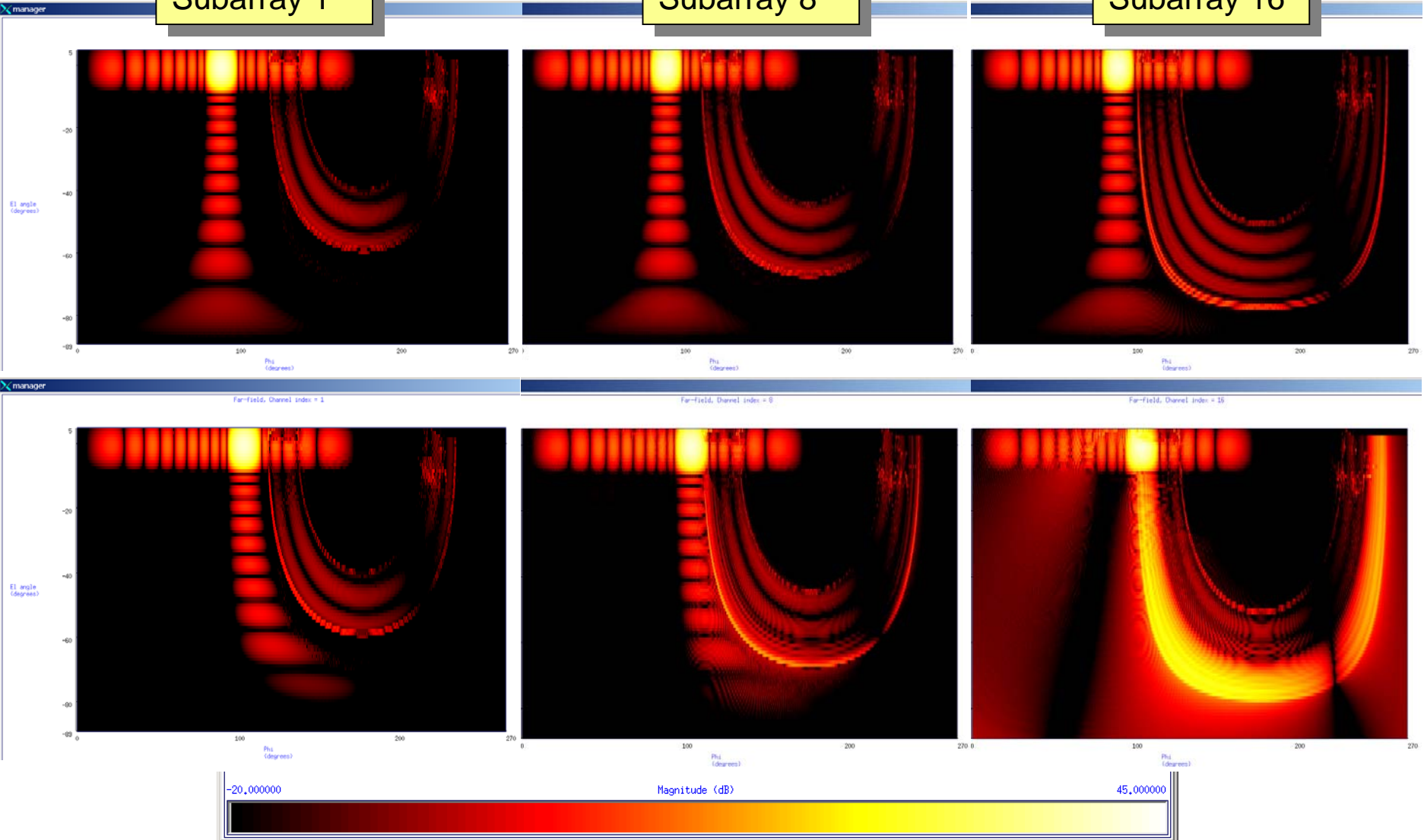


Rx Patterns for Subarrays 1, 8, 16 at Az = 0 and 15 Deg.

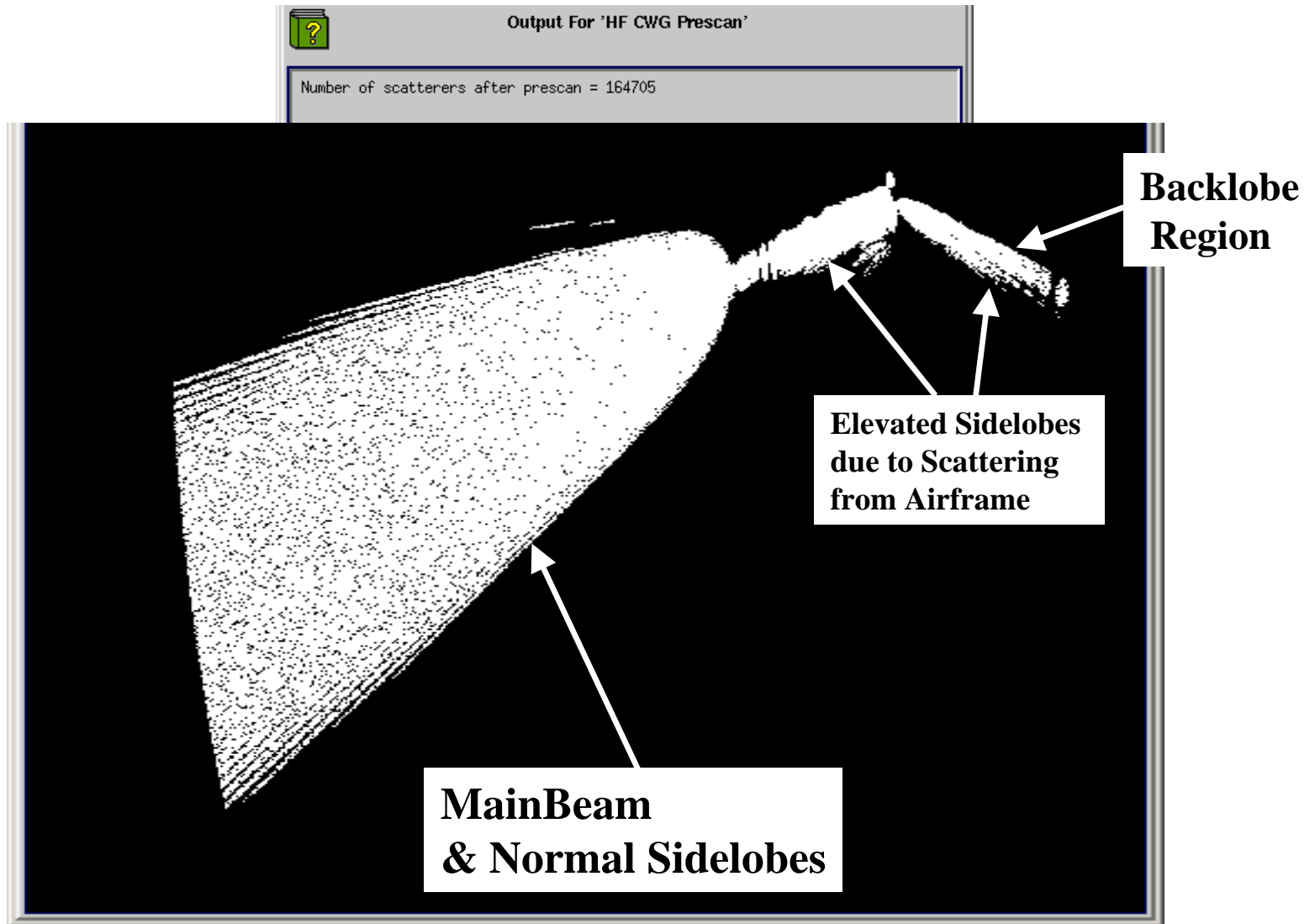
Subarray 1

Subarray 8

Subarray 16



Scatterer Field after Prescan, Azimuth = 15 Deg.



Conventional Doppler Processor Output, Azimuth = 15 Deg.

