

アレー信号処理におけるSpatial Signature推定と  
多重散乱波環境におけるアレー最適信号合成への応用

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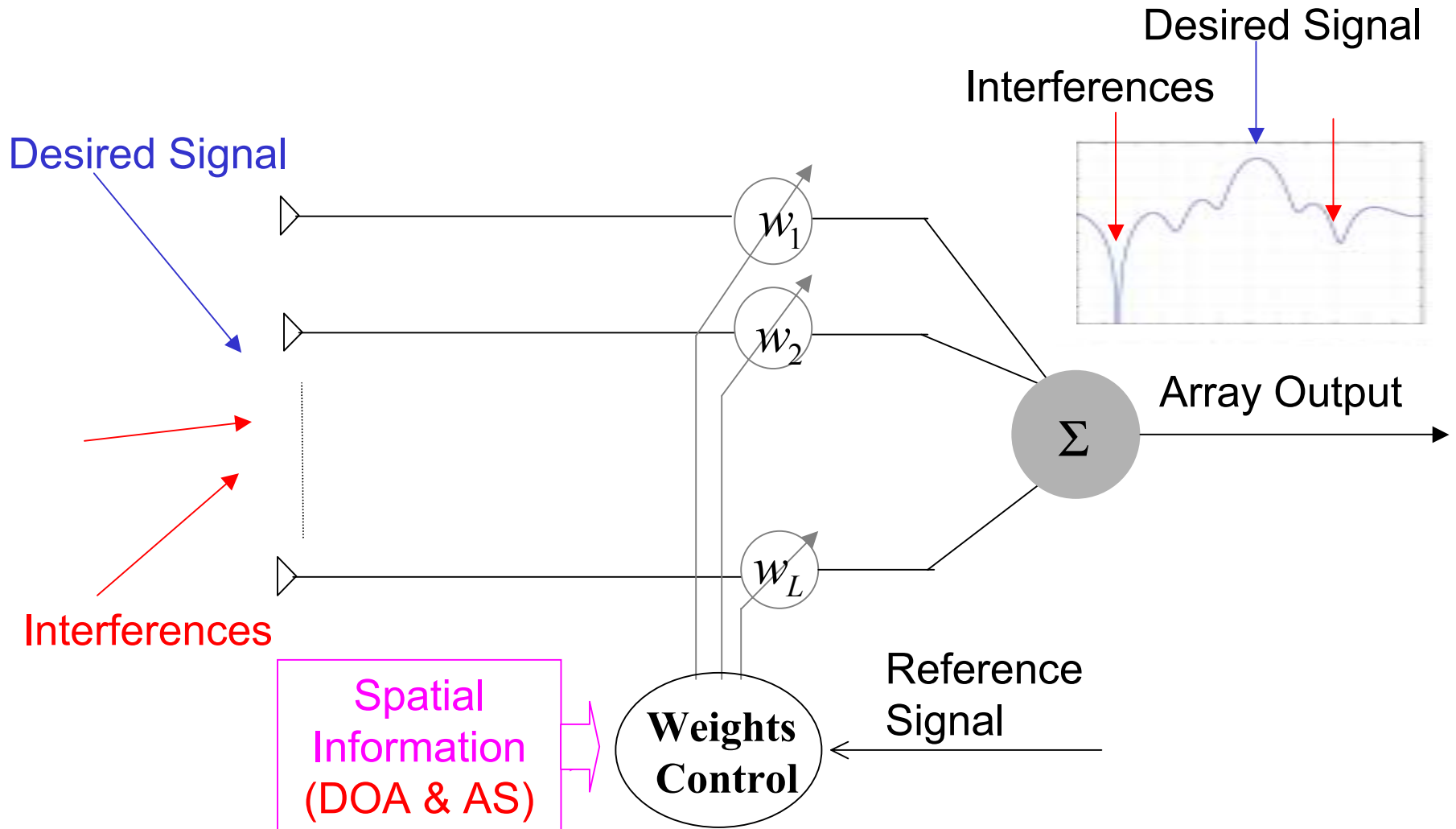
- Research Backgrounds and Objectives
- Data Model for Array Antenna Signal Processing
- **Expression of Spatial Signature by Extended Array Mode Vector**
- **Joint Estimation for DOA and Angular Spread**
  - MUSIC & ESPRIT algorithms with EAMV
  - Spatial Signature Estimation & Evaluation
- **Robust Optimal Signal Combining Techniques**
  - DCMP<sup>1</sup> & ZF<sup>2</sup> Algorithms using EAMV Estimates
  - Performance Analysis & Evaluation
- Conclusions

# Motivation

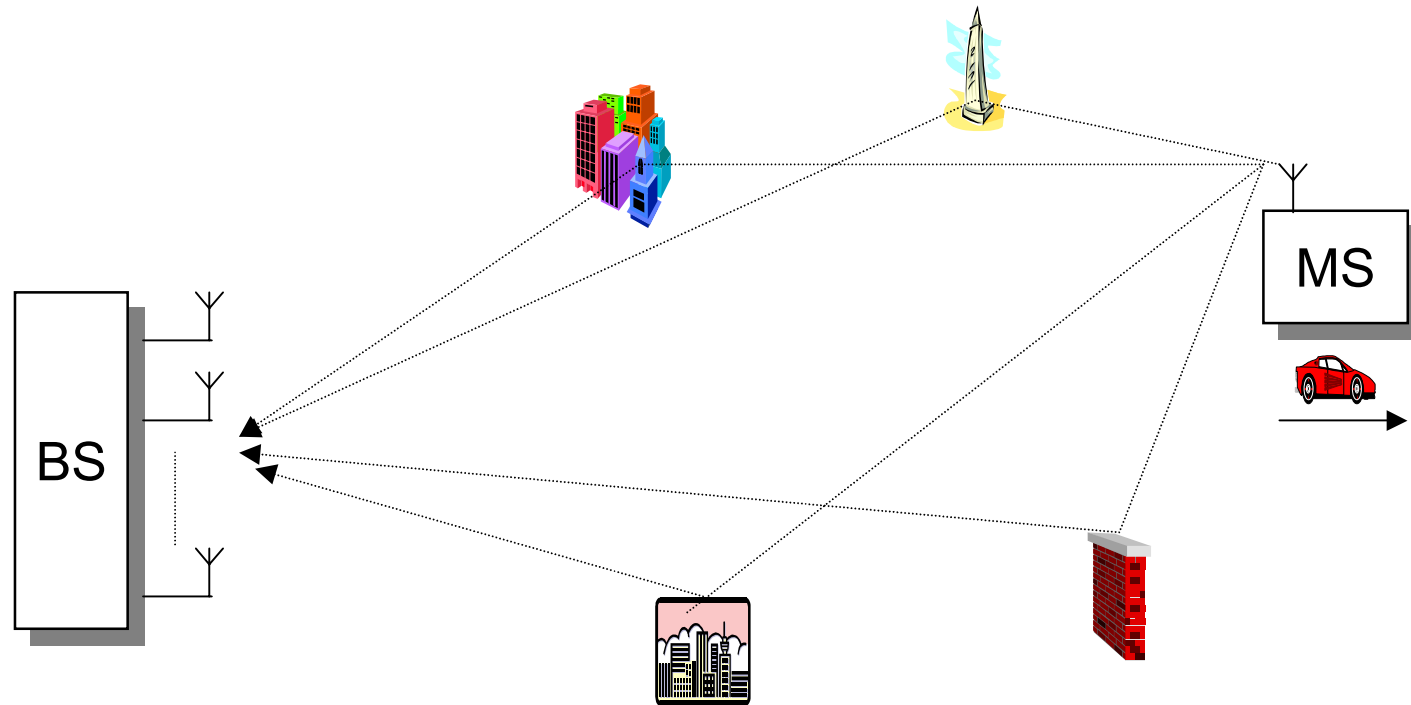
## *Demands on Mobile Communications Systems*

- **Expectation to Spatial Signal Processing**
  - Maximization in SINR
  - Decrease in BER
  - Optimal Design of Communication Systems
- **Technologies**
  - Estimation of Spatial Signature for Mobile Channel
  - Signal Combining Techniques

# Background (1)

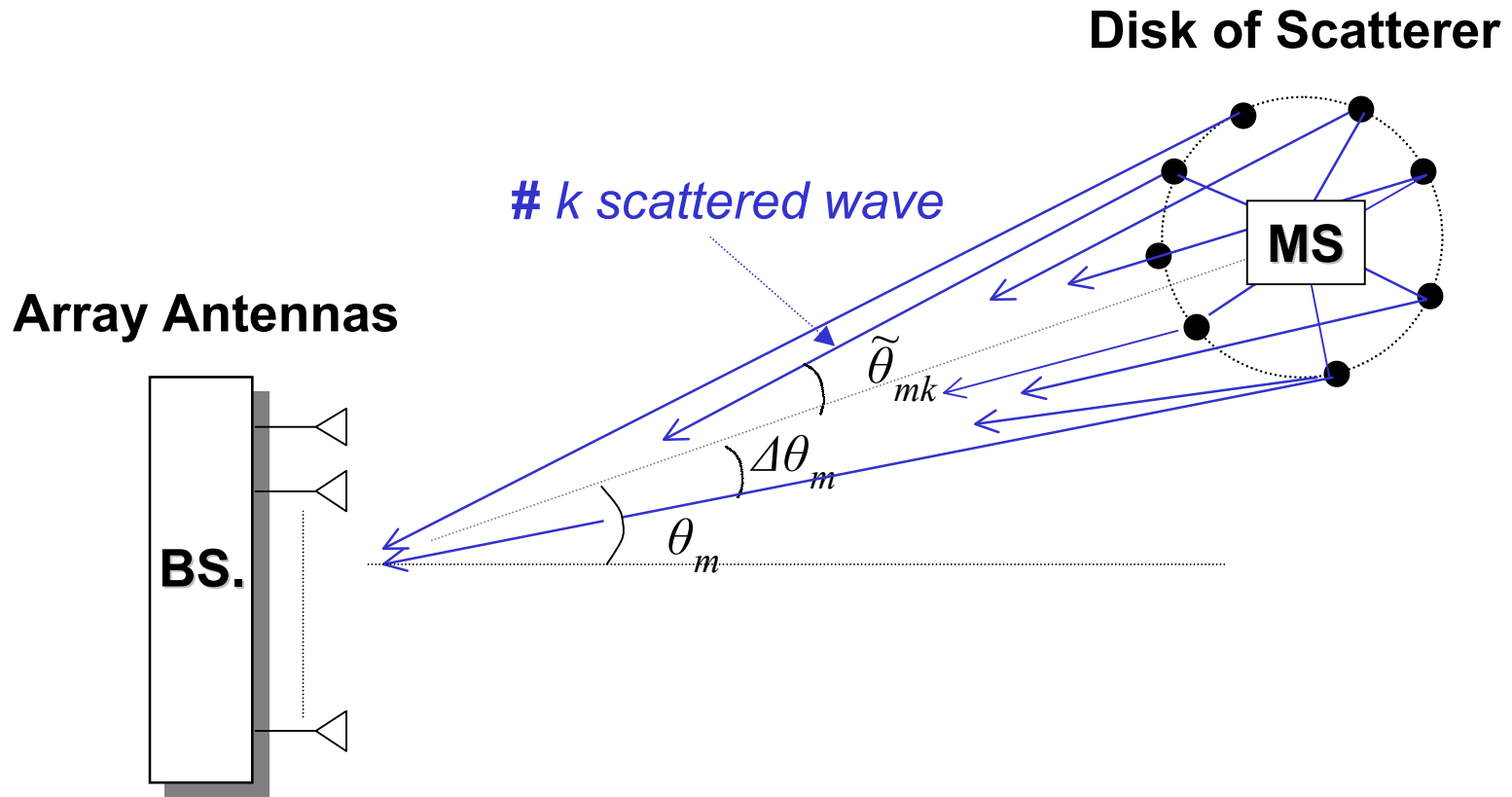


# Mobile Communication Environments



# Background (2)

## Mobile Communication Environments



## Background (3)

- DOA Estimation based on Plane Waves Model
  - Causing Modeling Errors in Angular Spread Environment
- Degradation of Estimation Performance of Spatial Signature
  - Obstacles to Signal Waveforms Recovery & SINR Maximization
- Requiring Robust DOA & AS Estimators against Realistic Environments

# Related Research (1)

## Problem of Estimating AS

- **Effects of Multipath-Induced AS on DOA estimators**  
→ T. Sorelius et.al., (Proc. IEEE/IEE Int. Workshop, 1995)
- **Estimation of Nominal DOA and AS**  
→ T. Trump & B. Ottersten (Signal Processing, 1996)
- **Low Complexity Estimators**  
→ Bengtsson & B.Ottersten (IEEE Trans. SP, 2001)
- **Effects of Local Scattering DOA estimation with MUSIC & ESPRIT**  
→ D.Asztely & B.Ottersten (ICASSP, 1998)
- **Effects of Local Scattering on DOA estimation with MUSIC**  
→ D.Asztely & B.Ottersten (IEEE, 1999)



## Related Research (2)

Problem of combining Signals in AS environments

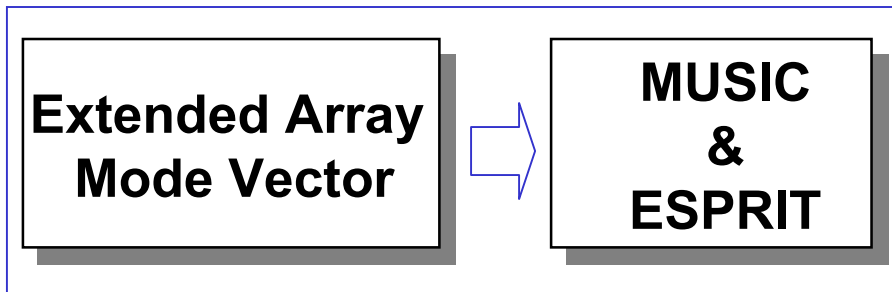
- **An Adaptive Array for Mobile Communication Systems**  
→ S. Anderson et.al., (IEEE Trans. VT, 1991)
- **Modified Array Manifold for Signal Waveform Estimation**  
→ D.Asztely & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf., 1996)
- **Signal Waveform Estimation in AS Environment**  
→ M. Bengtsson & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf., 1996)

# Objectives

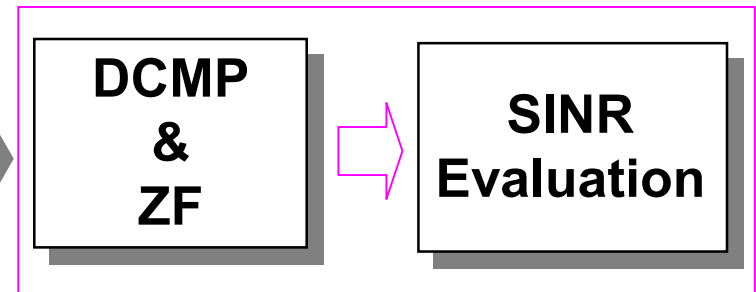
- To cope with Modeling Errors of DOA Estimators in AS
- To obtain More Accurate Spatial Signature(SS) Estimates
- To provide Robust Signal Combining Technique in AS Environments



## Proposals for Joint Estim. of DOA & AS $\rightarrow$ SS Estim.

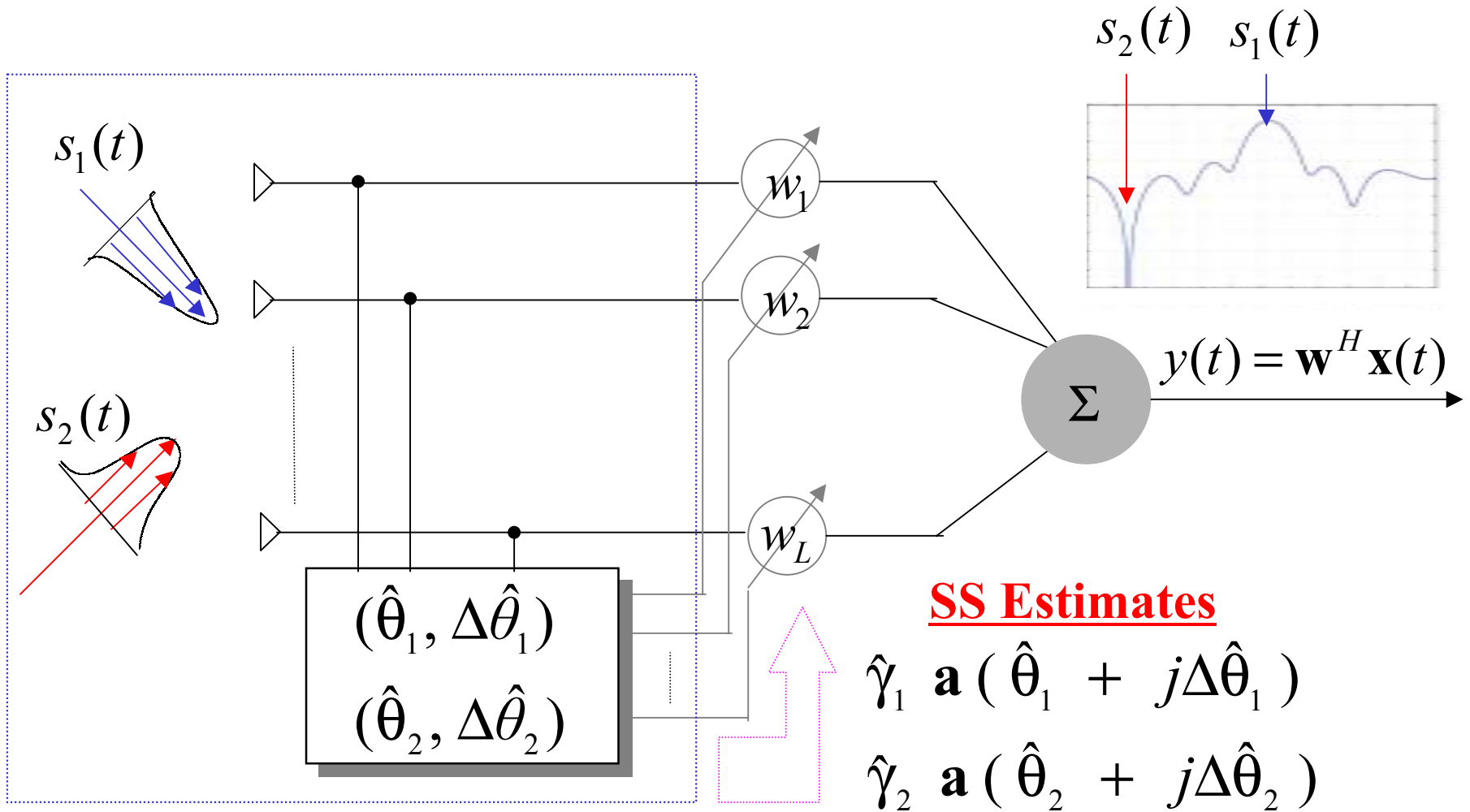


## Proposal for Optimal Signal Combining using EAMV



- (1) Slow Fading Environments modeled by Local Scattering.
- (2) Spatial Signal Processing at BS.

