

# SAR POLARIMETRY BASICS

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Université  
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Toulouse  
Midi-Pyrénées



Université  
de Rennes



# RADAR POLARIMETRY



## Objective

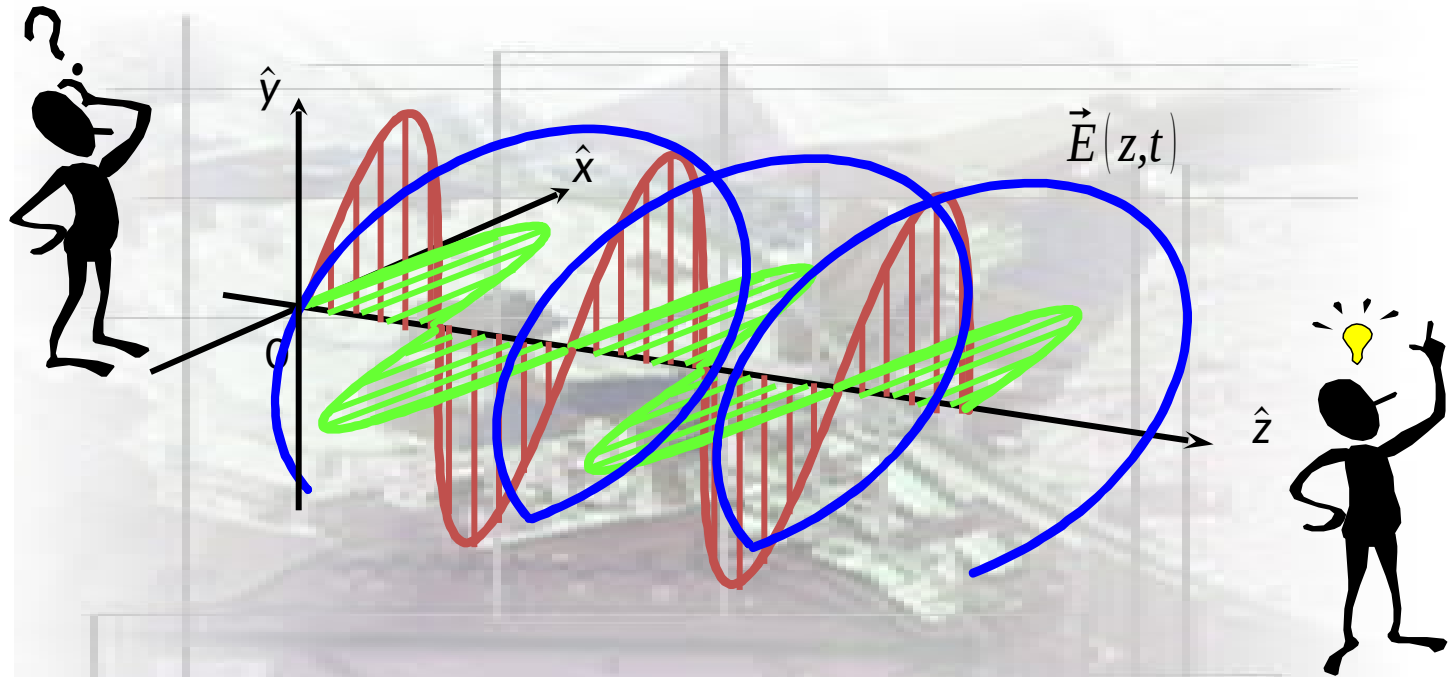
**To provide the minimum, but necessary, amount of knowledge required to understand scientific works on :**



**SAR Polarimetry (PolSAR)**

**SAR Polarimetry + Interferometry (Pol-InSAR)**

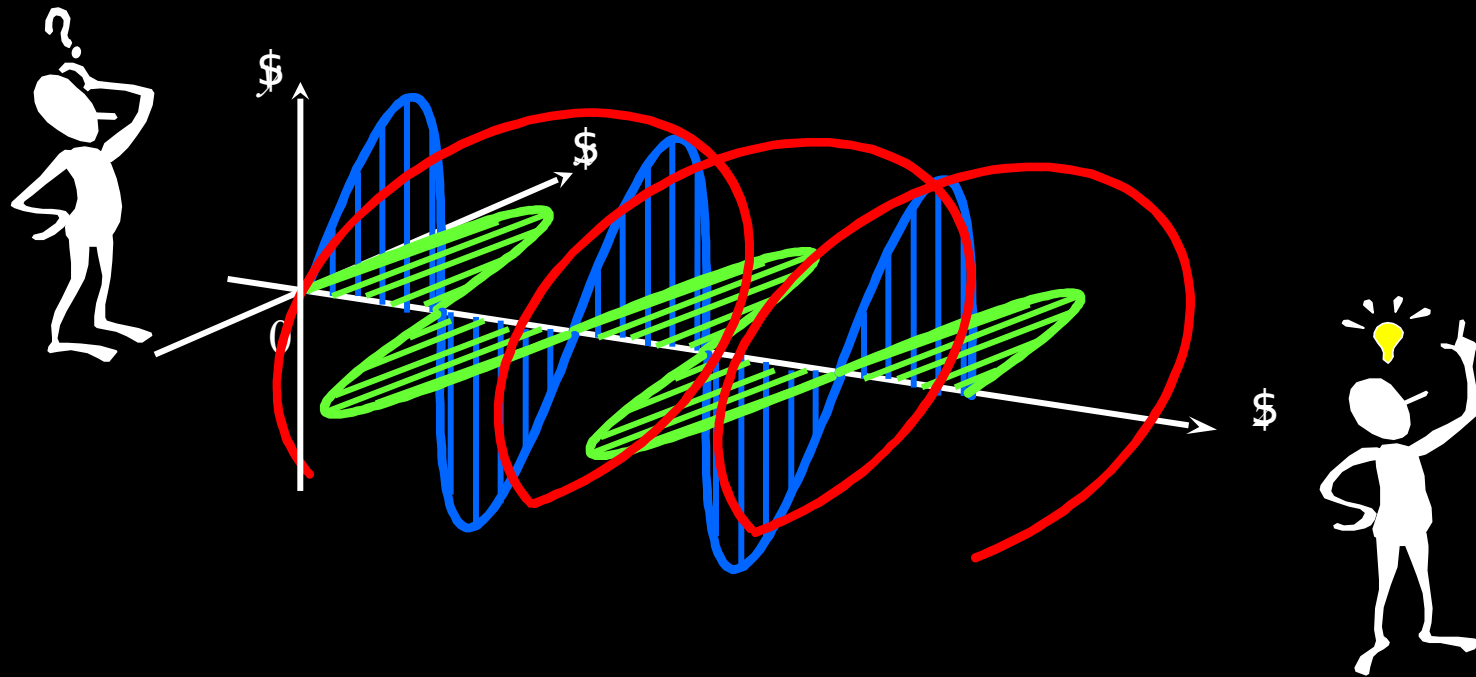
**SAR Polarimetry + Tomography (Pol-TomSAR)**



# GENERAL INTRODUCTION



# Radar Polarimetry



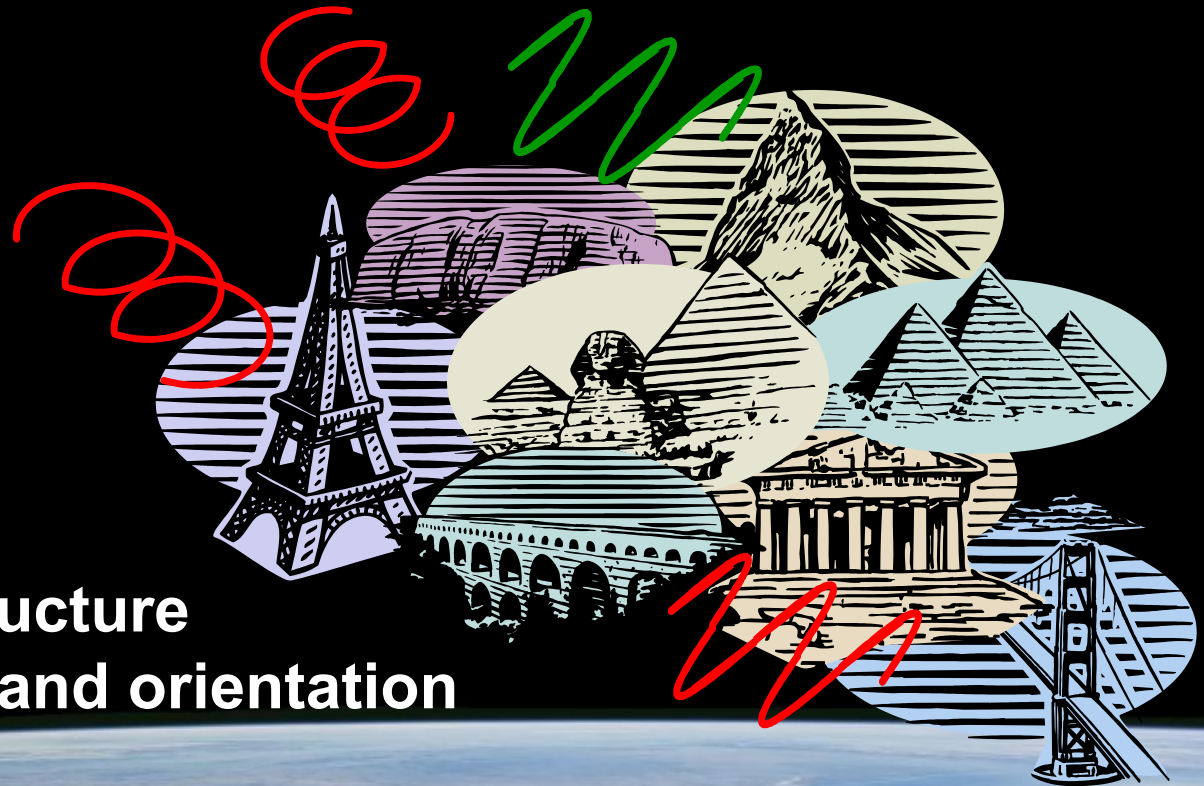
Radar Polarimetry (**Polar : polarisation Metry: measure**) is the science of acquiring, processing and analysing the polarization state of an electromagnetic field

Radar Polarimetry deals with the full vector nature of polarized electromagnetic waves

# Radar Polarimetry



The POLARISATION information  
Contained in the waves backscattered  
from a given medium is highly related to:



its geometrical structure  
reflectivity, shape and orientation

its geophysical properties such as humidity, roughness, ...

# SAR Polarimetry Applications



**Forest Vegetation**

- Forest Height
- Forest Biomass
- Forest Structure
- Canopy Extinction
- Underlying Topography

- Forest Ecology
- Forest Management
- Ecosystem Change
- Carbon Cycle



**Agriculture**

- Soil Moisture Content
- Soil roughness
- Height of Vegetation Layer
- Extinction of Vegetation Layer
- Moisture of Vegetation Layer

- Farming Management
- Water Cycle
- Desretification



**Snow and Ice**

- Topography
- Penetration Depth / Density
- Snow Ice Layer
- Snow Ice Extinction
- Water Equivalent

- Ecosystem Change
- Water Cycle
- Water Management



**Urban Areas**

- Geometric Properties
- Dielectric Properties

- Urban Monitoring



Courtesy of Dr. I. Hajnsek

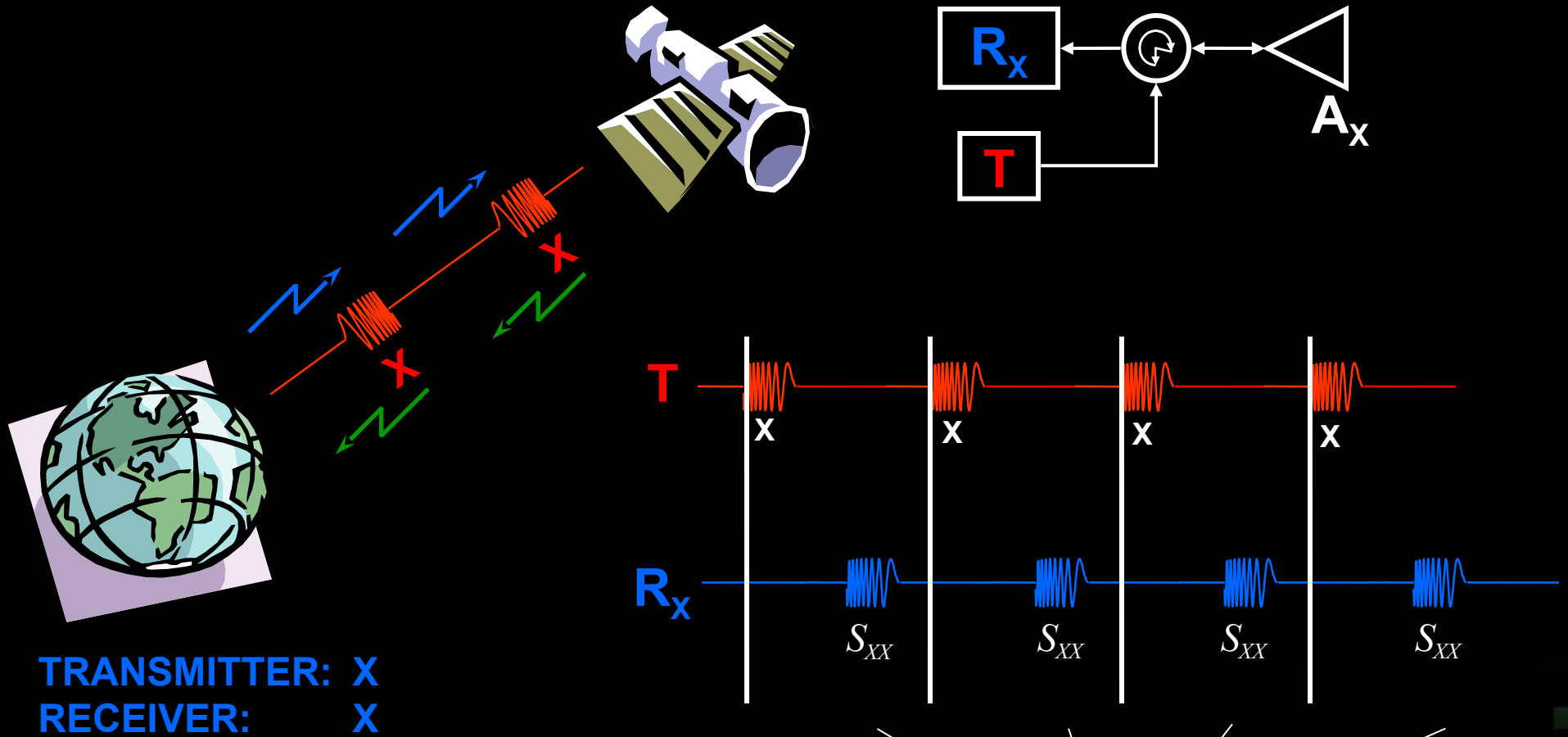


# Polarimetric Radar (SAR)



## Spaceborne Sensors

# Scattering Coefficient



TRANSMITTER: X  
RECEIVER: X

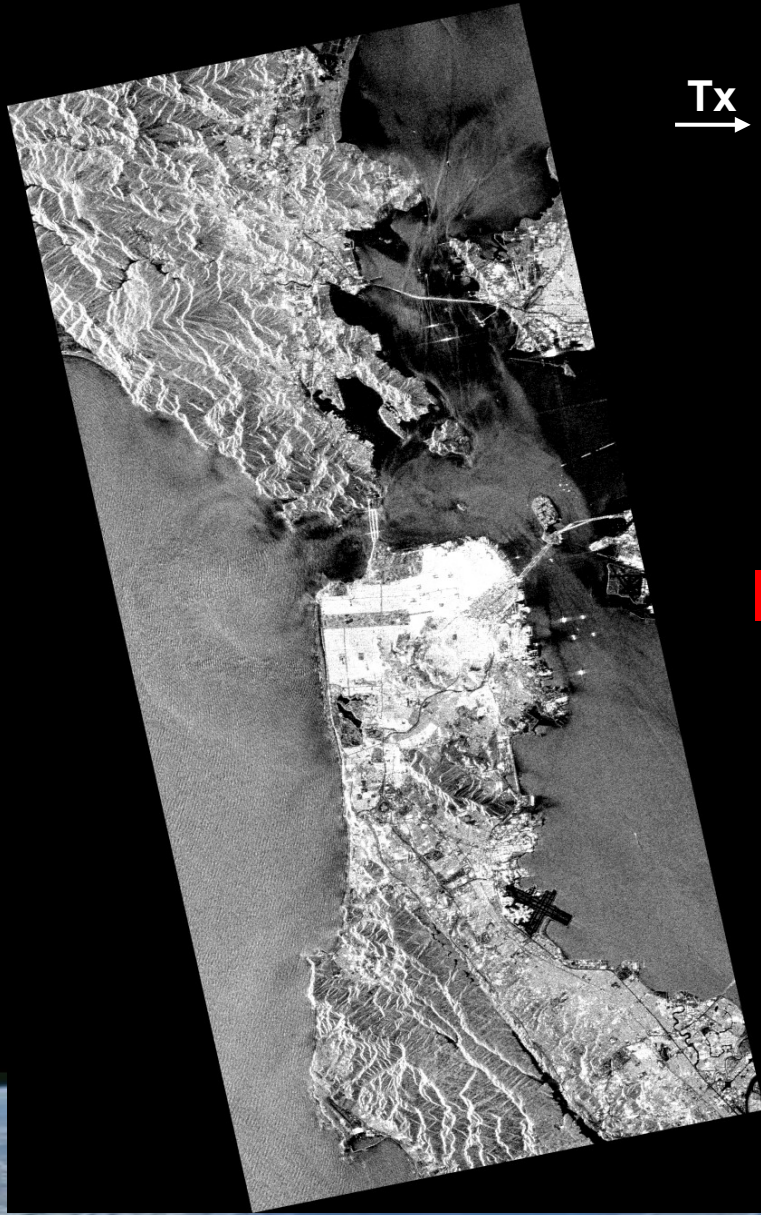
BACKSCATTERING  
COEFFICIENT

$$\{ S_{XX} \}$$

NO POLARIMETRY



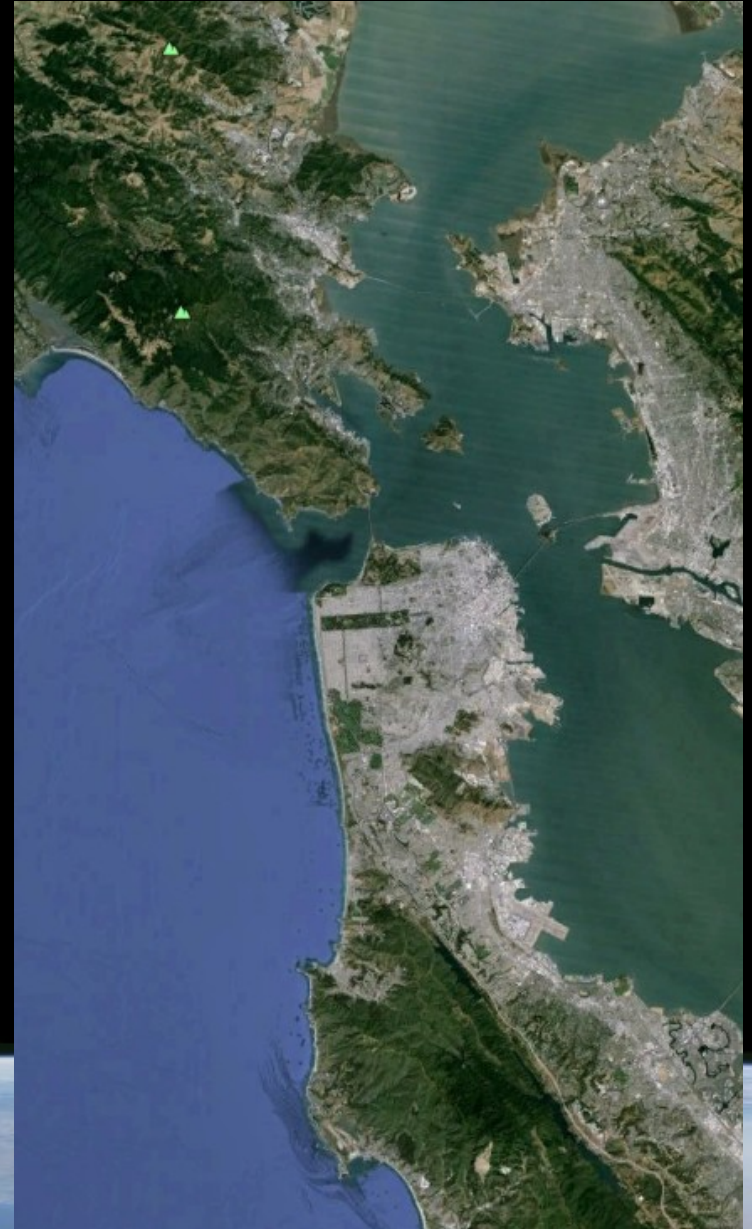
# Space-borne Sensors



Tx →

Rx →

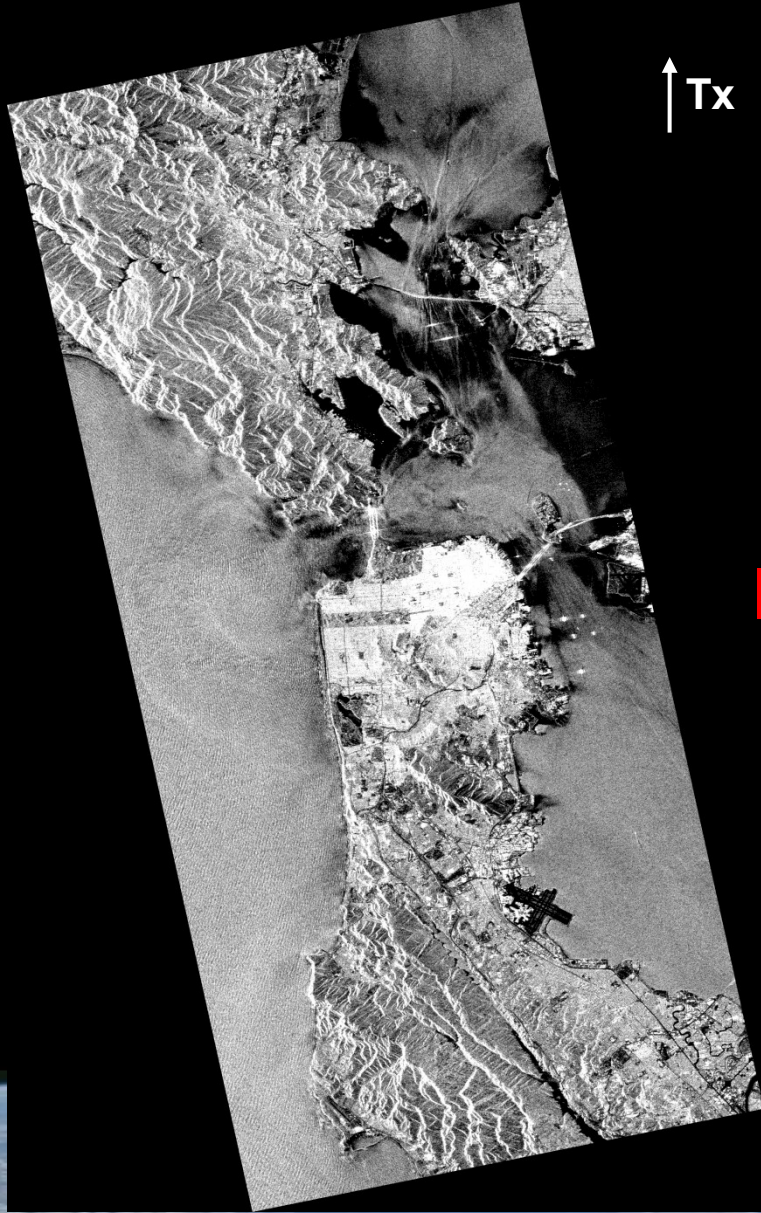
$|HH|_{dB}$



San Francisco Bay – (L-Band)