Channel 1

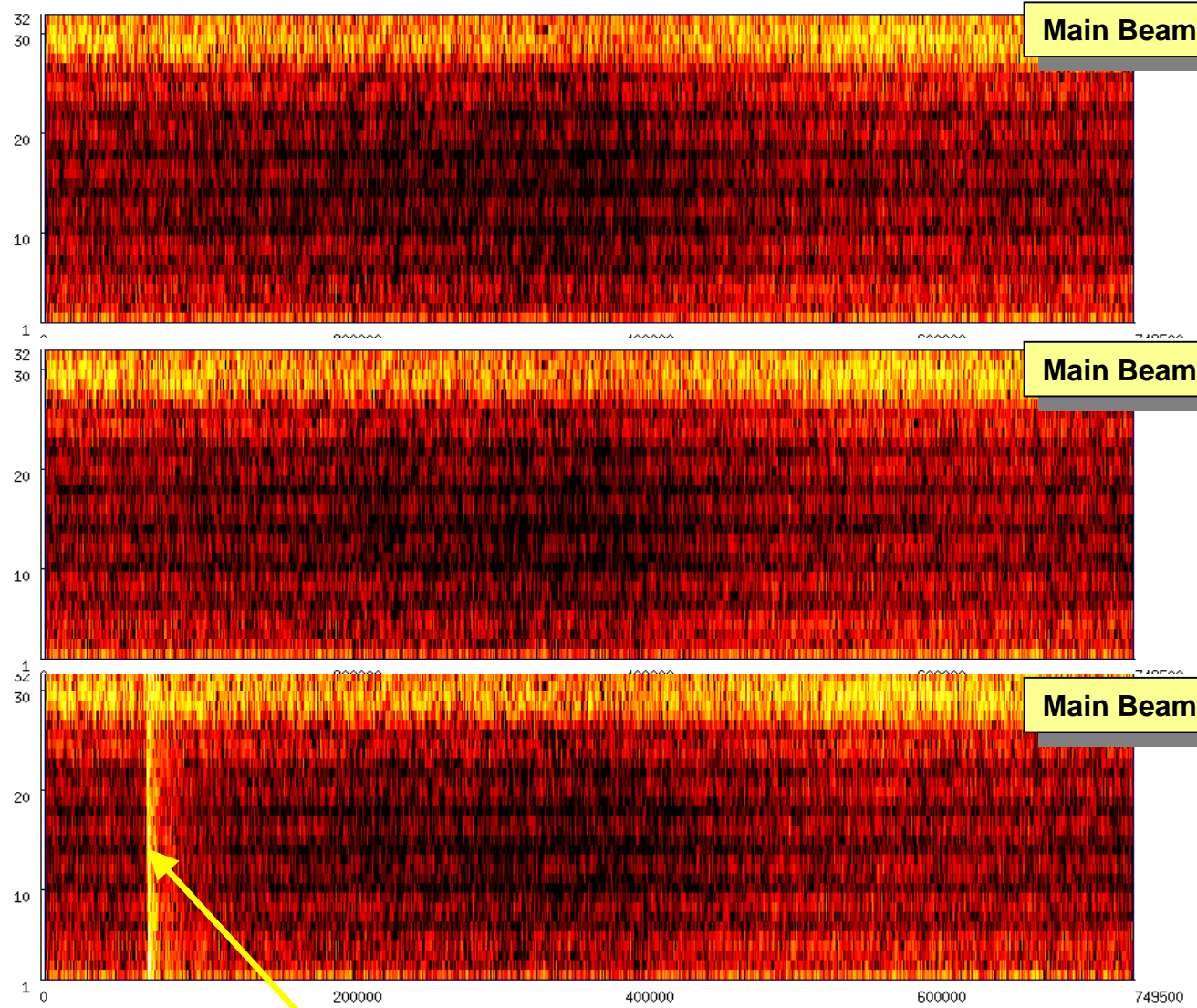
Main Beam Clutter

Channel 8

Main Beam Clutter

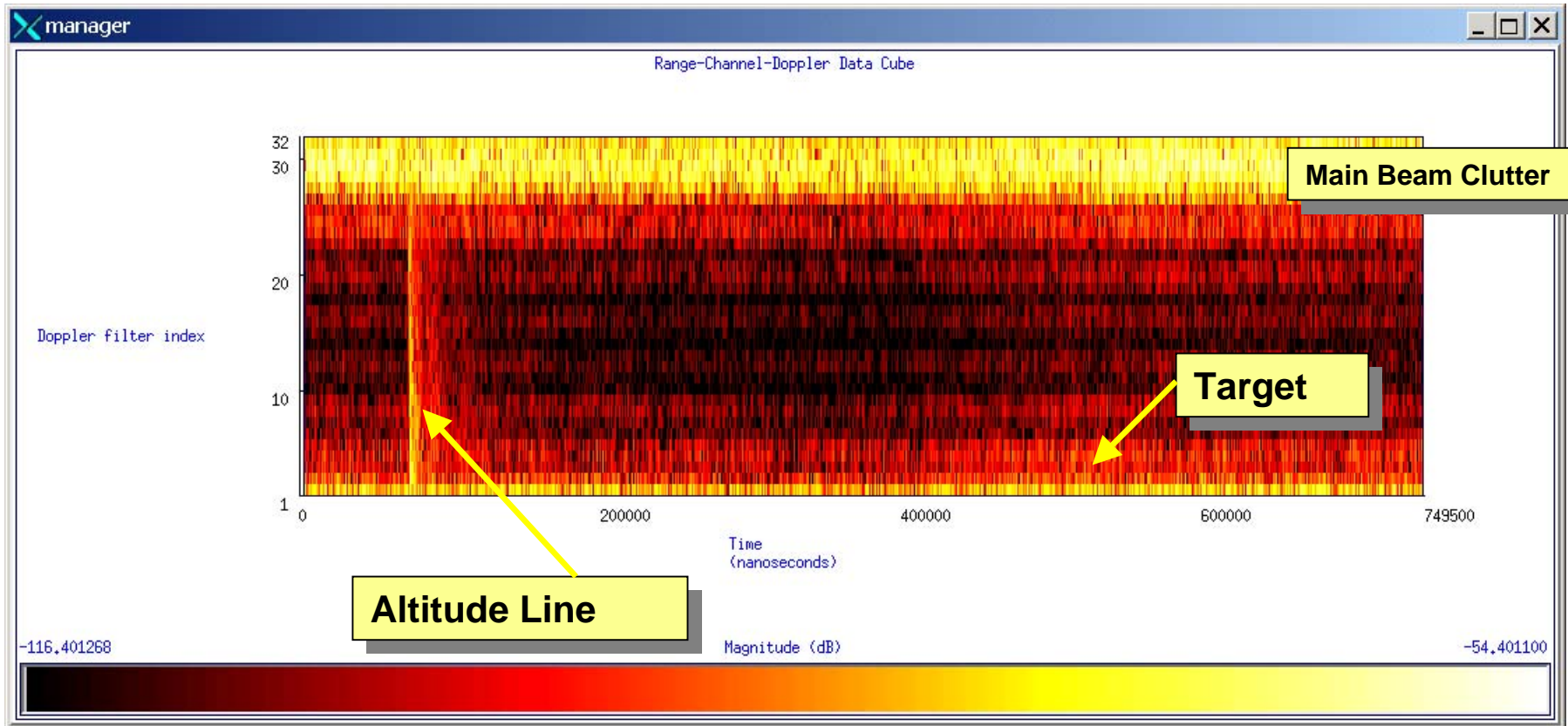
Channel 16

Main Beam Clutter

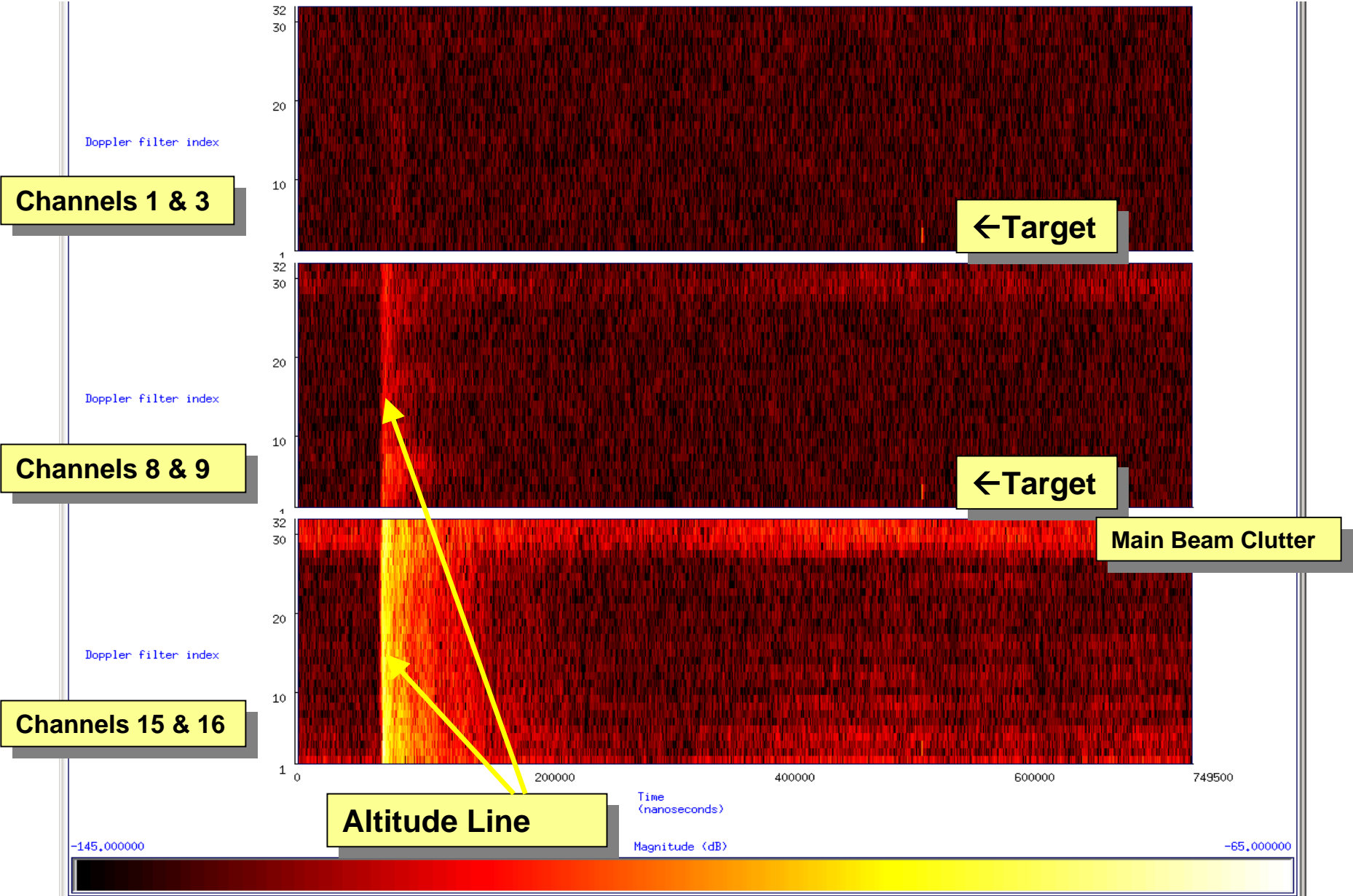


Altitude Line

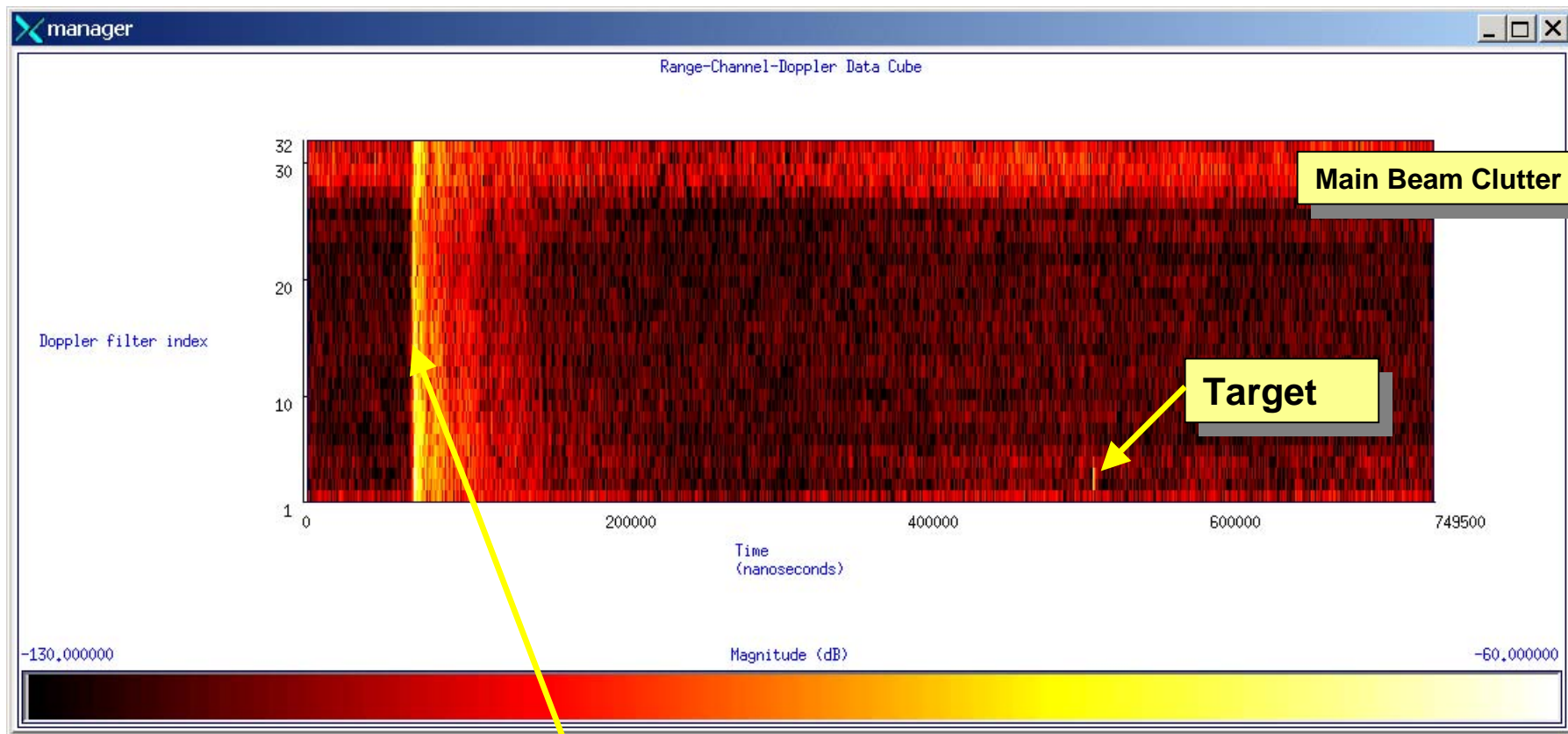
Doppler Processing + Digital Beamforming, Azimuth = 15 Deg.



DPCA + Doppler Processing, Azimuth = 15 Deg.

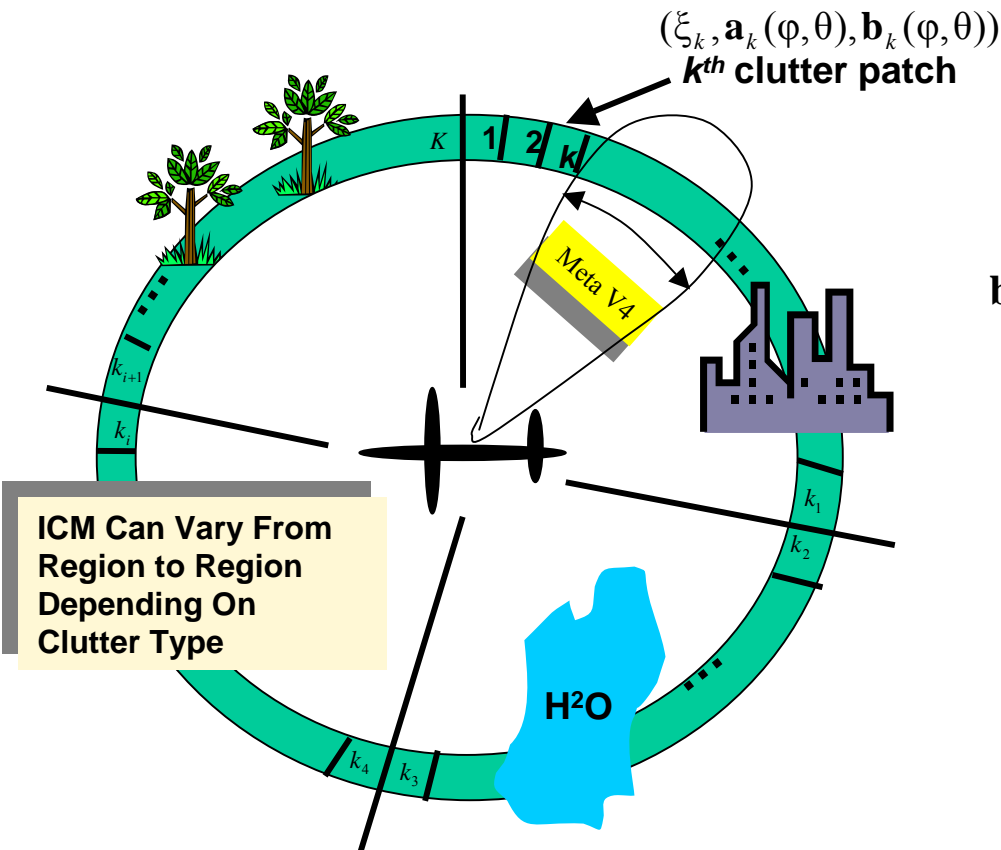


DPCA + Doppler Processing + Digital Beamforming, Azimuth = 15 Deg.



Altitude Line

Clutter Analytic (Clairvoyant) Covariance Matrix Calculation Technique



ICM Can Vary From Region to Region Depending On Clutter Type

Homogeneous Clutter in Low Fidelity Meta-Model
Heterogeneous Clutter in Higher Fidelity

Spatial Vector

$$\mathbf{a}_k = \exp(j2\pi(0:N-1)\frac{d}{\lambda}\sin(\phi_k)\cos(\theta_k))$$

Temporal Vector

$$\mathbf{b}_k = \exp(j2\pi(0:M-1)\frac{2v}{\lambda \bullet prf}\sin(\phi_k + \phi_{vma})\cos(\theta))$$

Space Time Vector

$$\mathbf{v}_k = (\mathbf{b}_k \otimes \mathbf{a}_k) \in C^{NM \times 1}$$

Analytic Covariance Matrix Calculation

$$\mathbf{R} = \sum_{k=1}^K \xi_k^2 \mathbf{v}_k \mathbf{v}_k^H$$