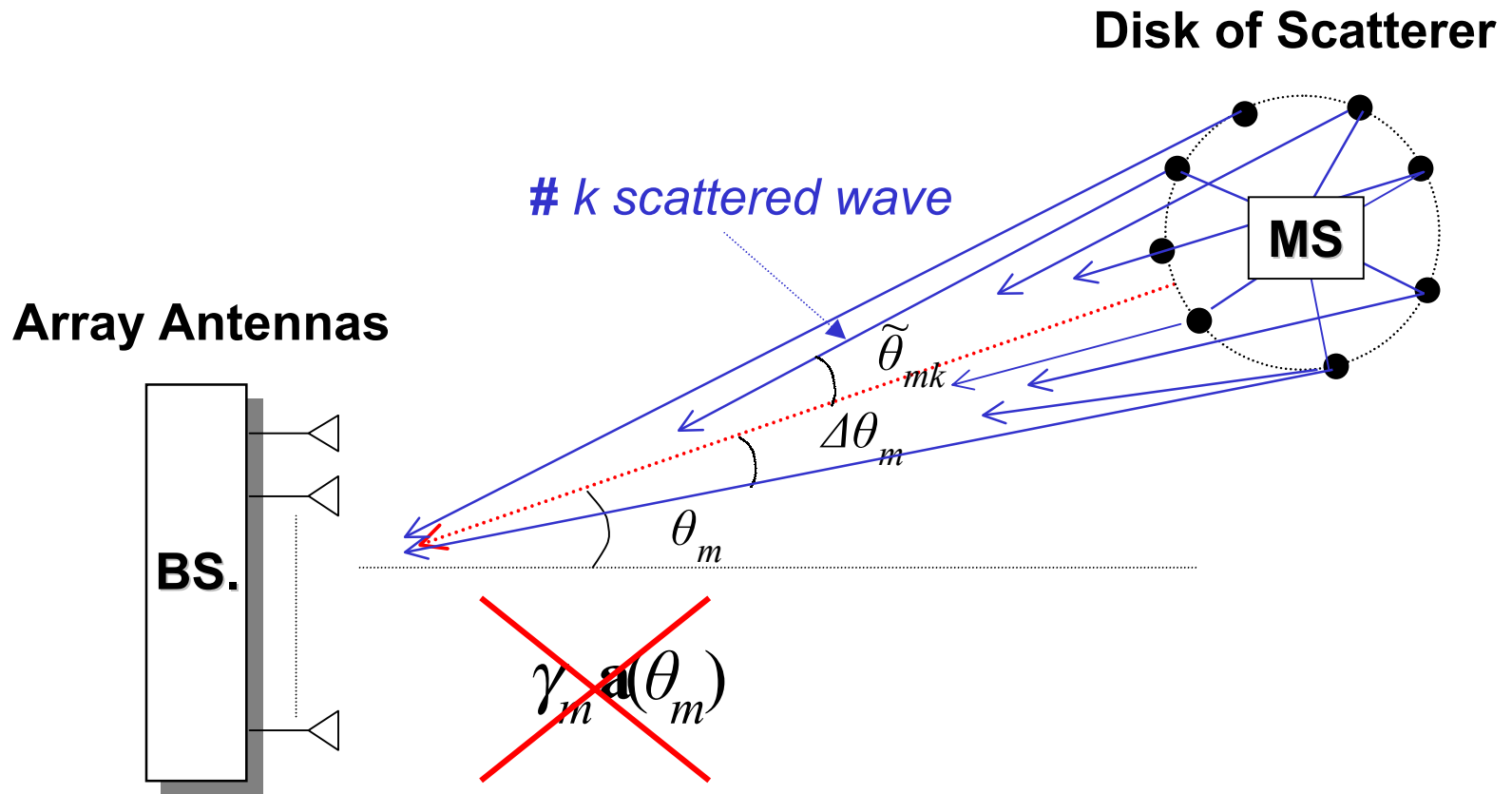
# Spatial Processing at Base Station



# A brief description of mobile channel related to AS

Frequency Flat Channel $T_s \gg T_m$			
No AS $\sigma_\theta = 0$	Narrow AS $\sigma_\theta \ll \theta_{3dB}$	Wide AS	
	Slow Fading $T_c \gg T_o$	Fast Fading $T_c \approx T_o$	$\sigma_\theta \geq \theta_{3dB}$ , $\sigma_\theta \approx \theta_{3dB}$
Plane Wave Model	Conv. Approach (1)	Conv. Approach (2)	???
Frequency Selective Channel $T_s \approx T_m$			
Spatial and Temporal Model			

# Local Scattering Model



# Data Model in Scattering Environments

## Conventional Approach

$$\mathbf{x}(t) = \sum_{k=1}^{K_m} \beta_{mk} \mathbf{a}(\theta_m + \tilde{\theta}_{mk}) s_m(t) + \mathbf{n}(t)$$

Spatial Signature

Conventional Array Mode Vector

$$\left( \sum_{k=1}^{K_m} \beta_{mk} \right) \mathbf{a}(\theta_m + \tilde{\theta}_{mk}) \cong \left( \sum_{k=1}^{K_m} \beta_{mk} \right) \mathbf{a}(\theta_m) + \left( \sum_{m=1}^K \beta_{mk} \tilde{\theta}_{mk} \right) \frac{\partial \mathbf{a}(\theta)}{\partial \theta} \Big|_{\theta=\theta_m}$$

$$\cong \gamma_m \left( \mathbf{a}(\theta_m + \text{Re}\{\zeta_m\}) + \text{Im}\{\zeta_m\} \frac{\partial \mathbf{a}(\theta)}{\partial \theta} \Big|_{\theta=\theta_m} \right)$$

$$\gamma_m \equiv \sum_{k=1}^{K_m} \beta_{mk} \quad \zeta_m \equiv \frac{\sum_{k=1}^{K_m} \beta_{mk} \tilde{\theta}_{mk}}{\sum_{k=1}^{K_m} \beta_{mk}}$$

# Assumptions for Data Model

**Frequency Flat Channel**  $T_s \gg T_m$

**Narrow AS**  $\sigma_\theta \ll \theta_{3\text{dB}}$

**Slow Fading**

$T_c \gg T_o$

# Assumptions for Data Model

(A 1)

1Burst  $f_D \cdot T_{obs} \approx 0$

Coherence Time

Observation Time

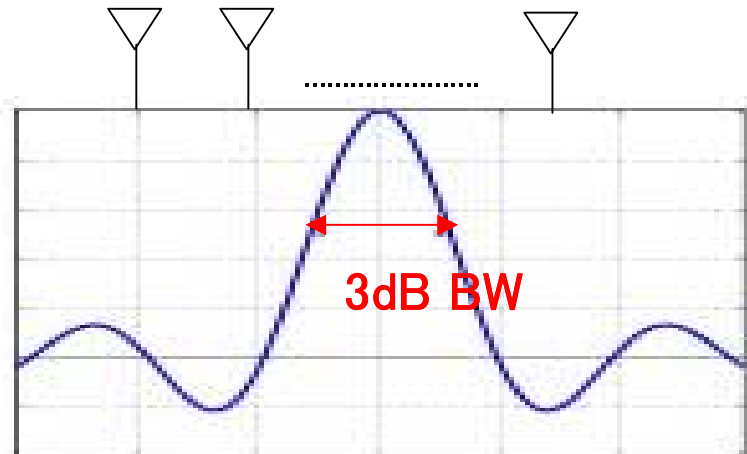
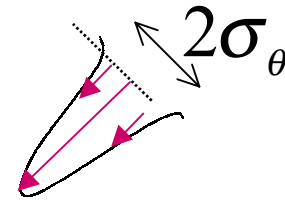
One Symbol Duration

Max. Excess Delay Time

N  
E  
G  
L  
I  
G  
I  
B  
L  
E

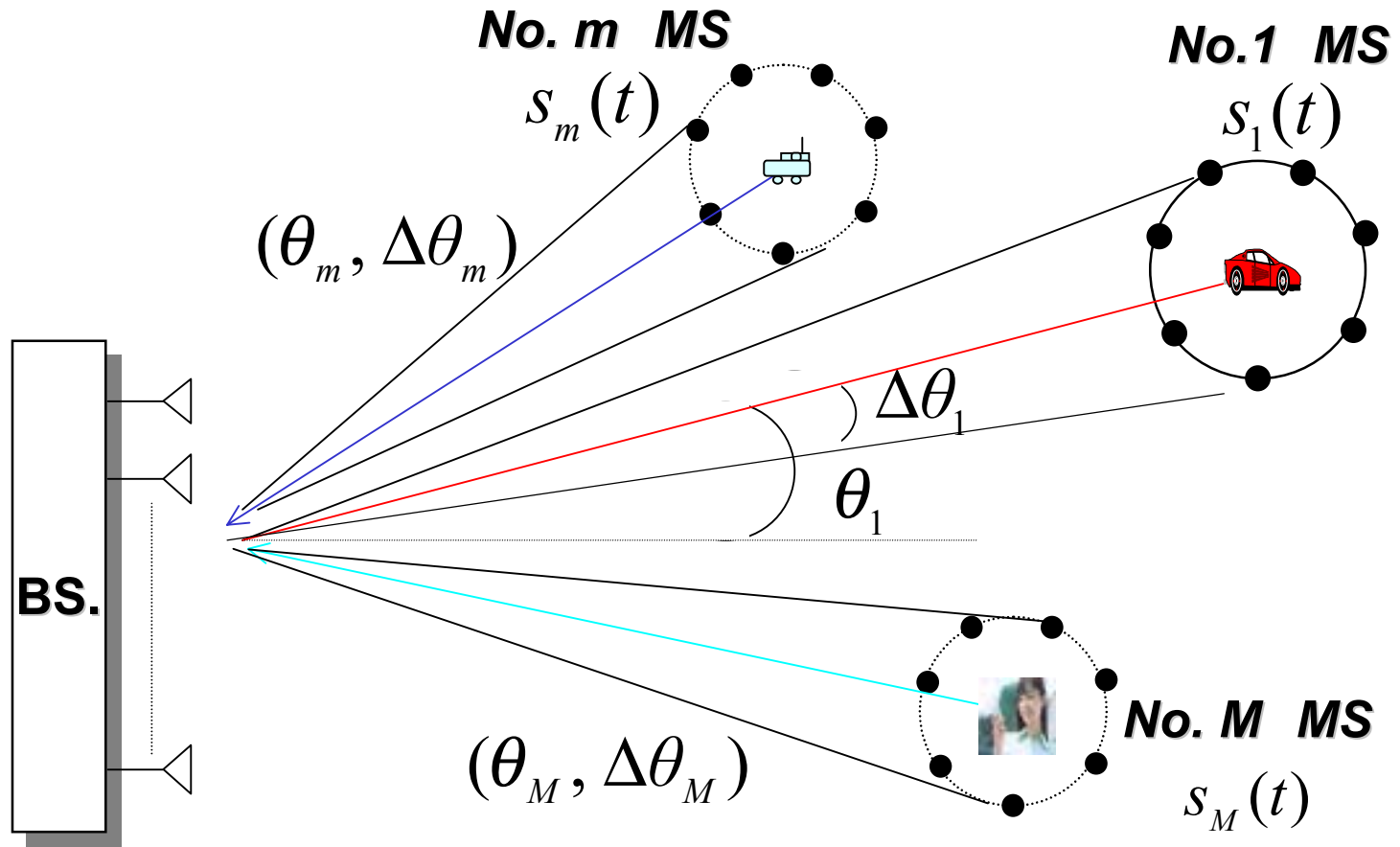
(A 2)

$$\sigma_\theta \ll \theta_{3dB}$$

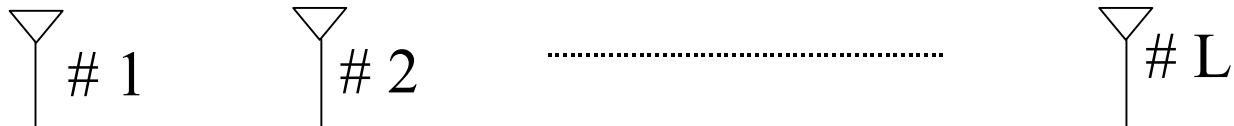




# Multiple Clusters Environments



# Extended Array Mode Vector (EAMV)



$$\mathbf{x}(t) = \sum_{m=1}^M \sum_{k=1}^{K_m} \beta_k \mathbf{a}(\theta_m + \tilde{\theta}_{mk}) s_m(t) + \mathbf{n}(t)$$



$$\gamma_m \mathbf{a}(\underbrace{\theta_m + \text{Re}\{\zeta_m\}}_{\text{Inst. DOA}} + \underbrace{\text{Im}\{\zeta_m\}}_{\text{Inst. AS}})$$



Inst. DOA

Inst. AS

Fading Coefficient

$$\zeta_m \equiv \frac{\sum_{k=1}^{K_m} \beta_{mk} \tilde{\theta}_{mk}}{\sum_{k=1}^{K_m} \beta_{mk}}$$

# Comparison (1)

## First-Order Approximation of Spatial Signatures

$$\gamma_m \mathbf{a}(\theta'_m + j\Delta\theta_m)$$



$$\gamma_m \left( \mathbf{a}(\theta'_m) + \text{Im}\{\zeta_m\} \left. \frac{\partial \mathbf{a}(\theta)}{\partial \theta} \right|_{\theta=\theta_m} \right)$$

## Comparison (2)

How the AS can be obtained ?

**Frequency Flat Channel**  $T_s \gg T_m$

**Narrow AS**  $\sigma_\theta \ll \theta_{3\text{dB}}$

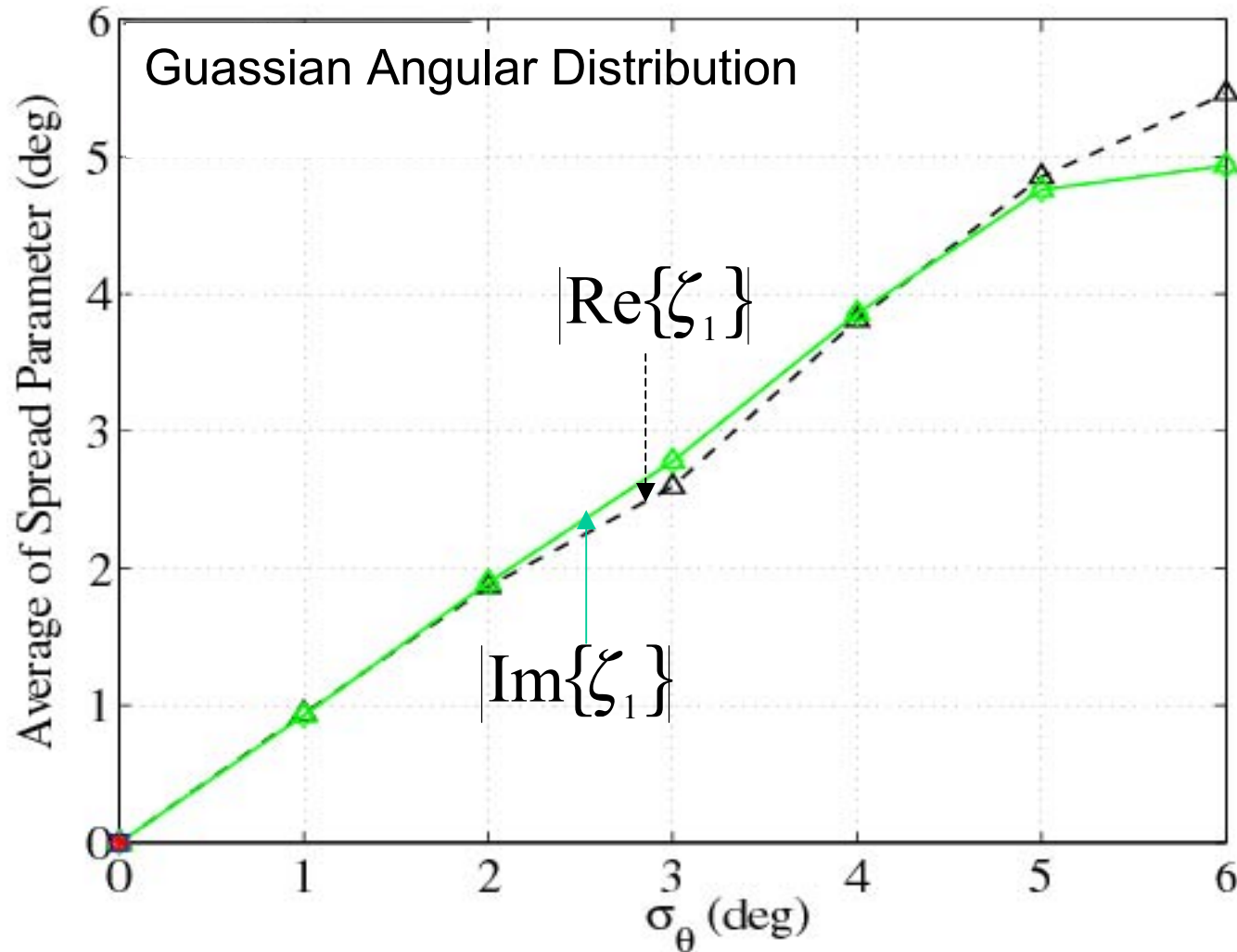
**Slow Fading**

$T_c \gg T_o$

Conventional Approach (1)  $\longrightarrow$  Standard Deviation of DOA Estimates

**Proposed Approach  $\longrightarrow$  Instantaneous DOA & Instantaneous AS**

# Statistical Property in Spread Parameter



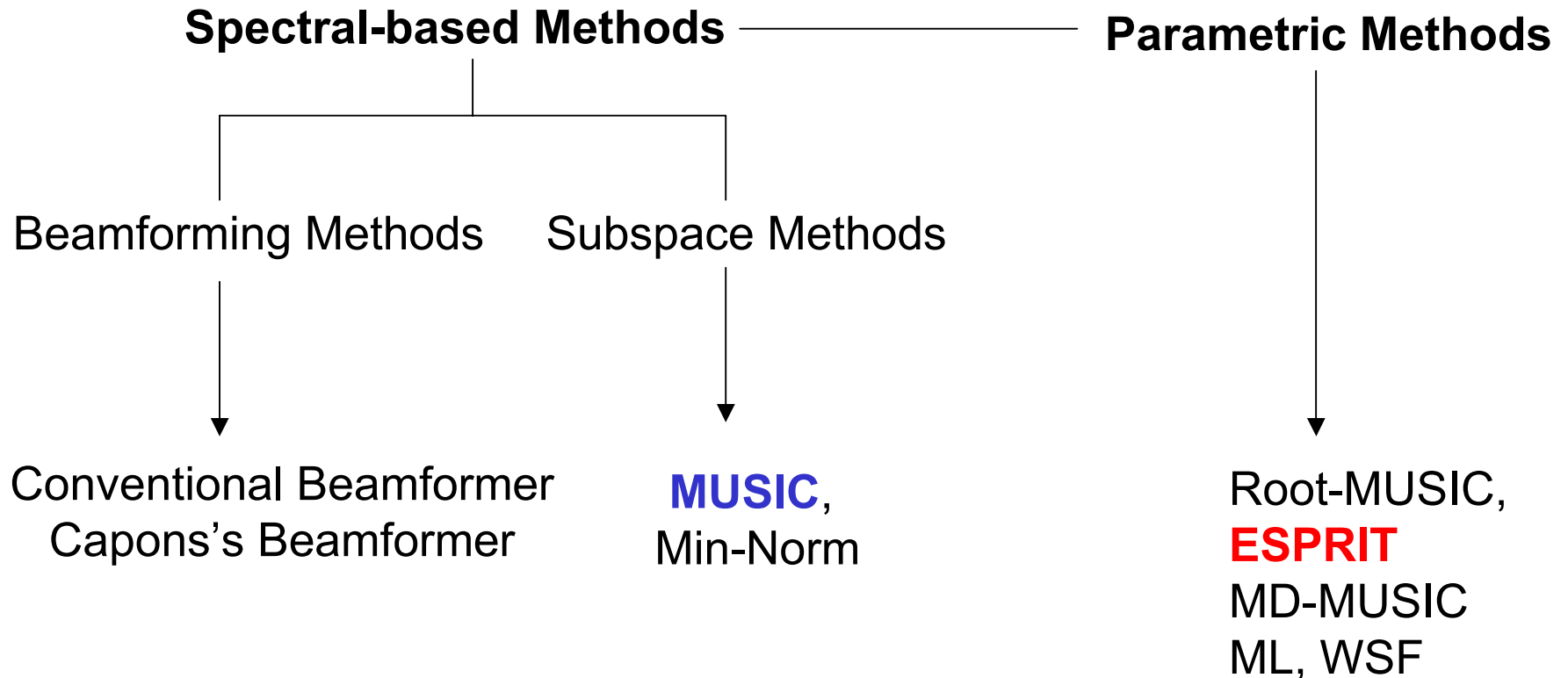
# Summary

- Proposal of EAMV representing Inst. DOA & Inst. AS
- The EAMV incorporates  $\text{Im}\{\zeta_1\}$  into AS.
- Range of the first-order approx.  $\rightarrow$  limited to the small AS
- The EAMV is applicable to many DOA estimation algorithms.
- It is expected to be effective parameters in the slow fading environments

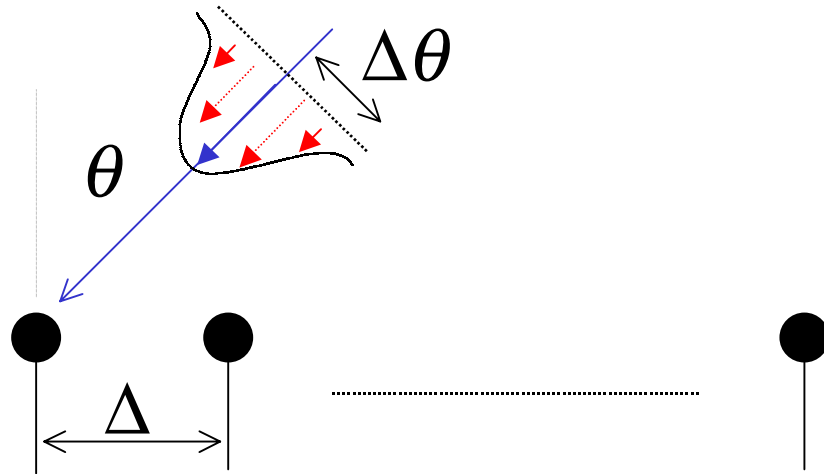
## **: Signal Waveform Estimation in AS Environment**

$\rightarrow$  M. Bengtsson & B. Ottersten (Proc. 30<sup>th</sup>  
Asilomar Conf., 1996)

# Review for Parameter Estimation Algorithms



# EAMV



$$\mathbf{a}(\theta + j\Delta\theta) \cong \left[ 1 \quad e^{j\frac{2\pi}{\lambda}\Delta\sin(\theta+j\Delta\theta)} \quad \dots \quad e^{j(L-1)\frac{2\pi}{\lambda}\Delta\sin(\theta+j\Delta\theta)} \right]^T$$