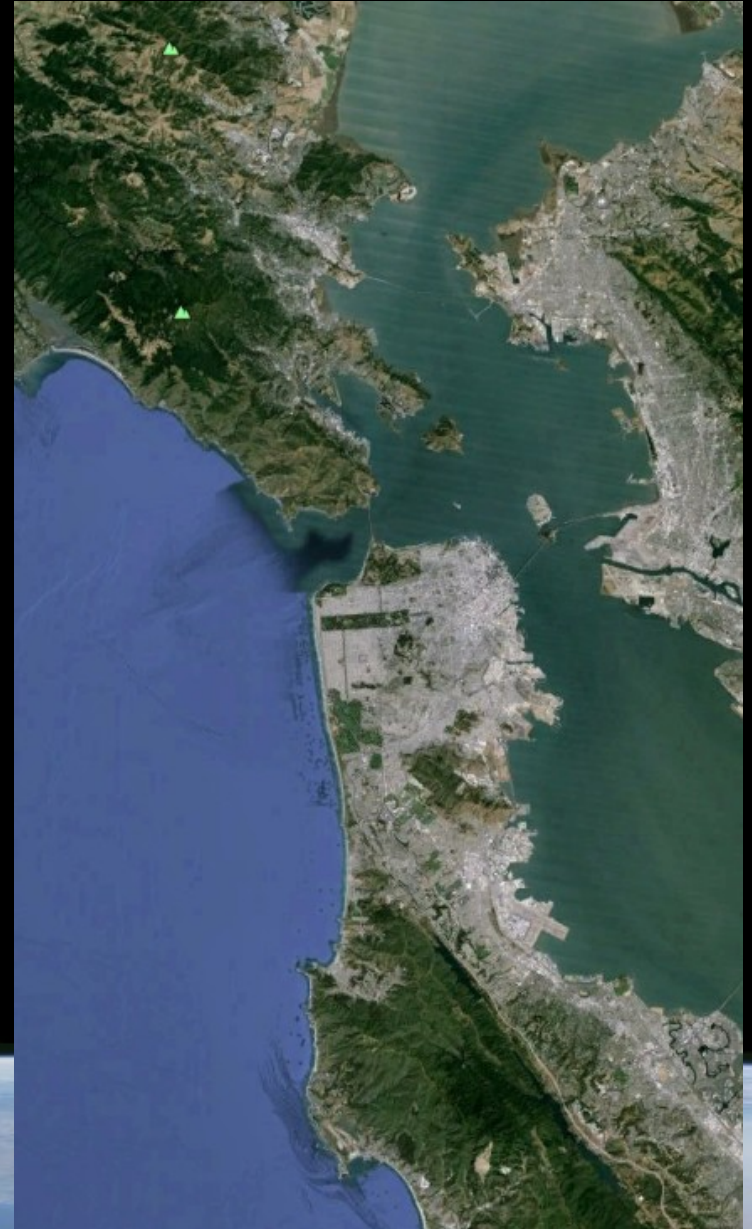
# Space-borne Sensors



↑ Tx

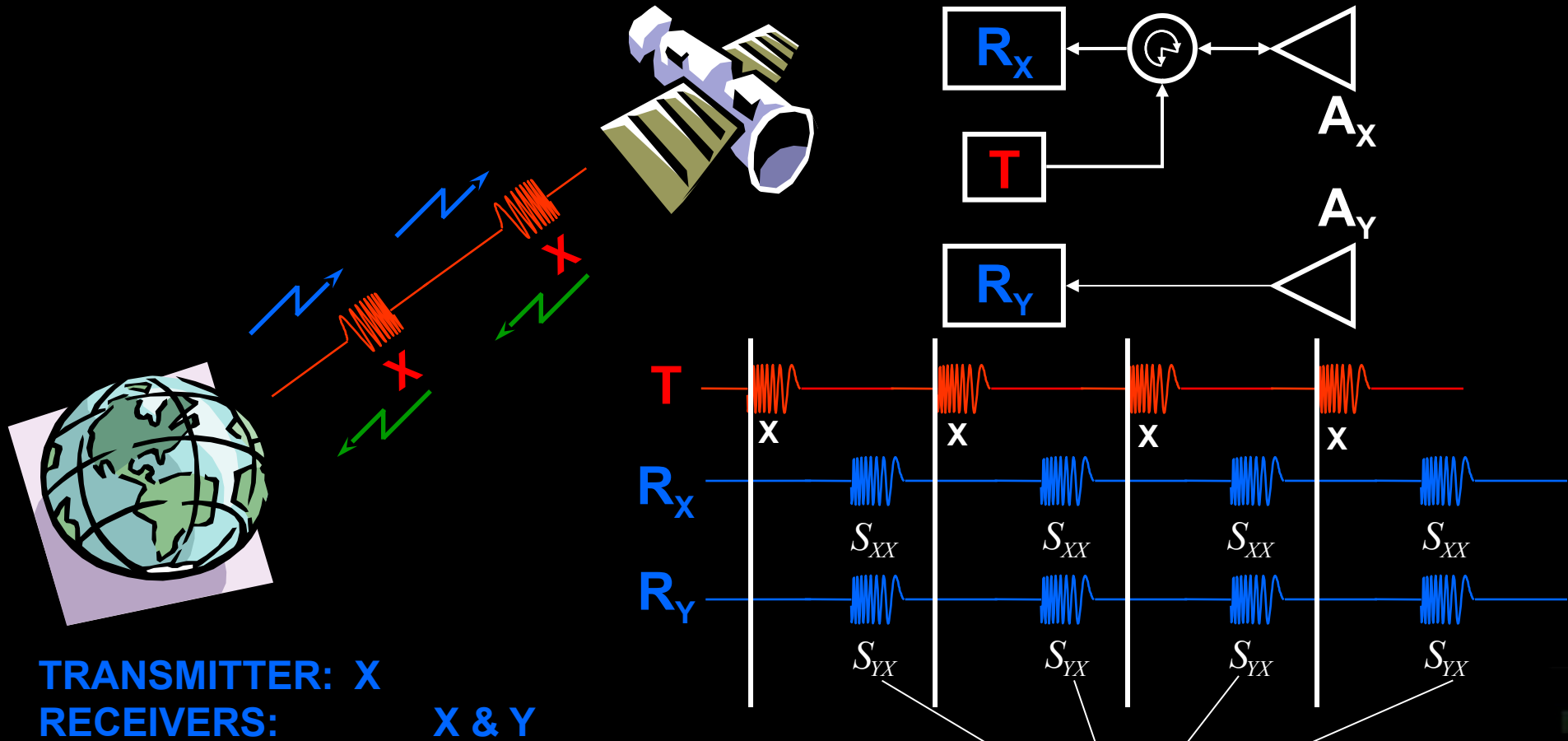
↑ Rx

$|VV|_{dB}$



San Francisco Bay – (L-Band)

# Wave Polarimetry



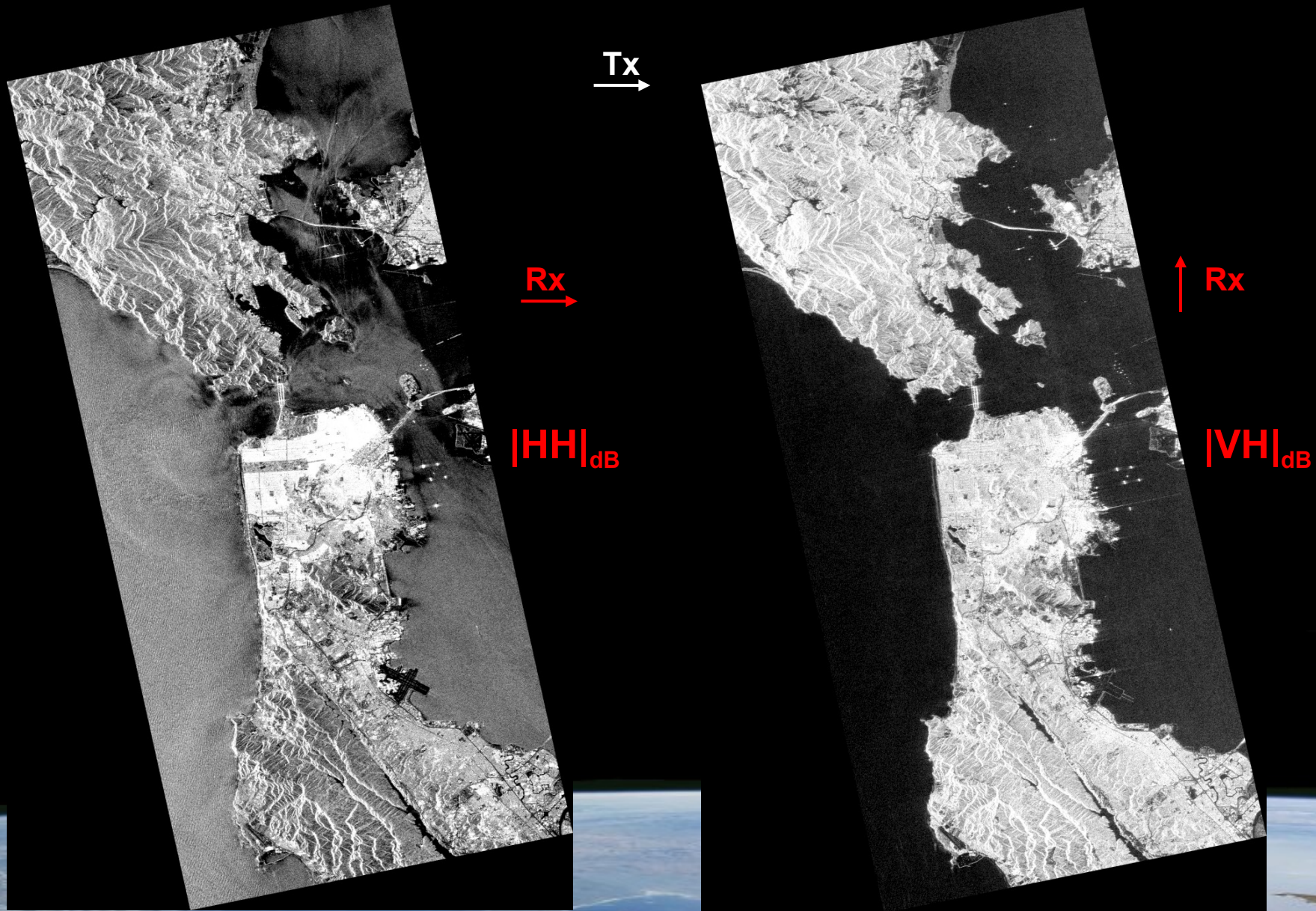
JONES VECTORS

$$\underline{E}_s = \begin{bmatrix} S_{XX} \\ S_{YX} \end{bmatrix}$$

WAVE POLARIMETRY



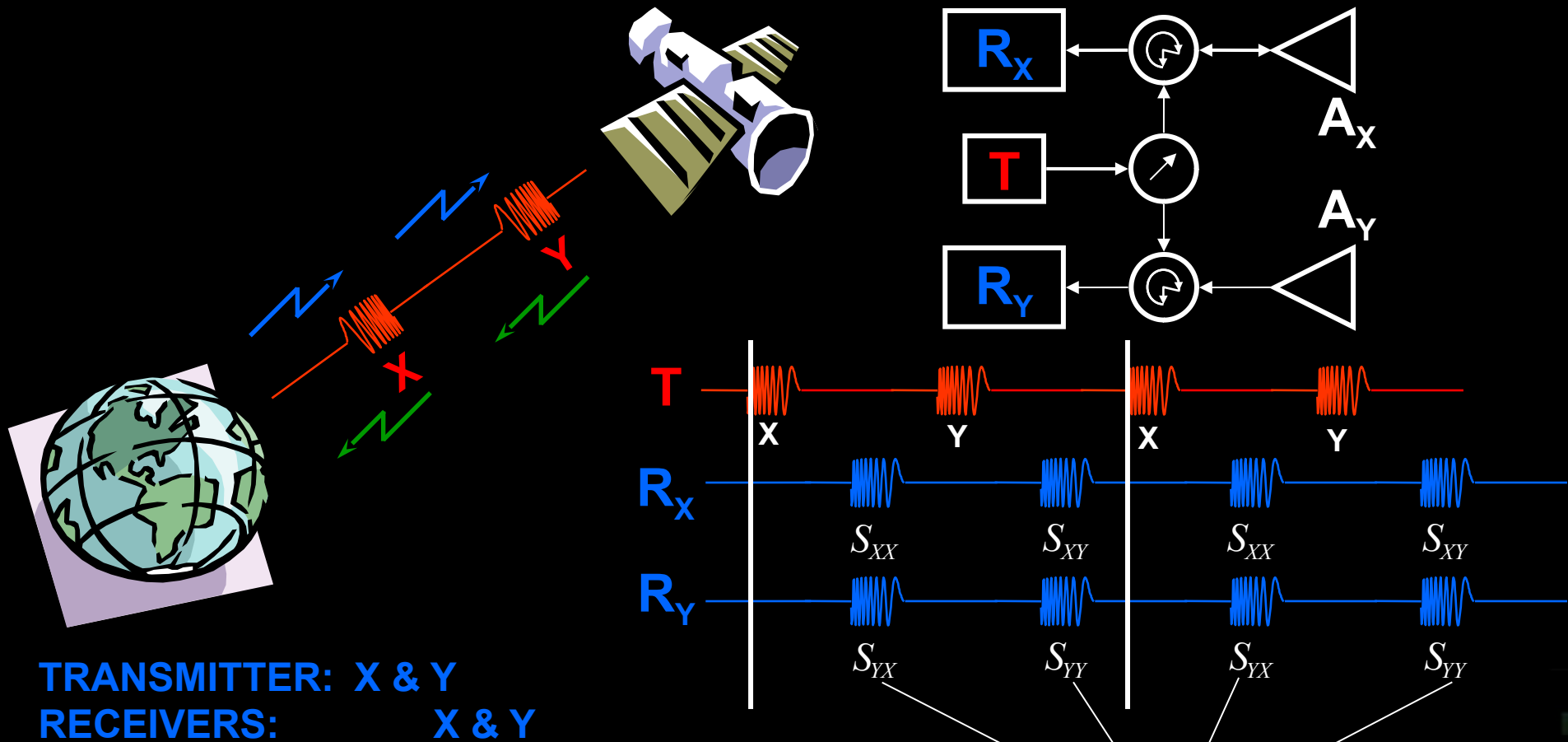
# Space-borne Sensors



San Francisco Bay – (L-Band)



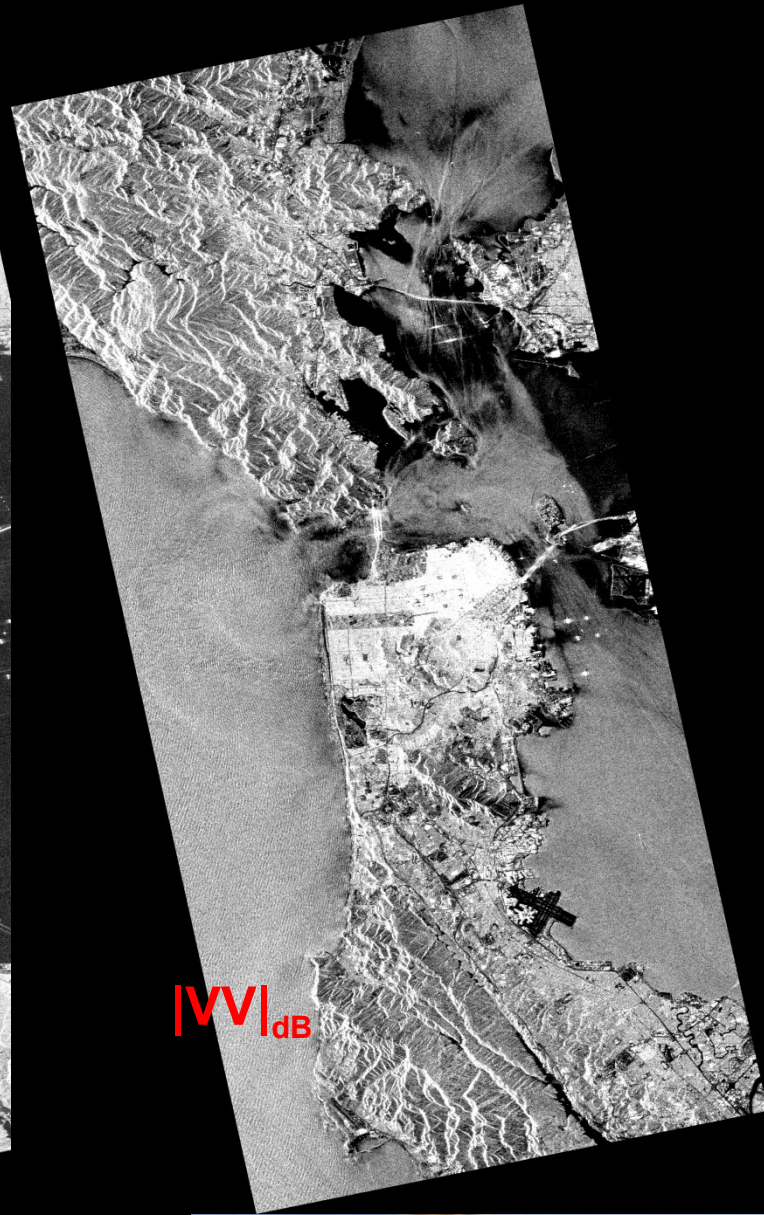
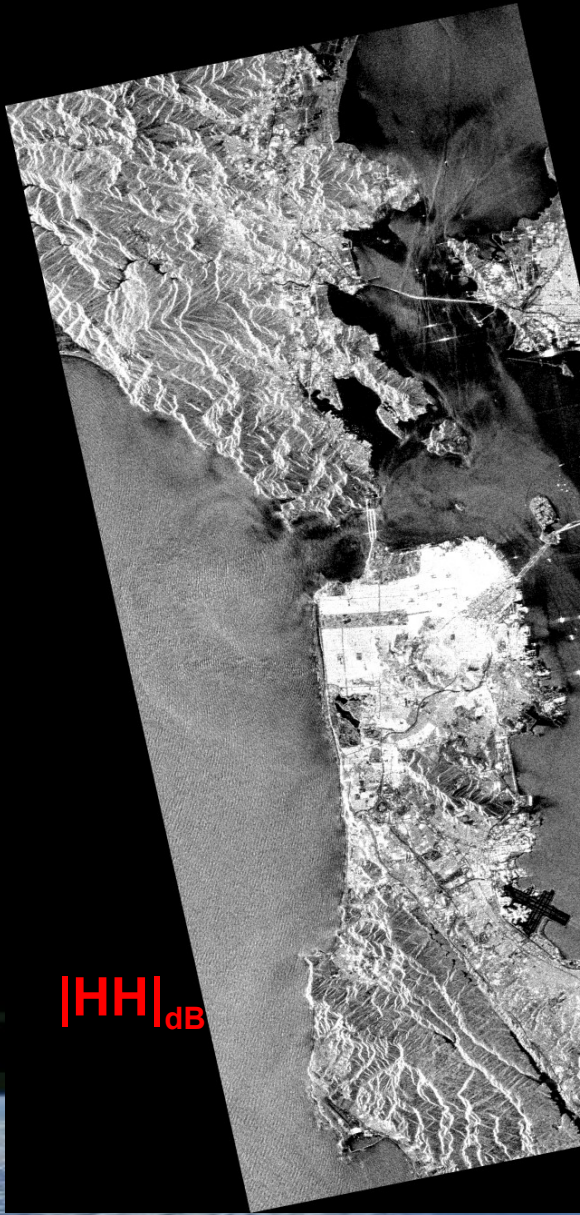
# Scattering Polarimetry



**SINCLAIR MATRICES**

$$\left[ S \right] = \begin{bmatrix} S_{XX} & S_{XY} \\ S_{YX} & S_{YY} \end{bmatrix}$$
**SCATTERING POLARIMETRY**

# Space-borne Sensors



San Francisco Bay – (L-Band)



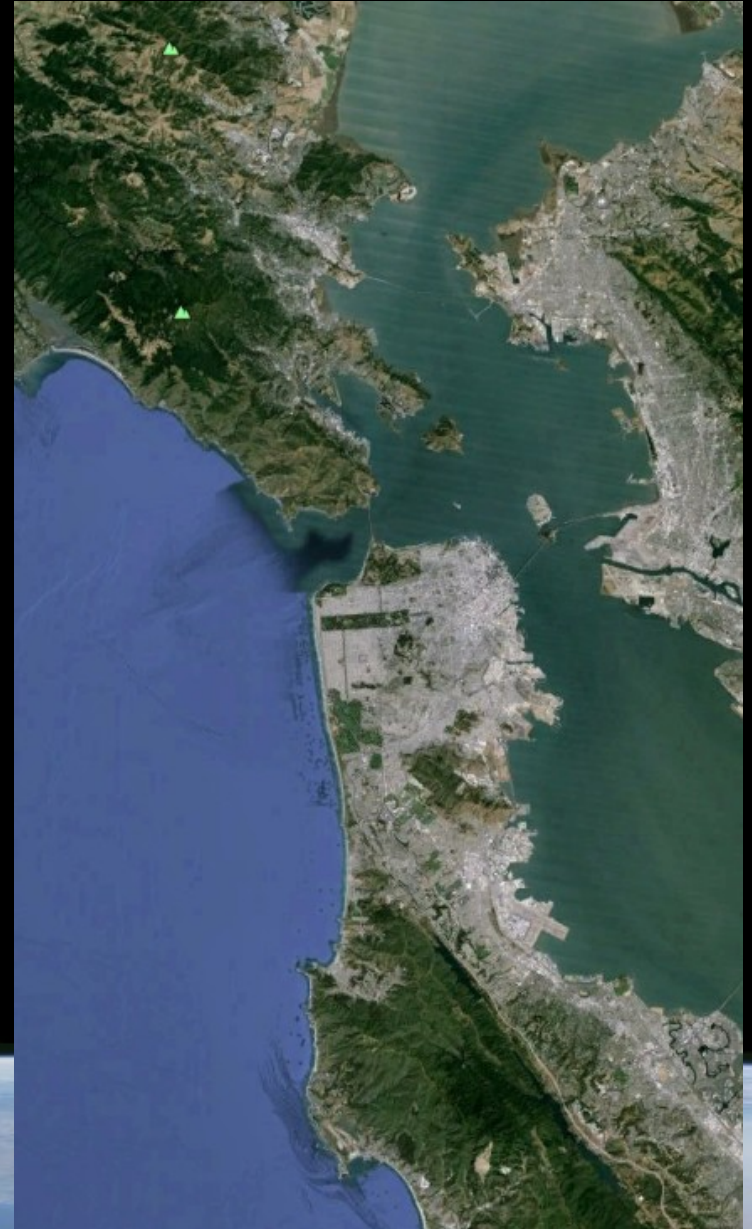
# Space-borne Sensors



$|HH|_{dB}$

$|HV|_{dB}$

$|VV|_{dB}$

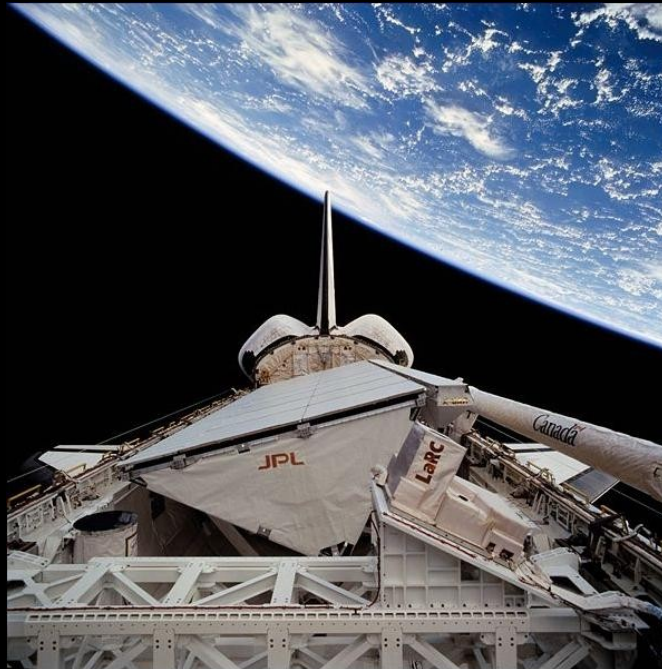


San Francisco Bay – (L-Band)