Adaptive Processing Metrics

- GMTI Requires Robust MDV Performance
- Moving Platform – Clutter Coupled in Angle and Doppler – Use **STAP**
- Adaptive Matched Filter With Known Covariance Matrix \mathbf{R}
- Metric Used: SINR Loss

Received Signal Vector

STAP Filter Output

Constrained STAP Weight Vector

The Known Interference Covariance Matrix, \mathbf{R} , Was Used

SNR

$$\mathbf{w} = \mathbf{s}, \quad SNR = \frac{\alpha^2 |\mathbf{s}^H \mathbf{s}|^2}{\mathbf{s}^H (\sigma^2 \mathbf{I}) \mathbf{s}} = \frac{NM\alpha^2}{\sigma^2}$$

SINR

$$SINR_{out} = \frac{P_s}{P_n} = \frac{\alpha^2 |\mathbf{w}^H \mathbf{s}_t|^2}{\mathbf{w}^H \mathbf{R} \mathbf{w}}$$

SINR Loss

$$SINR_{Loss} = \frac{SINR}{SNR}$$

Target Signal Vector

Thermal Noise + Interference

$$\mathbf{x} = \alpha \mathbf{s}_t + \mathbf{n}$$

$$y = \mathbf{w}^H \mathbf{x} = \alpha \mathbf{w}^H \mathbf{s}_t + \mathbf{w}^H \mathbf{n}$$

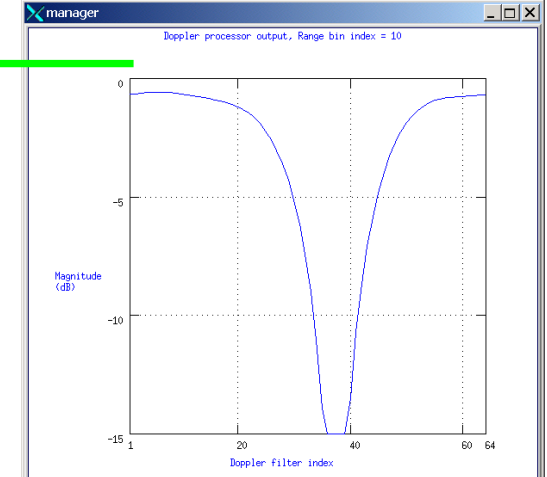
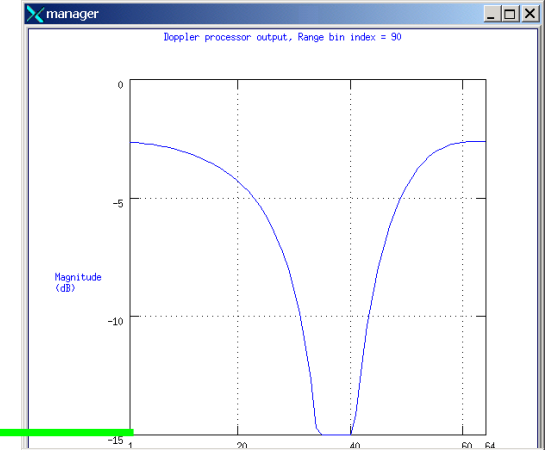
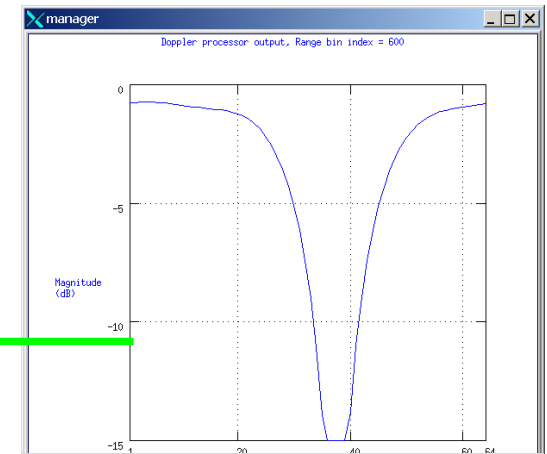
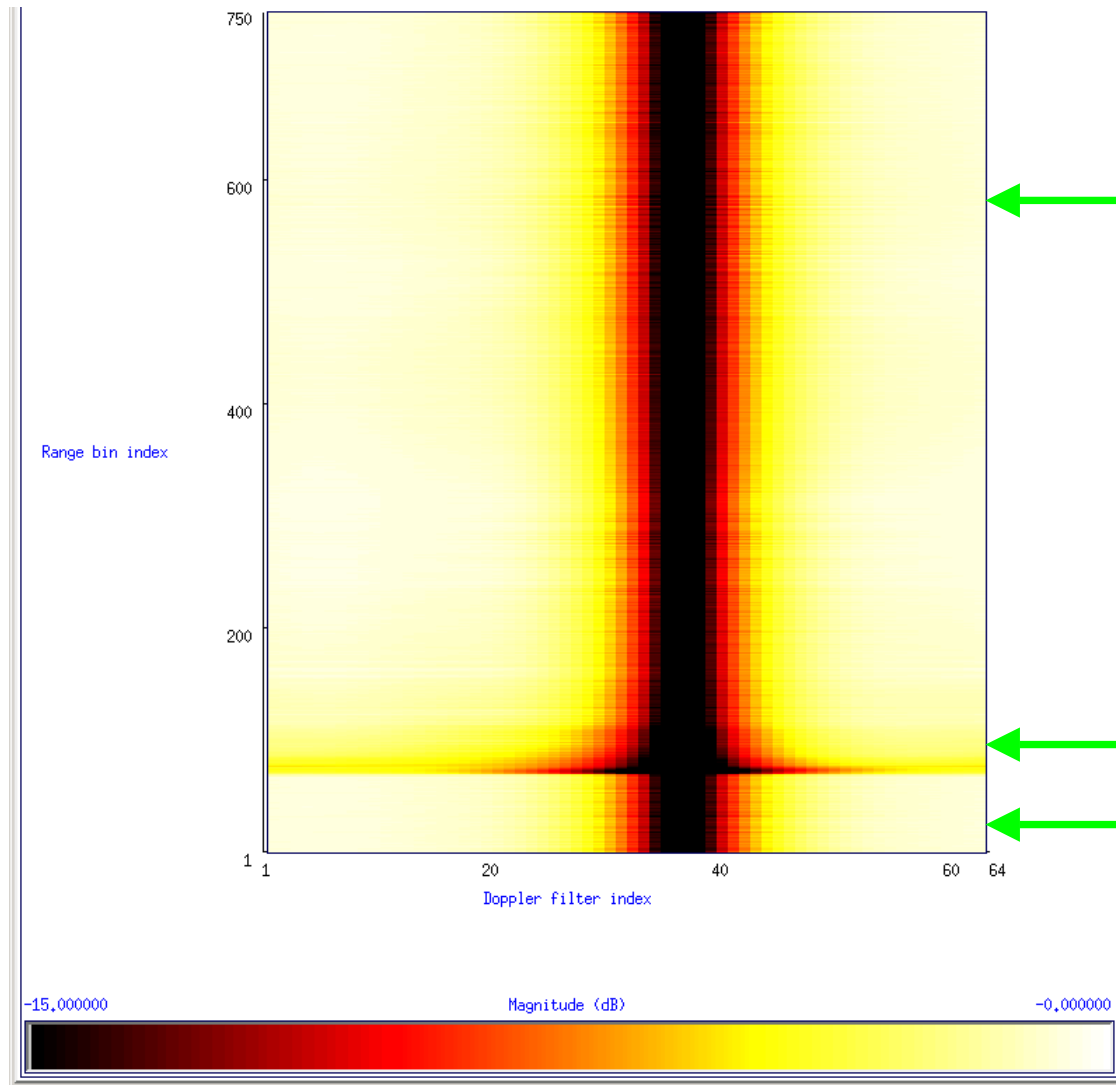
Desired Signal Vector