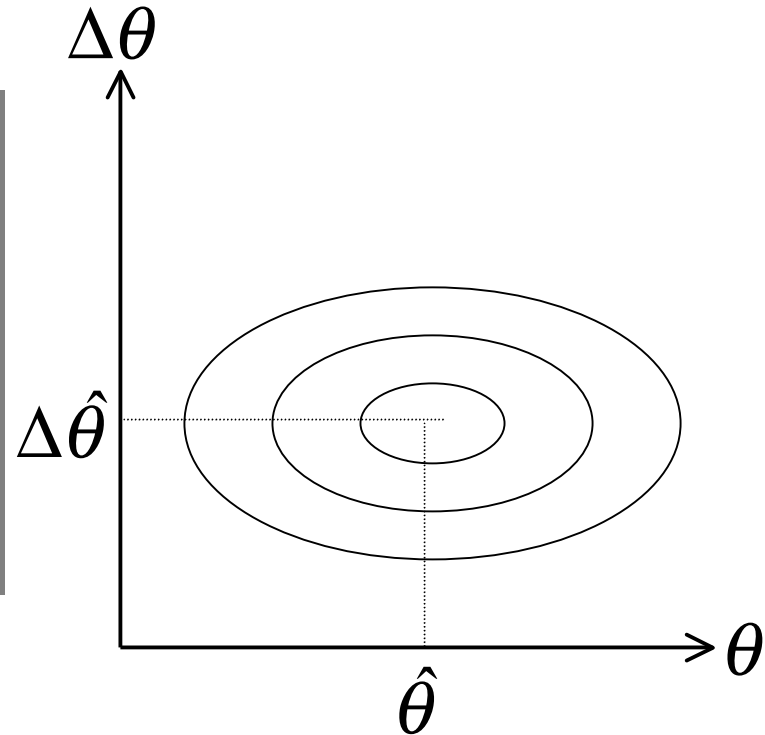


# MUSIC for Joint Estimation of DOA & AS

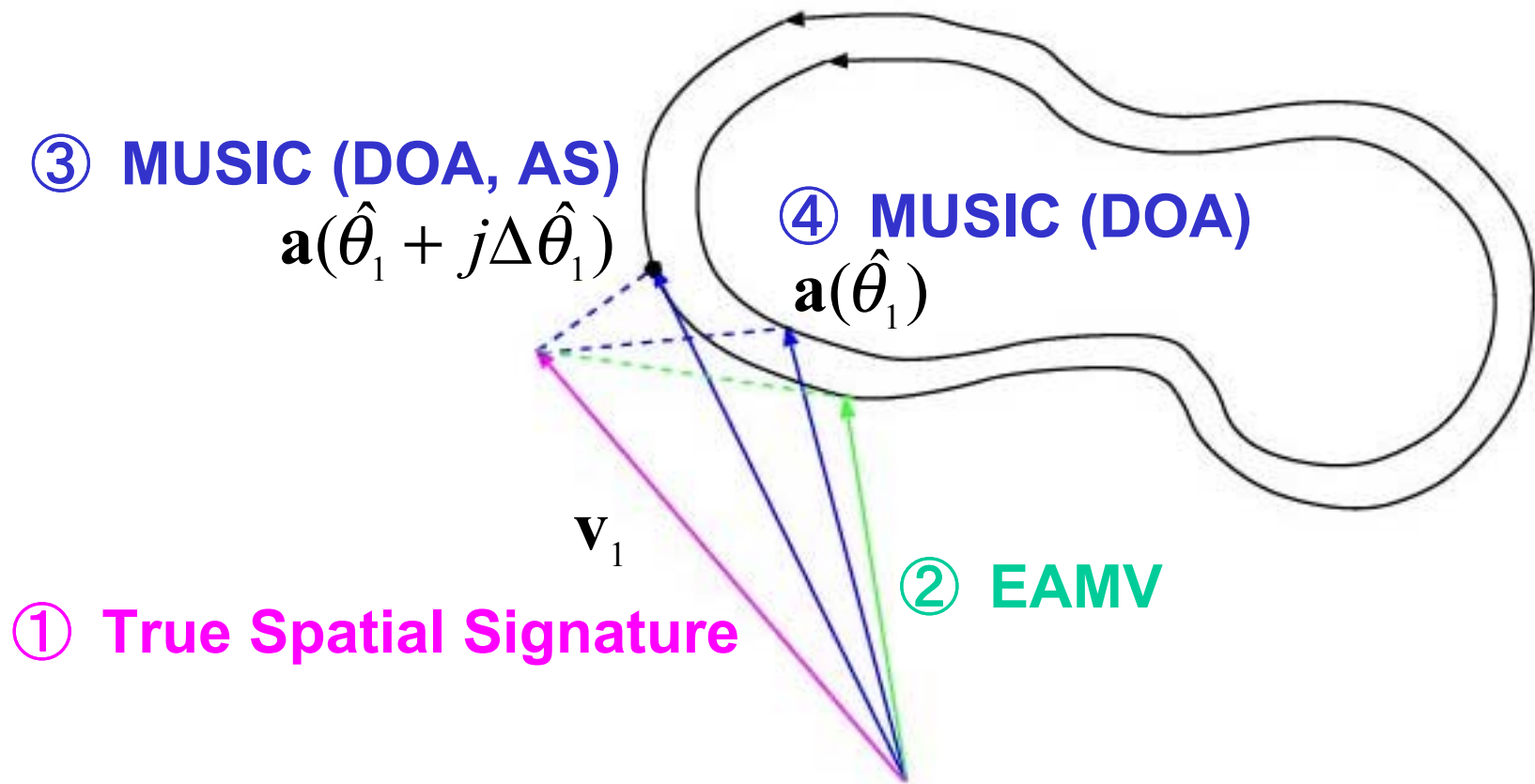
*Min. of MUSIC Cost Function*

$$\min_{\hat{\theta}_m, \Delta \hat{\theta}_m} \frac{\|\mathbf{E}_N^H \mathbf{a}(\theta + j\Delta\theta)\|^2}{\|\mathbf{a}(\theta + j\Delta\theta)\|^2}$$

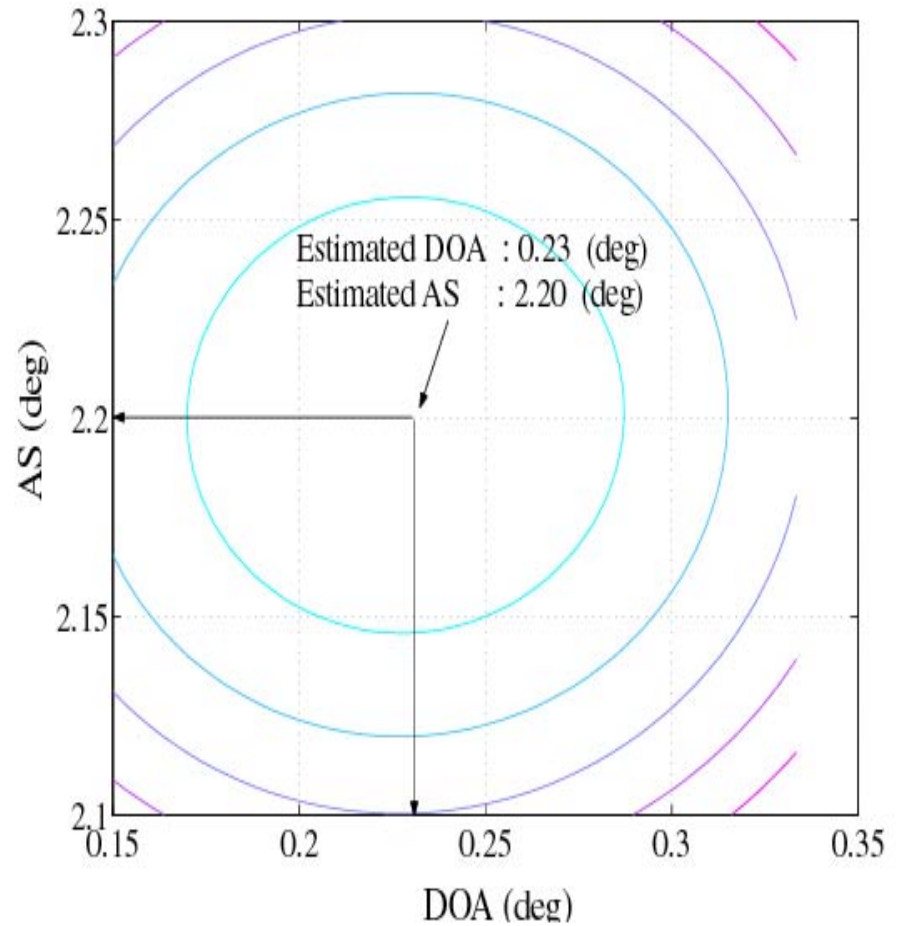
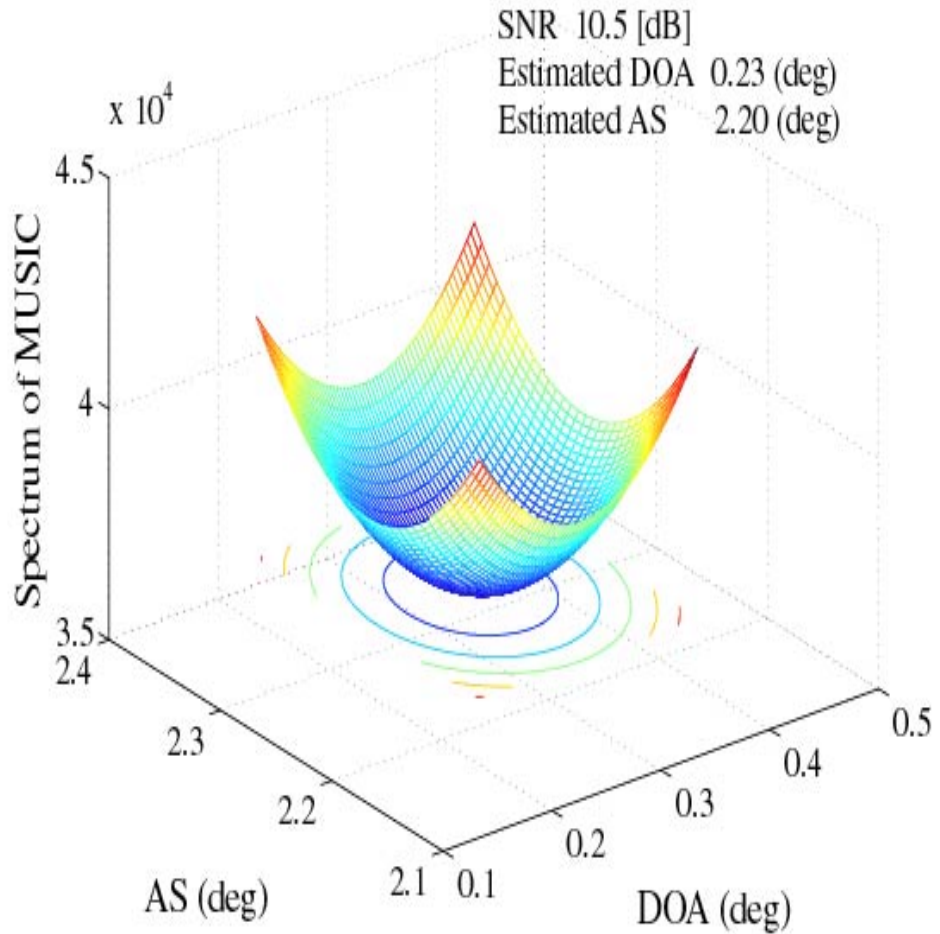
if  $\Delta\theta = 0 \rightarrow$  Conventional MUSIC.



# Array Manifold over Complex Angle Planes -- Trace of EAMV --

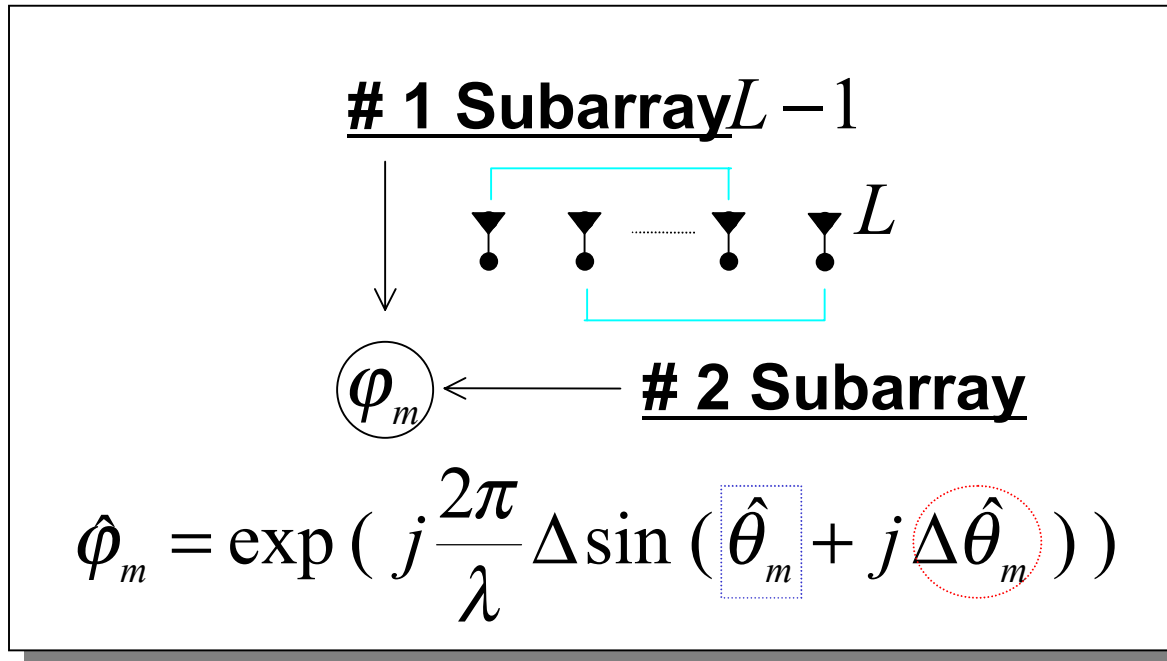


# Example of Estimates (Inst. DOA & Inst. AS)



# ESPRIT for Joint Estimation of DOA & AS

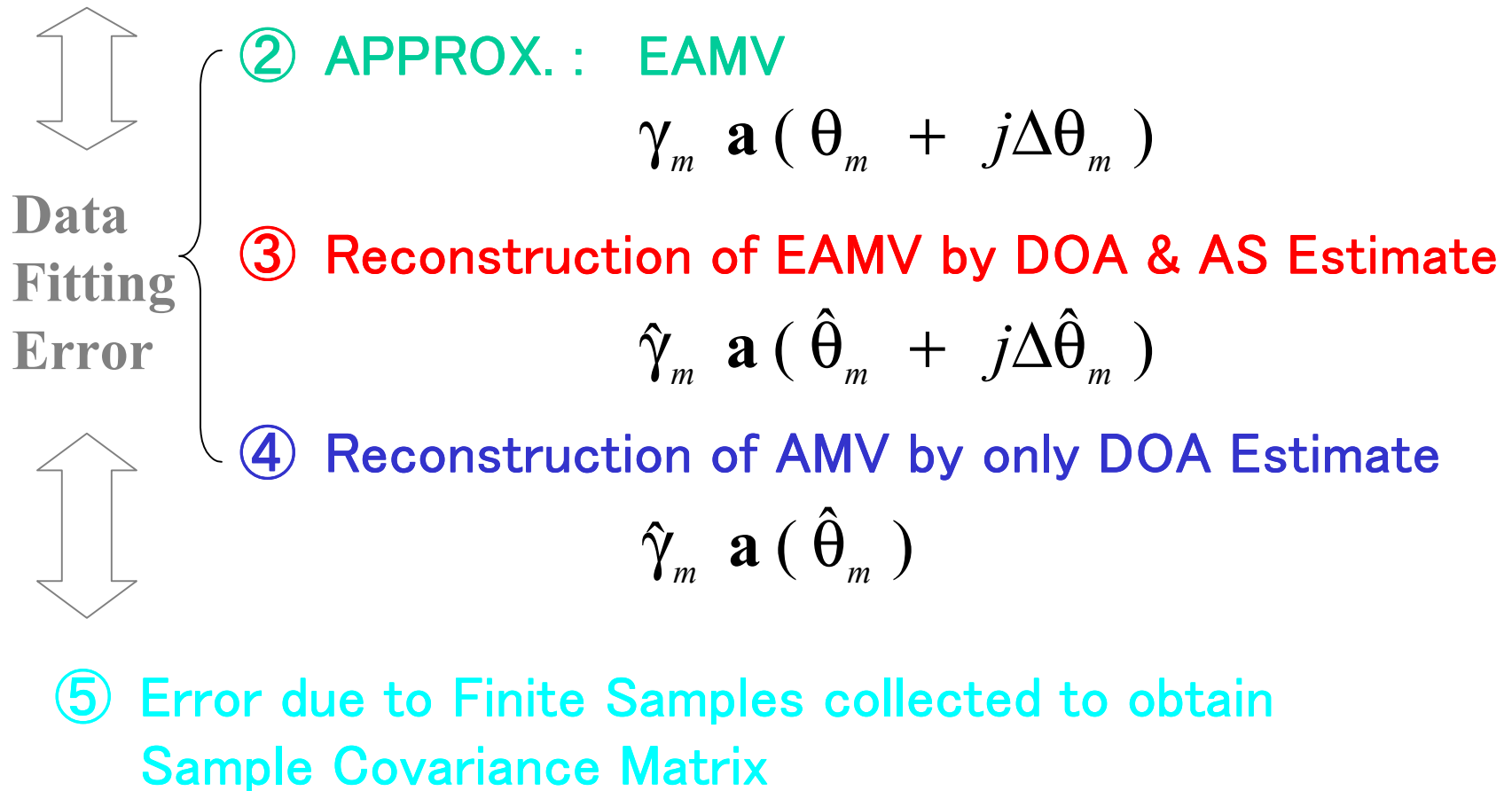
- Two Identical Subarray
- Translational Invariance Principle



# Estimation Performance

- Instantaneous DOA and AS Estimates
- Proximity of True Spatial Signature
  - One Signal Case
  - Multiple Signals Case

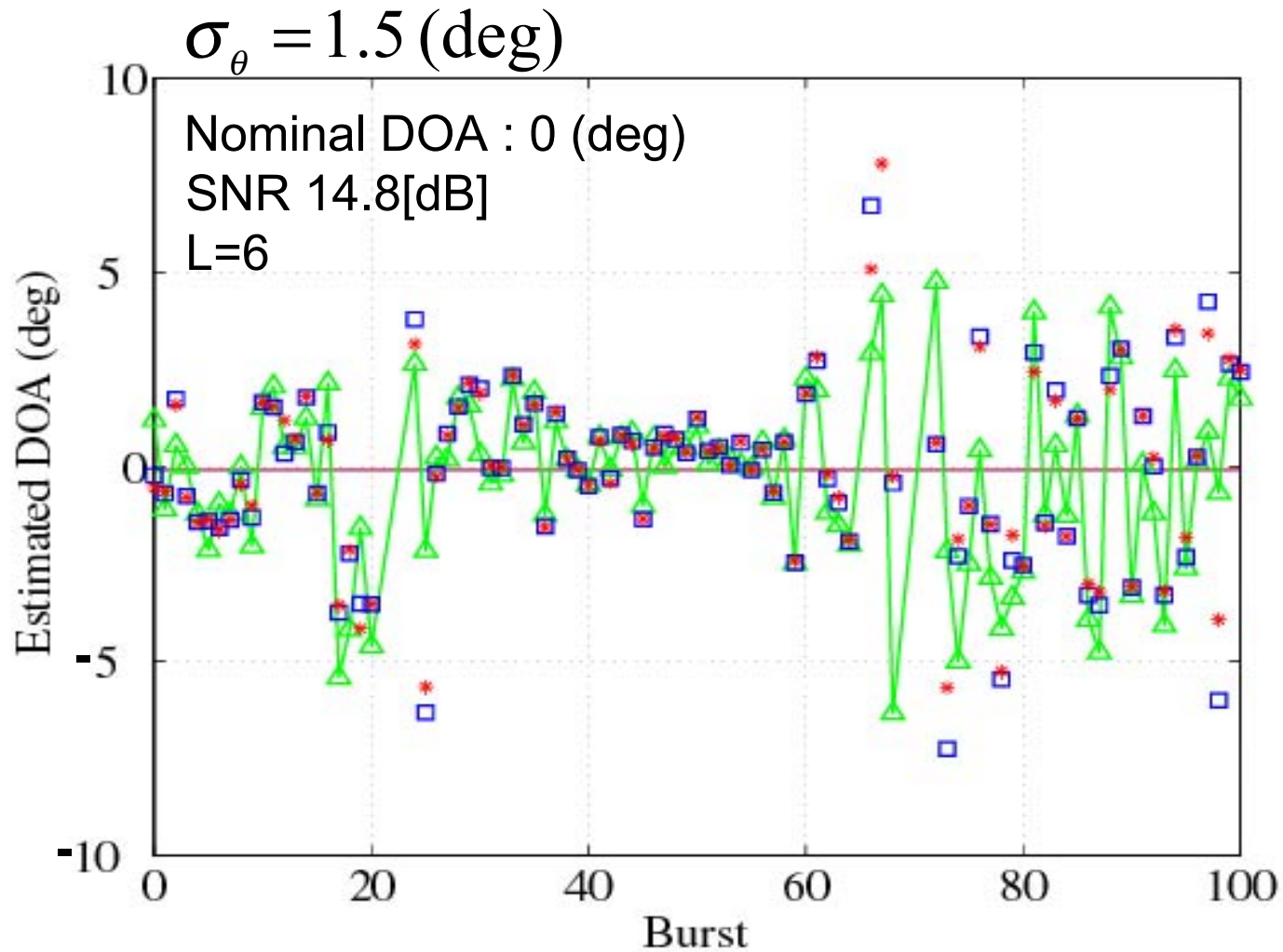
# ① Proximity Evaluation to Spatial Signature