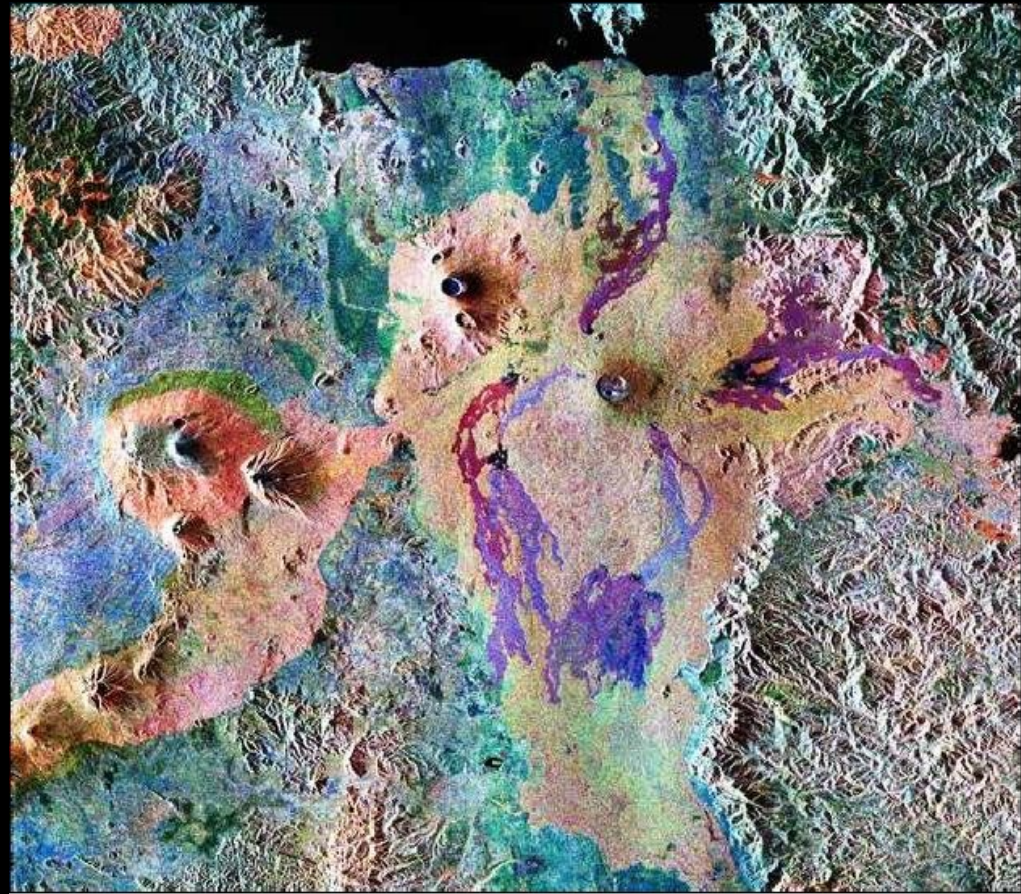


# Space-borne PolSAR Sensors

## SIR-C / X-SAR



**April 1994**  
**L- and C-Band (Quad)**  
**X-Band (Sngl)**

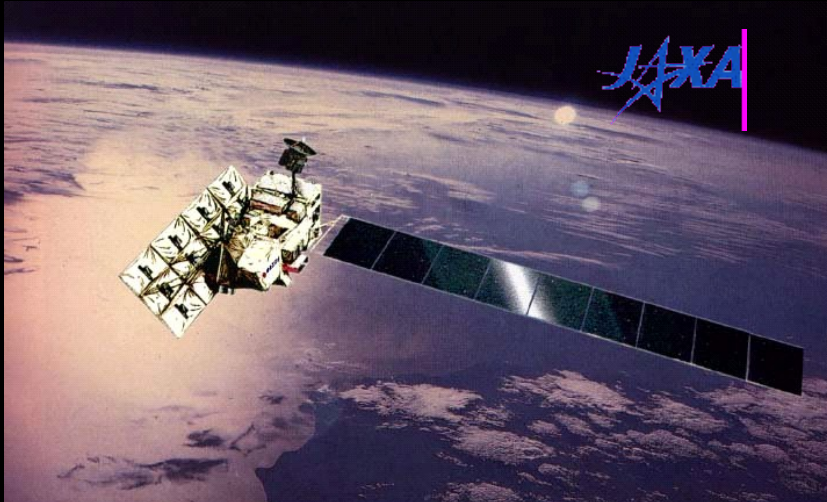


**Rwanda, Zaire, Uganda**



# Space-borne PolSAR Sensors

## ALOS - PALSAR



January 2006

L-Band (Sngl / Twin / Quad)



ALOS : Advanced Land Observing Satellite  
PALSAR : Phase Array L-Band SAR



# Space-borne PolSAR Sensors

## RADARSAT - 2

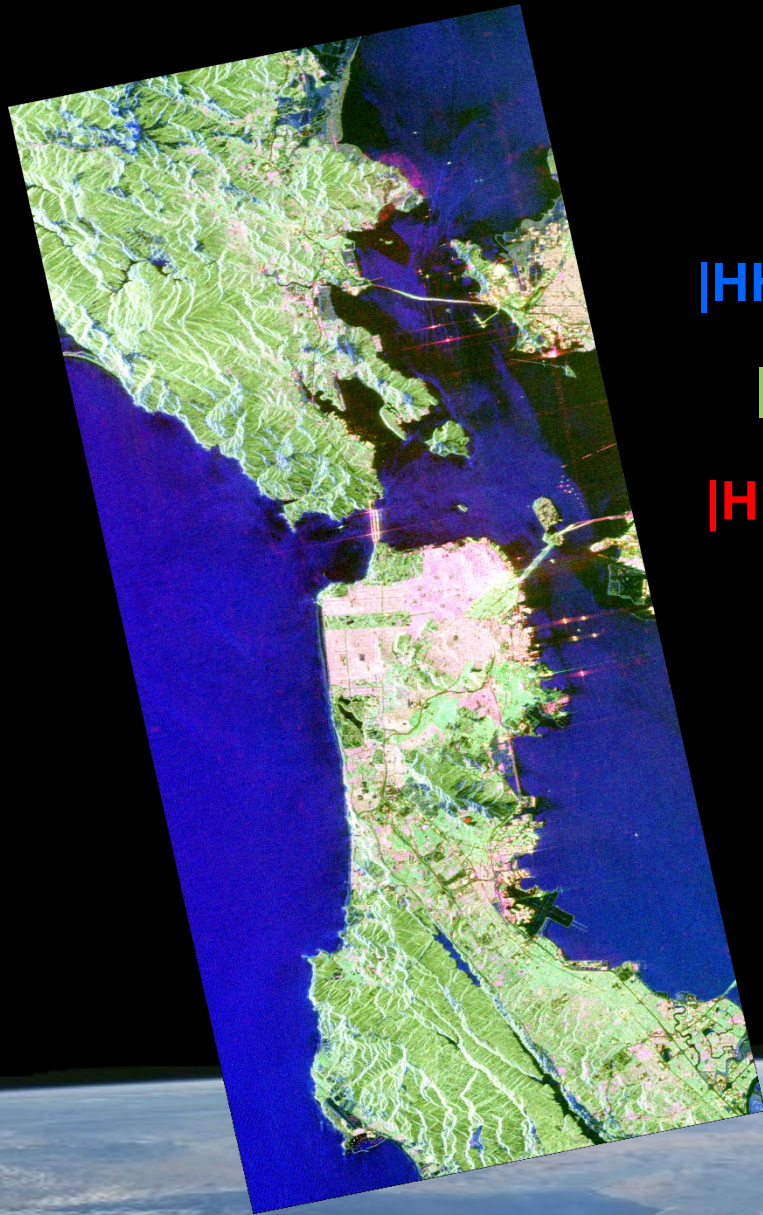


December 2007  
C-Band (Quad)





# Space-borne Sensors



$|HH+VV|_{dB}$

$|HV|_{dB}$

$|HH-VV|_{dB}$

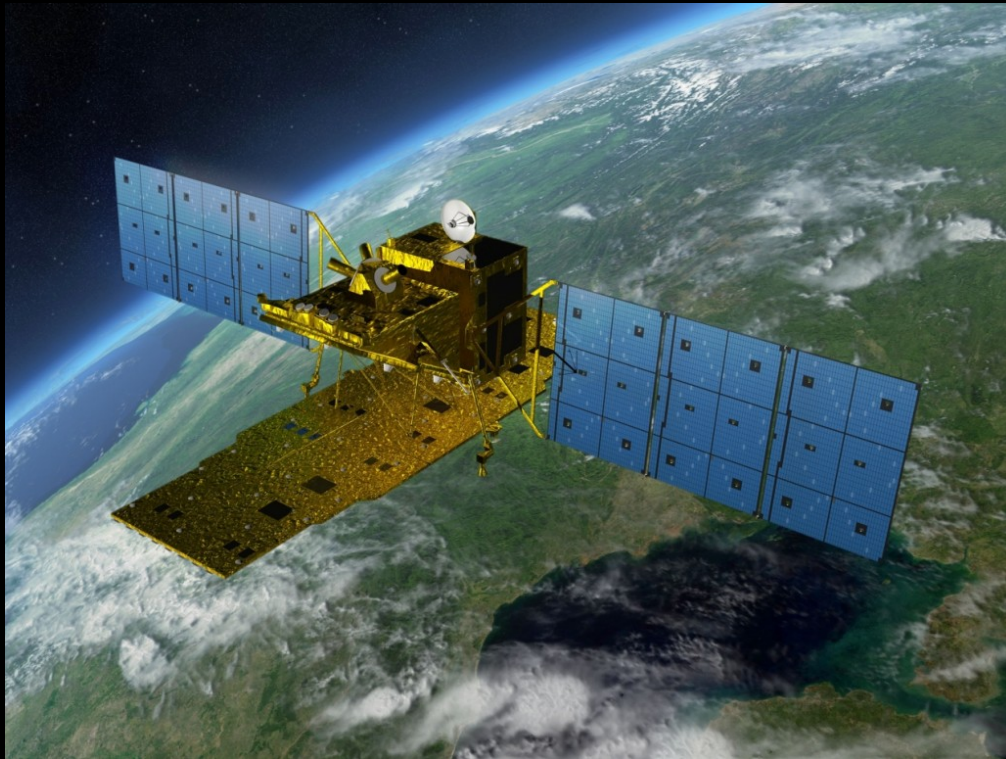


San Francisco Bay – (L-Band and C-Band)

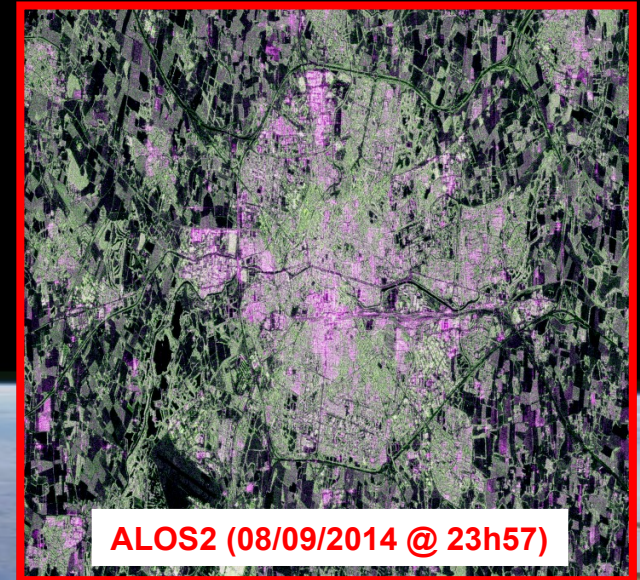


# Space-borne PolSAR Sensors

**ALOS - 2**



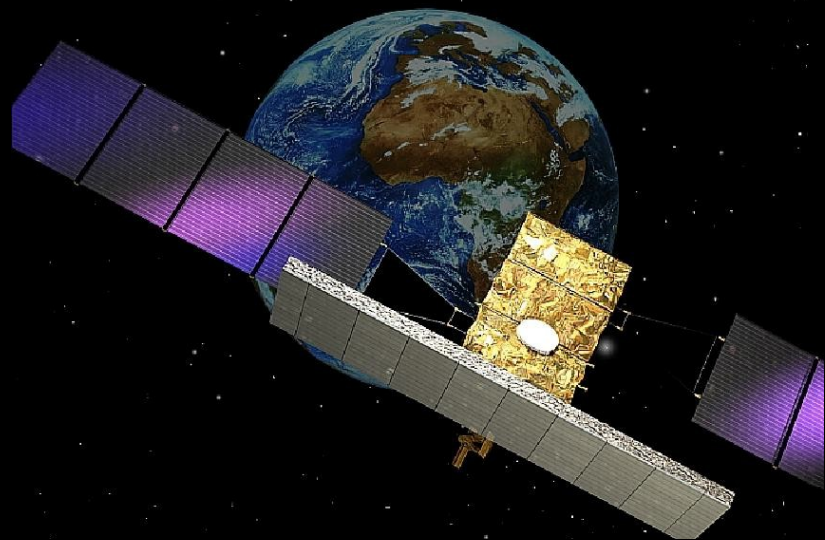
**May 2014**  
**L-Band (Quad)**





# Space-borne PolSAR Sensors

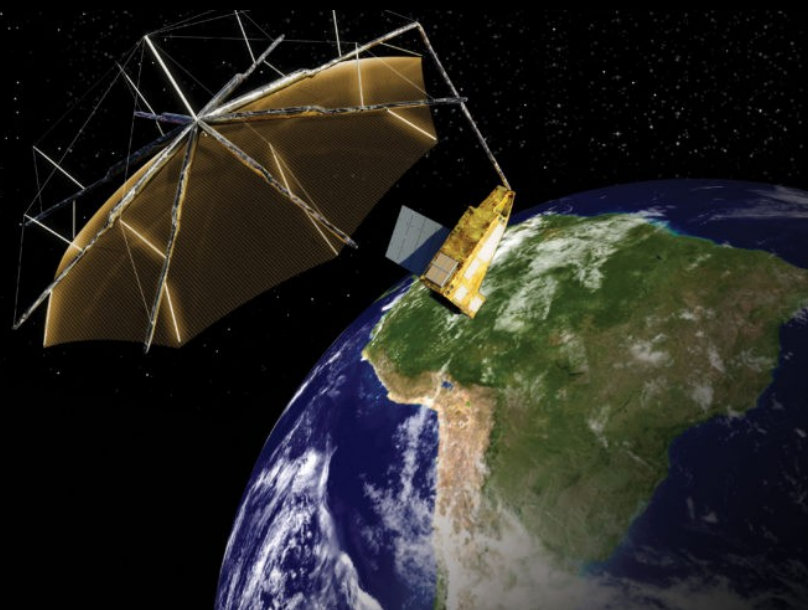
**COSMO - SkyMed - CSG**



**2A : 2018    2B : 2019**

**X-Band (Sngl / Dual / Quad Exp.)**

**Earth Explorer - BIOMASS**

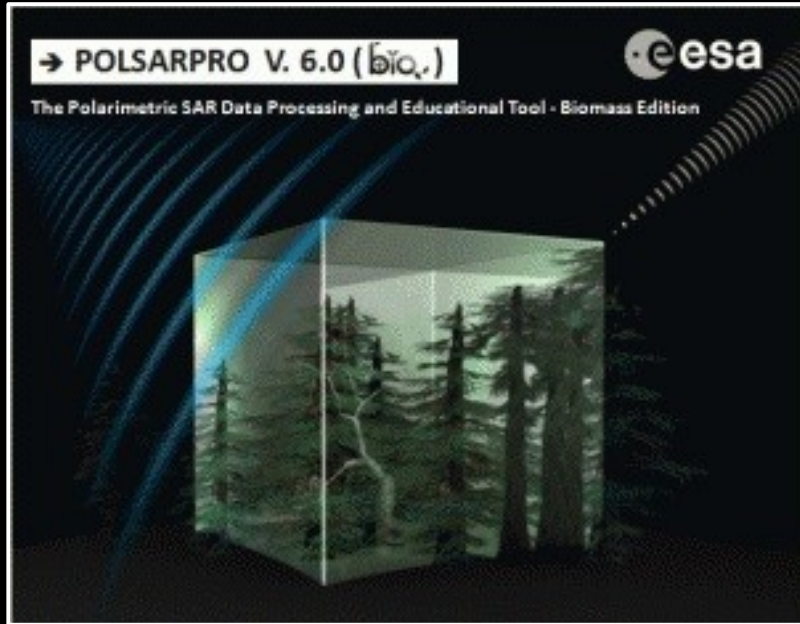


**2021**

**P-Band (Quad)**



# ESA PolSARpro Toolbox



**Polarimetric SAR data Processing**  
and educational tool

 since 2003

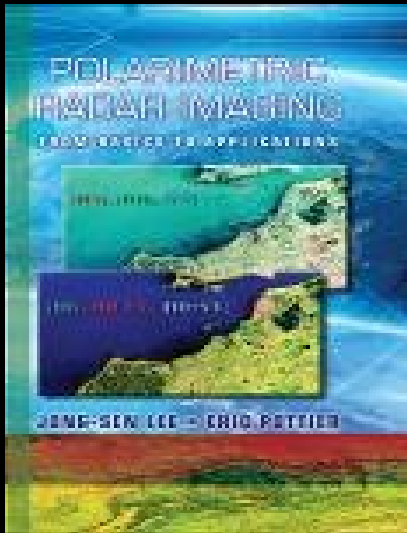
- +3000 registered users
- +70 foreign countries

**International Collaborative Project**  
(Agencies, Research Centres, Universities)





# Books On Polarimetric Radar SAR, Polarimetric Interferometry

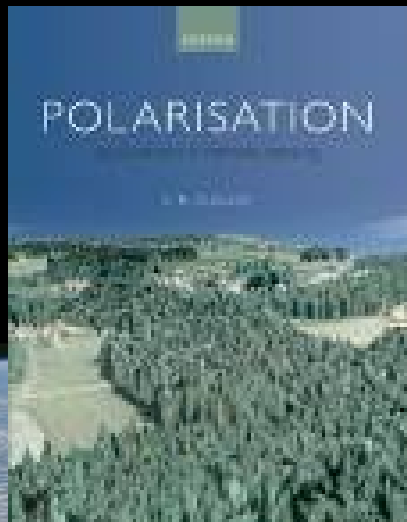


## **Polarimetric Radar Imaging: From basics to applications**

*Jong-Sen LEE – Eric POTTIER*

CRC Press; 1st ed., February 2009, pp 422

ISBN: 978-1420054972



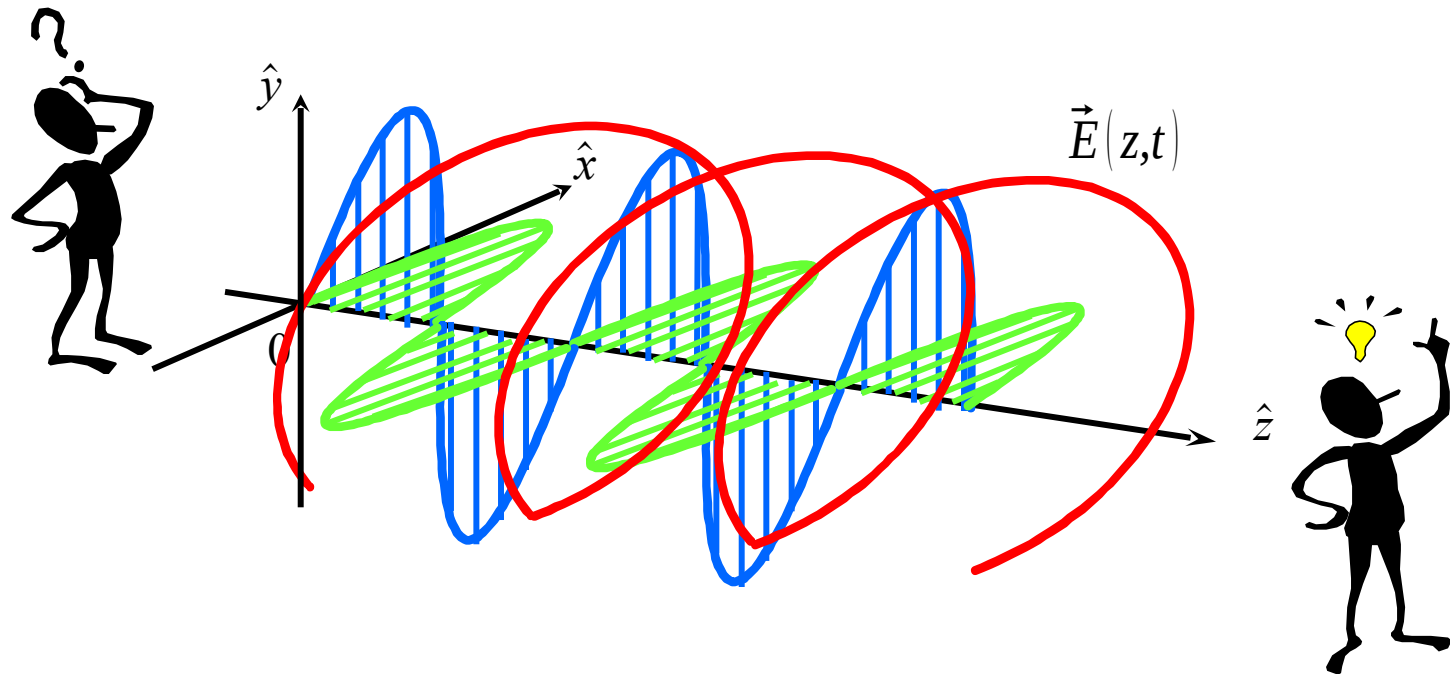
## **Polarisation: Applications in Remote Sensing**

*Shane R. CLOUDE*

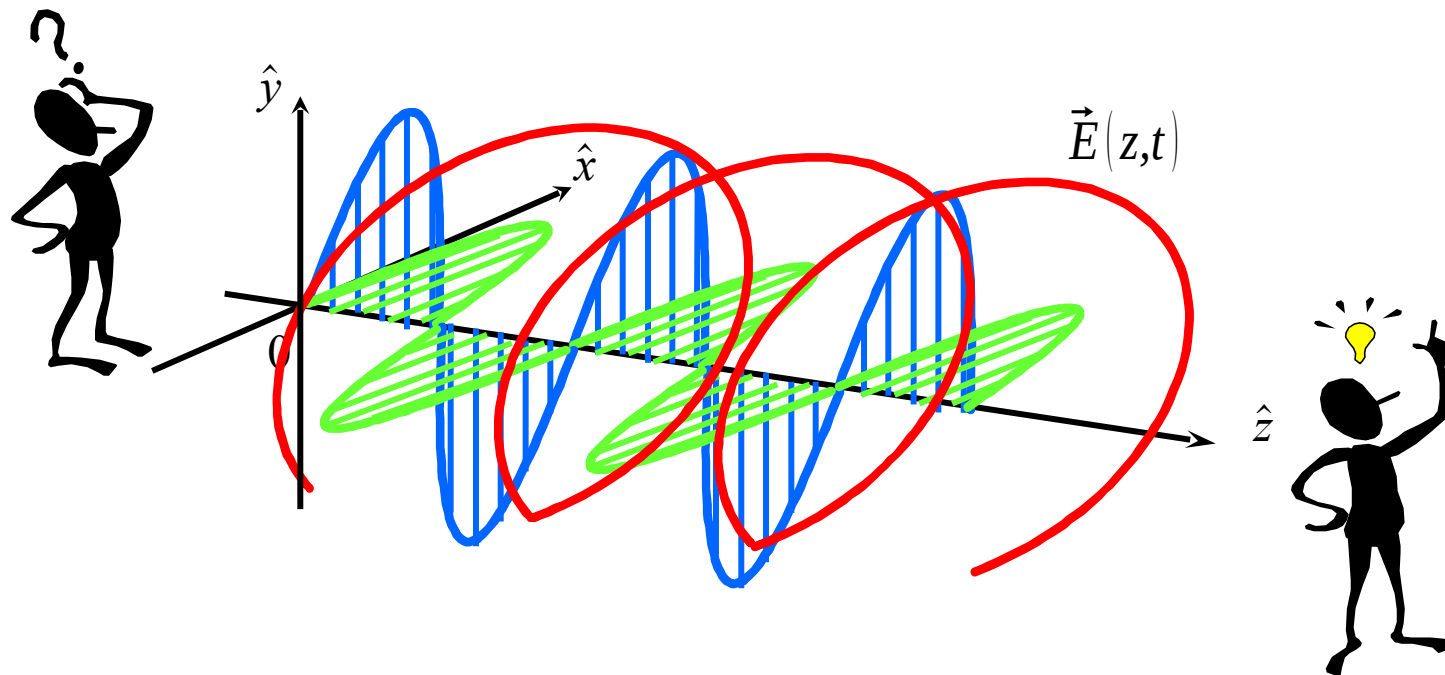
Oxford University Press, October 2009, pp 352