$$\mathbf{w} = \kappa \tilde{\mathbf{R}}^{-1} \mathbf{s}_d = \frac{\tilde{\mathbf{R}}^{-1} \mathbf{s}_d}{\mathbf{s}_d^H \tilde{\mathbf{R}}^{-1} \mathbf{s}_d}$$

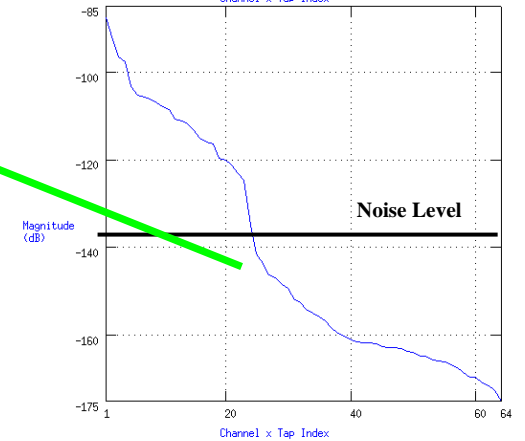
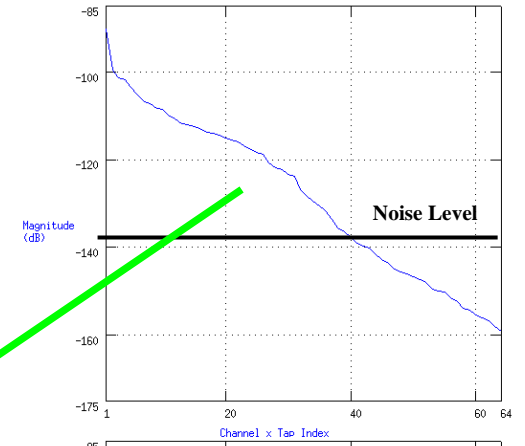
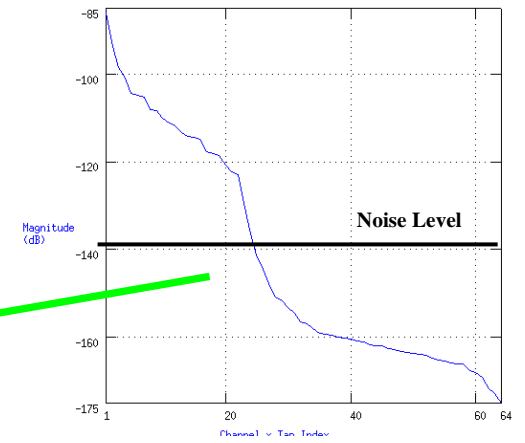
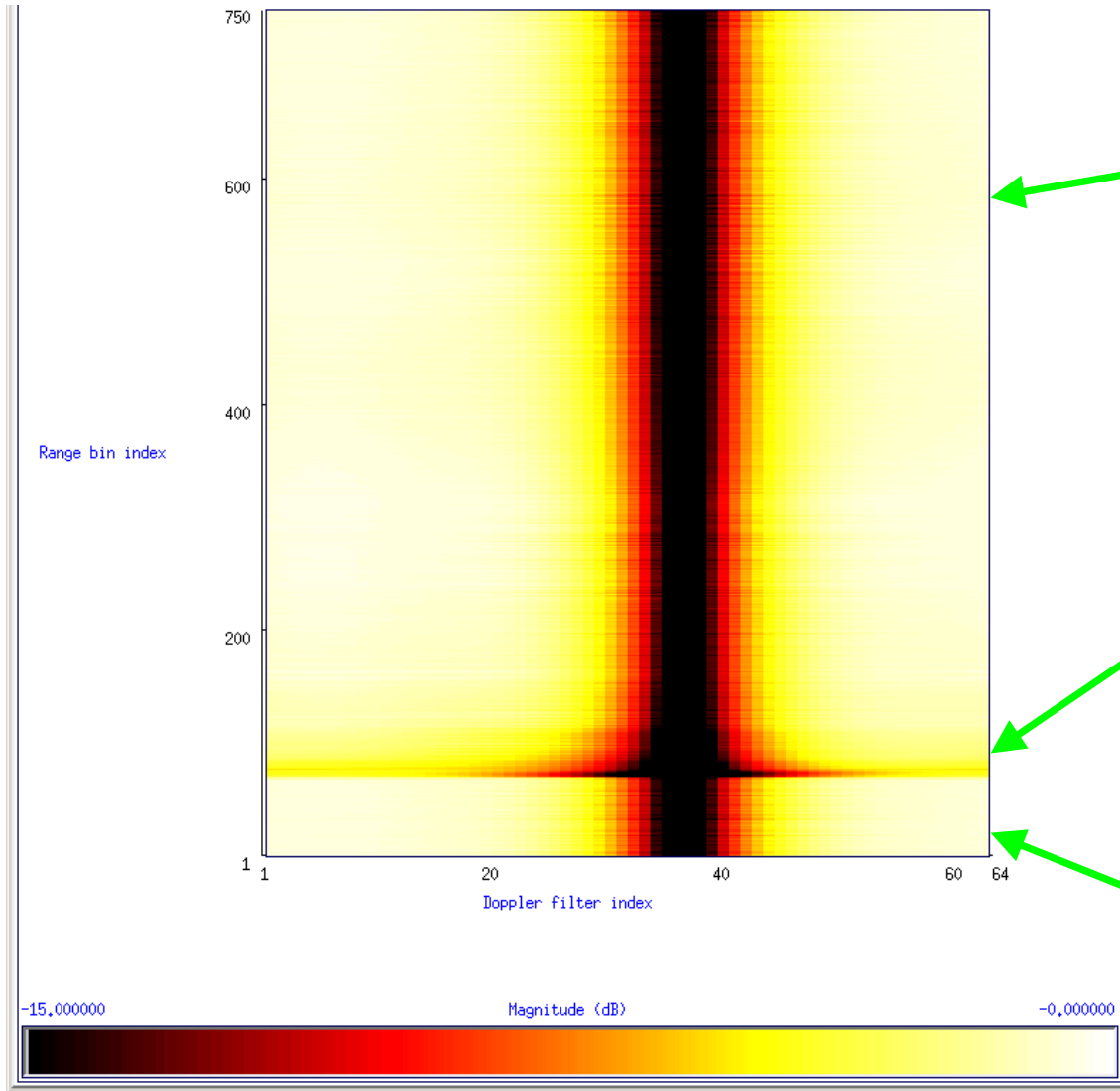
Estimated Interference Covariance Matrix