# Simulation Conditions (1)

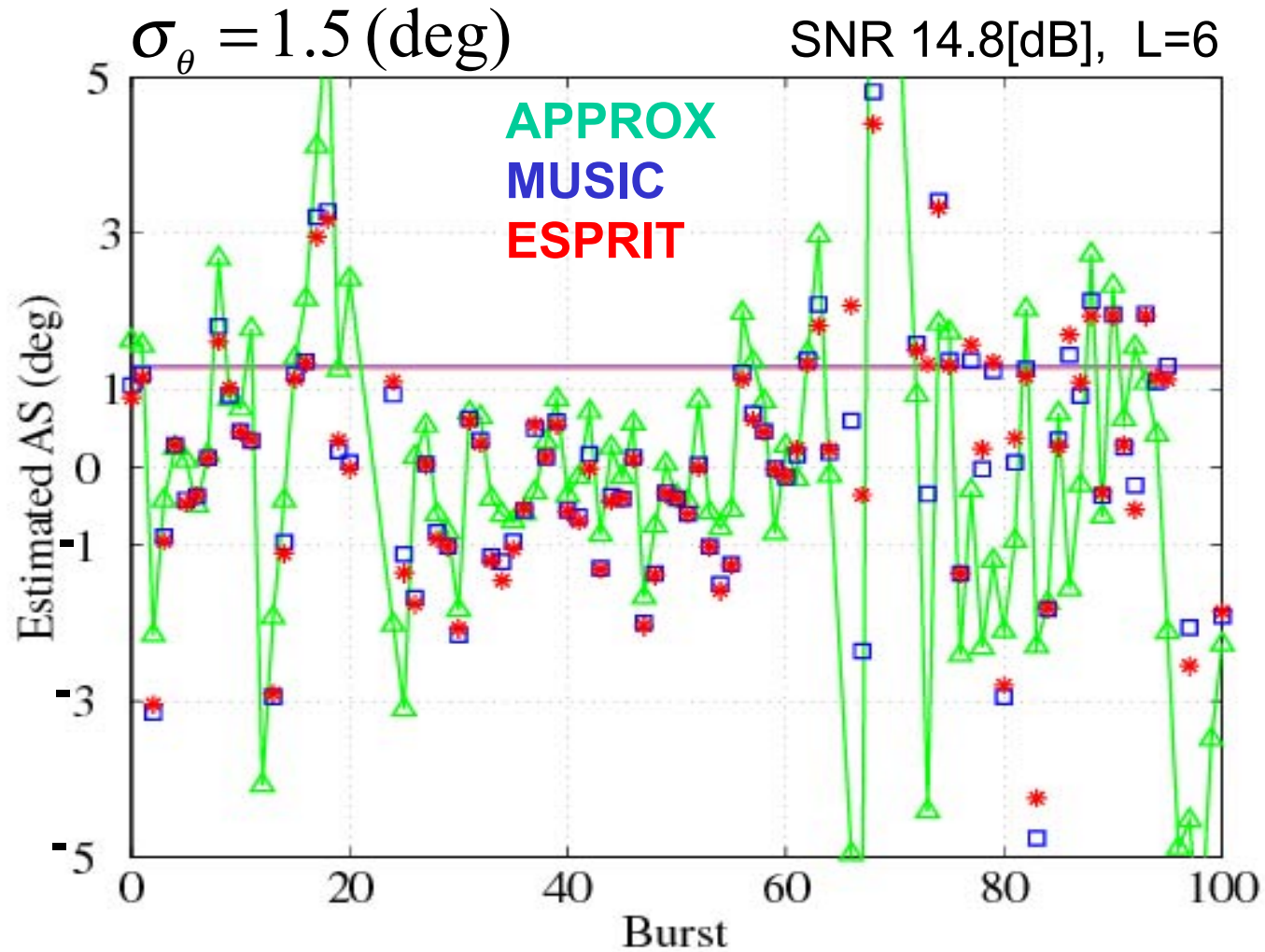
Type of Antenna	Uniform Linear Array Antenna
Number of Elements	Variable
Interelement Spacing	A Half of Wavelength
DOAs	0 (deg) / -10, 10 (deg)
Number of Scattered Waves	32
Angular Distribution	Gaussian Distributed at BS
Angular Spread (AS) : $\sigma_{\theta}$	Variable
Snapshots / burst	127, Variable (BPSK)