ISBN: 978-0199569731





# BASIC CONCEPTS



# WAVE POLARIMETRY



# PROPAGATION EQUATION

REAL ELECTRIC FIELD VECTOR  $\vec{E}(z,t)$

## MAXWELL EQUATIONS

MAXWELL – FARADAY EQUATION  $\nabla \wedge \vec{E}(z,t) = -\frac{\partial \vec{B}(z,t)}{\partial t}$

MAXWELL – AMPERE EQUATION  $\nabla \wedge \vec{H}(z,t) = \vec{J}_T(z,t)$

GAUSS THEOREM  $\nabla \cdot \vec{D}(z,t) = \rho(z,t)$

$$\nabla \cdot \vec{B}(z,t) = 0$$

$\sigma$  (Conductivity)

$\mu$  (Permeability)

$\varepsilon$  (Permittivity)

# PROPAGATION EQUATION

$$\nabla \wedge (\nabla \wedge \vec{A}) = \nabla (\nabla \cdot \vec{A}) - \nabla \cdot (\nabla \vec{A})$$



## PROPAGATION EQUATION

$$\nabla^2 \vec{E}(z,t) - \mu\epsilon \frac{\partial^2 \vec{E}(z,t)}{\partial t^2} - \mu\sigma \frac{\partial \vec{E}(z,t)}{\partial t} = -\frac{1}{\epsilon} \frac{\partial \rho(z,t)}{\partial t}$$

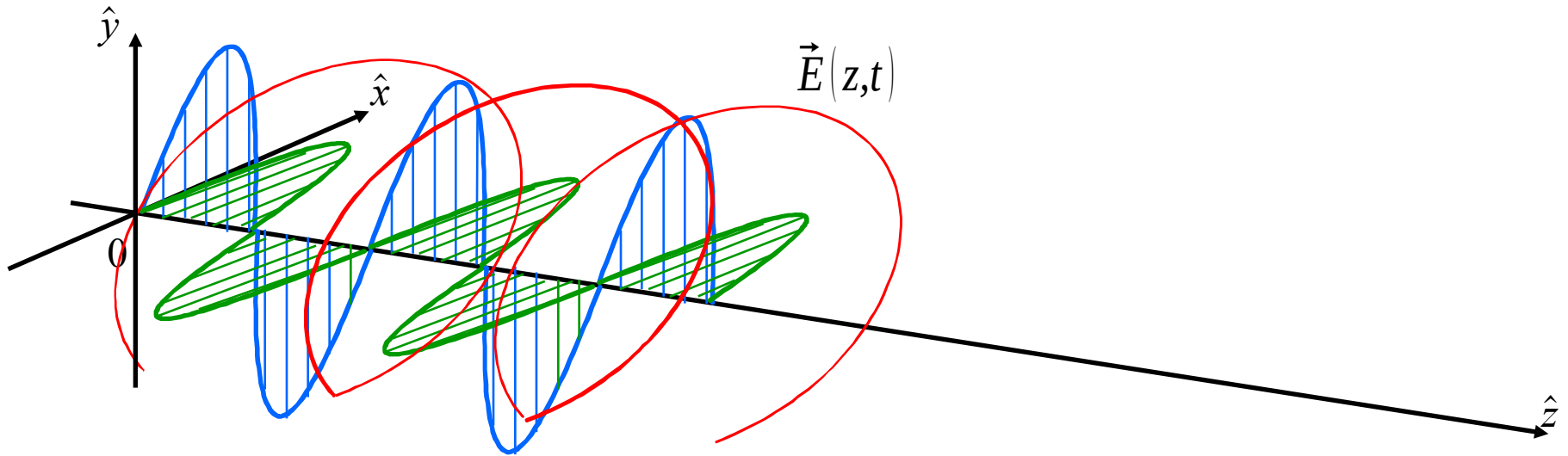


## HELMHOLTZ PROPAGATION EQUATION

$$\nabla^2 \vec{E}(z,t) - \mu\epsilon \frac{\partial^2 \vec{E}(z,t)}{\partial t^2} = 0$$

**Source Free, Linear, Homogeneous, Isotropic,  
Dielectric and lossless Medium**

# POLARISATION ELLIPSE

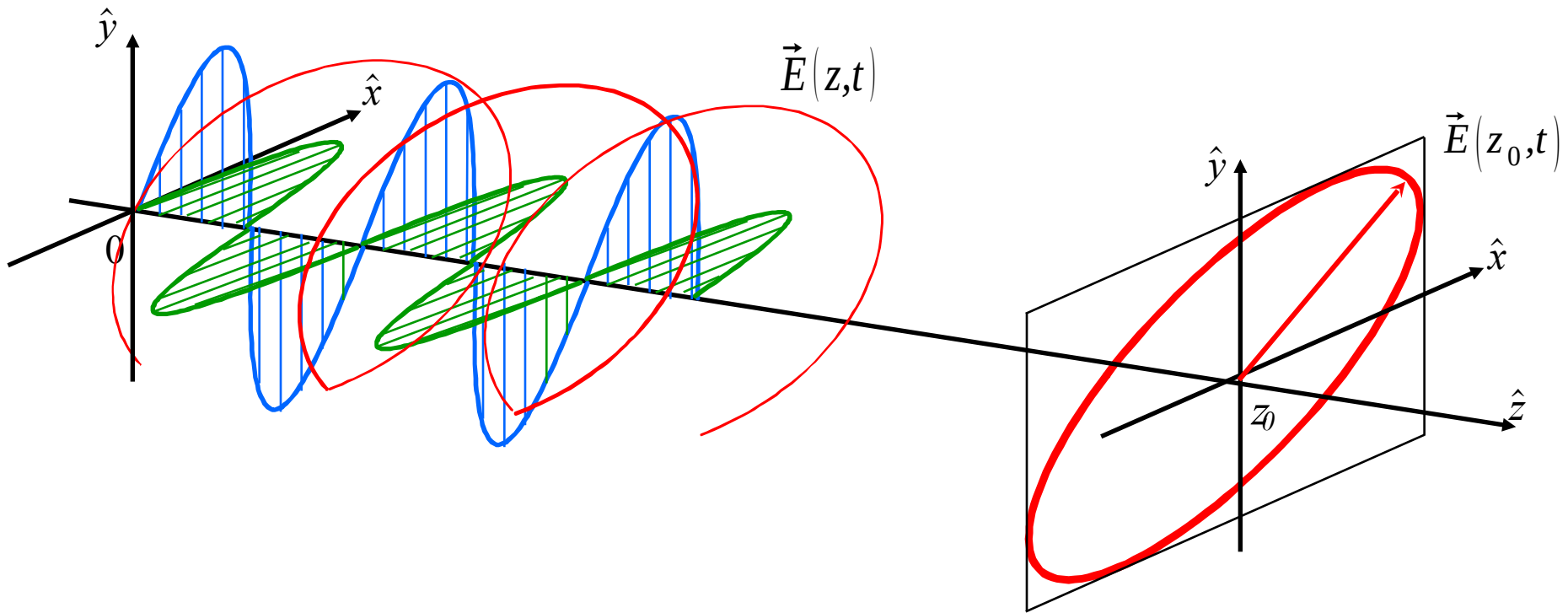


## REAL ELECTRIC FIELD VECTOR

$$\vec{E}(z,t) = \begin{cases} E_x = E_{0x} \cos(\omega t - kz - \delta_x) \\ E_y = E_{0y} \cos(\omega t - kz - \delta_y) \\ E_z = 0 \end{cases}$$



# POLARISATION ELLIPSE

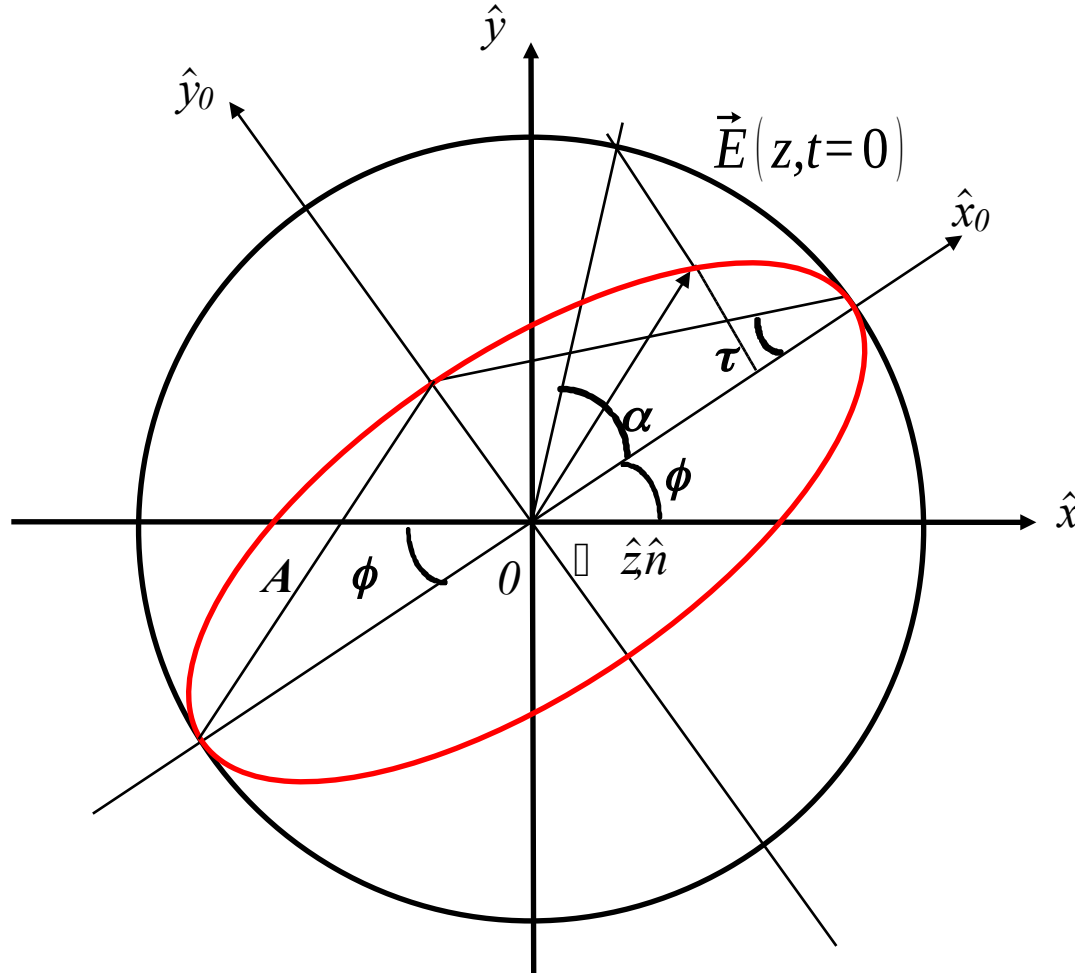


**THE REAL ELECTRIC FIELD VECTOR MOVES IN TIME ALONG AN ELLIPSE**

$$\left(\frac{E_x}{E_{0x}}\right)^2 - 2\frac{E_x E_y}{E_{0x} E_{0y}} \cos(\delta) + \left(\frac{E_y}{E_{0y}}\right)^2 = \sin^2(\delta)$$

With:  $\delta = \delta_y - \delta_x$

# POLARISATION ELLIPSE



**A : WAVE AMPLITUDE**

**$\alpha$  : ABSOLUTE PHASE**

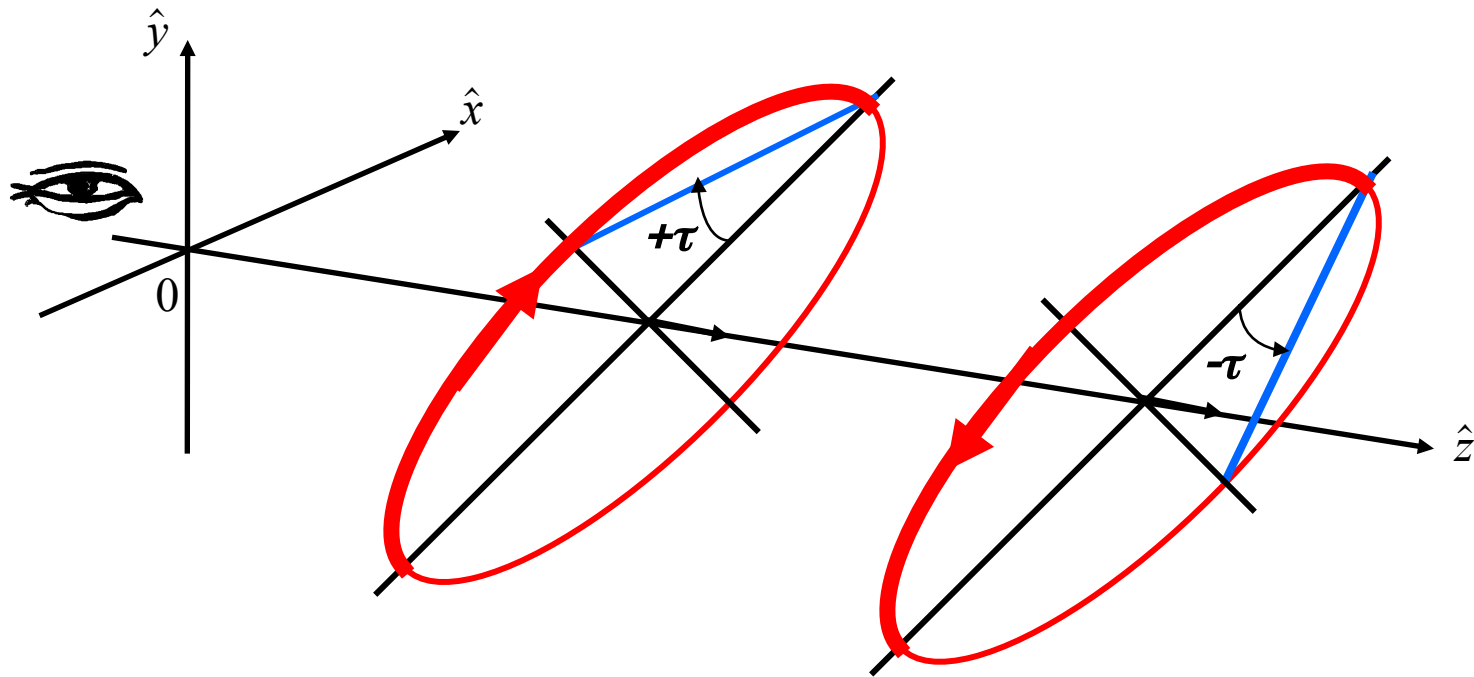
**$\phi$  : ORIENTATION ANGLE**  $-\frac{\pi}{2} \leq \phi \leq \frac{\pi}{2}$

**$\tau$  : ELLIPTICITY ANGLE**  $0 \leq \tau \leq \frac{\pi}{4}$



# POLARISATION HANDENESS

ROTATION SENSE: LOOKING INTO THE DIRECTION OF THE WAVE PROPAGATION



ANTI-CLOCKWISE ROTATION

LEFT HANDED POLARISATION



ELLIPTICITY ANGLE :  $\tau > 0$



$$-\frac{\pi}{4} \leq \tau \leq \frac{\pi}{4}$$

CLOCKWISE ROTATION

RIGHT HANDED POLARISATION



ELLIPTICITY ANGLE :  $\tau < 0$



# JONES VECTOR

## REAL ELECTRIC FIELD VECTOR

$$\vec{E}(z,t) = \begin{cases} E_x = E_{0x} \cos(\omega t - kz - \delta_x) \\ E_y = E_{0y} \cos(\omega t - kz - \delta_y) \\ E_z = 0 \end{cases}$$

## PHASOR = JONES VECTOR

$$\underline{E} = \begin{bmatrix} E_x = E_{0x} e^{j\delta_x} \\ E_y = E_{0y} e^{j\delta_y} \end{bmatrix}$$



With:  $\vec{E}(z,t) = \Re(\underline{E} e^{j(\omega t - kz)})$

## GEOMETRICAL PARAMETERS

### ABSOLUTE PHASE

$$\alpha = \delta_x$$

### AMPLITUDE

$$A = \sqrt{E_{0x}^2 + E_{0y}^2}$$

### ORIENTATION ANGLE

$$\tan 2\varphi = 2 \frac{E_{0x} E_{0y}}{E_{0x}^2 - E_{0y}^2} \cos \delta$$

### ELLIPTICITY ANGLE

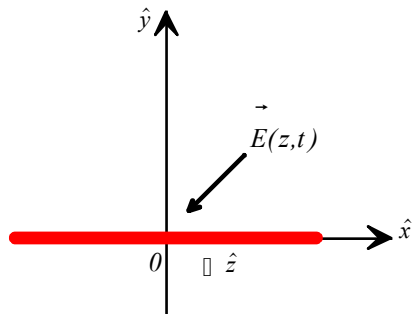
$$\sin 2\tau = 2 \frac{E_{0x} E_{0y}}{E_{0x}^2 + E_{0y}^2} \sin \delta$$

### POLARISATION HANDENESS: $Sign(\tau)$



# JONES VECTOR

## HORIZONTAL POLARISATION STATE

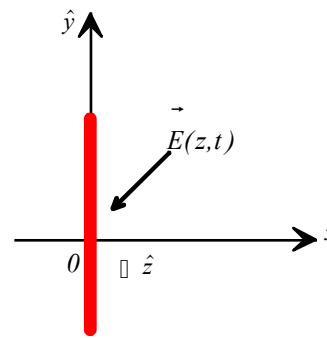


$$\underline{H} = \begin{bmatrix} 1 \\ 0 \end{bmatrix}$$

$$\varphi = 0$$

$$\tau = 0$$

## VERTICAL POLARISATION STATE

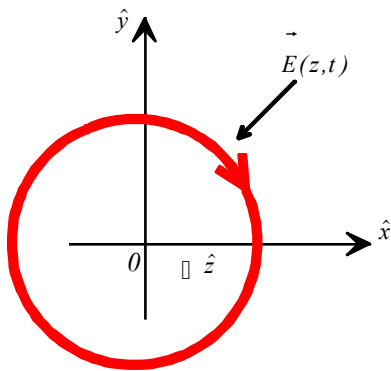


$$\underline{V} = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$

$$\varphi = \frac{\pi}{2}$$

$$\tau = 0$$

## LEFT CIRCULAR POLARISATION STATE

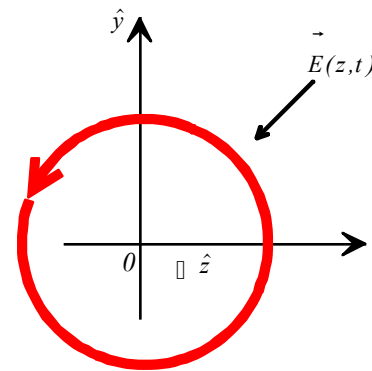


$$\underline{LC} = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 \\ j \end{bmatrix}$$

$$-\frac{\pi}{2} \leq \varphi \leq +\frac{\pi}{2}$$

$$\tau = +\frac{\pi}{4}$$

## RIGHT CIRCULAR POLARISATION STATE

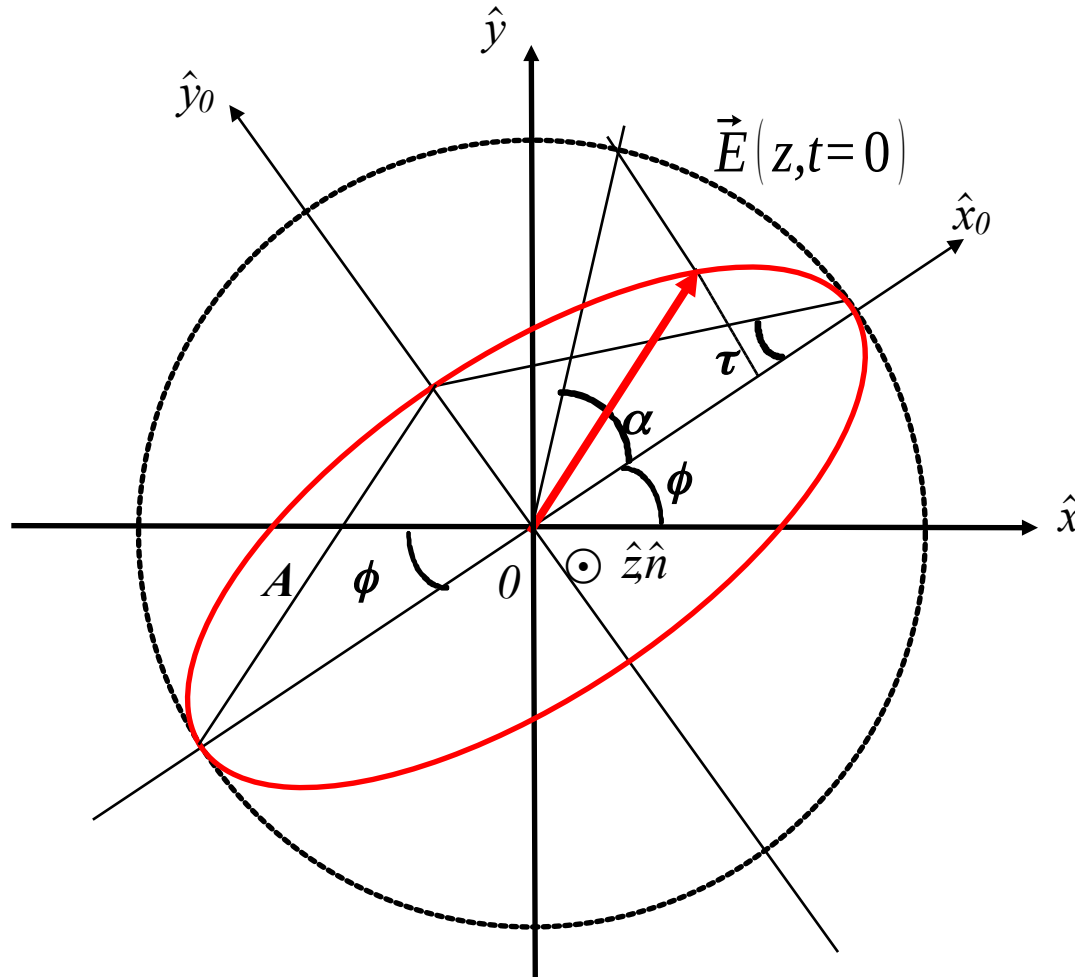


$$\underline{RC} = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 \\ -j \end{bmatrix}$$

$$-\frac{\pi}{2} \leq \varphi \leq +\frac{\pi}{2}$$

$$\tau = -\frac{\pi}{4}$$

# JONES VECTOR



$$\underline{E} = A \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} \hat{u}_x$$