SINR Loss – Performance of STAP Filter Relative to Interference Free Case

SINR Loss, 16 Channels, 4 Long Taps

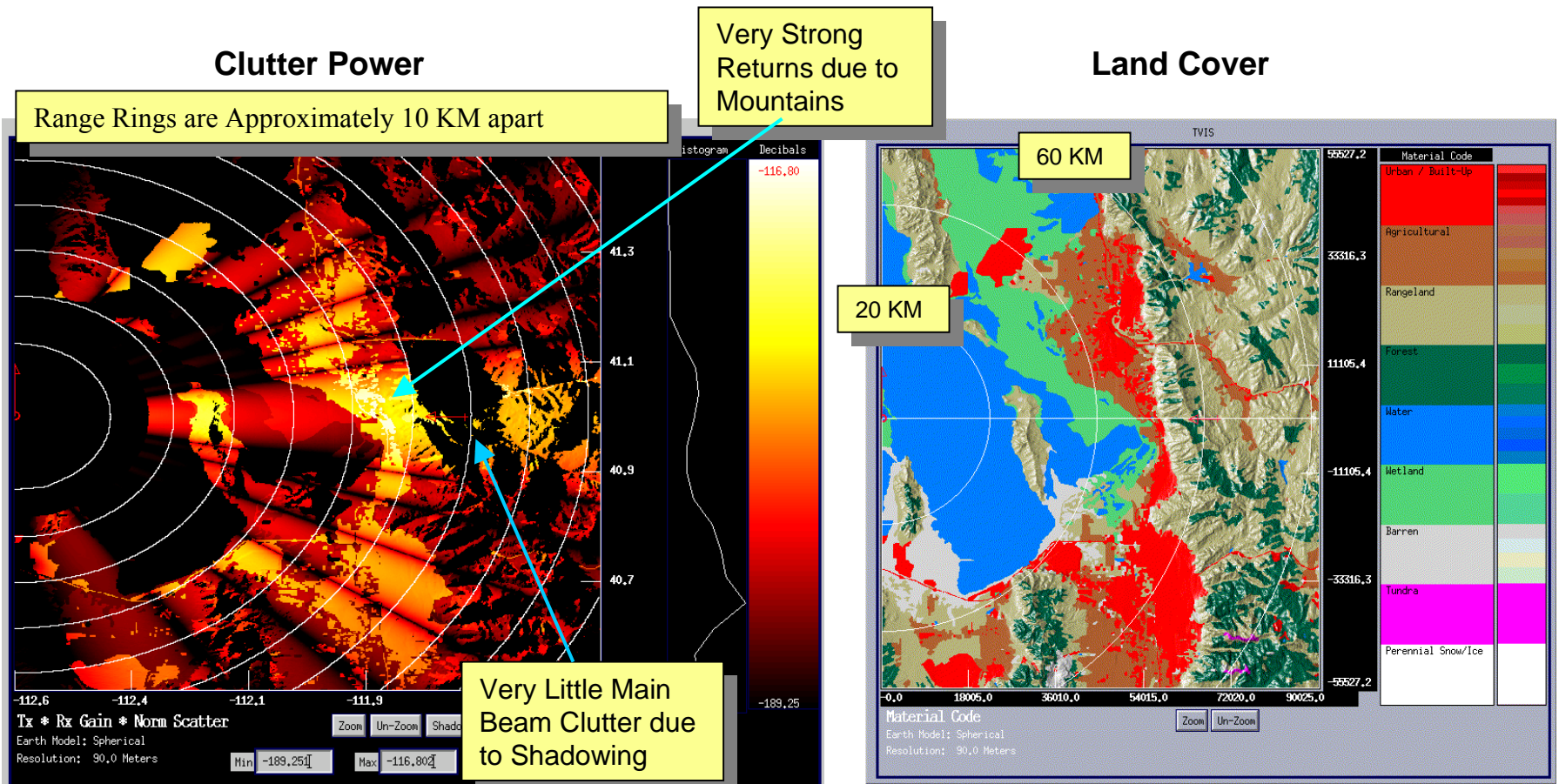


Eigen-Decomposition

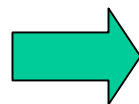
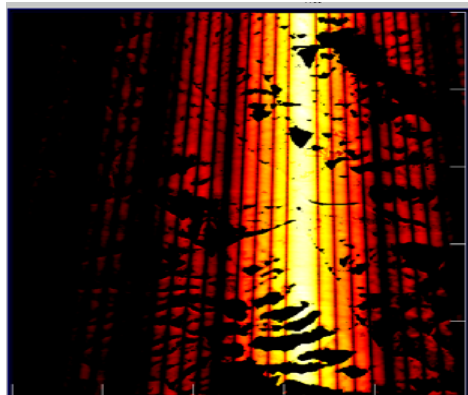


Example of Heterogeneous Clutter Background

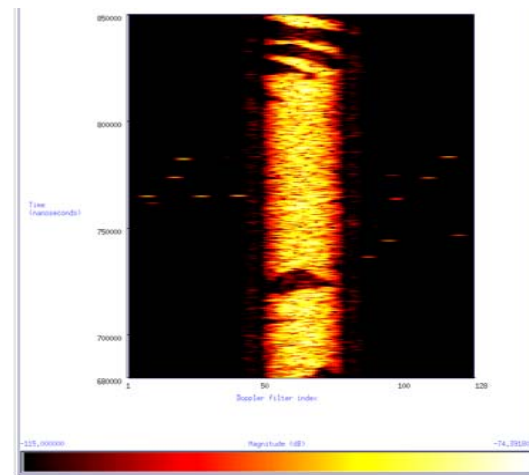
- Radar positioned just on left border of plot, 1/2 way down plot
- Looking out over Great Salt Lake towards SLC and Wasatch Mt. Range



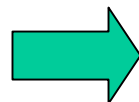
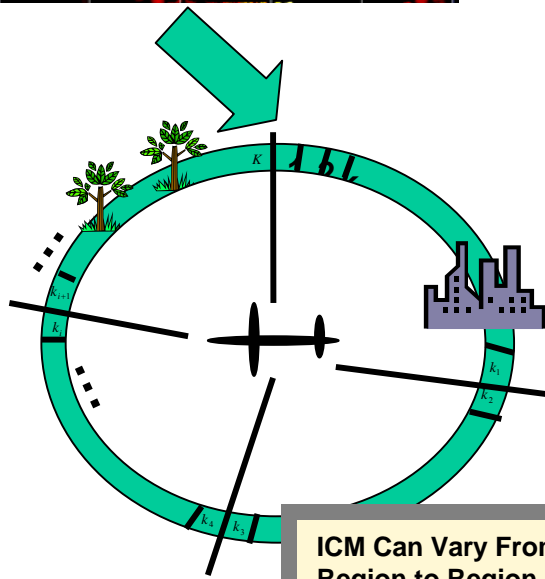
Appearance of Heterogeneous Backgrounds in High and Medium Fidelities



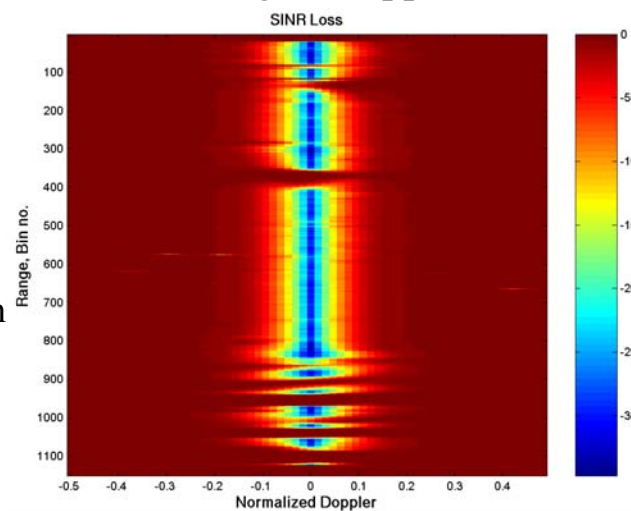
High Fidelity Waveform Gen.
& Doppler Processing



Range - Doppler



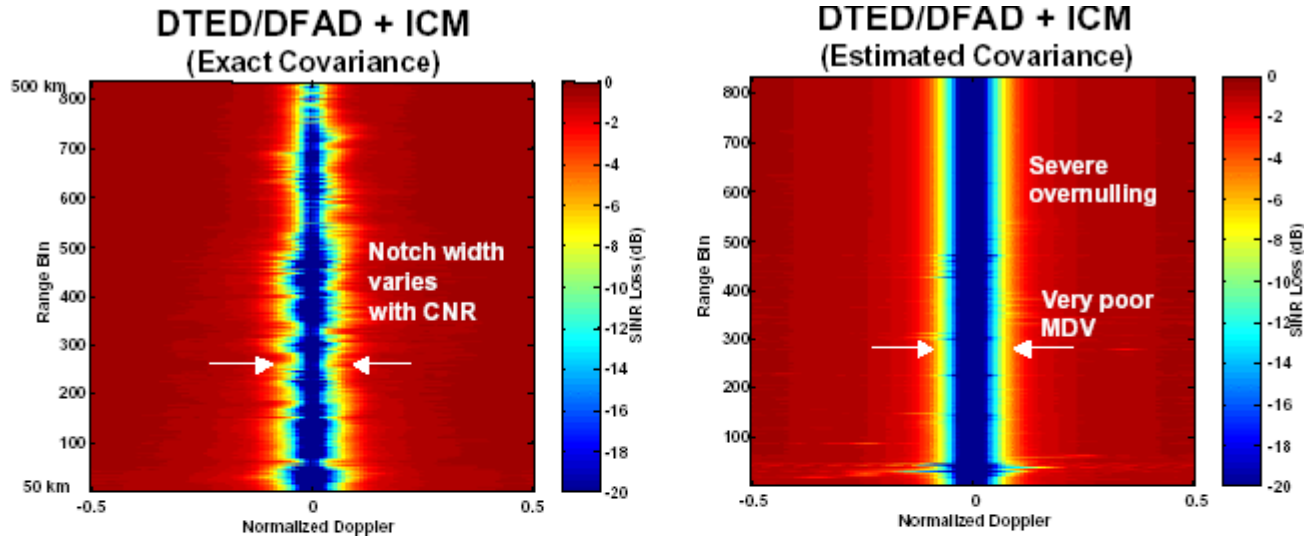
Analytic Covariance Gen.
& Adaption



SINR Loss


ICM Can Vary From
Region to Region
Depending On Clutter Type

Impact of Real-World Effects

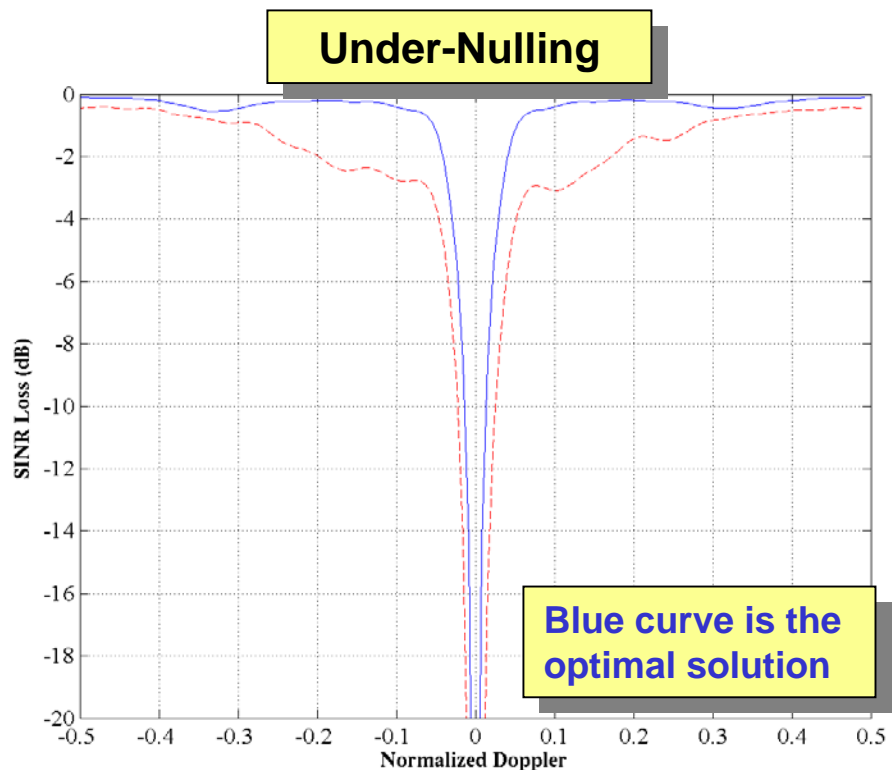


- When estimating covariance over large sample support, range cells with strong CNR dominant
 - Strong CNR cells also have high rank (e.g., Doppler spread)
 - Results in severe overnulling and poor MDV
- Localized training required to track “true” clutter rank