# Instantaneous DOA Estimates



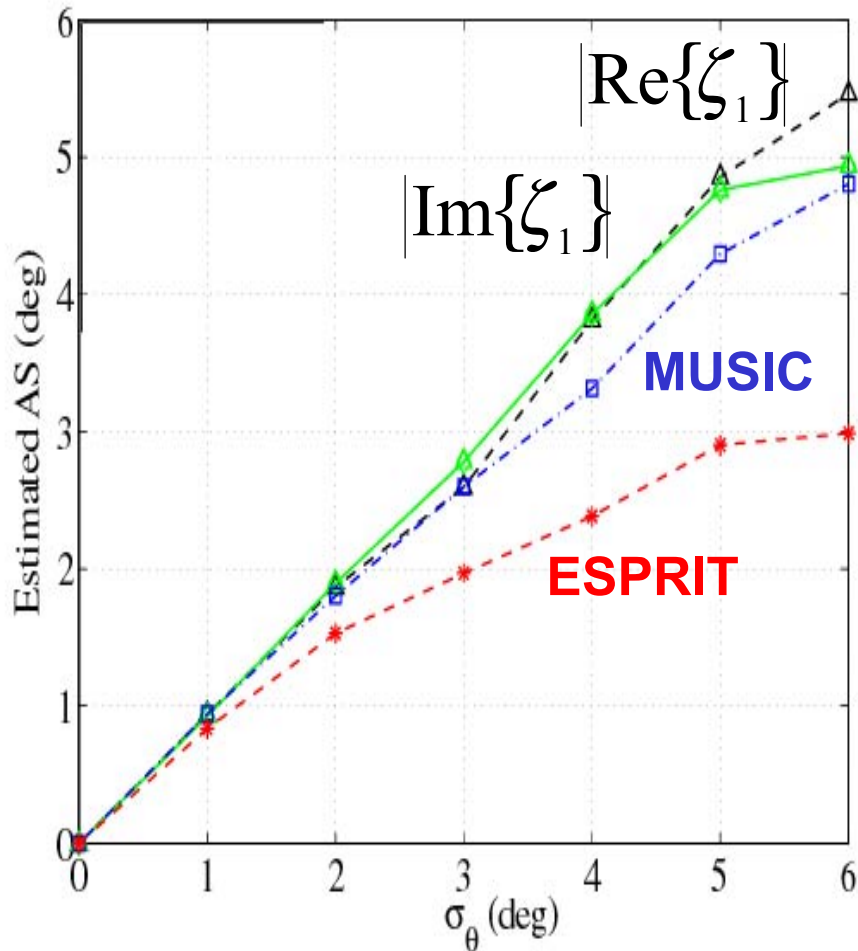


# Instantaneous AS Estimates

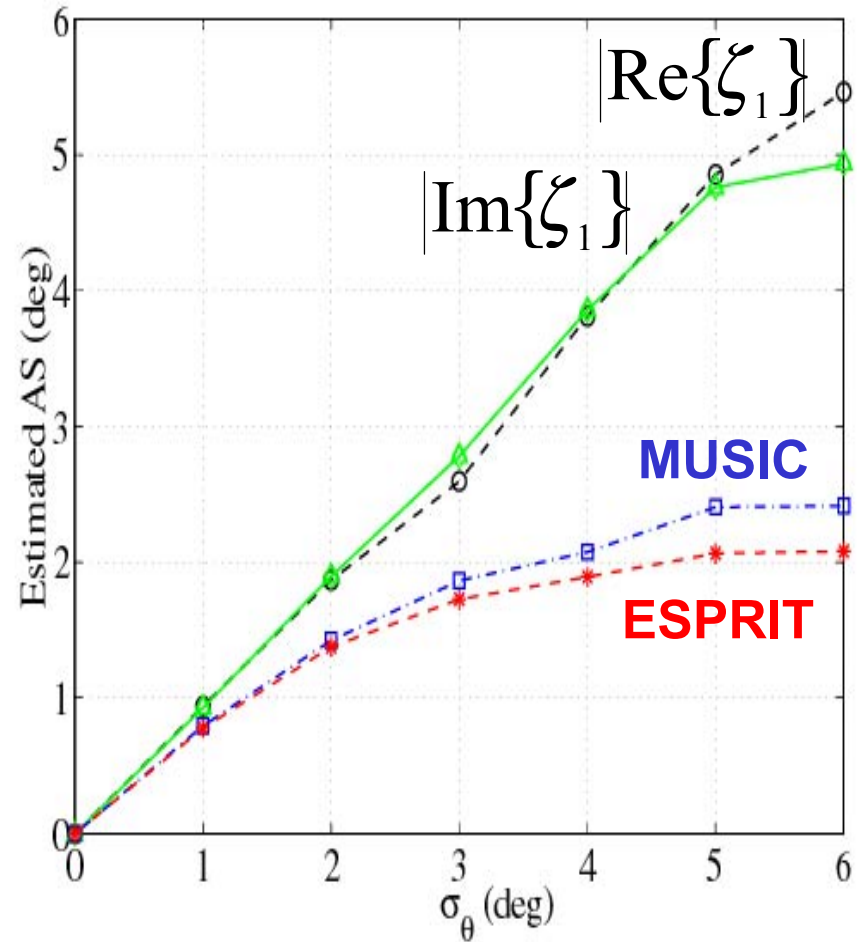


# Evaluation of First-Order Moment $E\left|\hat{\theta}_m - \theta_m\right|$

## Conv. MUSIC



## Proposed

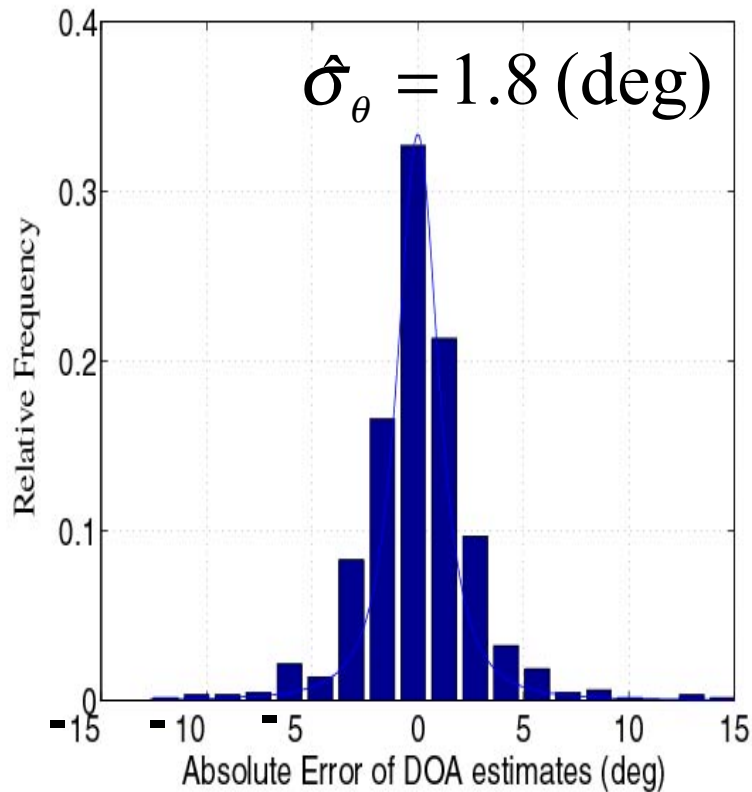


# Evaluation of First-Order Moment

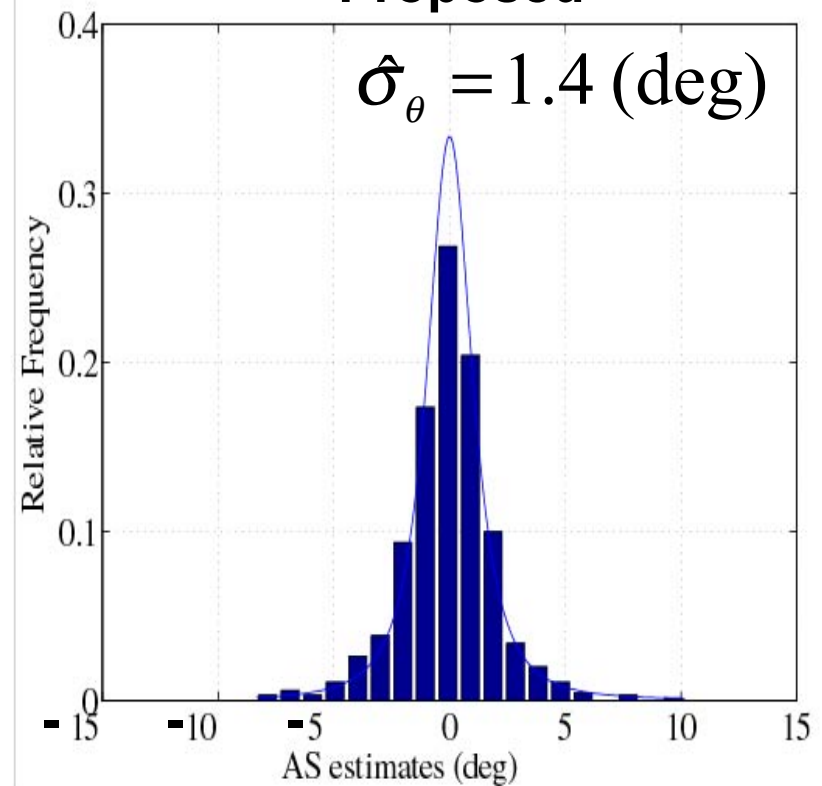
$$\sigma_{\theta} = 2.0 \text{ (deg)}$$

$$E\left[|\hat{\theta}_m - \theta_m|\right]$$

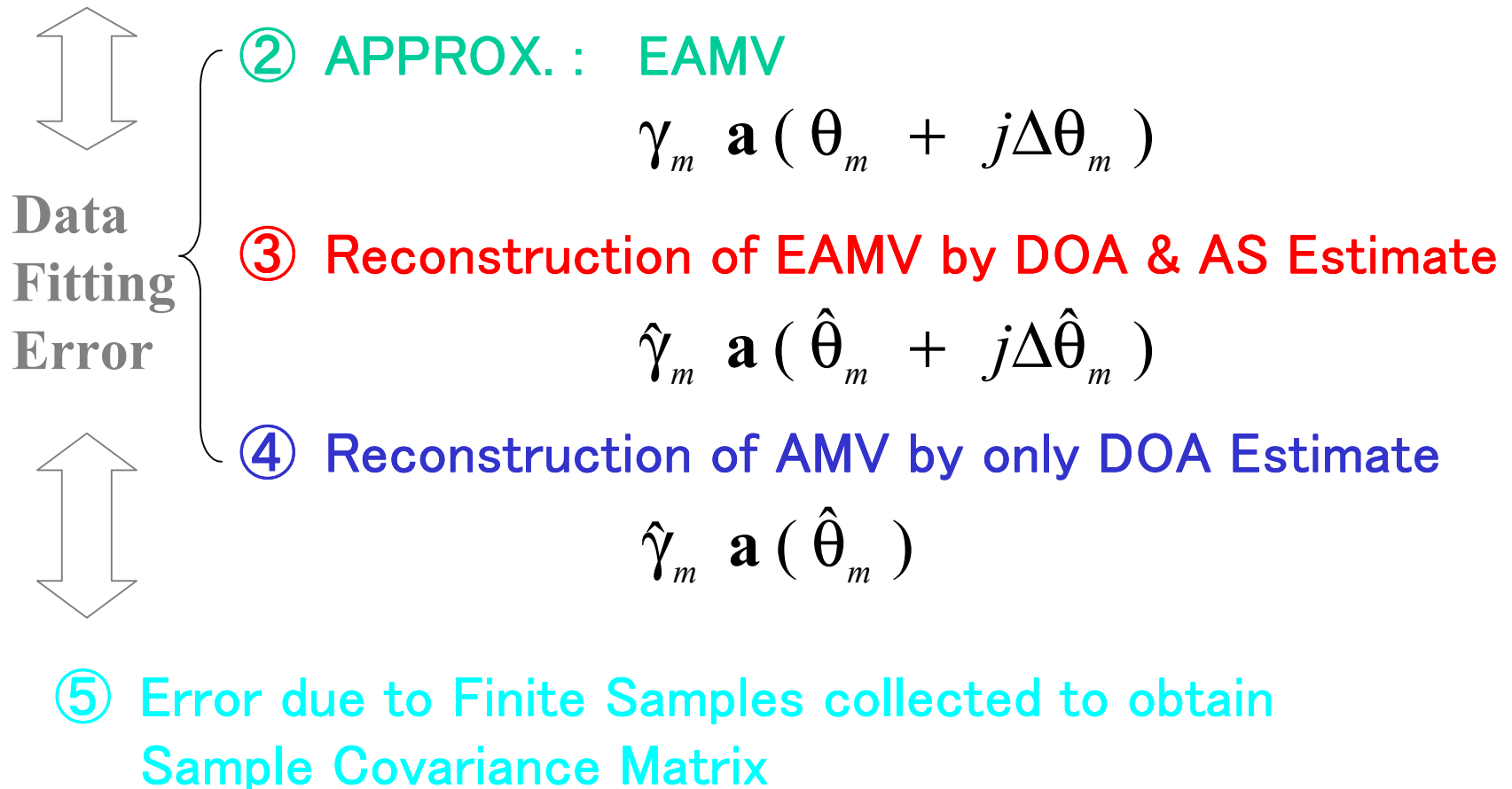
## Conv. MUSIC



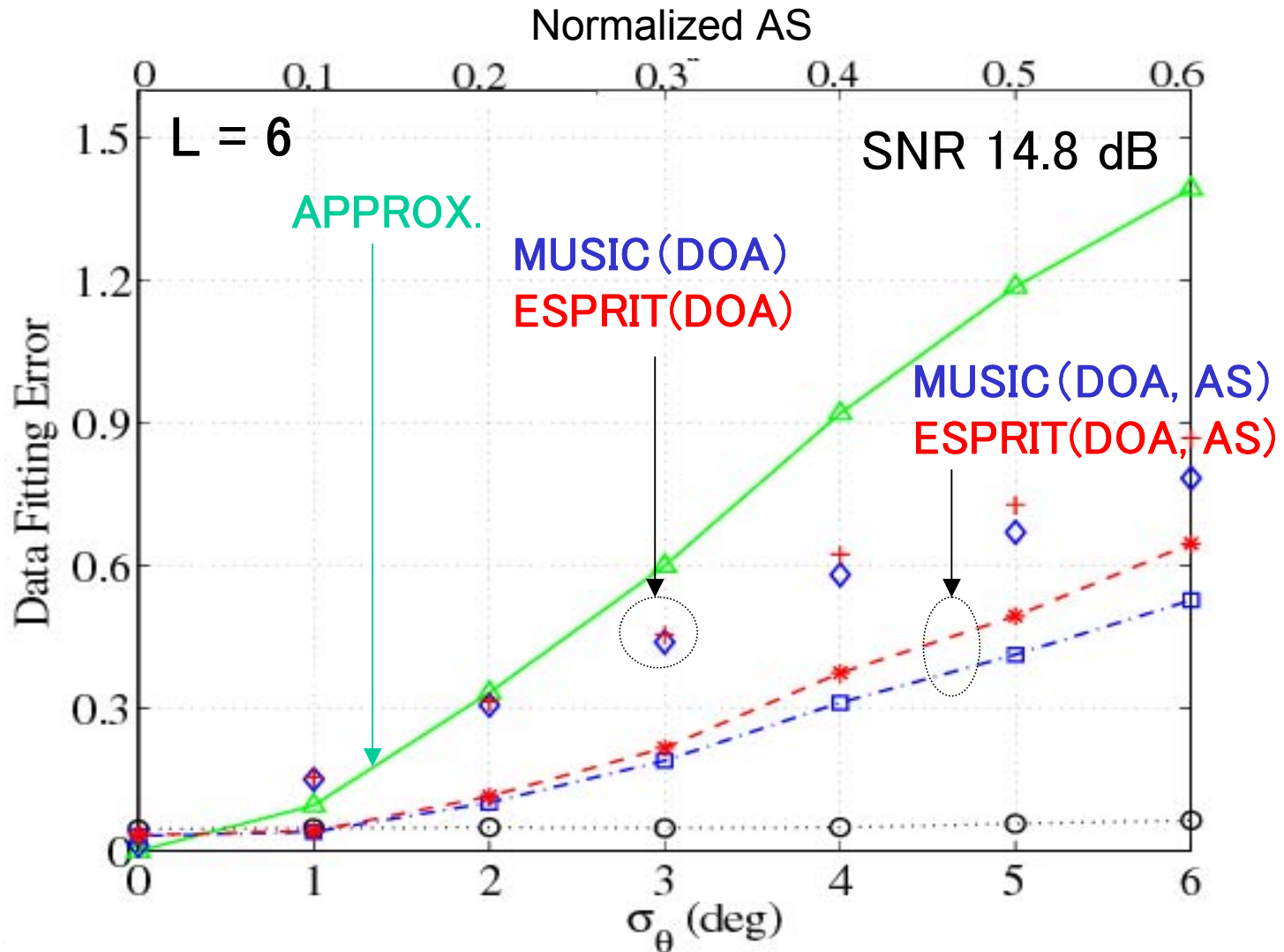
## Proposed



# ① Proximity Evaluation to Spatial Signature

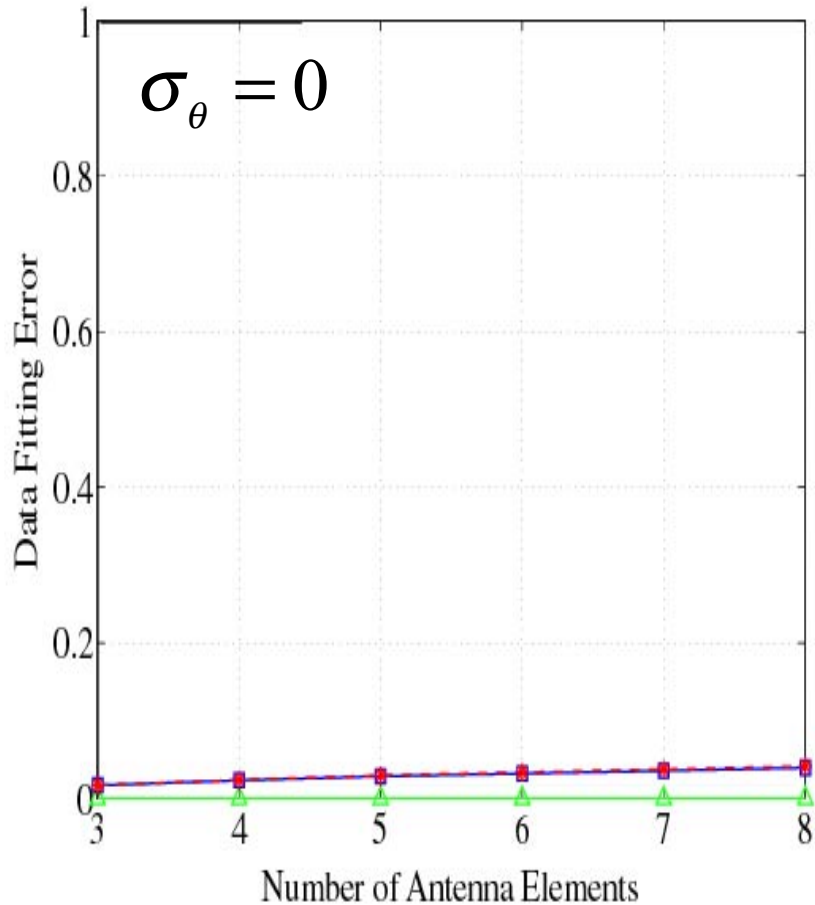


# Proximity Evaluation (1)

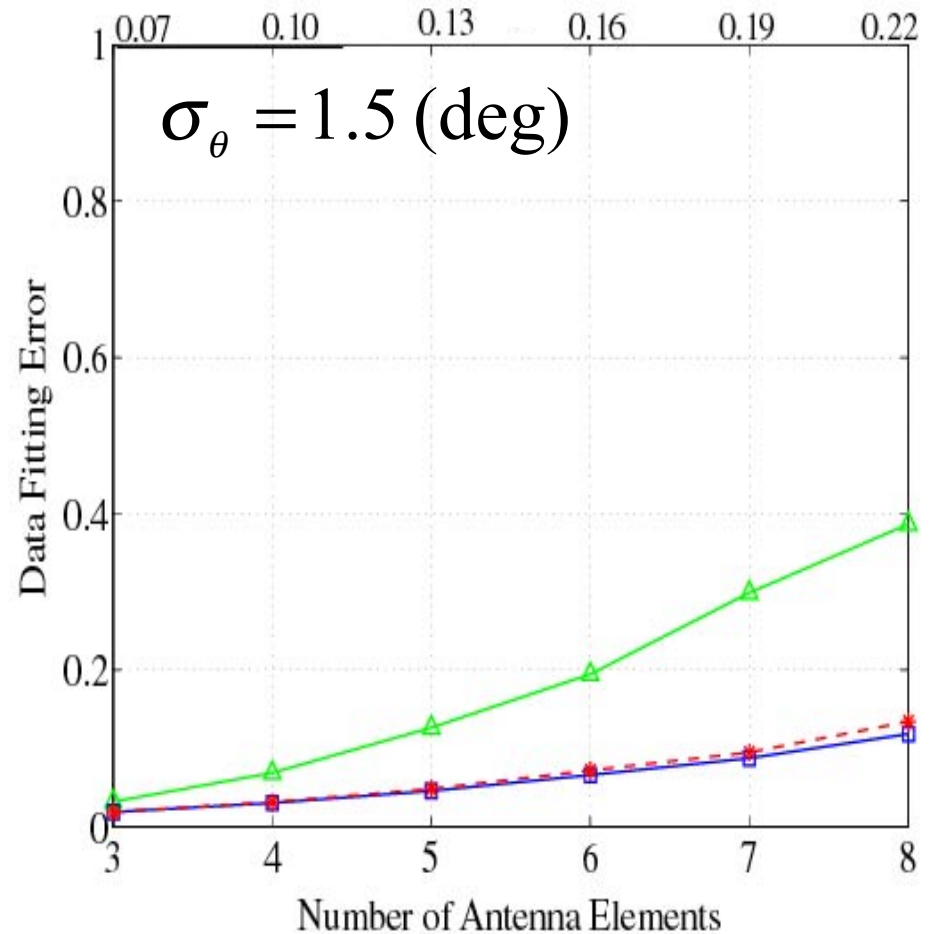


# Proximity Evaluation (2)

SNR 14.9 [dB]



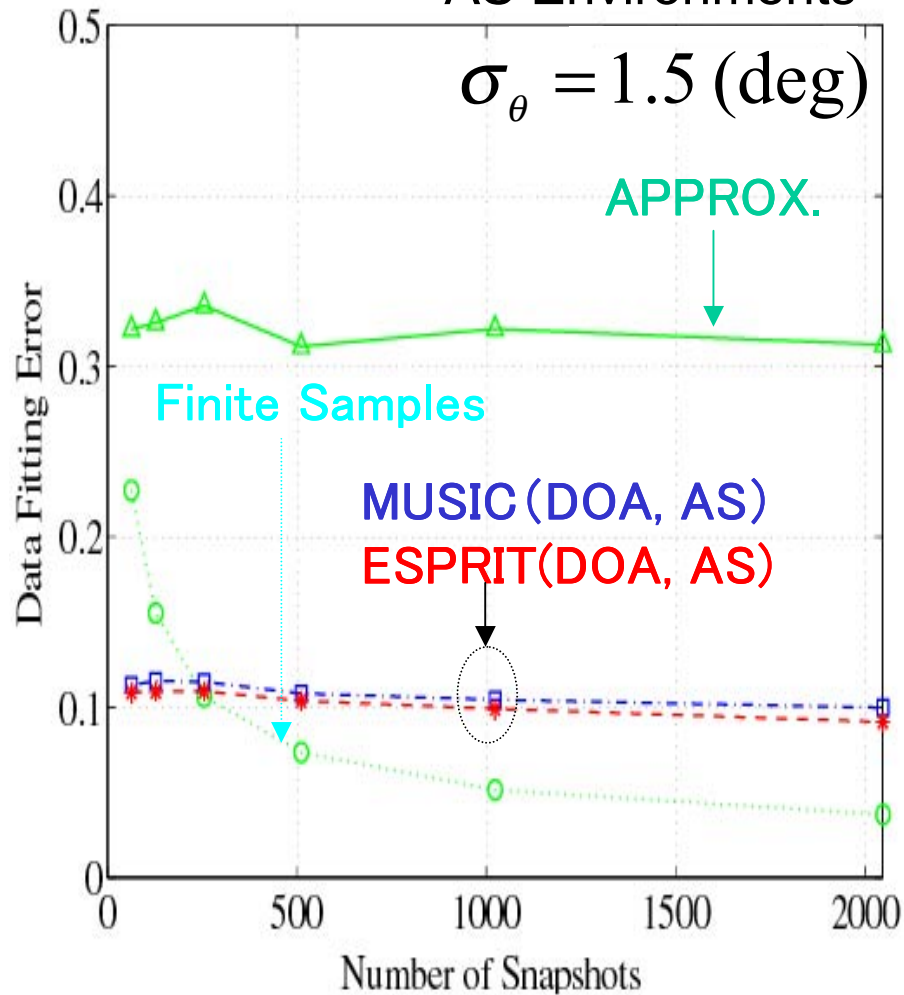
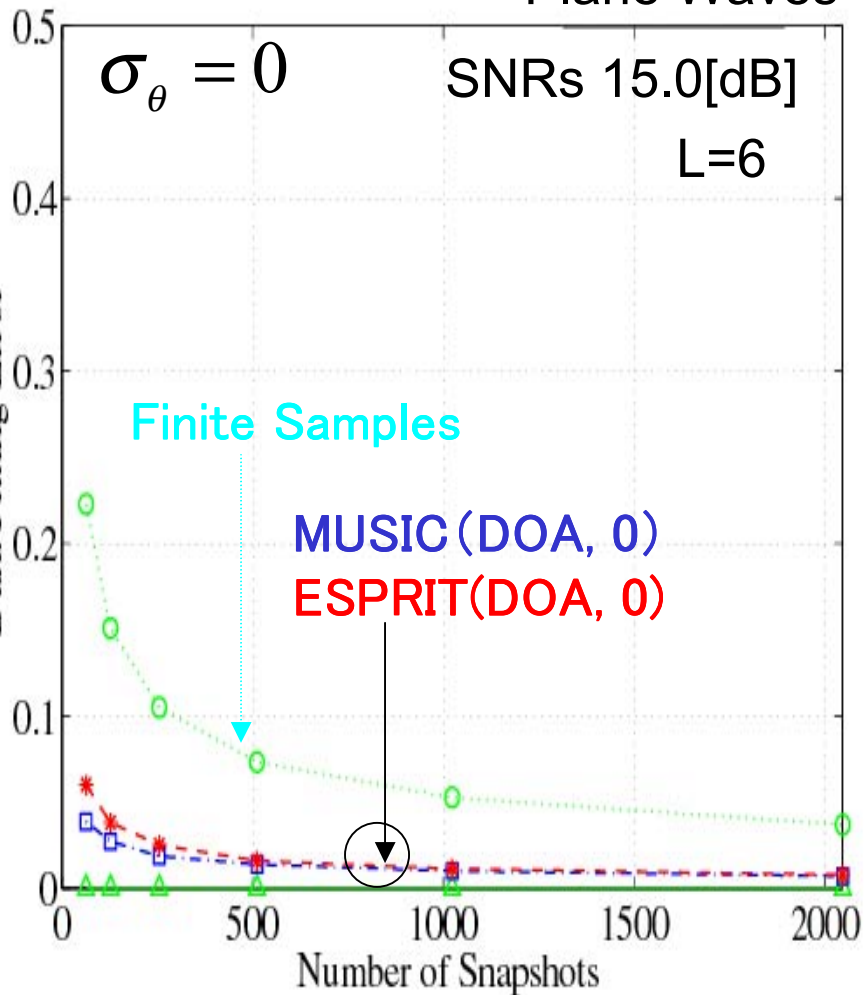
Normalized AS



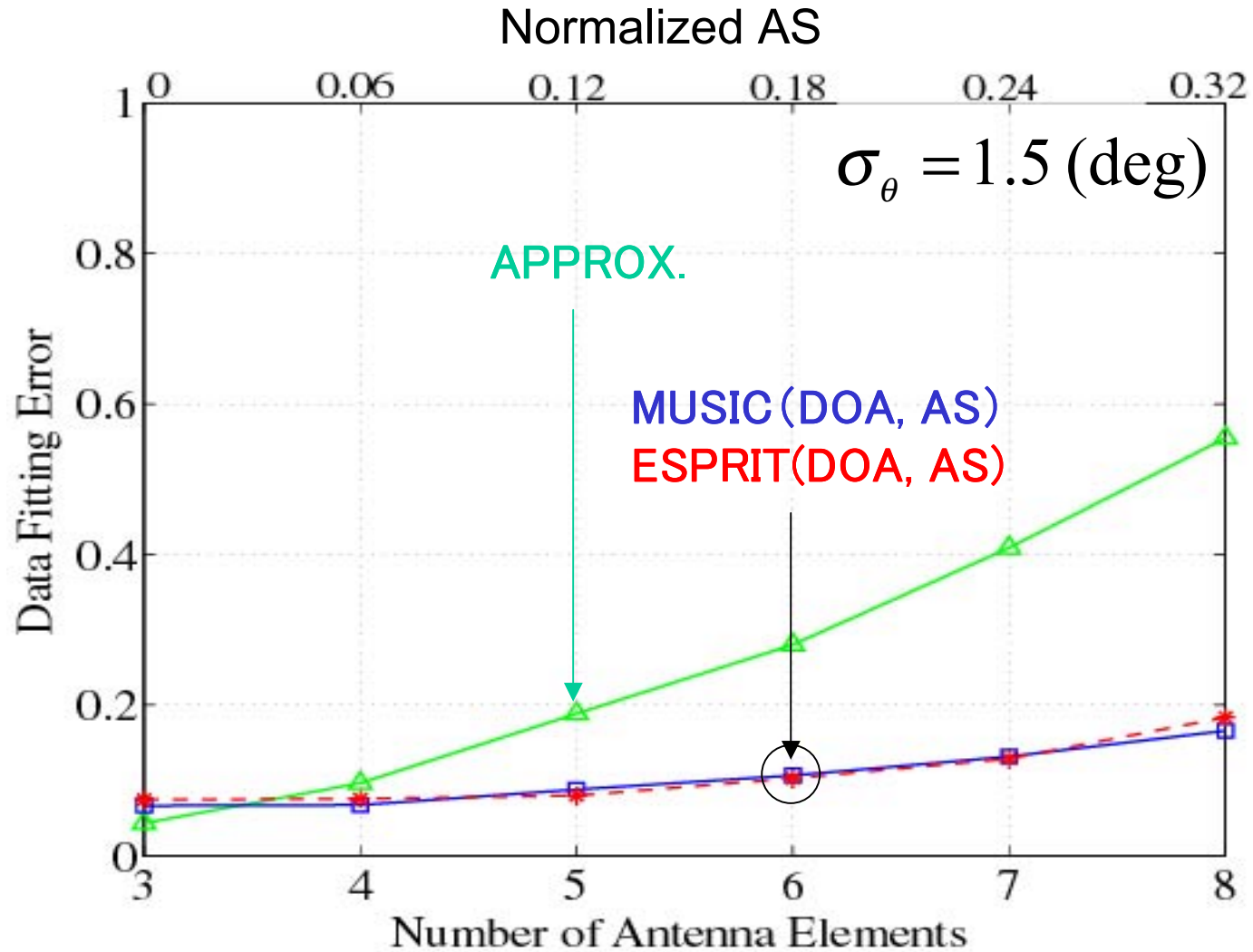
# Error due to Finite Samples

Plane Waves

AS Environments



# Effect on Increase of Antenna Elements

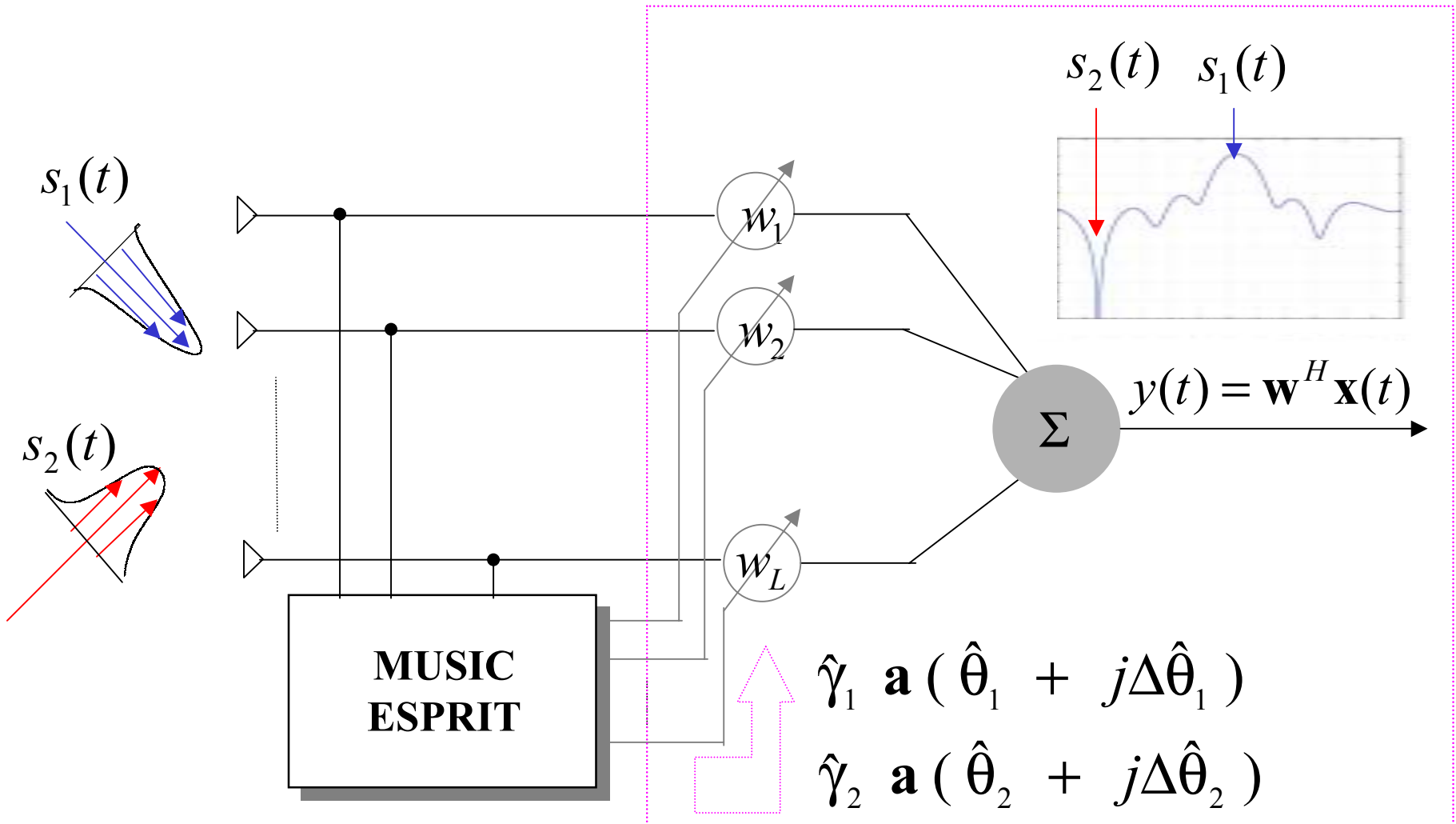




# Summary

- Proposal of MUSIC & ESPRIT for Joint Estimation (DOA & AS)
- Proximity Evaluation from Spatial Signature Estimates
  - Estimation Performance of MUSIC & ESPRIT
- It showed that the large-size antenna itself in the AS environment does not always improve the estimation performance.
- The data fitting errors in both MUSIC & ESPRIT are less than the error due to first-order approximation.
- In the AS, the error due to finite samples is not dominant.
- **The statistical analysis for the estimator is required.**

# Spatial Processing at Base Station



# Robust Optimal Signal Combining Technique Based on EAMV

(1) Review for Signal Combining Techniques

(2) Directionally Constrained Minimization of Power (DCMP)

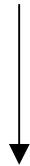
(3) Zero-Forcing (ZF)

(4) Performance Evaluation

(5) Summary

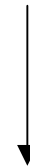
# Review for Signal Combining Techniques

## Methods based on Reference Signal



- MMSE

## Methods based on DOA Information



- Conventional Beamforming
- Null Steering Beamforming (ZF)
- LCMV<sup>1</sup> (MVDR or DCMP)

LCMV<sup>1</sup> : Linearly Constrained Minimum Variance Beamforming

## Related Research (2)

Problem of combining Signals in AS environments

- **An Adaptive Array for Mobile Communication Systems**  
→ S. Anderson et.al., (IEEE Trans. VT, 1991)
- **Modified Array Manifold for Signal Waveform Estimation**  
→ D.Asztely & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf., 1996)
- **Signal Waveform Estimation in AS Environment**  
→ M. Bengtsson & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf., 1996)