# ORTHOGONAL JONES VECTOR

## JONES VECTOR

$$\underline{E} = \begin{bmatrix} E_x \\ E_y \end{bmatrix} = \begin{bmatrix} E_{ox} e^{j\delta_x} \\ E_{oy} e^{j\delta_y} \end{bmatrix}$$
$$= A \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} \hat{u}_x$$



## POLARISATION ALGEBRA

**NORM OF A JONES VECTOR**

$$\|\underline{E}\| = \sqrt{E_{0x}^2 + E_{0y}^2}$$

**SCALAR PRODUCT**

$$\langle \underline{A} \underline{B} \rangle = \underline{A}^{*T} \underline{B}$$

**ORTHOGONALITY**

$$\langle \underline{A} \underline{A}_\perp \rangle = 0$$

# ELLIPTICAL BASIS TRANSFORMATION

## JONES VECTOR

$$\underline{E} = A \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} \hat{u}_x$$

## ORTHOGONAL JONES VECTOR

$$\underline{E} = A \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} \hat{u}_y$$



$$[\underline{E}, \underline{E}] = A \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} [\hat{u}_x, \hat{u}_y]$$



## ELLIPTICAL BASIS TRANSFORMATION



# ELLIPTICAL BASIS TRANSFORMATION

## SU(2) : SPECIAL UNITARY TRANSFORMATION MATRIX

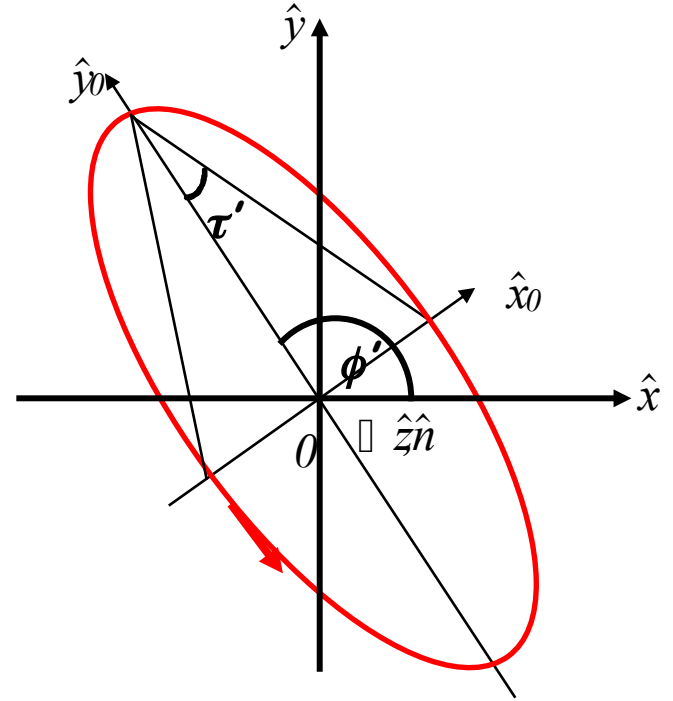
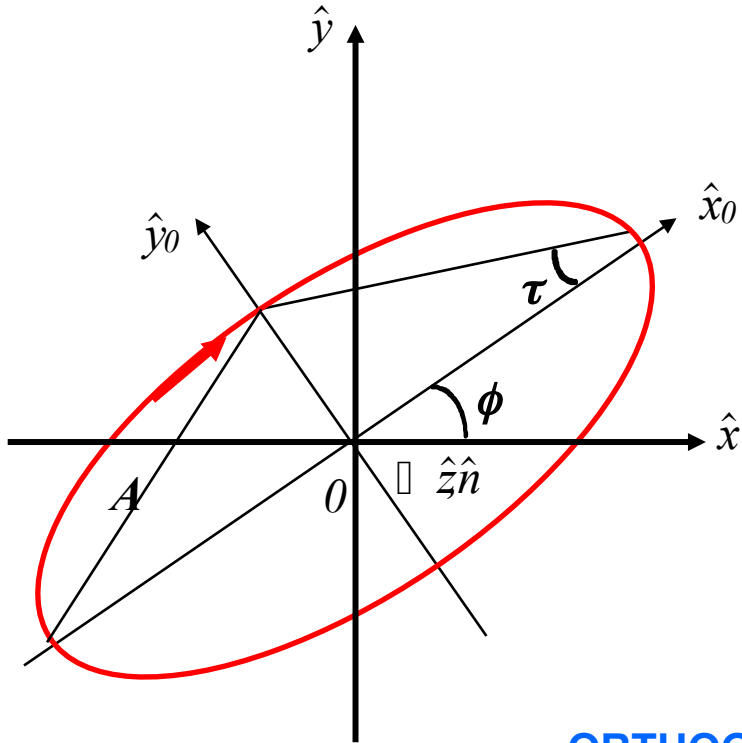
$$[U(\varphi, \tau, \alpha)] = \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix}$$



## ELLIPTICAL BASIS TRANSFORMATION MATRIX

$$[U_{(A,A) \mapsto (B,B)}] = [U(\varphi, \tau, \alpha)]^{-1} \begin{bmatrix} e^{j\alpha} & 0 \\ 0 & e^{-j\alpha} \end{bmatrix} \begin{bmatrix} \cos(\tau) & -j \sin(\tau) \\ -j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} \cos(\varphi) & \sin(\varphi) \\ -\sin(\varphi) & \cos(\varphi) \end{bmatrix}$$

# ORTHOGONAL JONES VECTOR



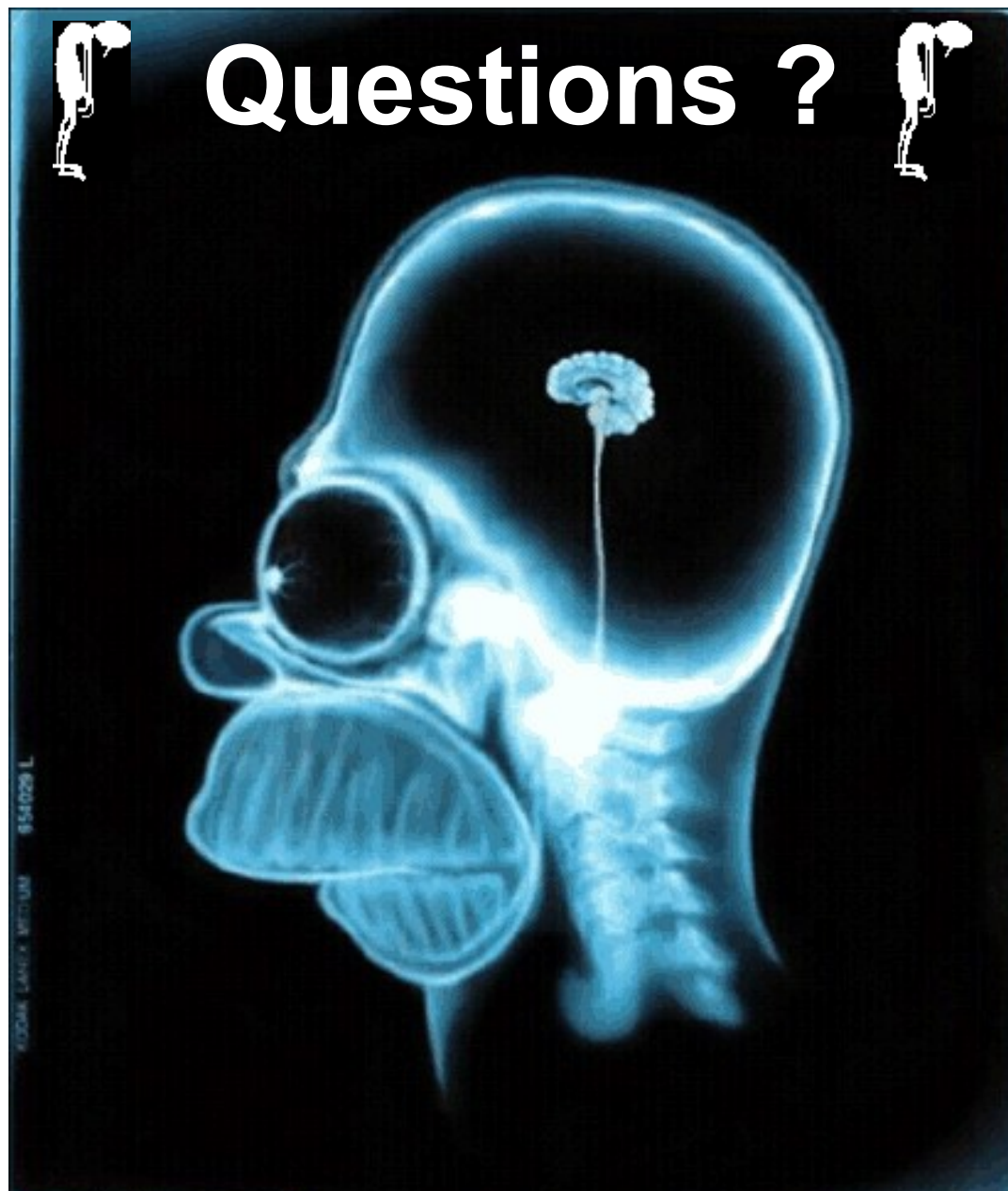
## ORTHOGONALITY CONDITIONS

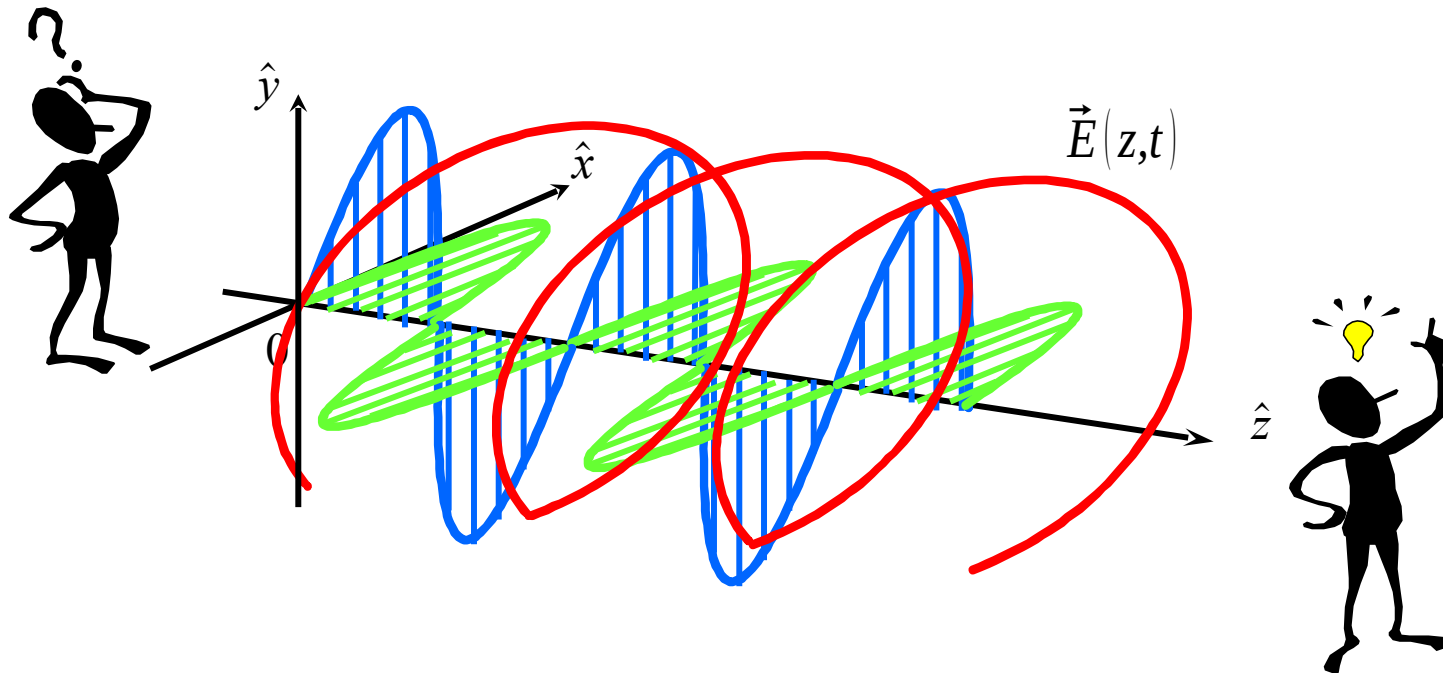
$$(\varphi, \tau) \mapsto \left\{ \begin{array}{l} \varphi' = \varphi + \frac{\pi}{2} \\ \tau' = -\tau \end{array} \right\} \rightarrow$$

CHANGE OF POLARISATION HANDENESS



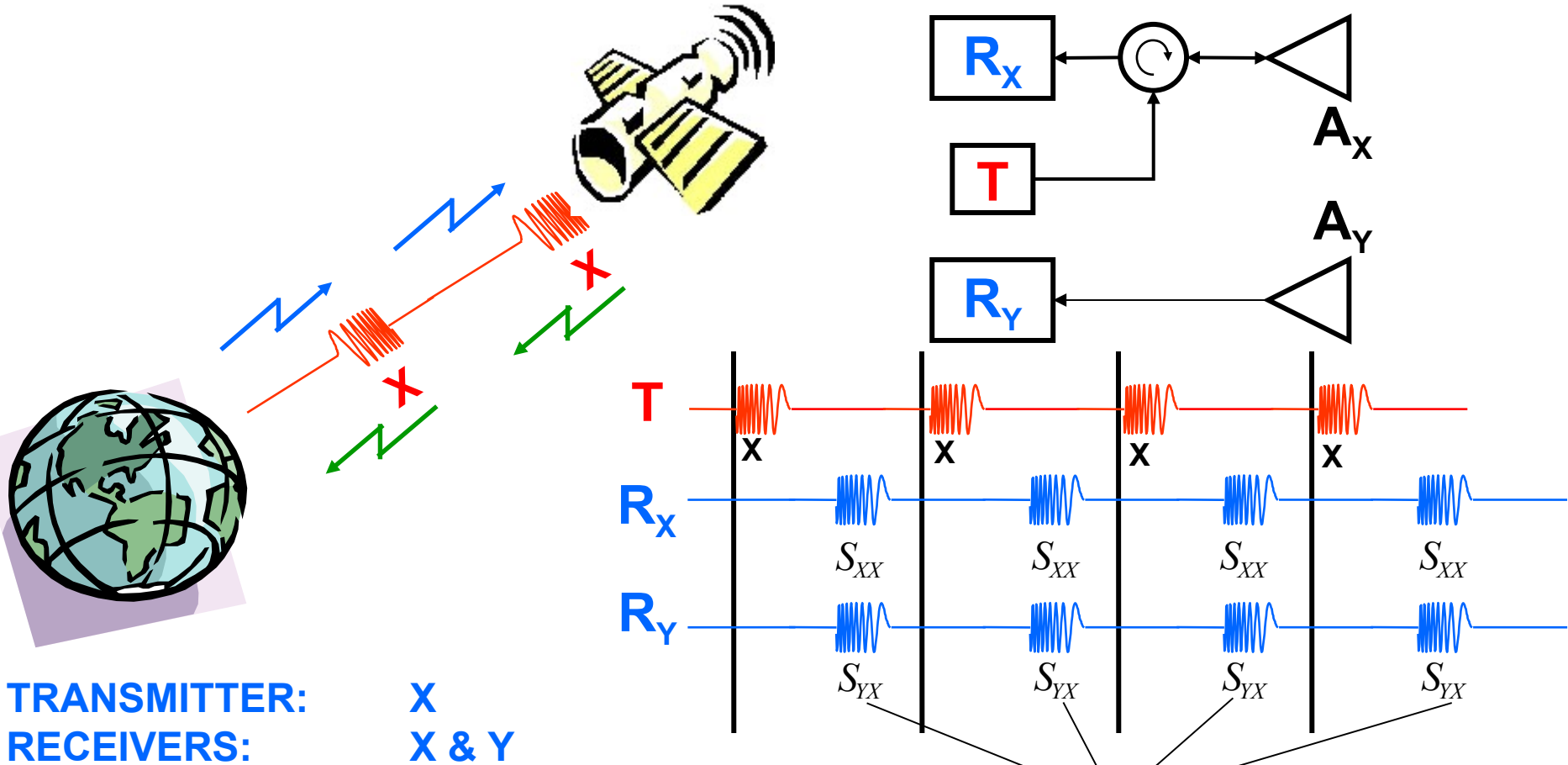
# Questions ?





# SCATTERING POLARIMETRY

# WAVE POLARIMETRY



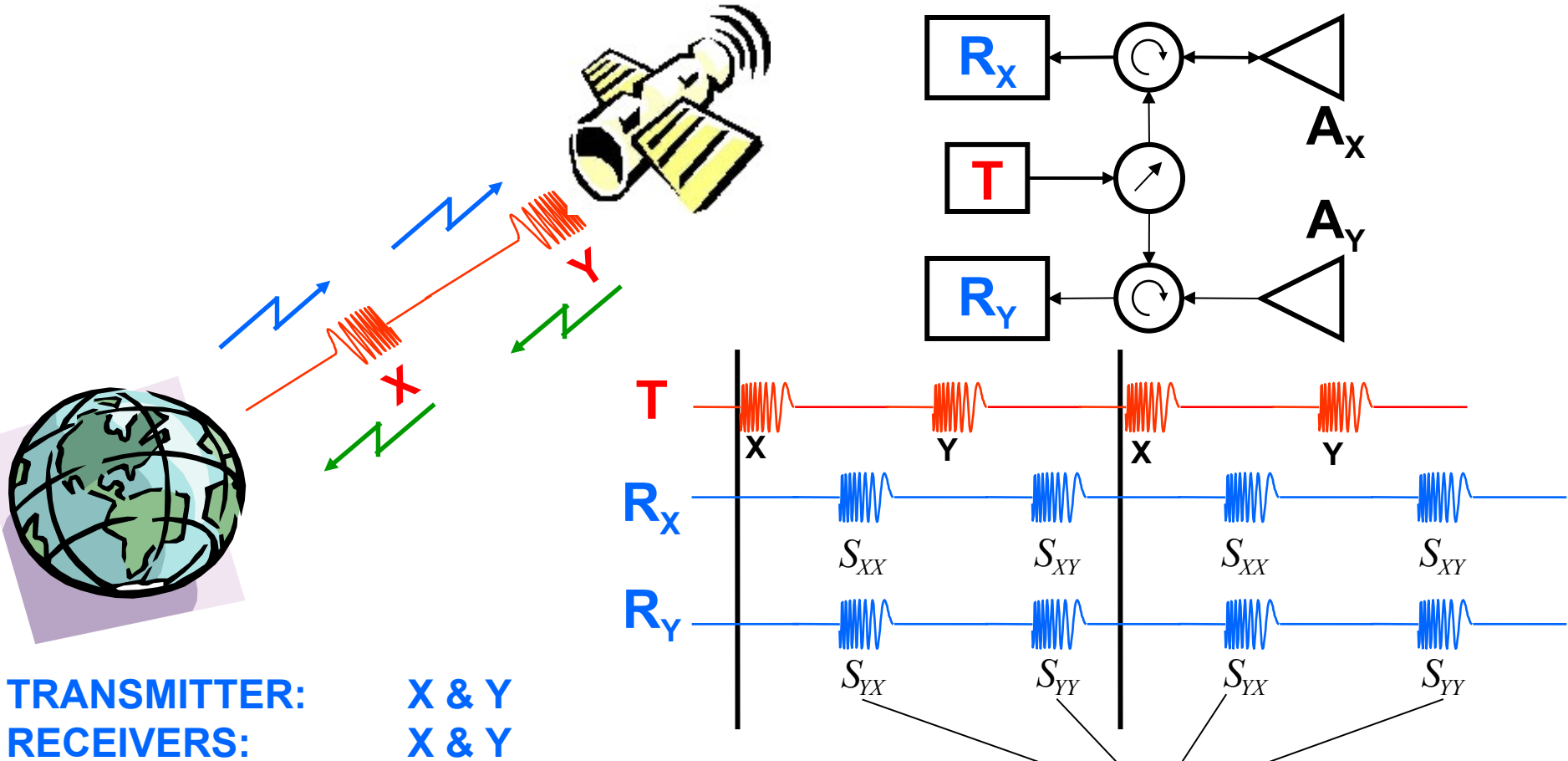
JONES VECTORS

$$\underline{E}_S = \begin{bmatrix} S_{XX} \\ S_{YY} \end{bmatrix}$$

WAVE POLARIMETRY



# SCATTERING POLARIMETRY

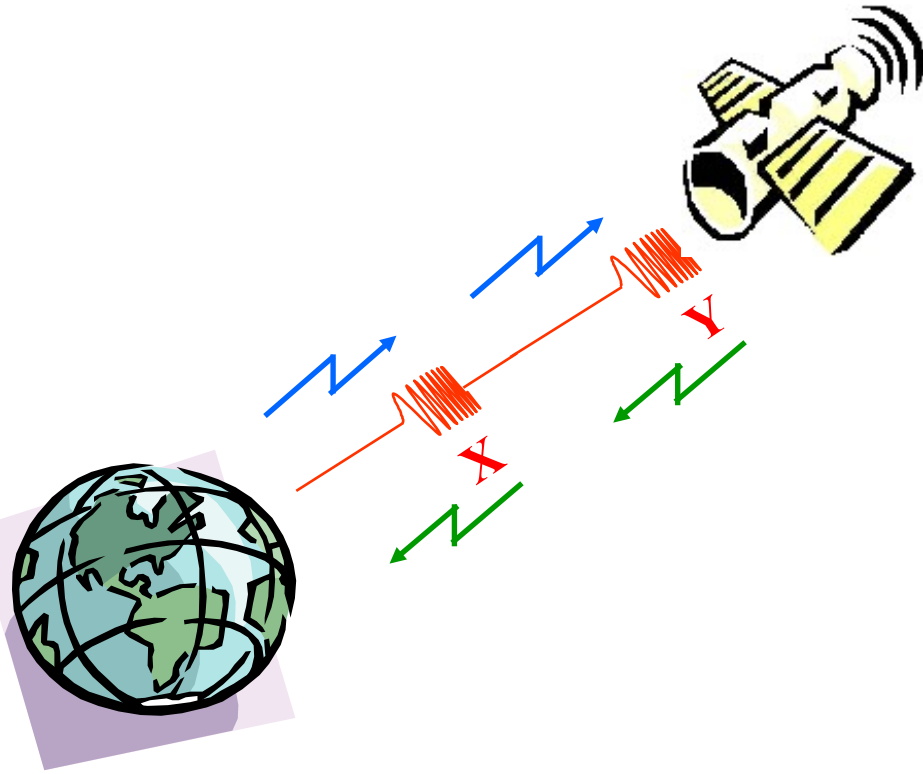


**SINCLAIR MATRICES**

$$\left\{ [S] = \begin{bmatrix} S_{XX} & S_{XY} \\ S_{YX} & S_{YY} \end{bmatrix} \right\}$$

**SCATTERING POLARIMETRY**

# POLARIMETRIC DESCRIPTORS



TRANSMITTER:  
RECEIVERS:

X & Y  
X & Y

## THE DIFFERENT TARGET POLARIMETRIC DESCRIPTORS

- [S] SINCLAIR Matrix
- $\underline{k}$ ,  $\underline{\Omega}$  Target Vectors
- [K] KENNAUGH Matrix
- [T] Coherency Matrix
- [C] Covariance Matrix

# BACKSCATTERING MATRIX

$$[S] = \frac{e^{jkr}}{r} \begin{bmatrix} S_{XX} & S_{XY} \\ S_{XY} & S_{YY} \end{bmatrix} = \frac{e^{jkr}}{r} \begin{bmatrix} |S_{XX}| e^{j\varphi_{XX}} & |S_{XY}| e^{j\varphi_{XY}} \\ |S_{XY}| e^{j\varphi_{XY}} & |S_{YY}| e^{j\varphi_{YY}} \end{bmatrix}$$