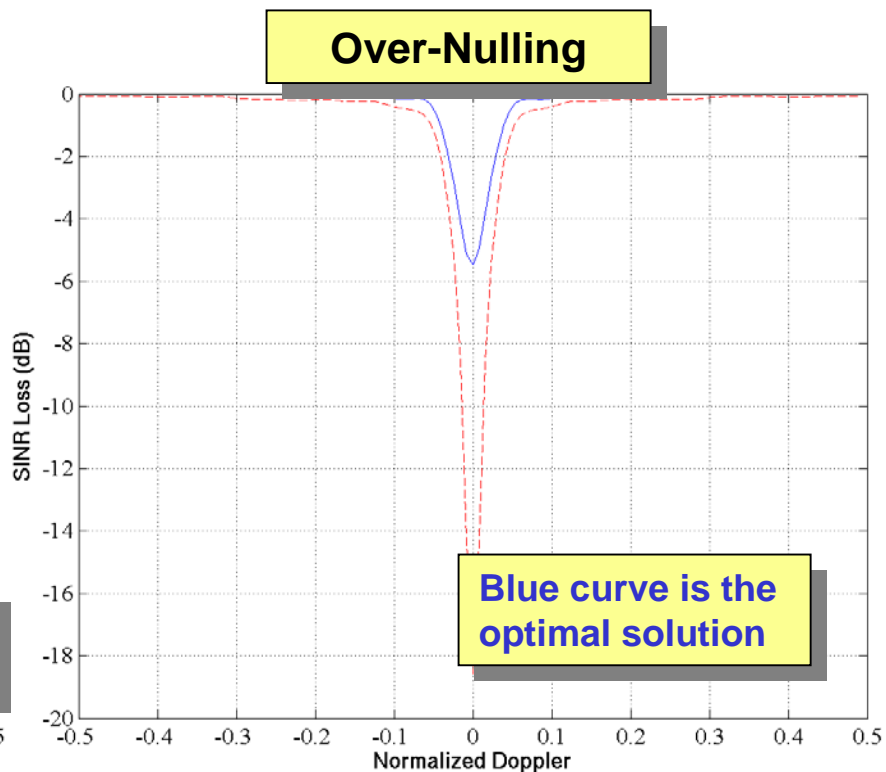
Requires Minimal Sample Support Solution

* Data courtesy of Information Systems Laboratories, Vienna, VA 

Additional SINR Loss due to errors in estimation process

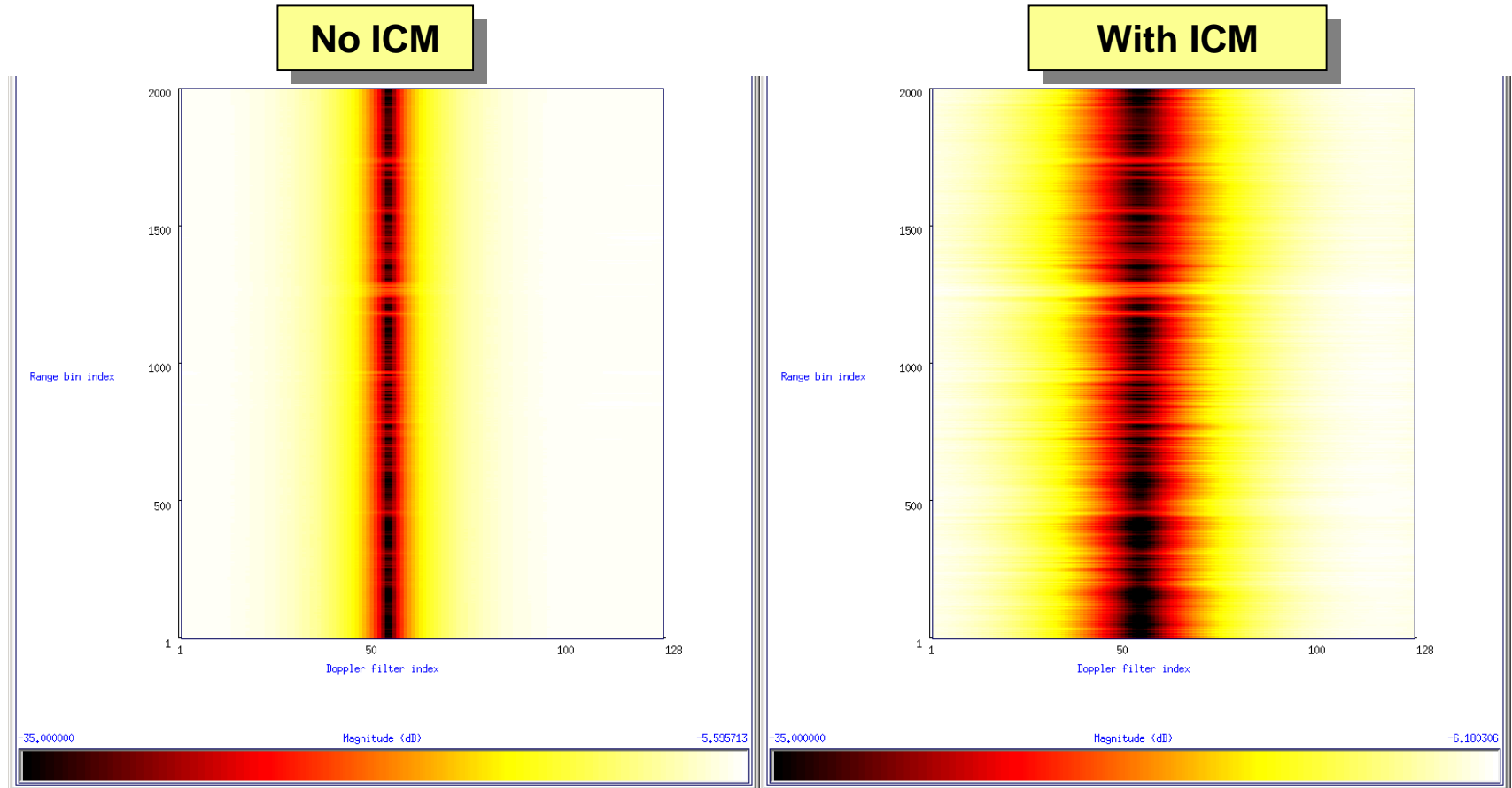


Medium CNR = 20 dB region was used to estimate STAP weights that were applied to High CNR = 40 dB region



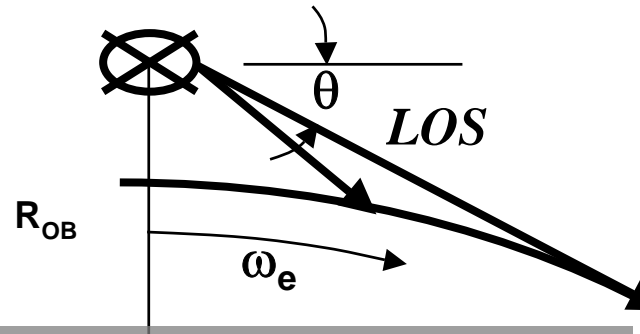
High CNR = 40 dB region was used to estimate STAP weights that were applied to Low CNR = 10 dB region

SINR Loss without and with Internal Clutter Motion



Doppler Warping due to earth's rotation

$H_{OB} = 500 \text{ KM}$
 $V_I = 7613 \text{ m/s}$
 $R_{OB} \omega_e = 458 \text{ m/s}$

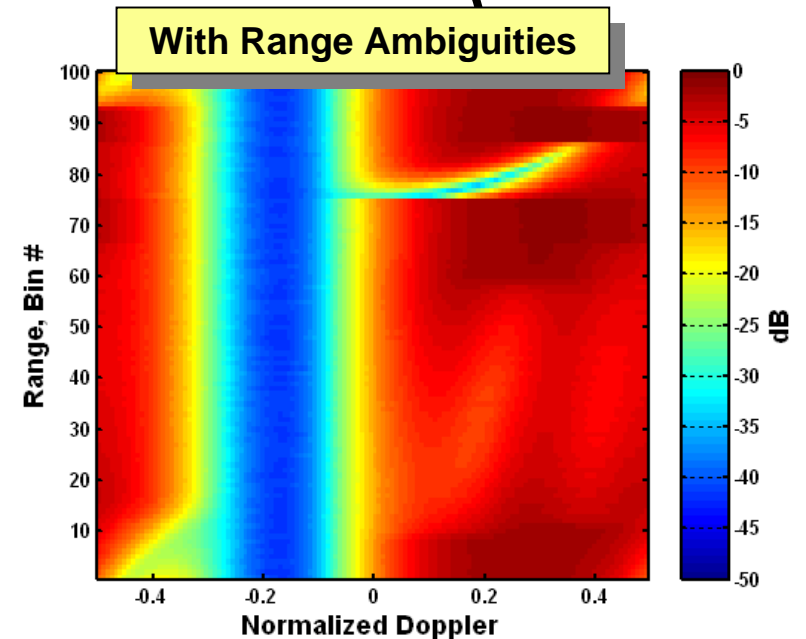
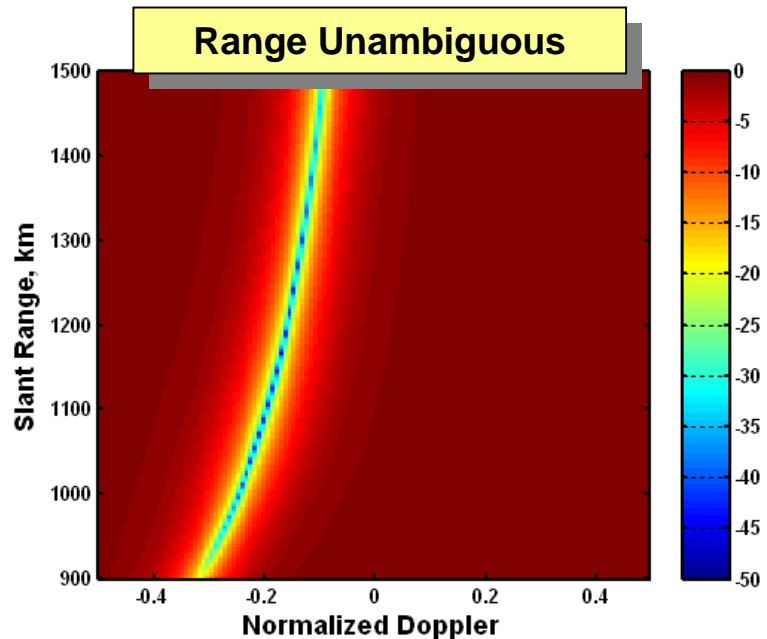