# Directionally Constrained Minimization of Power (DCMP)

$$\arg \min_{\mathbf{w}} \mathbf{w}^H \mathbf{R} \mathbf{w} \quad \text{subj. to} \quad \mathbf{w}^H \mathbf{v}_l = \text{const.}$$

$$\mathbf{w}_{\text{dcmp}} = \mathbf{R}^{-1} \mathbf{v}_1 \longrightarrow \text{Spatial Signature}$$



$$\text{Max. SINR} = \frac{\text{Output Desired Signal Power}}{\text{Output Interference Signal Power} + \text{Output Noise Power}}$$

# Zero Forcing (ZF)

$$\hat{\mathbf{s}}(t) = \arg \min_{\mathbf{s}(t)} \|\mathbf{x}(t) - \mathbf{V}\mathbf{s}(t)\|^2$$

$$\hat{\mathbf{s}}(t) = (\mathbf{V}^H \mathbf{V})^{-1} \mathbf{V}^H \mathbf{x}(t) \quad \mathbf{V} = [\mathbf{v}_1, \mathbf{v}_2]$$



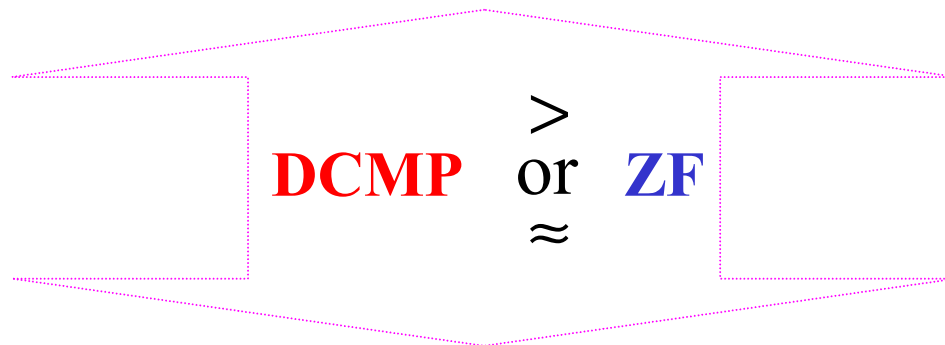
$$\hat{\mathbf{w}}_{\text{zf}} = [\mathbf{V}(\mathbf{V}^H \mathbf{V})^{-1}]_{\text{1st column}}$$

$$\hat{\mathbf{w}}_{\text{zf}} = \arg \max_{\mathbf{w}} \text{Output SNR} \quad \text{subj. to } \mathbf{w}^H \mathbf{v}_2 = 0$$

# Max. SINRs (Theoretical Values)

## For DCMP

$$\text{Max. SINR}_{\text{dcmp}} = \text{Input SNR} \left( 1 - \frac{|\rho|^2}{1 + \text{Input INR}} \right)$$



*Spatial Corr. Coeff.*

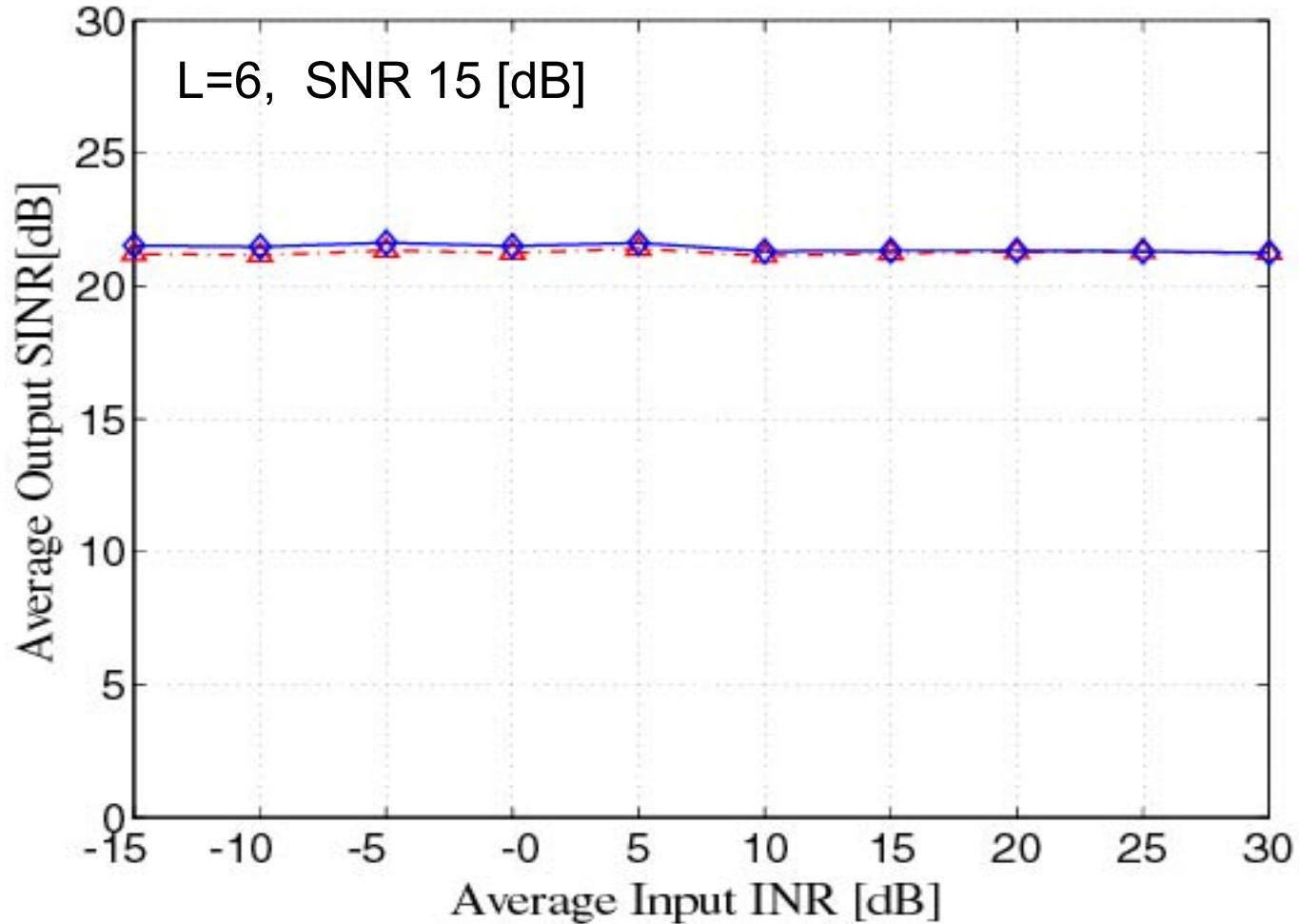
$$\rho = \frac{\mathbf{v}_1^H \mathbf{v}_2}{\|\mathbf{v}_1\| \|\mathbf{v}_2\|}$$

## For ZF

$$\text{Max. SINR}_{\text{zf}} = \text{Input SNR} (1 - |\rho|^2)$$



# Max. SINRs (Theoretical Values)



## Simulation Conditions (2)

- DOA and AS Estimates : **from MUSIC**
- DOAs : -10, 10 (deg)
- Evaluation for Four Spatial Signature

(1). True SS (Spatial Signature)  $\mathbf{v}$

(2). **EAMV Estimates**  $\mathbf{a}(\hat{\theta}_m + j\Delta\hat{\theta}_m)$

(3). **AMV with only DOA Estimates**  $\mathbf{a}(\hat{\theta}_m)$

(4). **AMV with Nominal DOA**  $\mathbf{a}(\theta_m)$

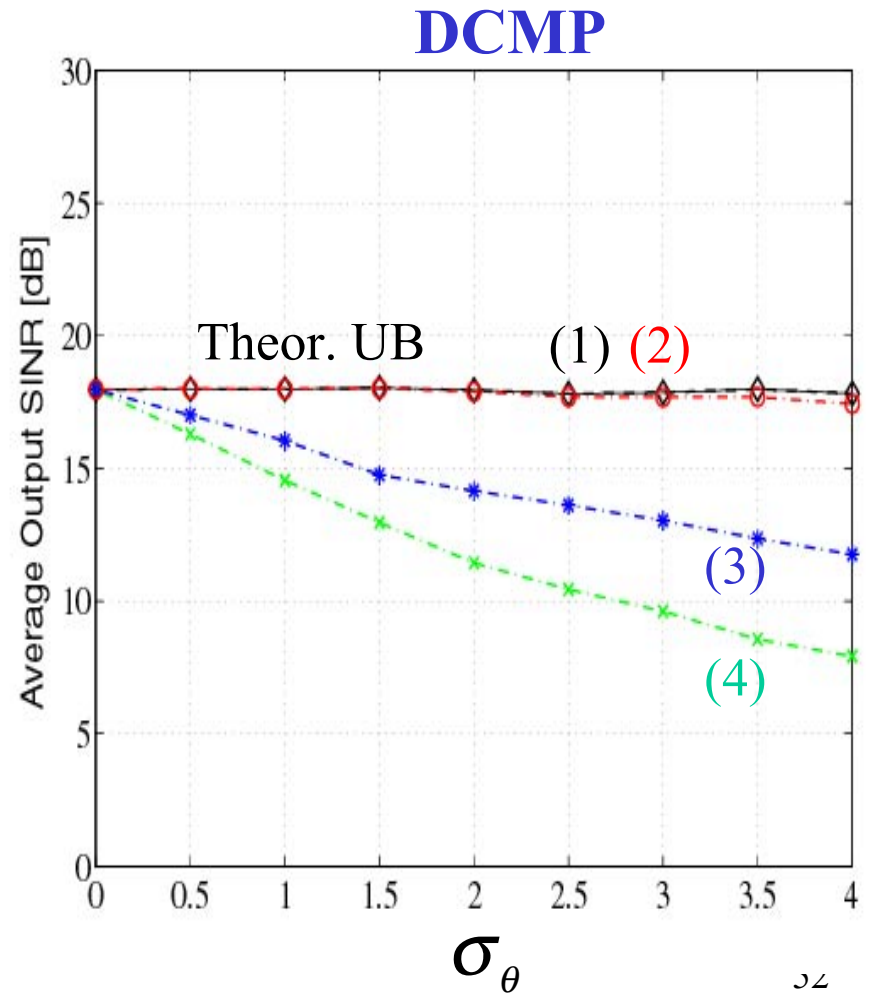
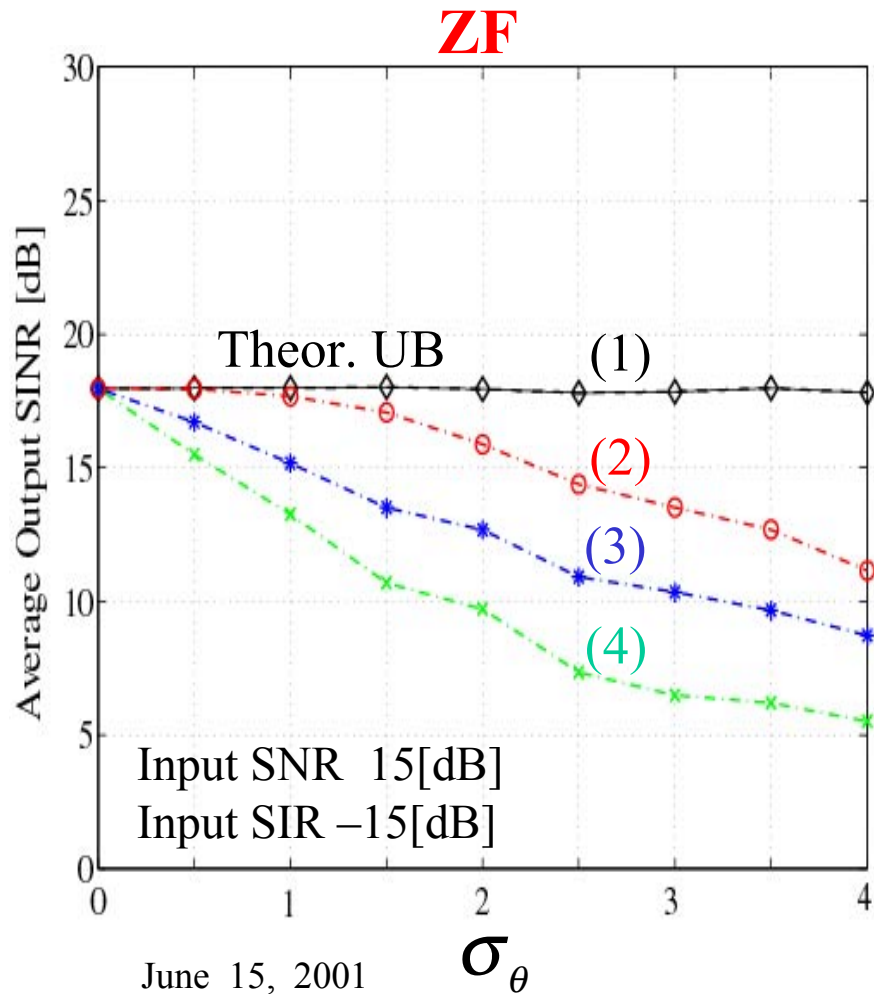
(0) Ideal Case that Covariance & Spatial Signature are perfectly known

### (3). AMV with only DOA Estimates

- **An Adaptive Array for Mobile Communication Systems**  
→ S. Anderson et.al., (IEEE Trans. VT, 1991)
- **Modified Array Manifold for Signal Waveform Estimation**  
→ D.Asztely & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf., 1996)
- **Signal Waveform Estimation in AS Environment**  
→ M. Bengtsson & B.Ottersten (Proc. 30<sup>th</sup> Asilomar Conf.,1996)

# Performance Evaluation in AS Environment (1)

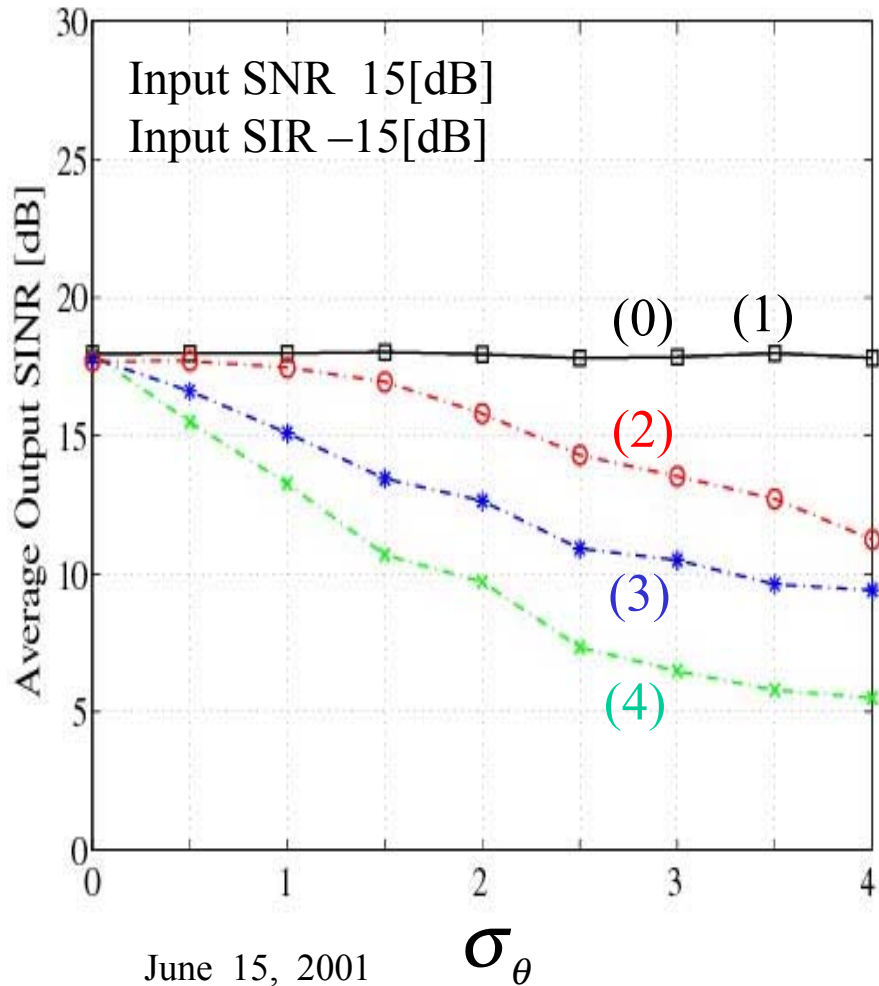
– Infinite Samples,  $L=3$



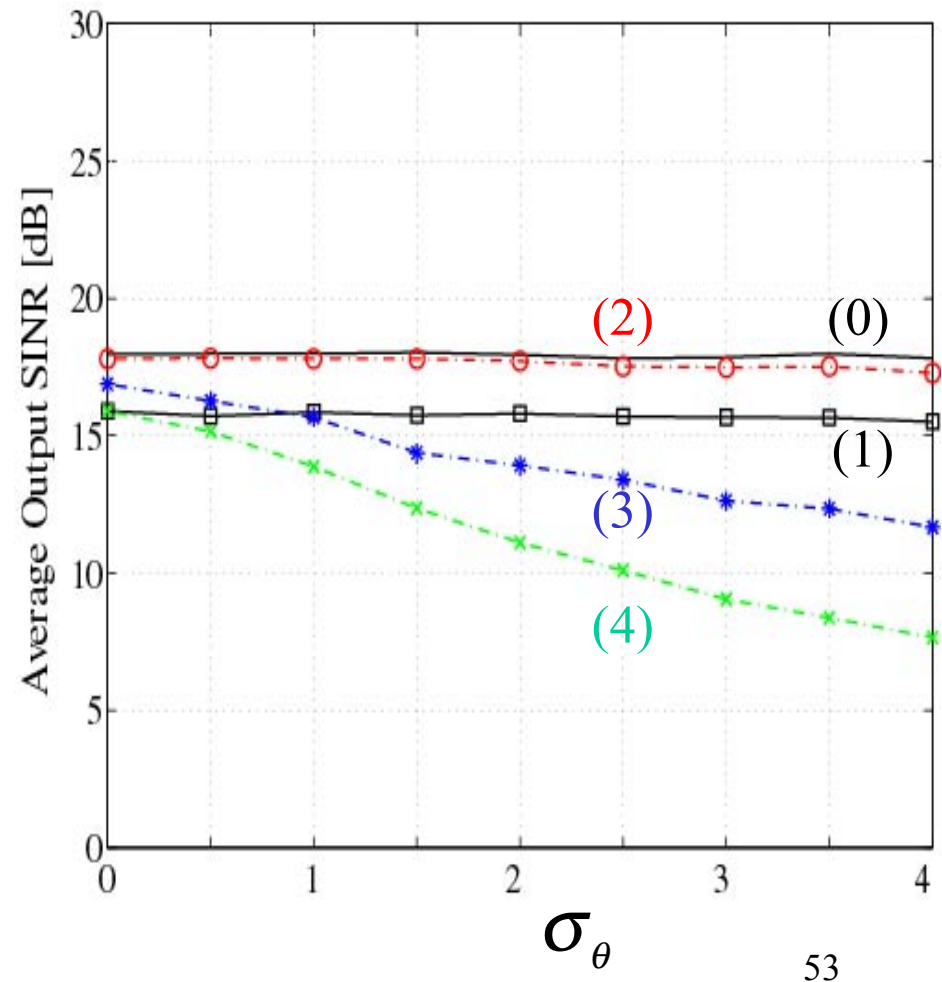
# Performance in AS Environment (2)