**ABSOLUTE BACKSCATTERING MATRIX**

$$[S] = \frac{e^{jkr} e^{j\varphi_{XX}}}{r} \begin{bmatrix} |S_{XX}| & |S_{XY}| e^{j(\varphi_{XY} - \varphi_{XX})} \\ |S_{XY}| e^{j(\varphi_{XY} - \varphi_{XX})} & |S_{YY}| e^{j(\varphi_{YY} - \varphi_{XX})} \end{bmatrix}$$

**Absolute Phase  
Factor**

**RELATIVE BACKSCATTERING MATRIX**  
Five Parameters: 3 Amplitudes and 2 Phases

**SCATTERER POLARIMETRIC DIMENSION = 5**



# SCATTERING POLARIMETRY

Tx → Rx →

Tx → Rx ↑

Tx ↑ Rx ↑



$|HH|_{dB}$

$|HV|_{dB}$

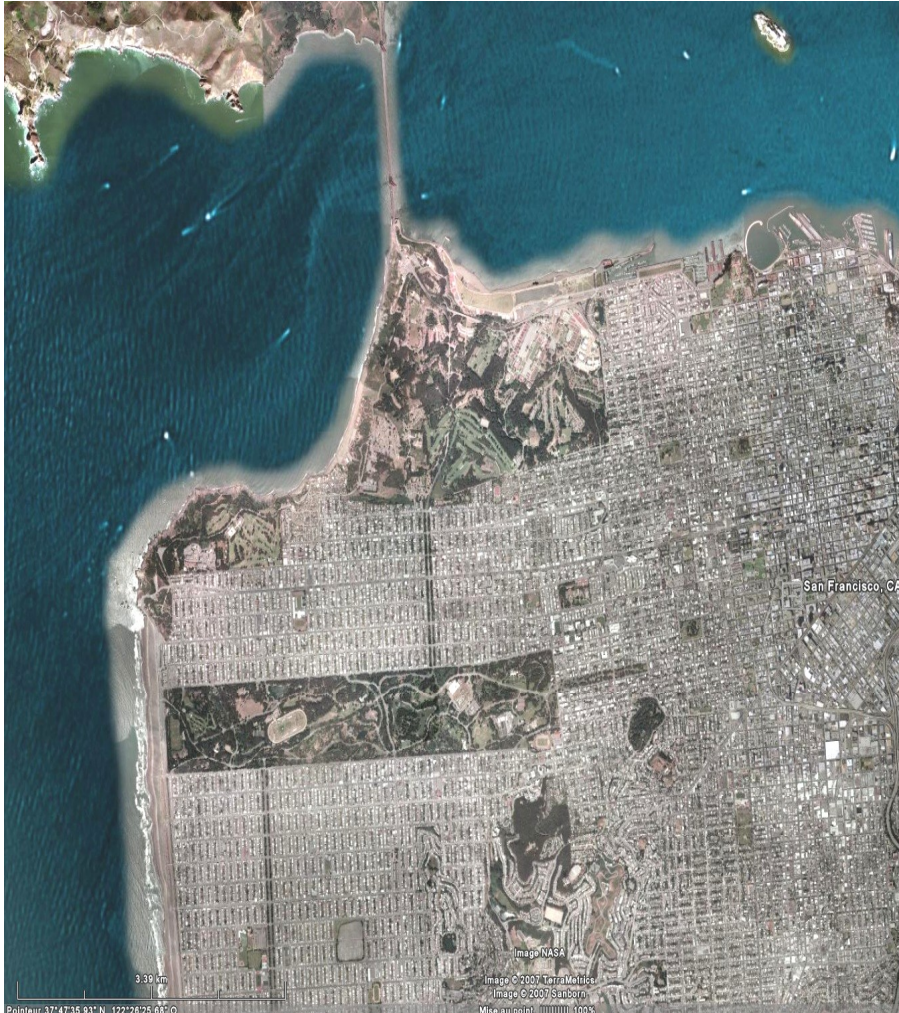
$|VV|_{dB}$

-30dB -15dB 0dB



# SCATTERING POLARIMETRY

## Sinclair Color Coding



© Google Earth



|HH|

|HV|

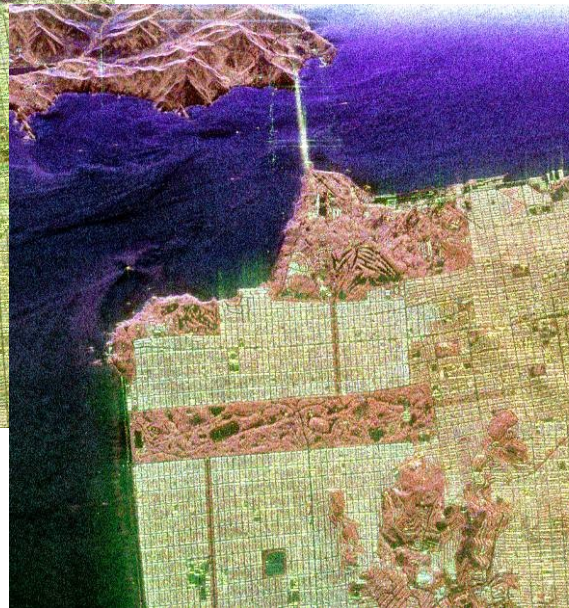
|VV|



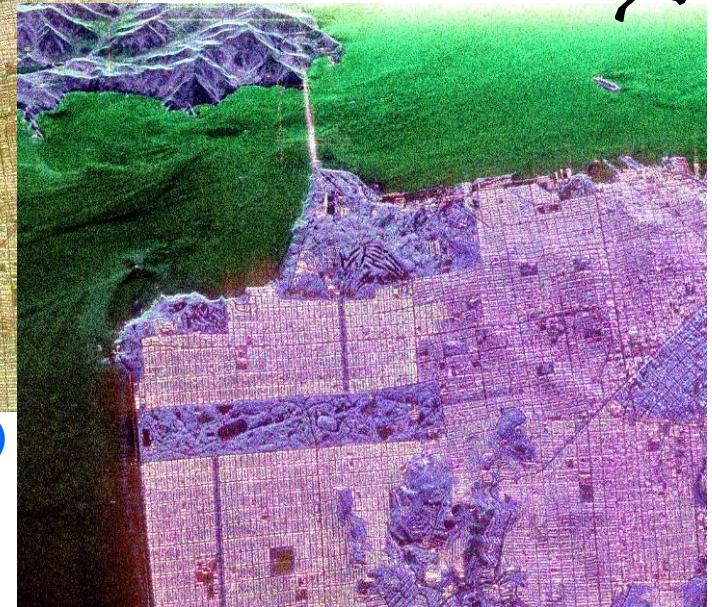
# ELLIPTICAL BASIS TRANSFORMATION



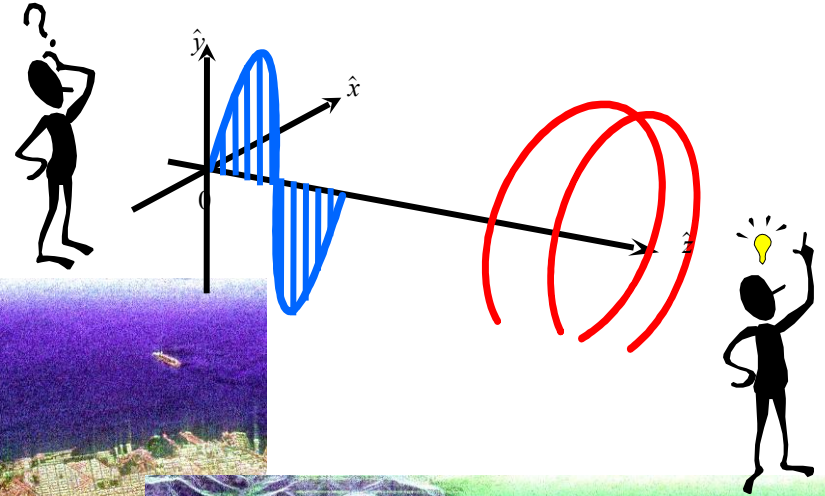
Pauli Color Coding (H,V)



Pauli Color Coding (+45,-45)



Pauli Color Coding (L,R)



Ernst LÜNEBURG  
(PIERS95 - Pasadena)



# ELLIPTICAL BASIS TRANSFORMATION

$$\left[ S_{(B,B)} \right] = \left[ U_{(A,A) \mapsto (B,B)} \right]^T \left[ S_{(A,A)} \right] \left[ U_{(A,A) \mapsto (B,B)} \right]$$

**CON-SIMILARITY TRANSFORMATION**

$$\left[ U_{(A,A) \mapsto (B,B)} \right]$$

**SU(2) SPECIAL UNITARY ELLIPTICAL  
BASIS TRANSFORMATION MATRIX**



$$\left[ U_{(A,A) \mapsto (B,B)} \right]$$

$$\left[ U(\varphi, \tau, \alpha) \right]^{-1}$$

$$\begin{bmatrix} e^{j\alpha} & 0 \\ 0 & e^{-j\alpha} \end{bmatrix} \begin{bmatrix} \cos(\tau) & -j \sin(\tau) \\ -j \sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} \cos(\varphi) & \sin(\varphi) \\ -\sin(\varphi) & \cos(\varphi) \end{bmatrix}$$

$$\left[ U_2(-\alpha) \right]$$

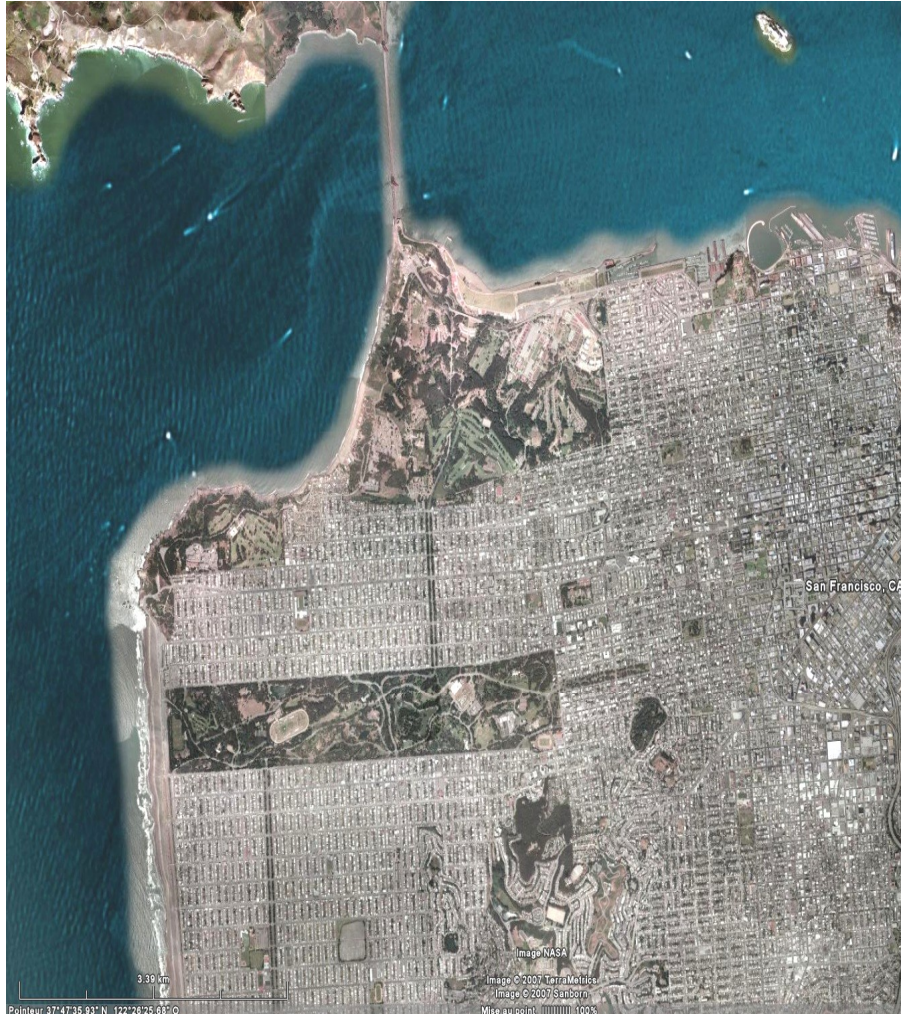
$$\left[ U_2(-\tau) \right]$$

$$\left[ U_2(-\varphi) \right]$$



# ELLIPTICAL BASIS TRANSFORMATION

(H,V) POLARISATION BASIS



© Google Earth



|HH+VV|

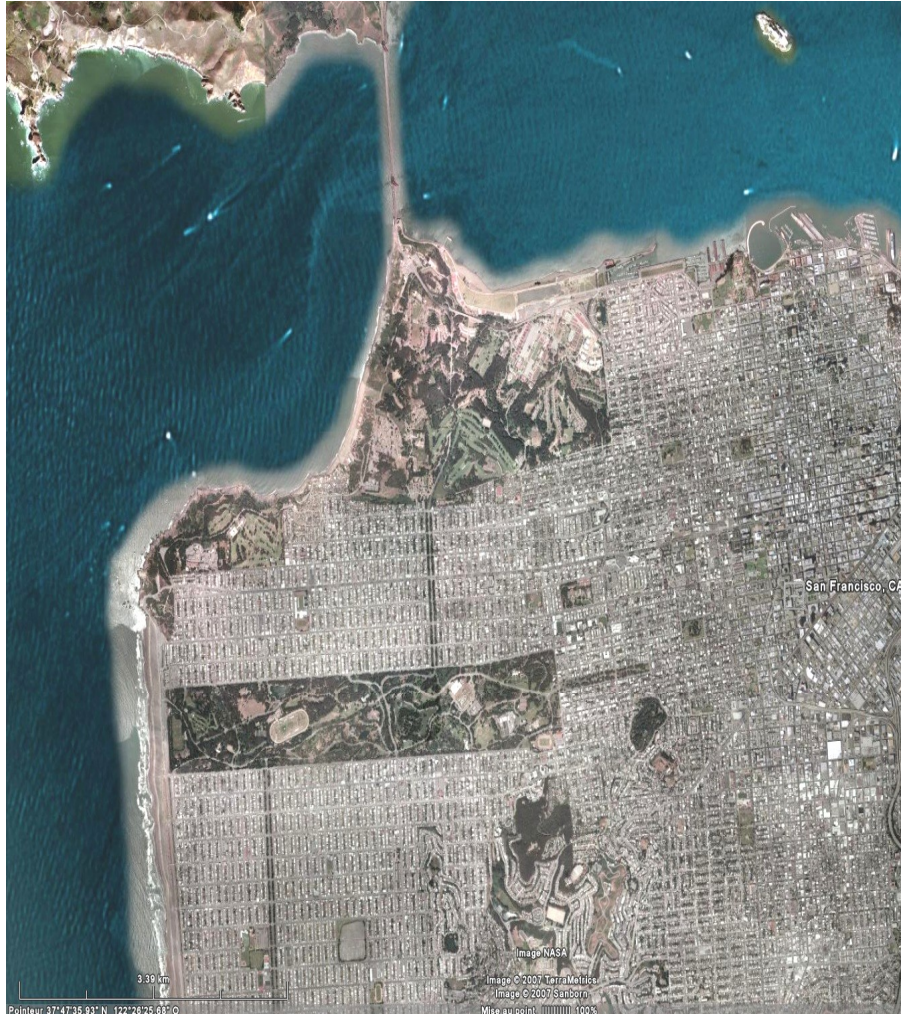
|HV|

|HH-VV|



# ELLIPTICAL BASIS TRANSFORMATION

(+45°, -45°) POLARISATION BASIS



© Google Earth



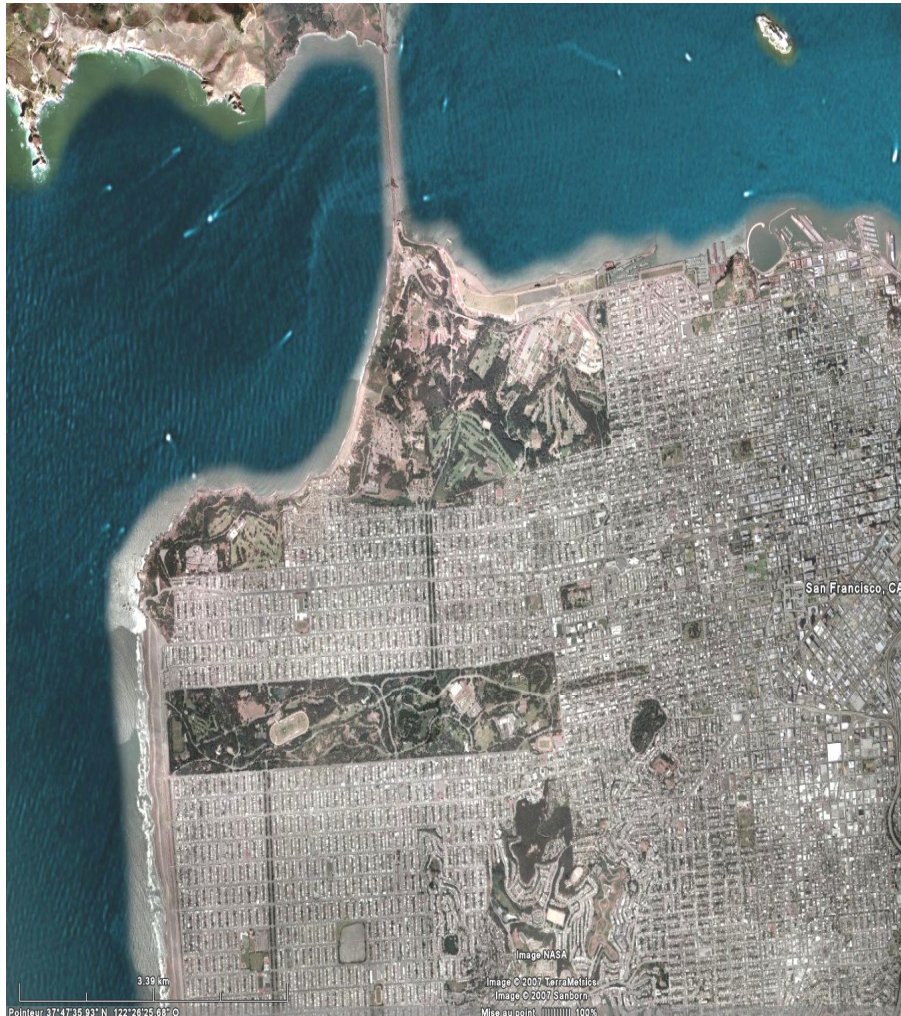
$|AA+BB|$        $|AB|$        $|AA-BB|$

With: A=Linear +45°, B=Linear -45°

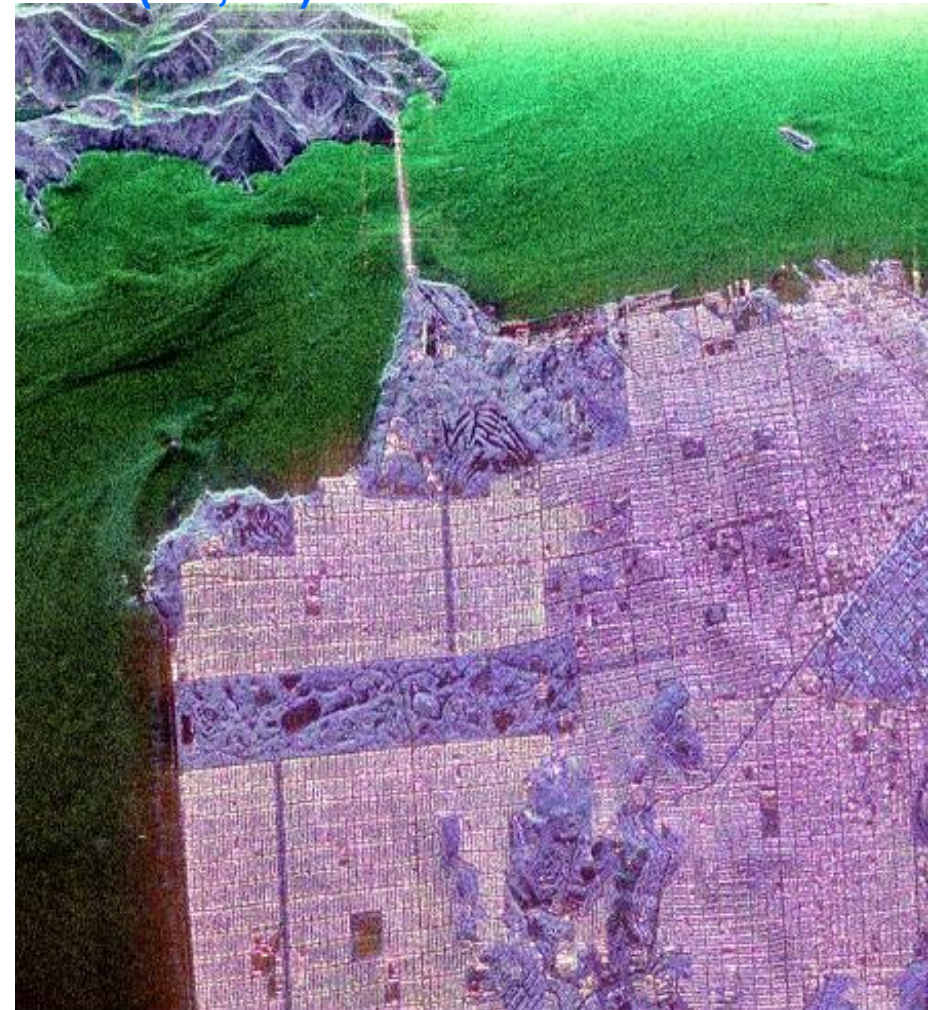


# ELLIPTICAL BASIS TRANSFORMATION

(LC,RC) POLARISATION BASIS



© Google Earth



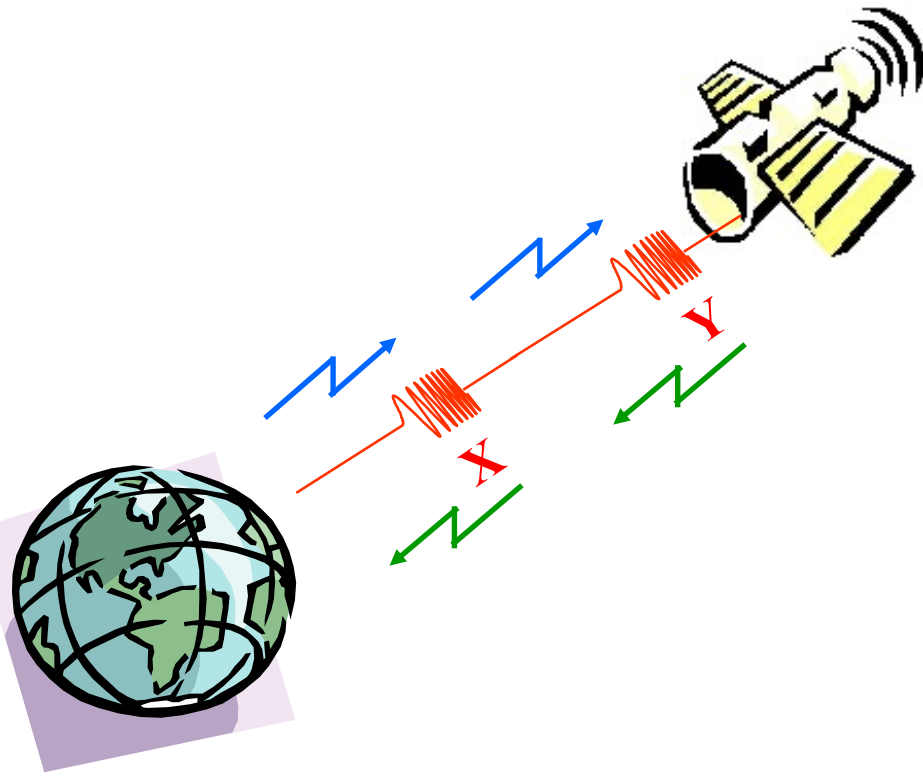
|LL+RR|

|LR|

|LL-RR|



# POLARIMETRIC DESCRIPTORS



TRANSMITTER:  
RECEIVERS:

X & Y  
X & Y

## THE DIFFERENT TARGET POLARIMETRIC DESCRIPTORS

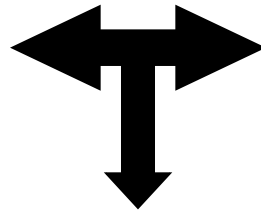
- [S] SINCLAIR Matrix
- k,  $\Omega$**  Target Vectors
- [K] KENNAUGH Matrix
- [T] Coherency Matrix
- [C] Covariance Matrix

# TARGET VECTORS

## SCATTERING VECTOR TRANSFORMATIONS

Pauli Scattering Vector:

$$\underline{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{XX} + S_{YY} \\ S_{XX} - S_{YY} \\ 2S_{XY} \end{bmatrix}$$



Lexicographic Scattering Vector:

$$\underline{\Omega} = \begin{bmatrix} S_{XX} \\ \sqrt{2} S_{XY} \\ S_{YY} \end{bmatrix}$$

### UNITARY TRANSFORMATION

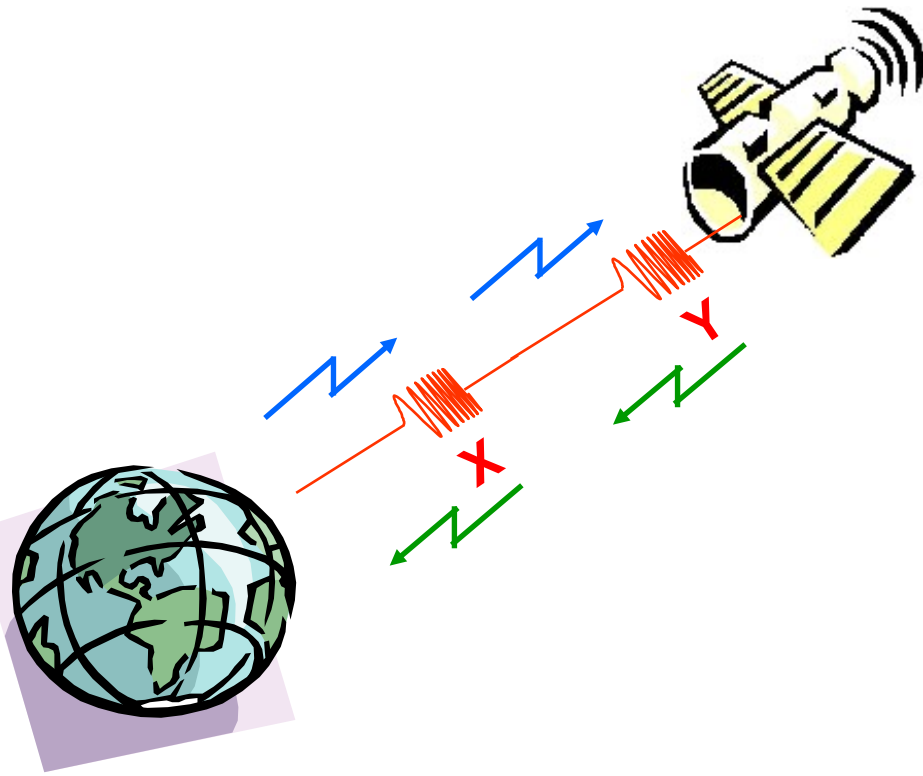
$$\underline{k} = [D_3] \underline{\Omega} \quad \text{and} \quad \underline{\Omega} = [D_3]^{-1} \underline{k} = [D_3]^T \underline{k}$$

WHERE  $[D_3]$  IS A SU(3) MATRIX  
IN ORDER TO PRESERVE THE NORM  
OF THE SCATTERING VECTOR

$$[D_3] = \frac{1}{\sqrt{2}} \begin{bmatrix} 1 & 0 & 1 \\ 1 & 0 & -1 \\ 0 & \sqrt{2} & 0 \end{bmatrix}$$



# POLARIMETRIC DESCRIPTORS



TRANSMITTER: X & Y  
RECEIVERS: X & Y

## THE DIFFERENT TARGET POLARIMETRIC DESCRIPTORS

- [S] SINCLAIR Matrix
- $\underline{k}, \underline{\Omega}$  Target Vectors
- [K] KENNAUGH Matrix
- [T] **Coherency Matrix**
- [C] Covariance Matrix

STATISTICAL DESCRIPTION  
PARTIAL SCATTERING POLARIMETRY

# COHERENCY MATRIX

## MONOSTATIC CASE

### PAULI SCATTERING VECTOR $\underline{k}$

$$\underline{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{XX} + S_{YY} & S_{XX} - S_{YY} & 2S_{XY} \end{bmatrix}^T$$



### COHERENCY MATRIX $[T]$

$$[T] = \underline{k} \cdot \underline{k}^T = \begin{bmatrix} 2A_0 & C - jD & H + jG \\ C + jD & B_0 + B & E + jF \\ H - jG & E - jF & B_0 - B \end{bmatrix}$$

HERMITIAN MATRIX - RANK 1

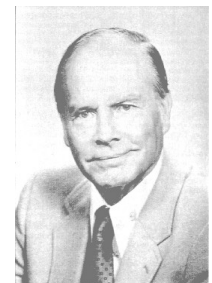
$A_0, B_0 + B, B_0 - B$  : HUYNEN TARGET GENERATORS

# HUYNEN PARAMETERS

## PHYSICAL INTERPRETATION MAN-MADE TARGET DECOMPOSITION IDENTIFICATION and ANALYSIS

« *PHENOMENOLOGICAL THEORY OF RADAR TARGETS* » (1970)

- A0 : GENERATOR OF TARGET SYMMETRY
- B0+B : GENERATOR OF TARGET NON-SYMMETRY
- B0-B : GENERATOR OF TARGET IRREGULARITY
- C : GENERATOR OF TARGET GLOBAL SHAPE (LINEAR)
- D : GENERATOR OF TARGET LOCAL SHAPE (CURVATURE)
- E : GENERATOR OF TARGET LOCAL TWIST (TORSION)
- F : GENERATOR OF TARGET GLOBAL TWIST (HELICITY)
- G : GENERATOR OF TARGET LOCAL COUPLING (GLUE)
- H : GENERATOR OF TARGET GLOBAL COUPLING (ORIENTATION)

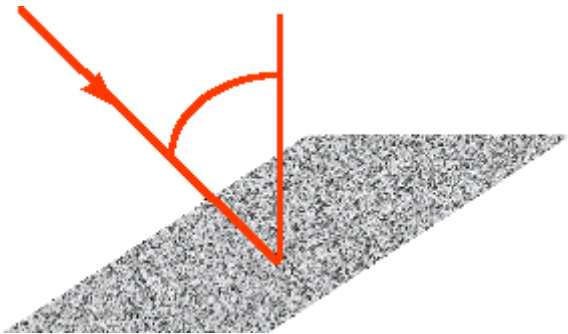




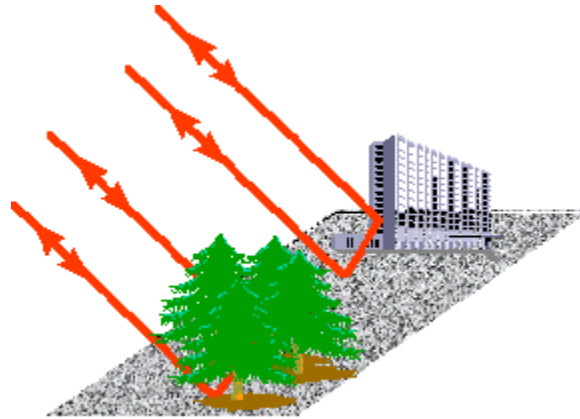
# TARGET GENERATORS

## PHYSICAL INTERPRETATION

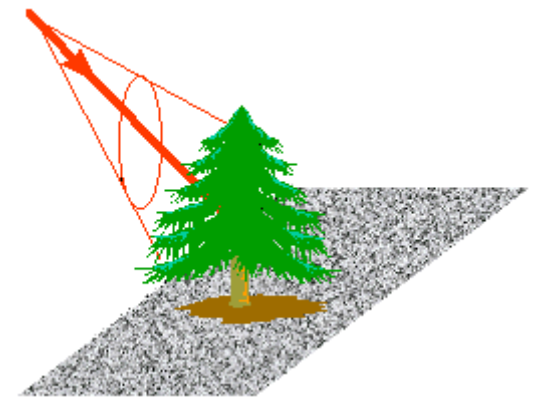
### SINGLE BOUNCE SCATTERING (ROUGH SURFACE)



### DOUBLE BOUNCE SCATTERING



### VOLUME SCATTERING



$$T_{11} = 2A_0 = |S_{XX} + S_{YY}|^2$$

$$T_{33} = B_0 - B = 2|S_{XY}|^2$$

$$T_{22} = B_0 + B = |S_{XX} - S_{YY}|^2$$

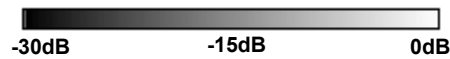
# TARGET GENERATORS



$|HH+VV|_{dB}$



$|HV|_{dB}$

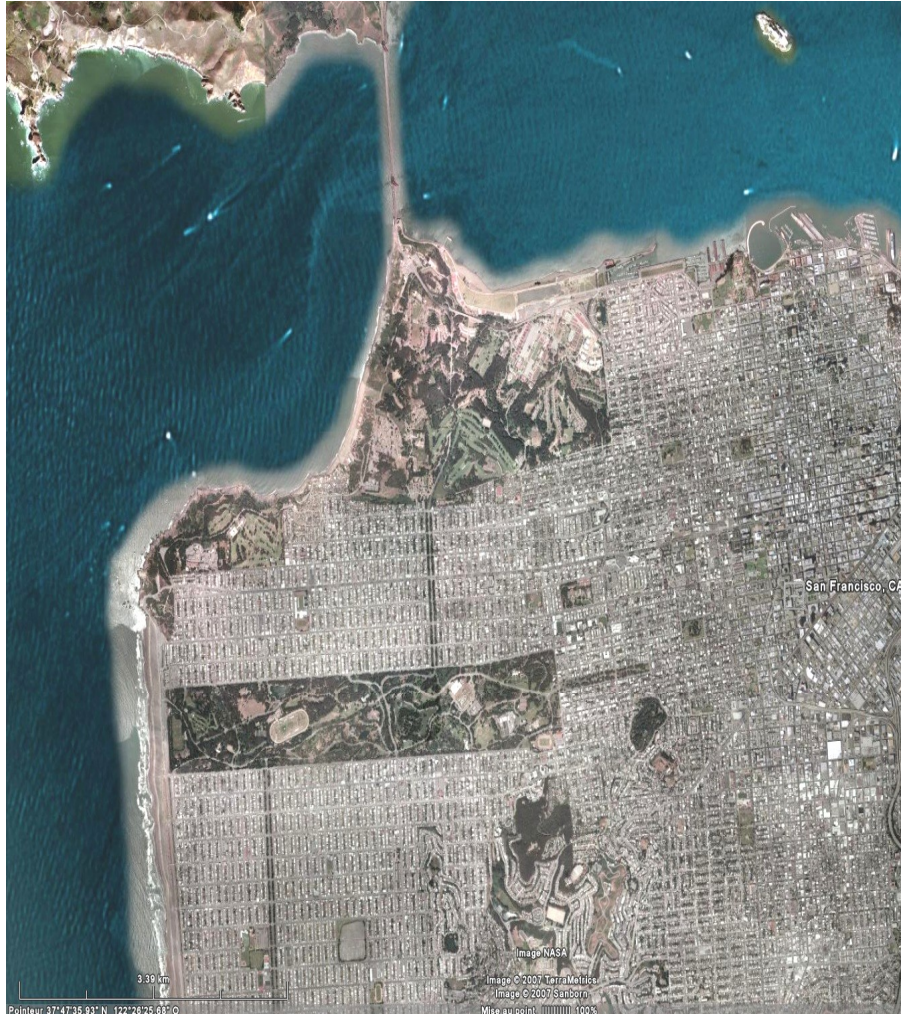


$|HH-VV|_{dB}$



# TARGET GENERATORS

(H,V) POLARISATION BASIS



© Google Earth



$|HH+VV|$

$|HV|$

$|HH-VV|$



# ELLIPTICAL BASIS TRANSFORMATION

## SPECIAL UNITARY SU(2) GROUP

$$[U_2] = \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} \begin{bmatrix} \cos(\tau) & j\sin(\tau) \\ j\sin(\tau) & \cos(\tau) \end{bmatrix} \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix}$$

$[U_2(\varphi)] \qquad [U_2(\tau)] \qquad [U_2(\alpha)]$



## SPECIAL UNITARY SU(3) GROUP

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos(2\varphi) & \sin(2\varphi) \\ 0 & -\sin(2\varphi) & \cos(2\varphi) \end{bmatrix} \begin{bmatrix} \cos(2\tau) & 0 & j\sin(2\tau) \\ 0 & 1 & 0 \\ j\sin(2\tau) & 0 & \cos(2\tau) \end{bmatrix} \begin{bmatrix} \cos(2\alpha) & -j\sin(2\alpha) & 0 \\ -j\sin(2\alpha) & \cos(2\alpha) & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

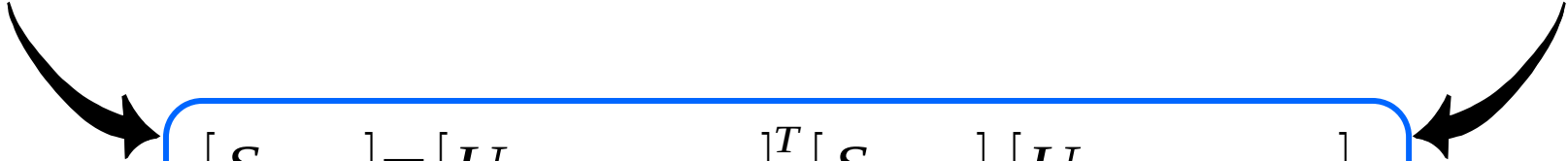
$[U_3(2\varphi)] \qquad [U_3(2\tau)] \qquad [U_3(2\alpha)]$

# ELLIPTICAL BASIS TRANSFORMATION

## SINCLAIR MATRIX

$$E_{(A,A)}^s = [S_{(A,A)}] E_{(A,A)}^i$$

$$E_{(B,B)}^s = [S_{(B,B)}] E_{(B,B)}^i$$


$$[S_{(B,B)}] = [U_{(A,A) \mapsto (B,B)}]^T [S_{(A,A)}] [U_{(A,A) \mapsto (B,B)}]$$

## CON-SIMILARITY TRANSFORMATION

## COHERENCY MATRIX

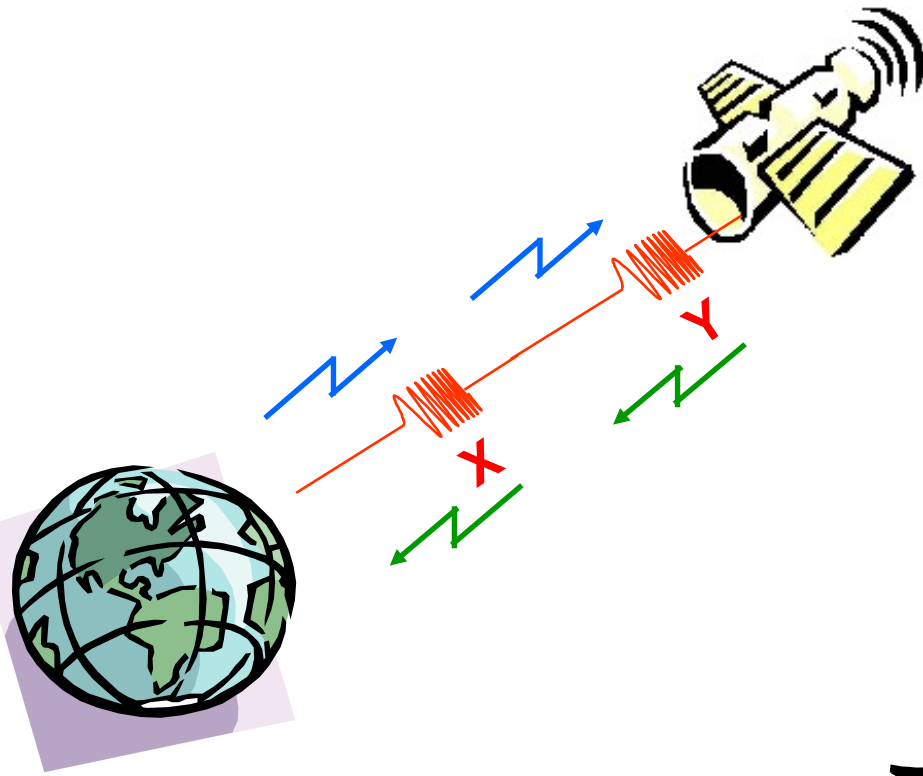
$$[T_{(B,B)}] = [U_{3(A,A) \mapsto (B,B)}] [T_{(A,A)}] [U_{3(A,A) \mapsto (B,B)}]^{-1}$$

## SIMILARITY TRANSFORMATION

$$[U_{3(A,A) \mapsto (B,B)}]$$

**U(3) SPECIAL UNITARY ELLIPTICAL  
BASIS TRANSFORMATION MATRIX**

# POLARIMETRIC DESCRIPTORS



TRANSMITTER: X & Y  
RECEIVERS: X & Y

## THE DIFFERENT TARGET POLARIMETRIC DESCRIPTORS

- [S] SINCLAIR Matrix
- $\underline{k}, \underline{\Omega}$  Target Vectors
- [K] KENNAUGH Matrix
- [T] Coherency Matrix
- [C] Covariance Matrix

STATISTICAL DESCRIPTION  
PARTIAL SCATTERING POLARIMETRY



# COVARIANCE MATRIX

## MONOSTATIC CASE

### LEXICOGRAPHIC SCATTERING VECTOR $\underline{\Omega}$

$$\underline{\Omega} = \left[ S_{XX} \quad \sqrt{2} S_{XY} \quad S_{YY} \right]^T$$



### COVARIANCE MATRIX [C]

$$[C] = \underline{\Omega} \cdot \underline{\Omega}^T = \begin{bmatrix} S_{XX} S_{XX} & \sqrt{2} S_{XX} S_{XY} & S_{XX} S_{YY} \\ \sqrt{2} S_{XY} S_{XX} & 2 S_{XY} S_{XY} & \sqrt{2} S_{XY} S_{YY} \\ S_{YY} S_{XX} & \sqrt{2} S_{YY} S_{XY} & S_{YY} S_{YY} \end{bmatrix}$$

HERMITIAN POSITIVE SEMI DEFINITE MATRIX - RANK 1

# COVARIANCE-COHERENCY MATRICES

## COHERENCY MATRIX

$$[T] = k \cdot k^T$$

$$k = [D_{3or4}] \underline{\Omega}$$

## COVARIANCE MATRIX

$$[C] = \underline{\Omega} \cdot \underline{\Omega}^T$$

### UNITARY TRANSFORMATION

$$[T] = [D_{3or4}] [C] [D_{3or4}]^{T*} \quad ;$$

**[T] and [C] HAVE THE SAME EIGENVALUES**

Both contain the same information about Polarimetric Scattering Amplitudes, Phase Angles and Correlations

**[T]** is closer related to Physical and Geometrical Properties of the Scattering Process, and thus allows a better and direct physical interpretation

**[C]** is directly related to the system measurables

**[T]** is directly related to the Kennaugh matrix and the Huynen parameters

# POLARIMETRIC DESCRIPTORS

## SINCLAIR MATRIX

$$[S] = \begin{bmatrix} S_{XX} & S_{XY} \\ S_{YX} & S_{YY} \end{bmatrix}$$



EQUIVALENCE ?

## SCATTERING VECTOR $\underline{k}$

$$\underline{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{XX} + S_{YY} & S_{XX} - S_{YY} & 2S_{XY} \end{bmatrix}^T$$

## COHERENCY MATRIX [T]

$$[T] = \underline{k} \cdot \underline{k}^T$$

## SCATTERING VECTOR $\underline{\Omega}$

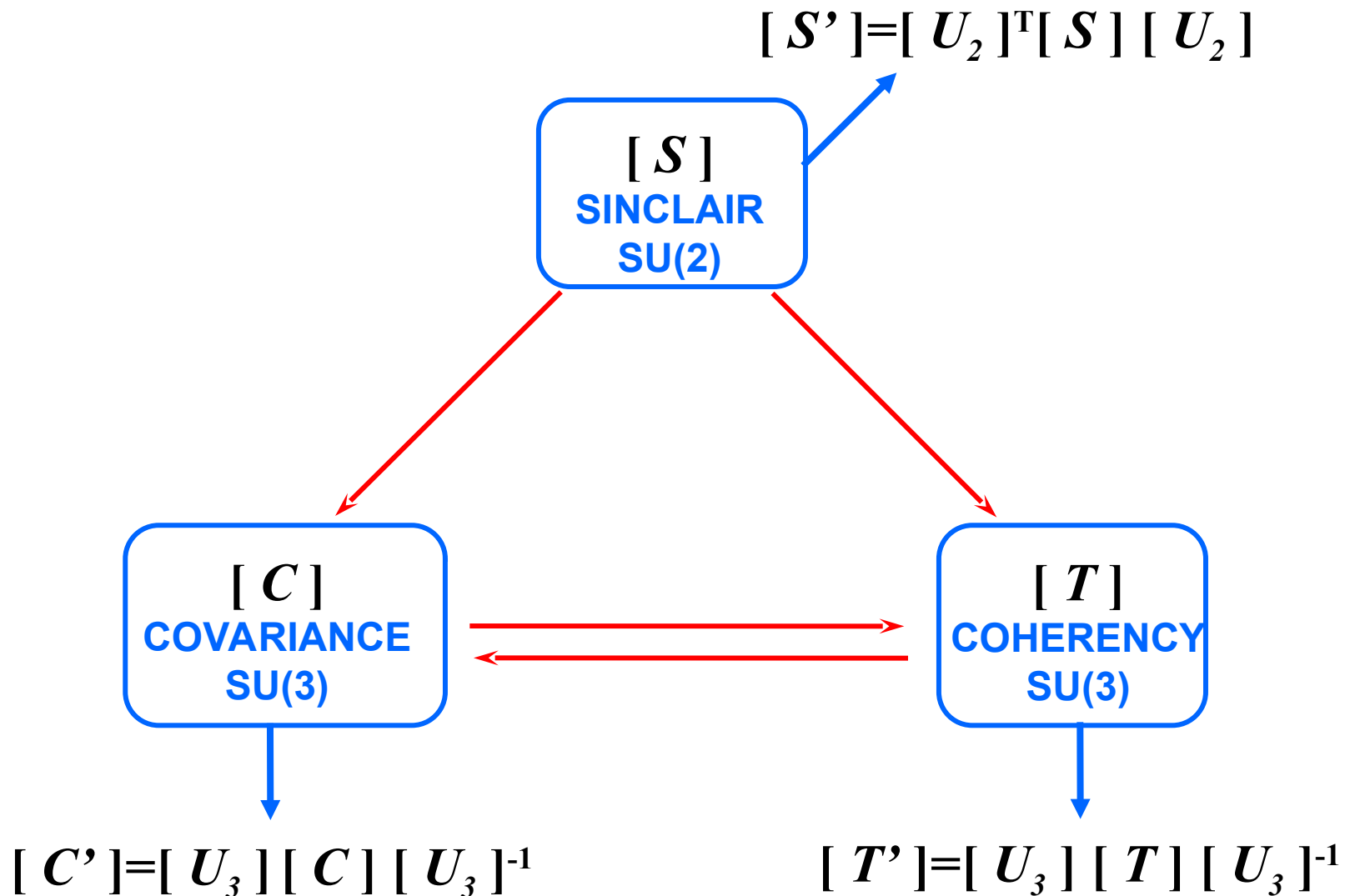
$$\underline{\Omega} = \begin{bmatrix} S_{XX} & \sqrt{2} S_{XY} & S_{YY} \end{bmatrix}^T$$