Doppler Shift Varies With Range

$$f_{\text{dop}_c} = \frac{-2\dot{R}}{\lambda} = \frac{-2\langle \text{LOS} | V_{\text{sat}} \rangle_{\text{ECEF}}}{\lambda} = -2 R_{OB} \omega_e \cos \theta$$

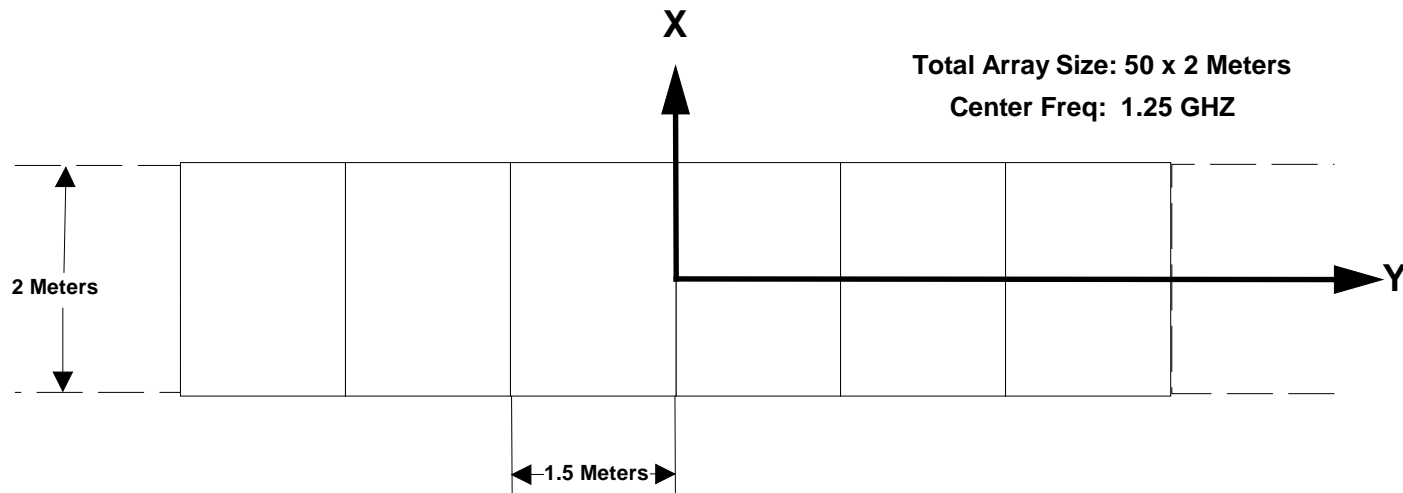
$$|V_{\text{sat}}\rangle_{\text{ECEF}} = \begin{bmatrix} V_I \\ -R_{OB} \omega_e \\ 0 \end{bmatrix}; \quad |\text{LOS}\rangle_{\text{ECEF}} = \begin{bmatrix} 0 \\ \cos \theta \\ \sin \theta \end{bmatrix} \text{ for a radial along equator}$$

$\omega_e = 7.2722 \times 10^{-5} \text{ rad/sec} = \text{earth rotation angle rate}$
 $R_{OB} = \text{distance from earth center to satellite}$



Space Radar Systems

- Present a new set of problems due to weight and packaging constraints:
 - The array must be folded up to fit into the launch vehicle shroud
 - On orbit the array is unfolded and attached to a truss structure
- The resulting array will not be flat to within $\lambda/20$ because distortions will occur which cannot be controlled by mechanical means alone. These may be due to:
 - Static distortions due to deployment errors
 - Dynamic distortions due to station keeping, heating, etc. The dynamic distortions must be sensed at a temporal rate higher than the natural frequency of the structure and spatially at a rate greater than the highest order mode of significance.
- A robust realtime metrology scheme coupled with dynamic electronic compensation is required to live with expected mechanical deformations.

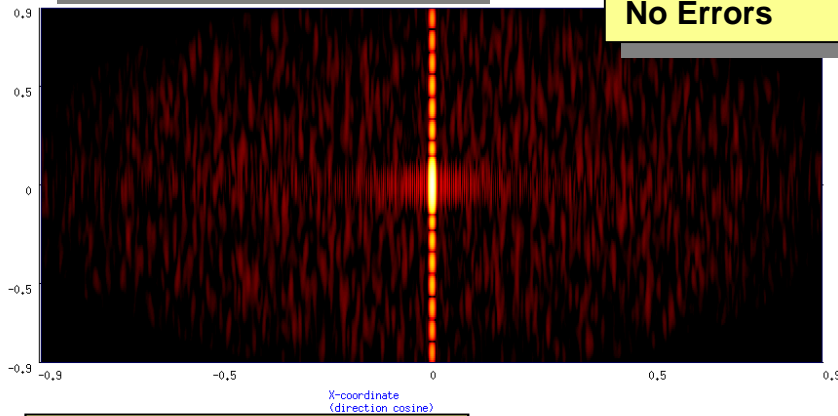


Volumetric patterns with no errors, out of plane, and orientation errors

L-Band
50m x 2.5m array
32 panels

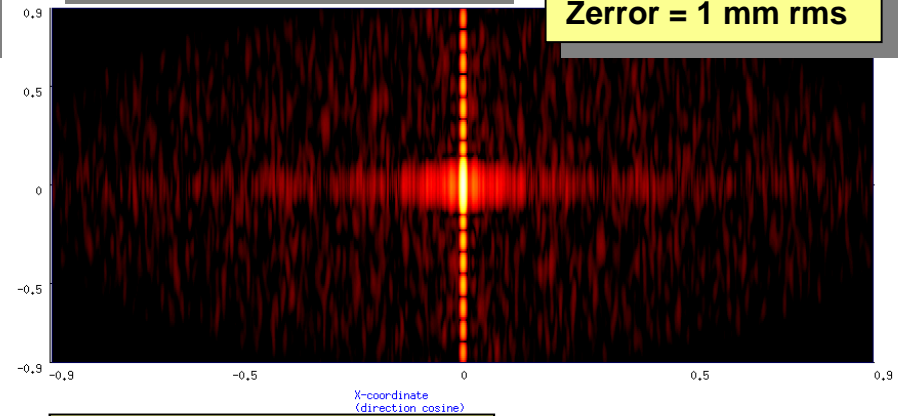
Pk Directive Gain = 41.7 dBI
RMS Sidelobes = - 55.7 dBML

No Errors



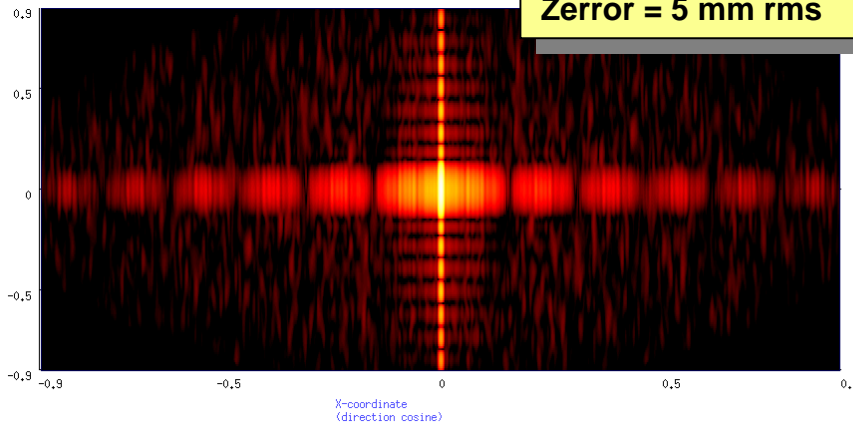
Pk Directive Gain = 41.7 dBI
RMS Sidelobes = - 55.5 dBML

Zerror = 1 mm rms



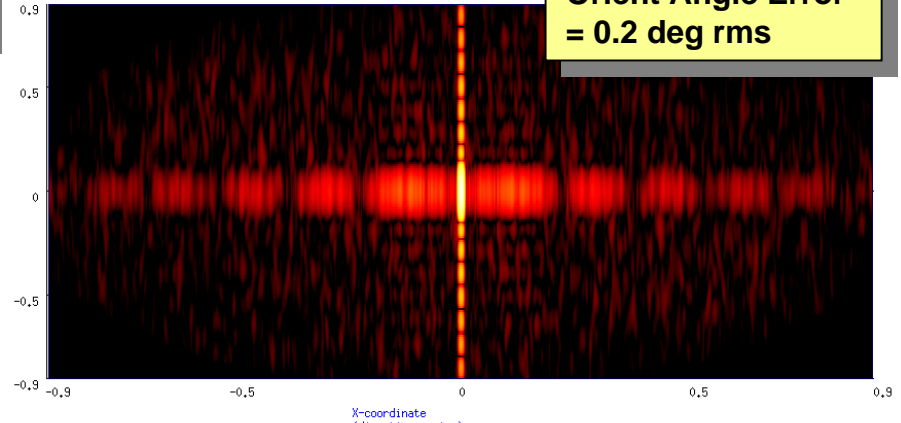
Pk Directive Gain = 41.6 dBI
RMS Sidelobes = - 51.8 dBML