127 Samples, L=3

## ZF

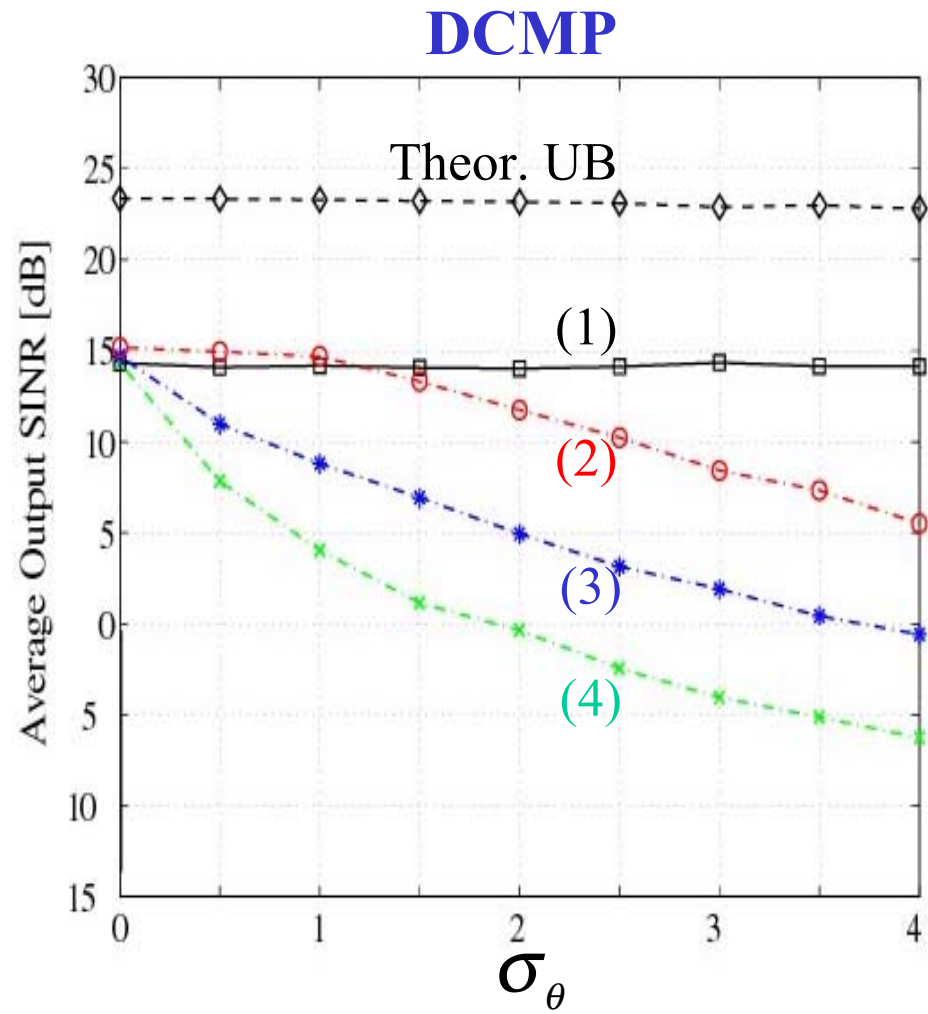
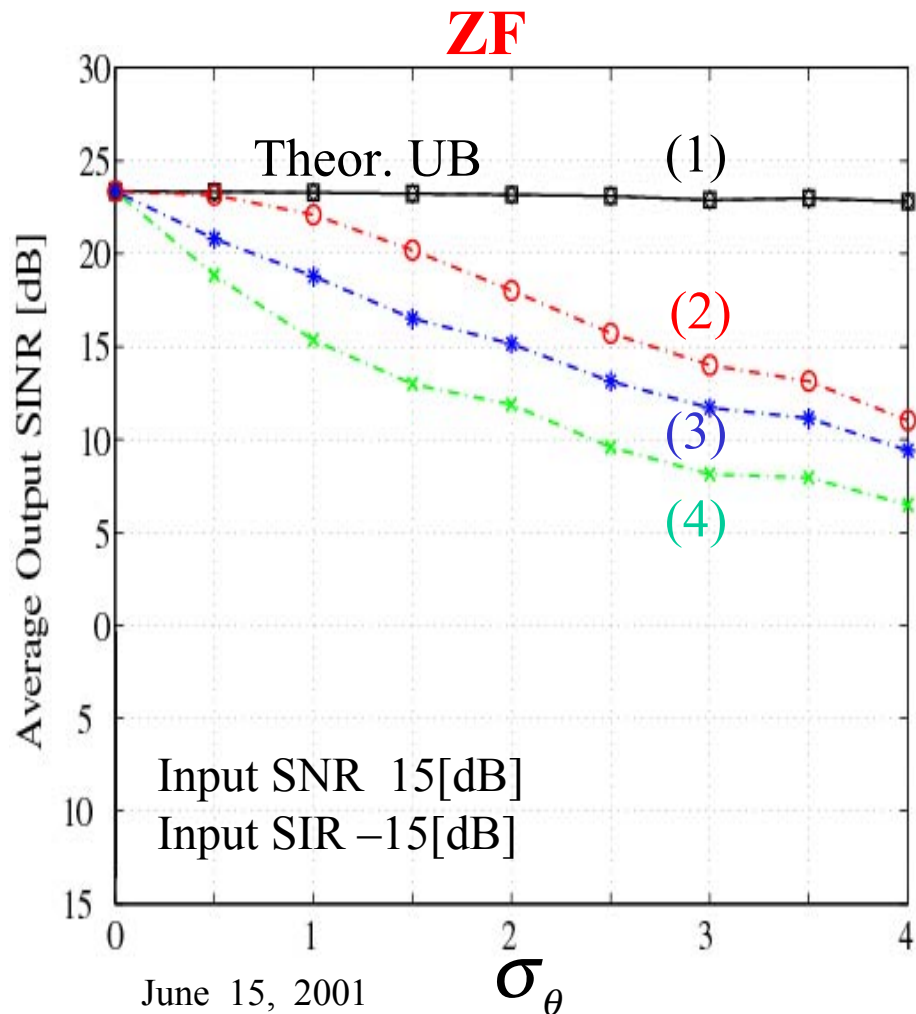


## DCMP



# Performance in AS Environment (3)

127 Samples, L=6

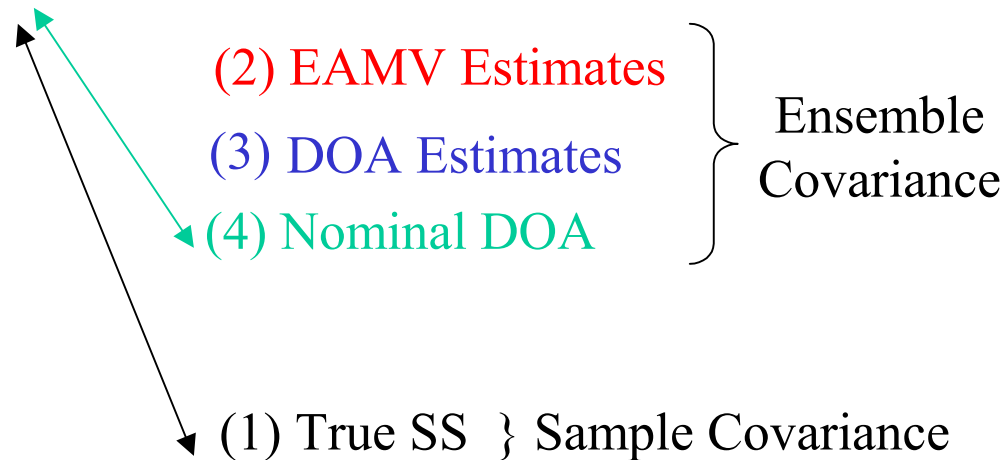


# Sensitivity Evaluation of Algorithms

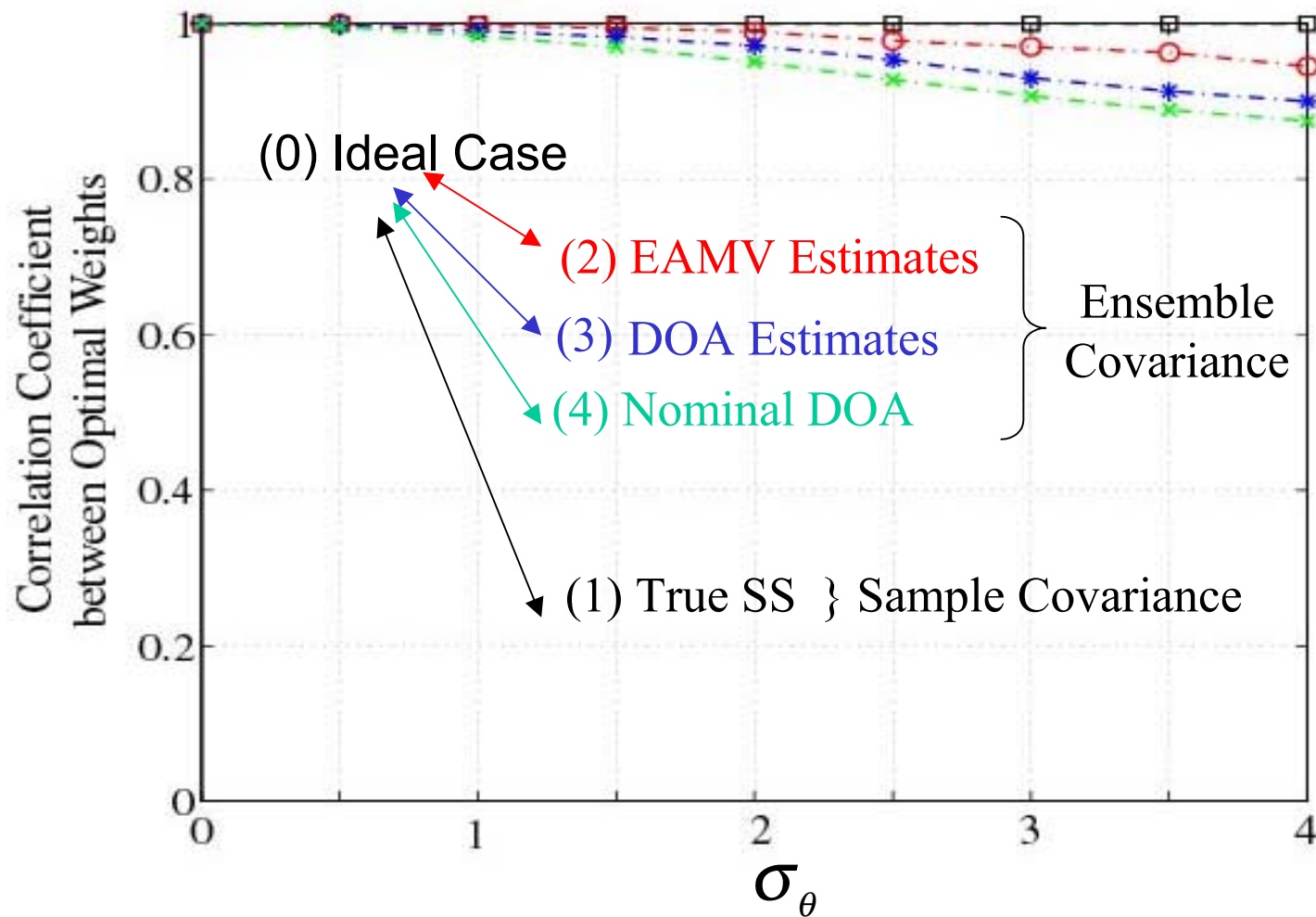
Definition of Corr. Coeff. between Weight Vectors

$$\rho_w = \frac{\|\mathbf{w}_{(0)}^H \mathbf{w}_{(i)}\|}{\|\mathbf{w}_{(0)}\| \|\mathbf{w}_{(i)}\|} \quad (i)=(1), (2), (3), (4)$$

(0) Ideal Case

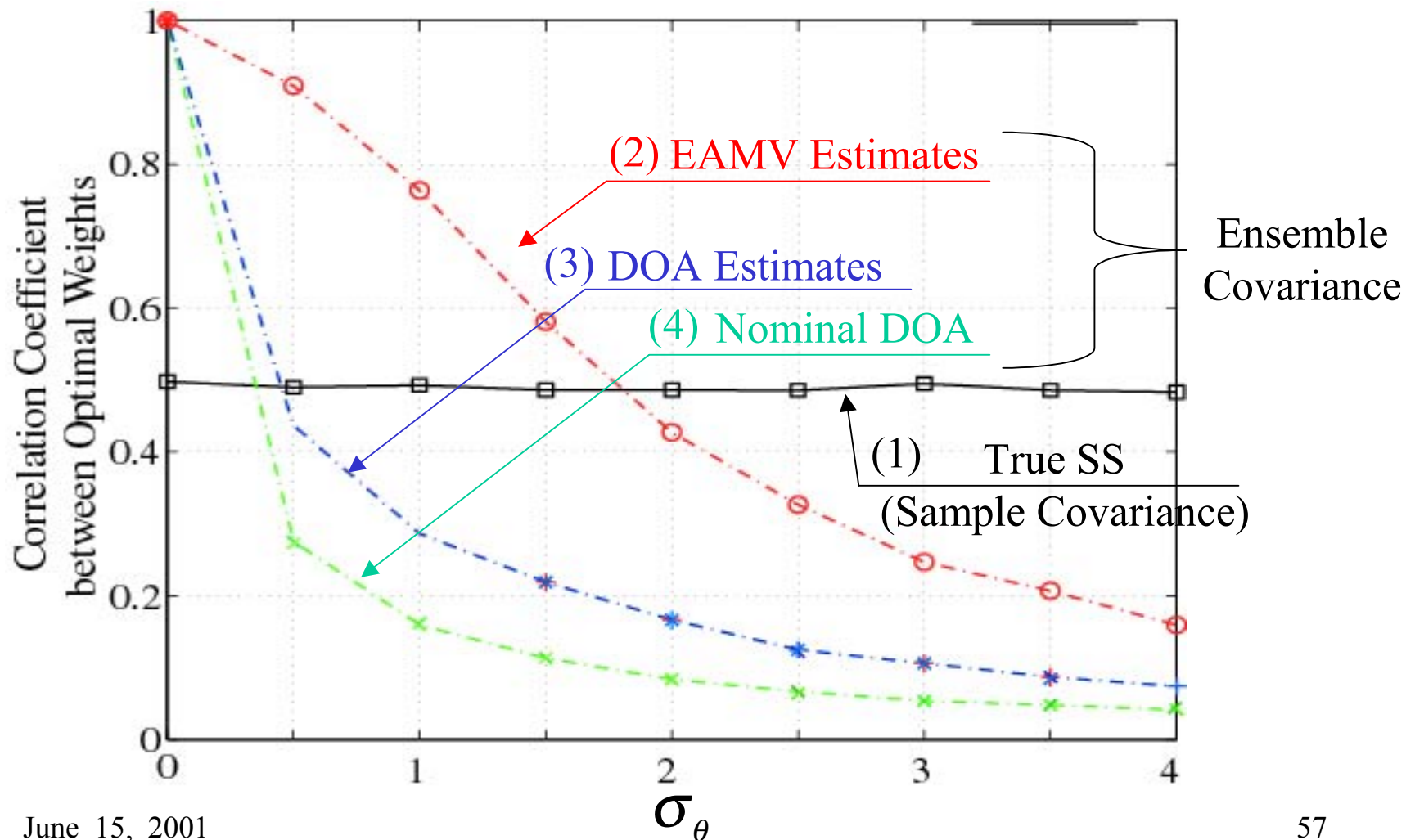


# Sensitivity of ZF in AS Environment (1)





# Sensitivity of DCMP in AS Environment (2)



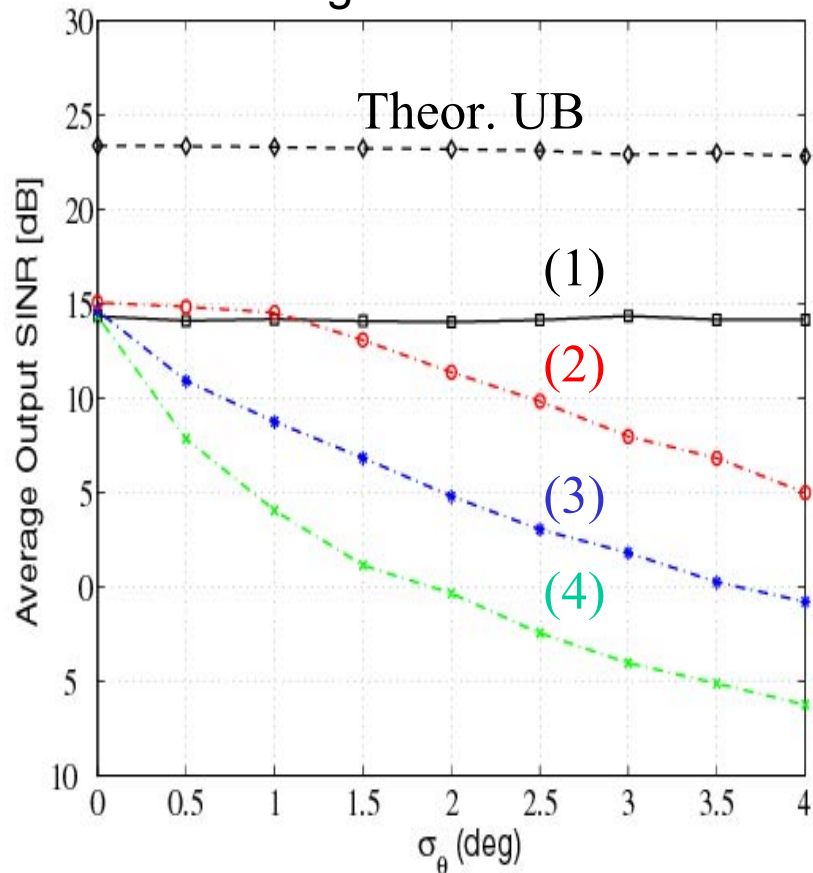
# Regularization of Covariance Matrix : DCMP (Diagonal Loading)

$$\bar{\mathbf{R}} = \hat{\mathbf{R}} + \alpha_n \mathbf{I}$$

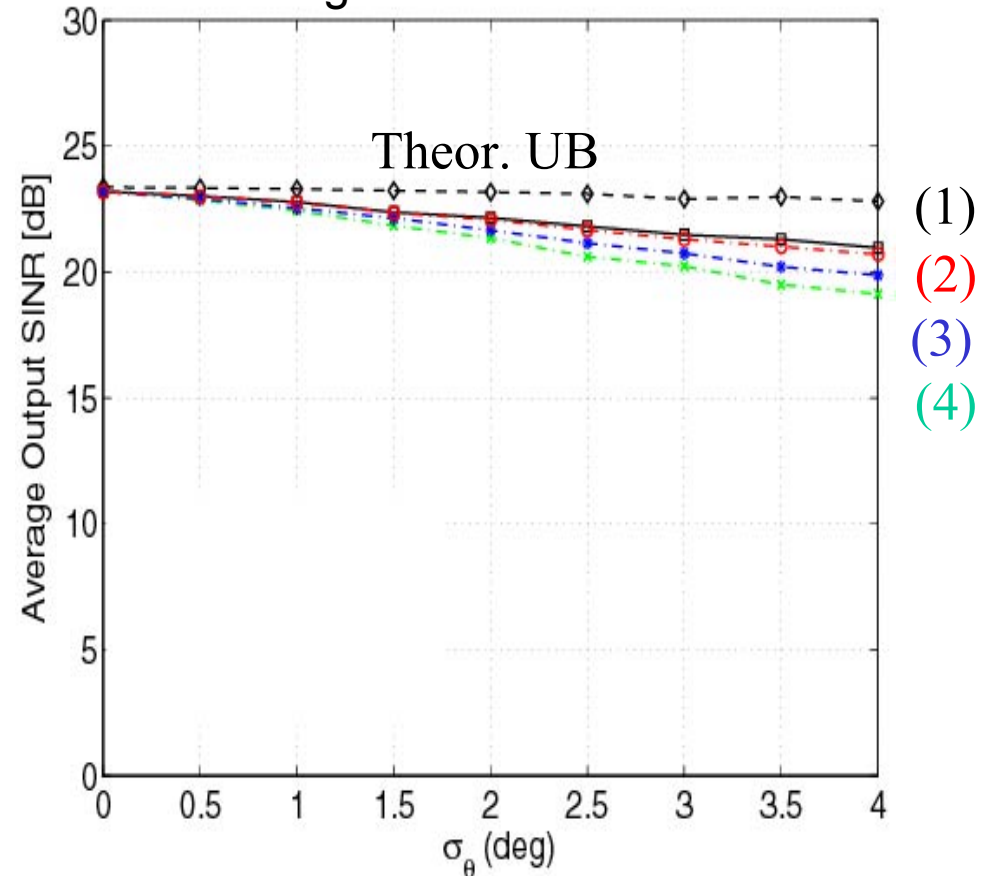
# Regularization of Covariance Matrix : DCMP