Zerror = 5 mm rms

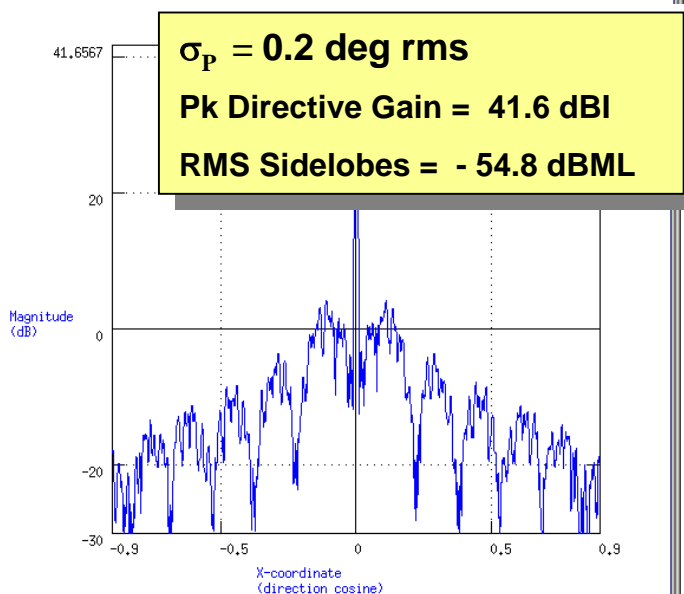
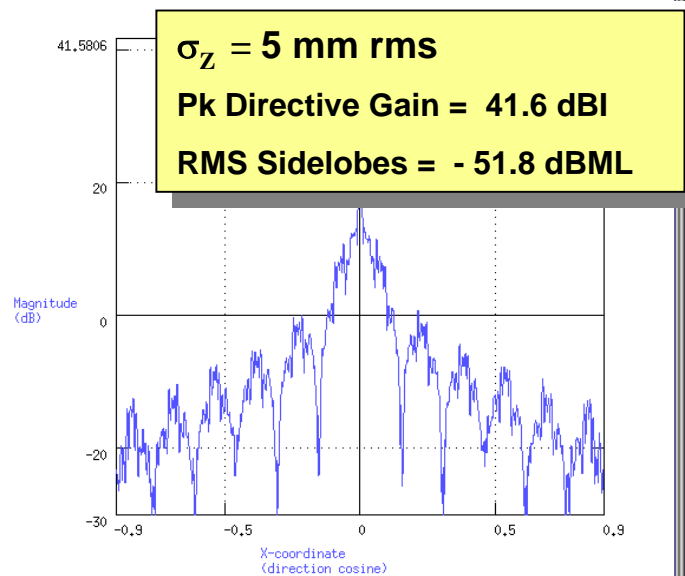
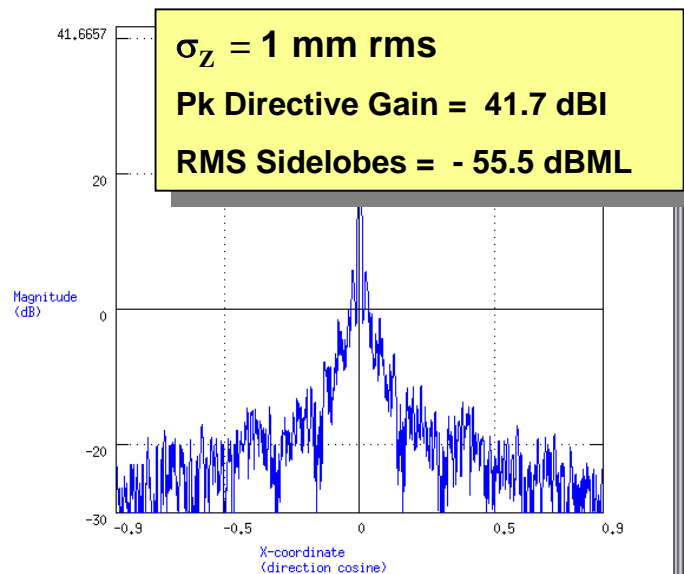
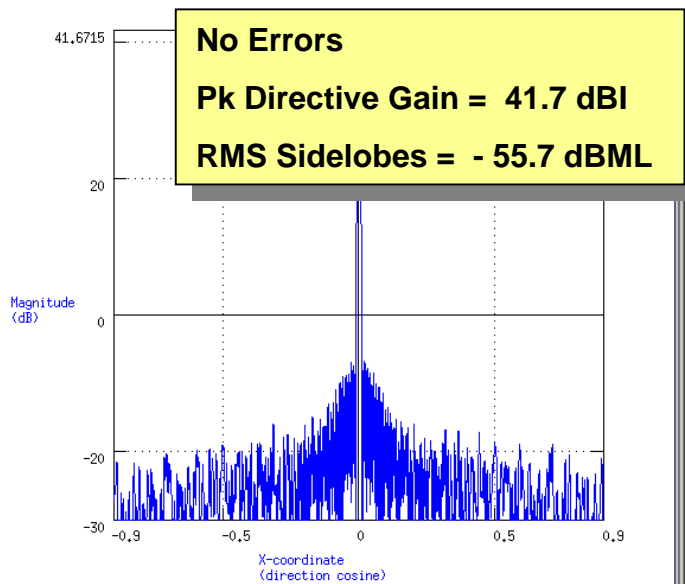


Pk Directive Gain = 41.6 dBI
RMS Sidelobes = - 54.8 dBML

Orient Angle Error = 0.2 deg rms



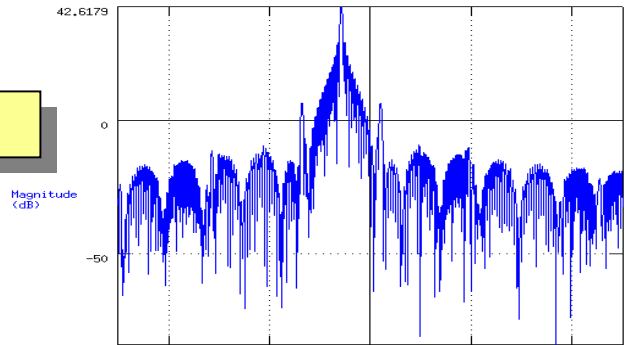
Azimuthal Cuts to show the Effect of some Errors



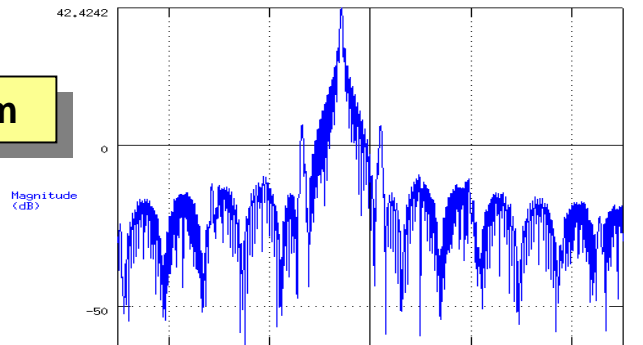
Antenna Performance & SINR Loss changes with parabolic bending of array truss (uncompensated)

Azimuthal cut thru pattern

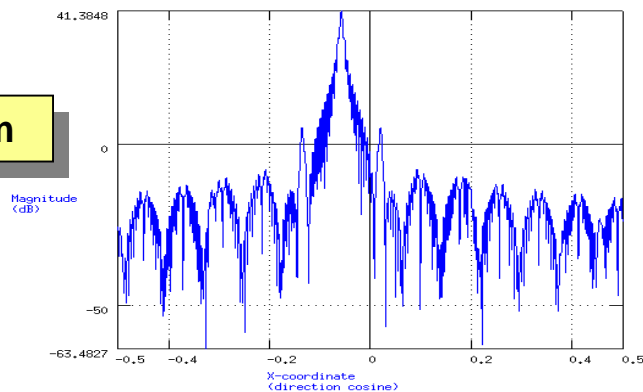
Zmax = 00 mm



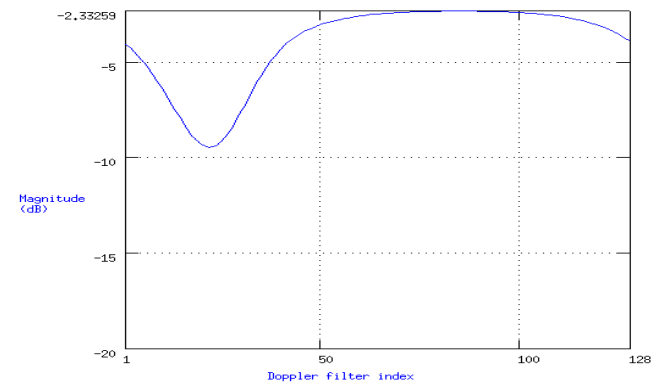
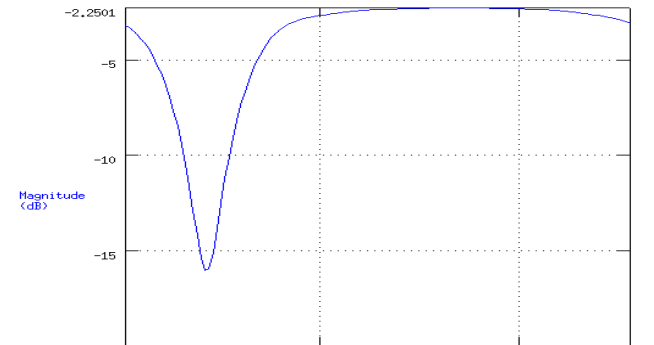
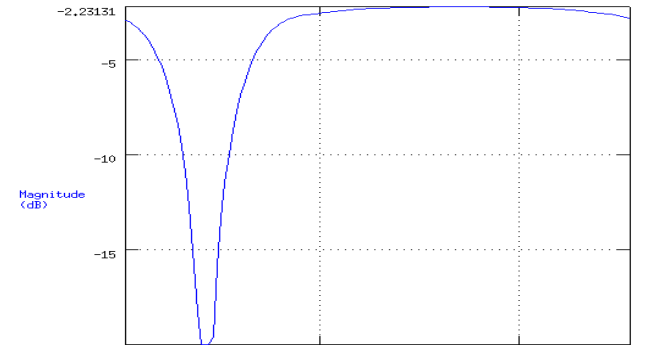
Zmax = 24 mm



Zmax = 60 mm



SINR Loss



Ending

Current Investigations to Mitigate Limiting Factors

- Knowledge-Based Approaches
 - Select Training Set
 - Mix Adaptive and Non-Adaptive Techniques
- Techniques that require less Sample Support in Training Set
- Orthogonal Waveforms
- Many Others