127 Samples, L=6

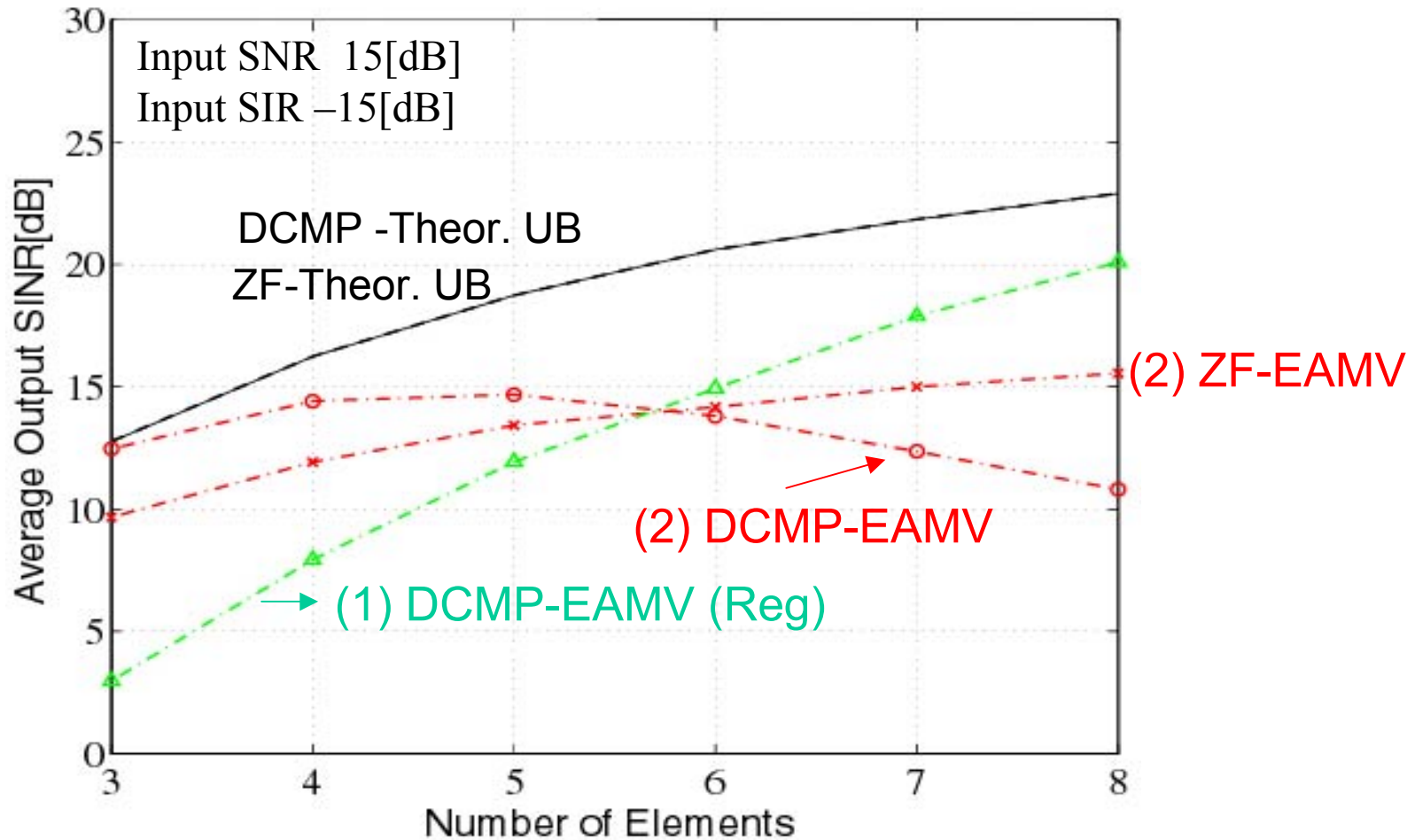
without Regularization



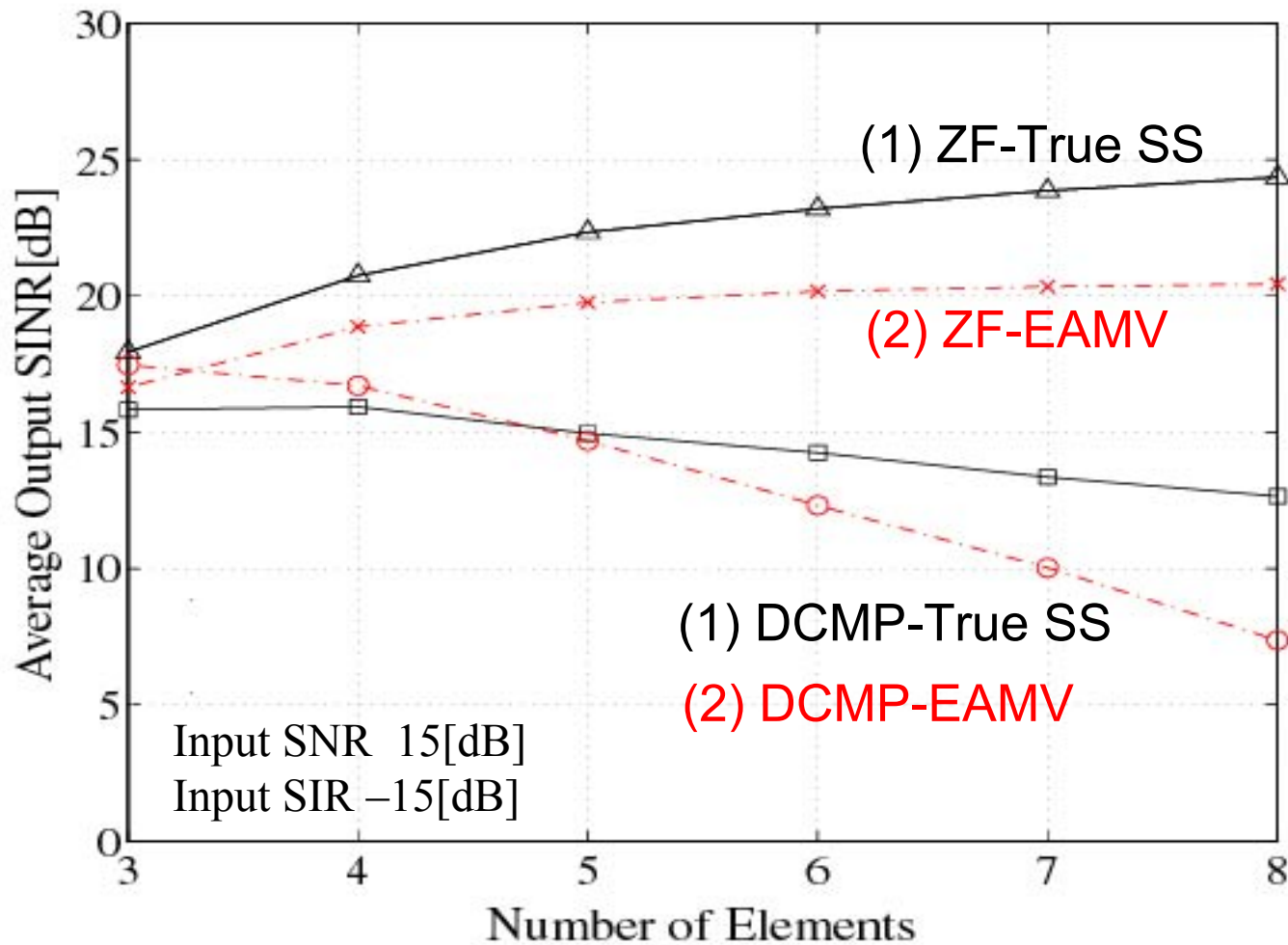
with Regularization



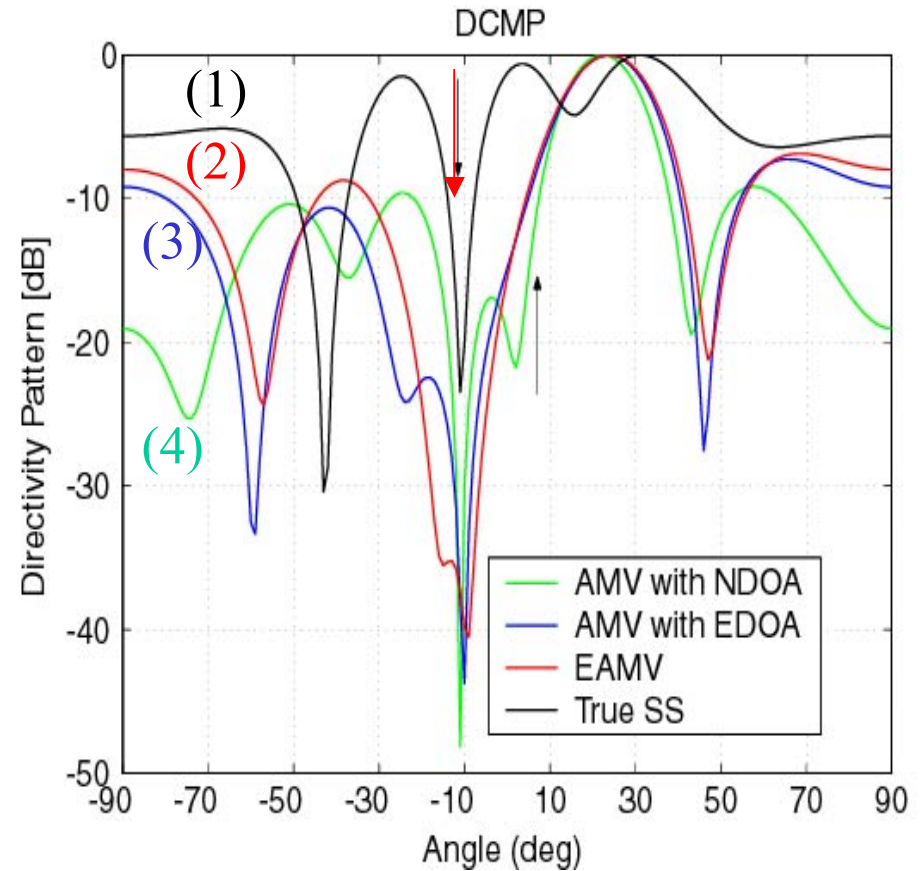
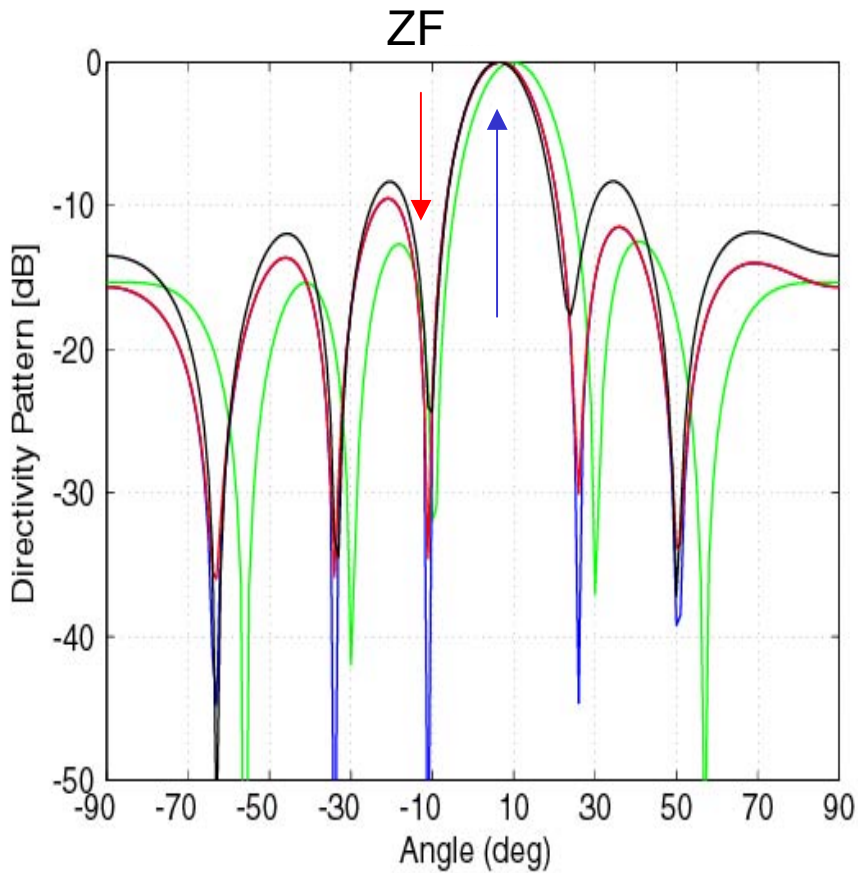
# Effect of Number of Antenna Elements



# Effect of Number of Antenna Elements



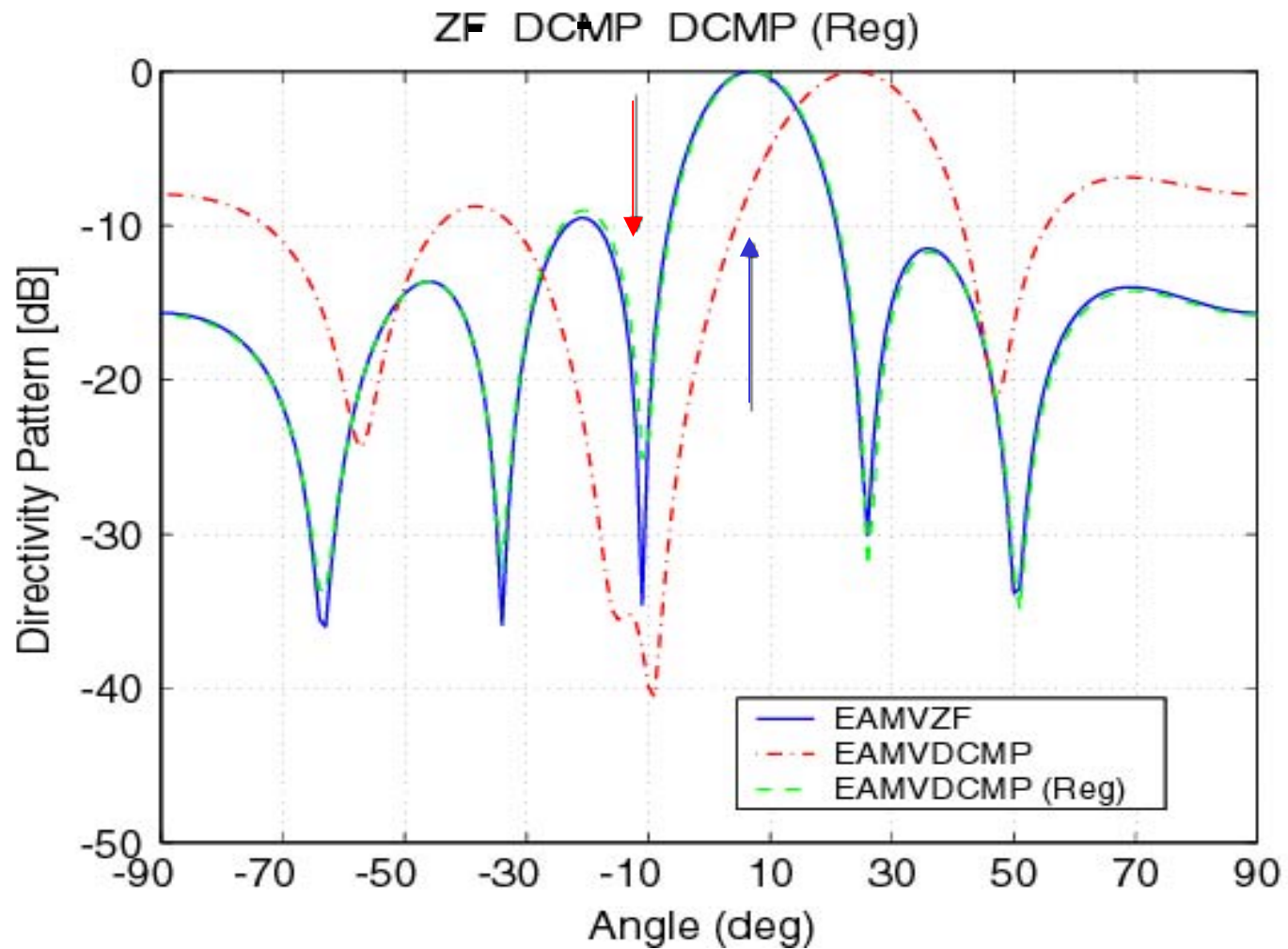
# Beam Pattern of Array Antenna



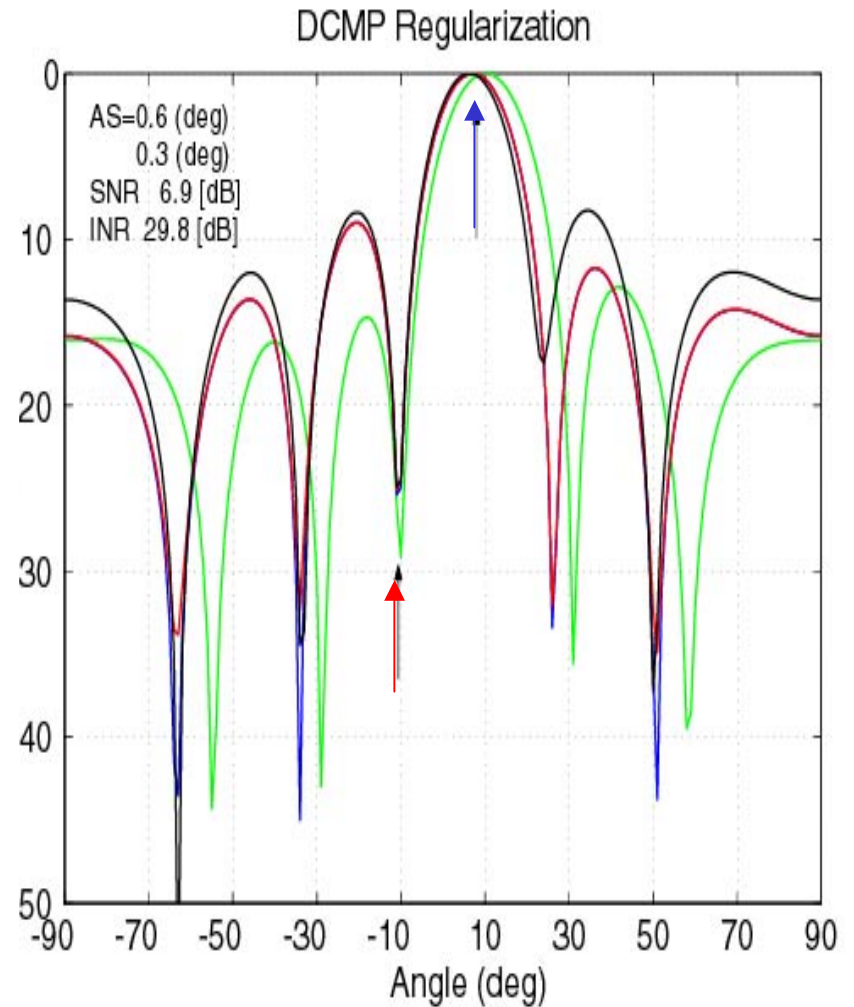
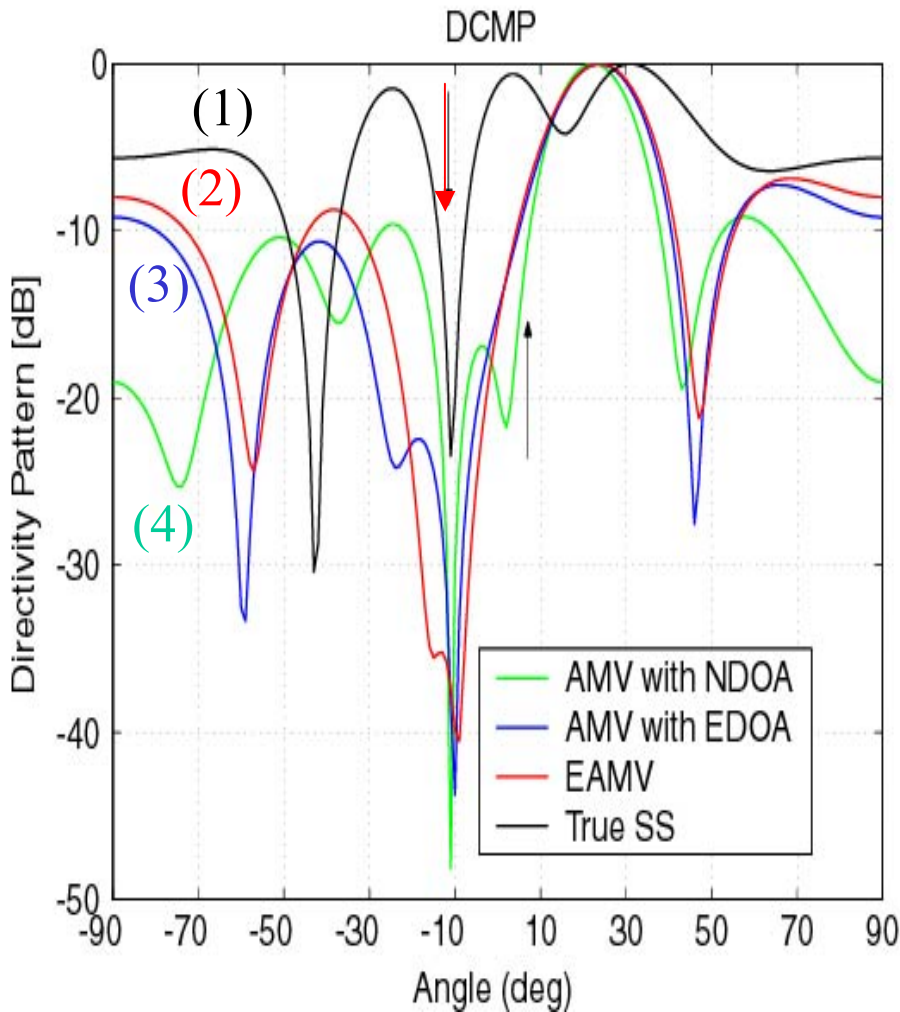
Input SINR : -22.9[dB]

Input SNR : 6.9, Input INR : 29.8

# Beam Pattern of Array Antenna



# Variation of Beam Pattern by Regularization



June 15, 2001

Input SINR : -22.9[dB]

Input SNR : 6.9, Input INR : 29.8



**Input SINR : -22.9, Input SNR : 6.9, Input INR : 29.8**

**Output SINR**

**ZF (NDOA) : 1.2, ZF(EDOA) : 1.3,**

**ZF (EAMV) : 3.3, ZF (True SS) : 14.6**

**DCMP( NDOA) : -10.9, DCMP (EDOA) : -2.0**

**DCMP (EAMV) : -1.03, DCMP (True SS) : 10.7**

***DCMP Reg***

**(NDOA) : 13.2, (EDOA) : 13.4**

**(EAMV) : 13.6, (True SS) : 13.8**

# Conclusions

- It is expected to reduce considerably model errors in algorithms based on the plane wave data model.
- The applicability to other superresolution algorithms is also expected..
- Proximity Evaluation from Spatial Signature Estimates
- It follows that the proposed method can obtain more accurate SS estimates than the case using only the DOA.
- Proposal of Optimal Signal Combining Techniques using EAMV Estimates.
  - Reduction of the effect due to weight perturbations
  - Enhanced SINR Performance.