## COVARIANCE MATRIX [C]

$$[C] = \underline{\Omega} \underline{\Omega}^T$$



# POLARIMETRIC DESCRIPTORS



# ELLIPTICAL BASIS TRANSFORMATION

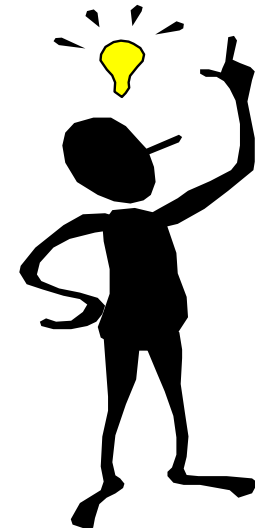
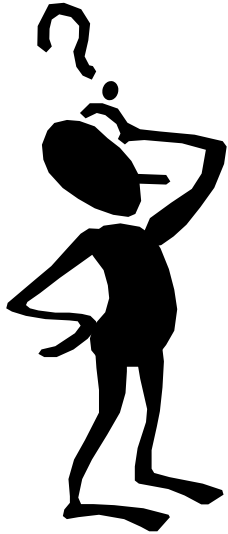
## SPECIAL UNITARY SU(2) GROUP

$$\begin{array}{ccc}
 \begin{bmatrix} \cos(\varphi) & -\sin(\varphi) \\ \sin(\varphi) & \cos(\varphi) \end{bmatrix} & \begin{bmatrix} \cos(\tau) & j \sin(\tau) \\ j \sin(\tau) & \cos(\tau) \end{bmatrix} & \begin{bmatrix} e^{-j\alpha} & 0 \\ 0 & e^{j\alpha} \end{bmatrix} \\
 [U_2(\varphi)] & [U_2(\tau)] & [U_2(\alpha)]
 \end{array}$$

## SPECIAL UNITARY SU(3) GROUP (T Matrix)

$$\begin{array}{ccc}
 \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos(2\varphi) & \sin(2\varphi) \\ 0 & -\sin(2\varphi) & \cos(2\varphi) \end{bmatrix} & \begin{bmatrix} \cos(2\tau) & 0 & j \sin(2\tau) \\ 0 & 1 & 0 \\ j \sin(2\tau) & 0 & \cos(2\tau) \end{bmatrix} & \begin{bmatrix} \cos(2\alpha) & -j \sin(2\alpha) & 0 \\ -j \sin(2\alpha) & \cos(2\alpha) & 0 \\ 0 & 0 & 1 \end{bmatrix} \\
 [U_3(2\varphi)] & [U_3(2\tau)] & [U_3(2\alpha)]
 \end{array}$$

# TARGET EQUATIONS



**POLARIMETRIC GOLDEN NUMBER**

**POLARIMETRIC TARGET DIMENSION**



# TARGET EQUATIONS



$$[S] = \begin{bmatrix} S_{XX} & S_{XY} \\ S_{YX} & S_{YY} \end{bmatrix}$$

## 5 DEGREES OF FREEDOM

$$|S_{XX}|, |S_{XY}|, |S_{YY}|$$

$$\varphi_{XY-XX}, \varphi_{YY-XX}$$

**KENNAUGH MATRIX [K]**

**COHERENCY MATRIX [T]**

**9 HUYNEN REAL PARAMETERS**  
(A0, B0, B, C, D, E, F, G, H)

**COVARIANCE MATRIX [C]**

**9 REAL PARAMETERS**

$$|XX|, |XY|, |YY|,$$

$$\text{Re}(XXXY^*), \text{Im}(XXXY^*)$$

$$\text{Re}(XXYY^*), \text{Im}(XXYY^*)$$

$$\text{Re}(XYYY^*), \text{Im}(XYYY^*)$$

**TARGET MONOSTATIC  
POLARIMETRIC « DIMENSION »**

**||**

**5**

**9 - 5 = 4 TARGET EQUATIONS**

# TARGET EQUATIONS

## PURE TARGET – MONOSTATIC CASE

$$[T] = \underline{k} \cdot \underline{k}^T = \begin{bmatrix} 2A_0 & C - jD & H + jG \\ C + jD & B_0 + B & E + jF \\ H - jG & E - jF & B_0 - B \end{bmatrix}$$

**3x3 HERMITIAN MATRIX - RANK 1**



**9 PRINCIPAL MINORS = 0**

$$\begin{aligned} 2A_0(B_0 + B) - C^2 - D^2 &= 0 & 2A_0(B_0 - B) - G^2 - H^2 &= 0 \\ -2A_0E + CH - DG &= 0 & B_0^2 - B^2 - E^2 - F^2 &= 0 \\ C(B_0 - B) - EH - GF &= 0 & -D(B_0 - B) + FH - GE &= 0 \\ 2A_0F - CG - DH &= 0 & -G(B_0 + B) + FC - ED &= 0 \\ H(B_0 + B) - CE - DF &= 0 & & \end{aligned}$$

# TARGET EQUATIONS



$$[S] = \begin{bmatrix} S_{XX} & S_{XY} \\ S_{YX} & S_{YY} \end{bmatrix}$$

## 5 DEGREES OF FREEDOM

$$|S_{XX}|, |S_{XY}|, |S_{YY}|$$

$$\varphi_{XY-XX}, \varphi_{YY-XX}$$

## COHERENCY MATRIX [T]

### 9 HUYNEN REAL PARAMETERS

(A0, B0, B, C, D, E, F, G, H)

## TARGET MONOSTATIC POLARIMETRIC « DIMENSION »

||  
**5**

## 9 - 5 = 4 TARGET EQUATIONS

$$2 A_0 (B_0 + B) \quad C^2 + D^2$$

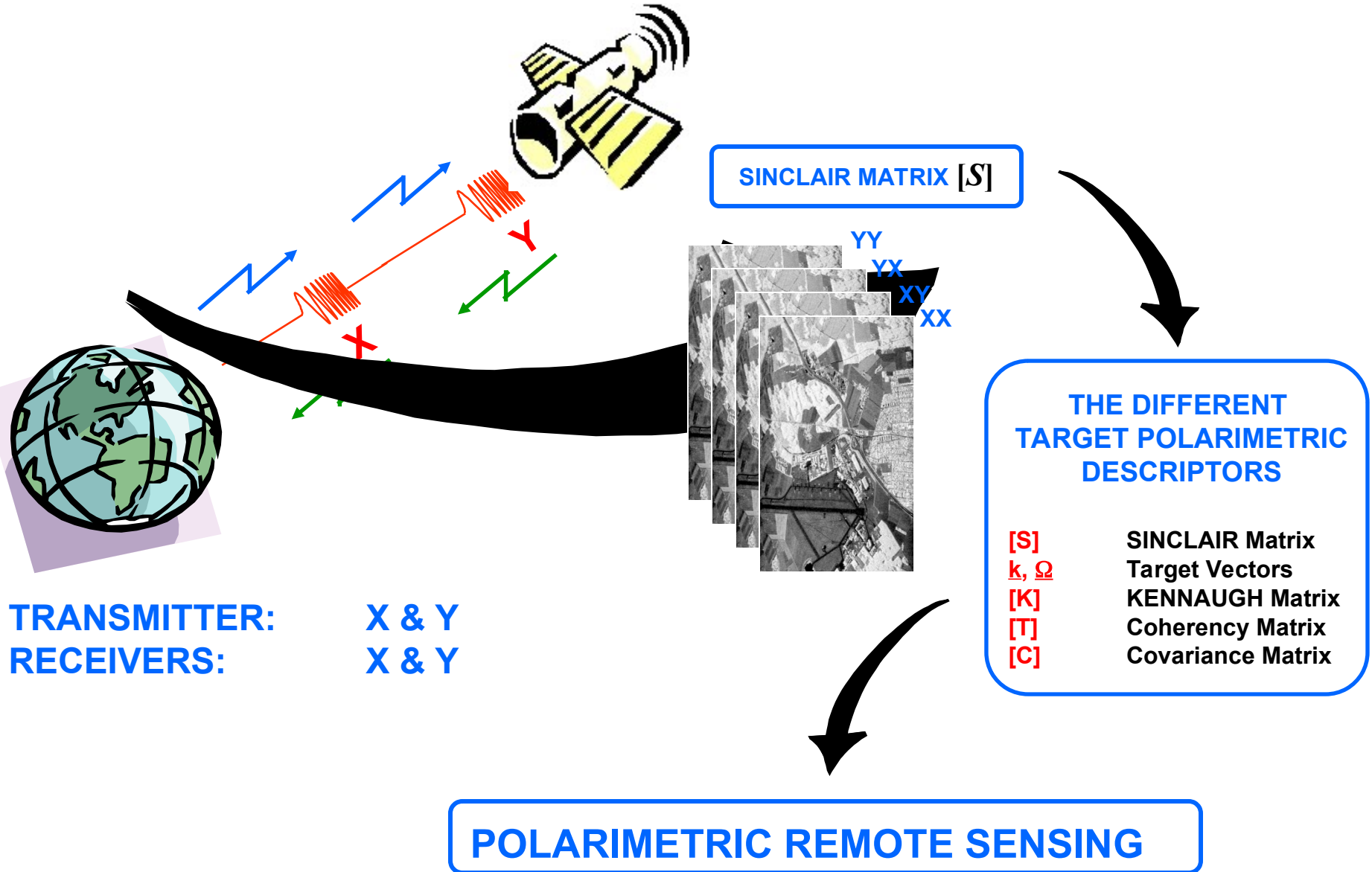
$$2 A_0 (B_0 - B) \quad G^2 + H^2$$

$$2 A_0 E \quad CH - DG$$

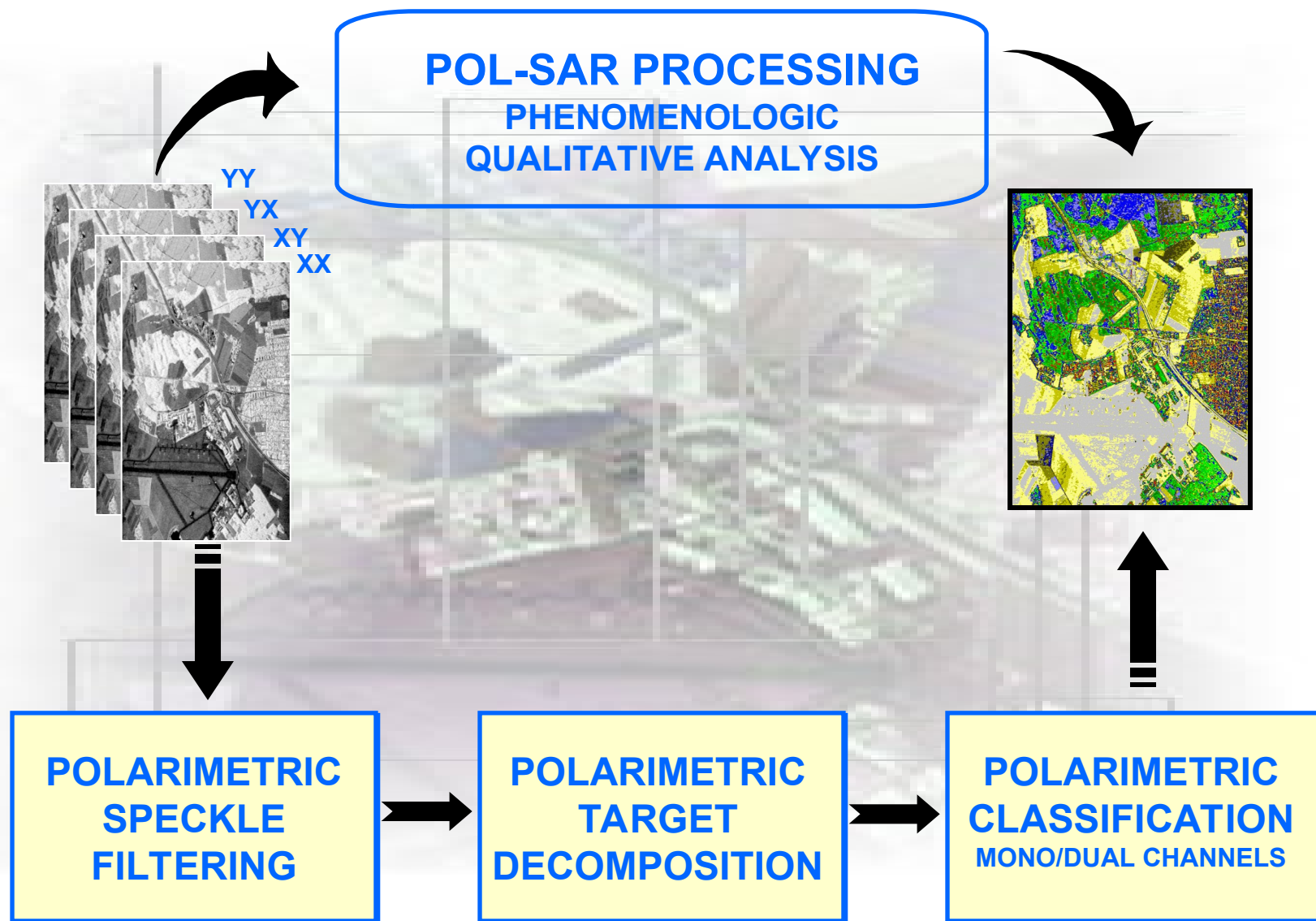
$$2 A_0 F \quad CG + DH$$



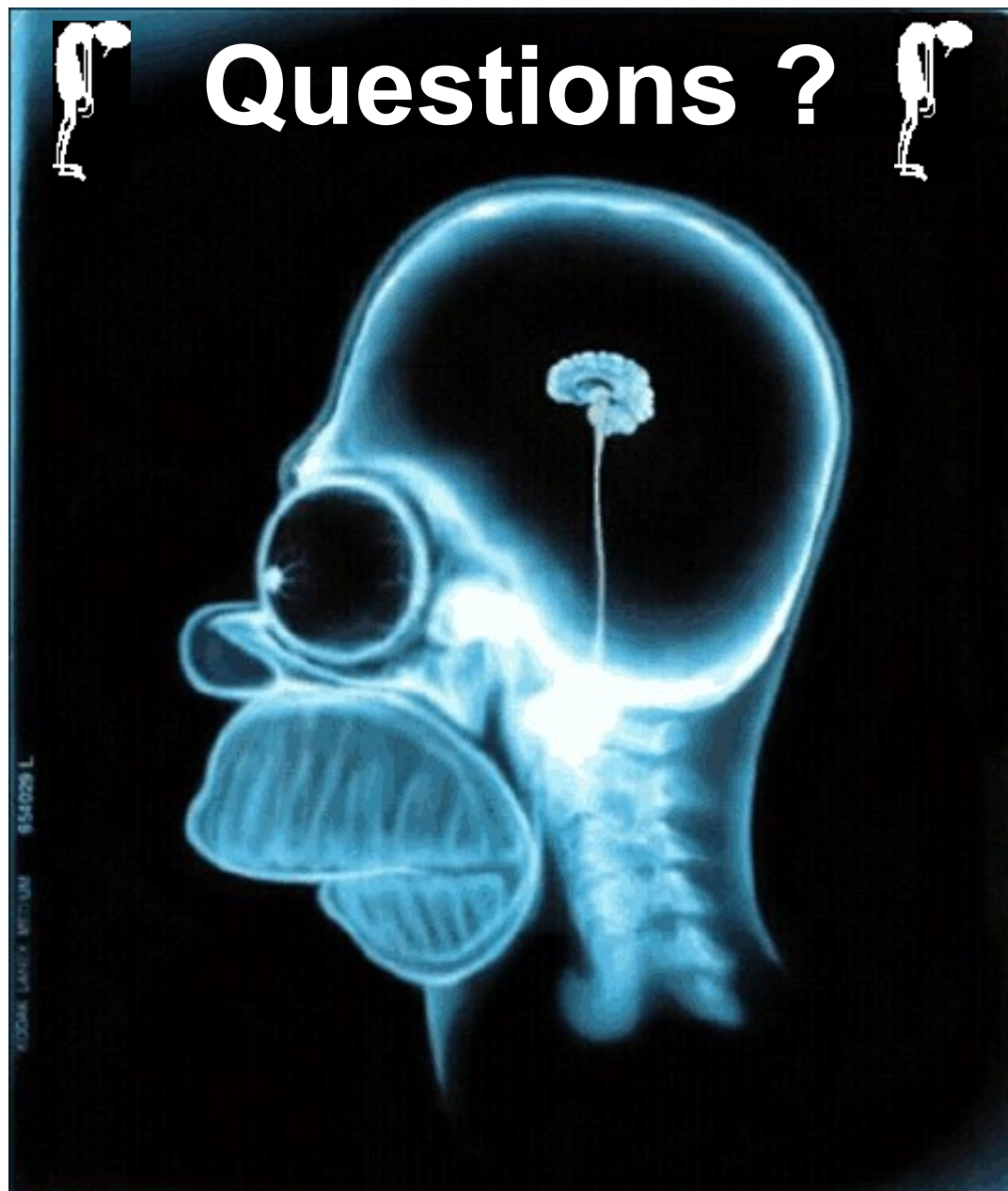
# SCATTERING POLARIMETRY



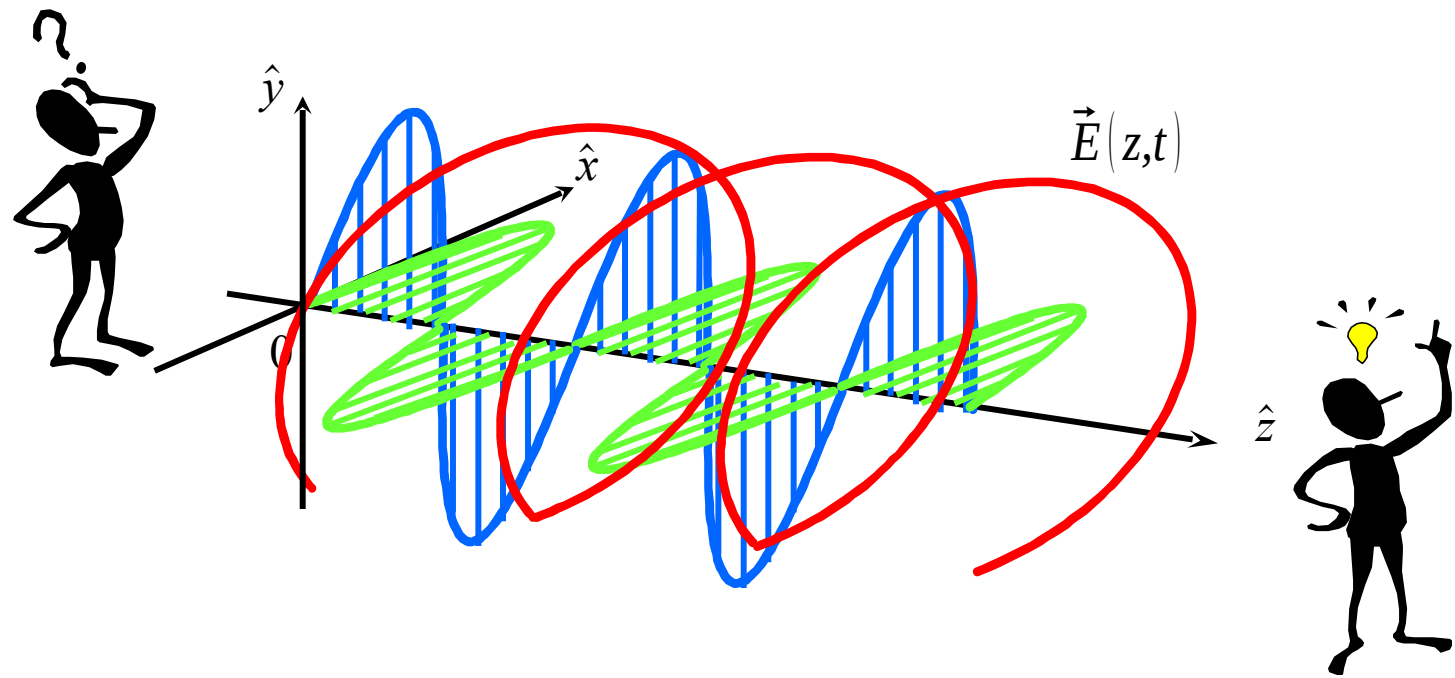
# POLARIMETRIC REMOTE SENSING



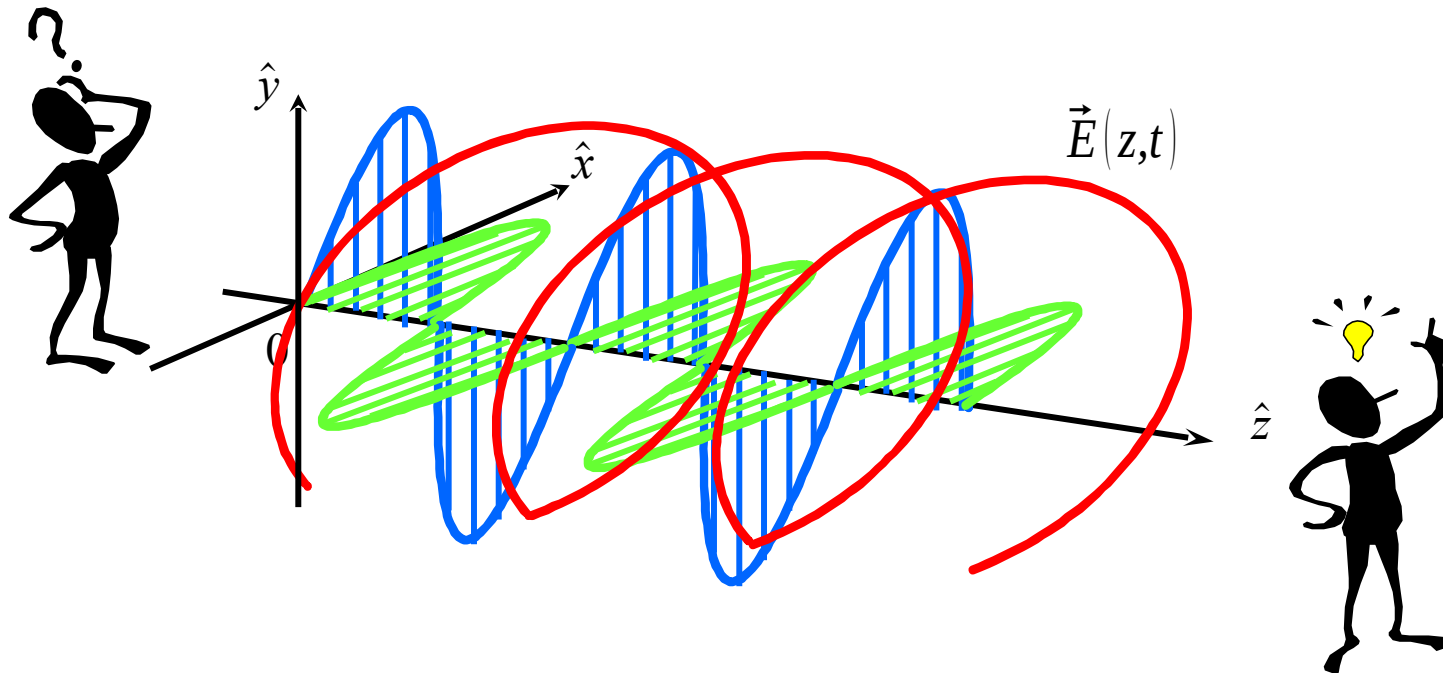
# Questions ?





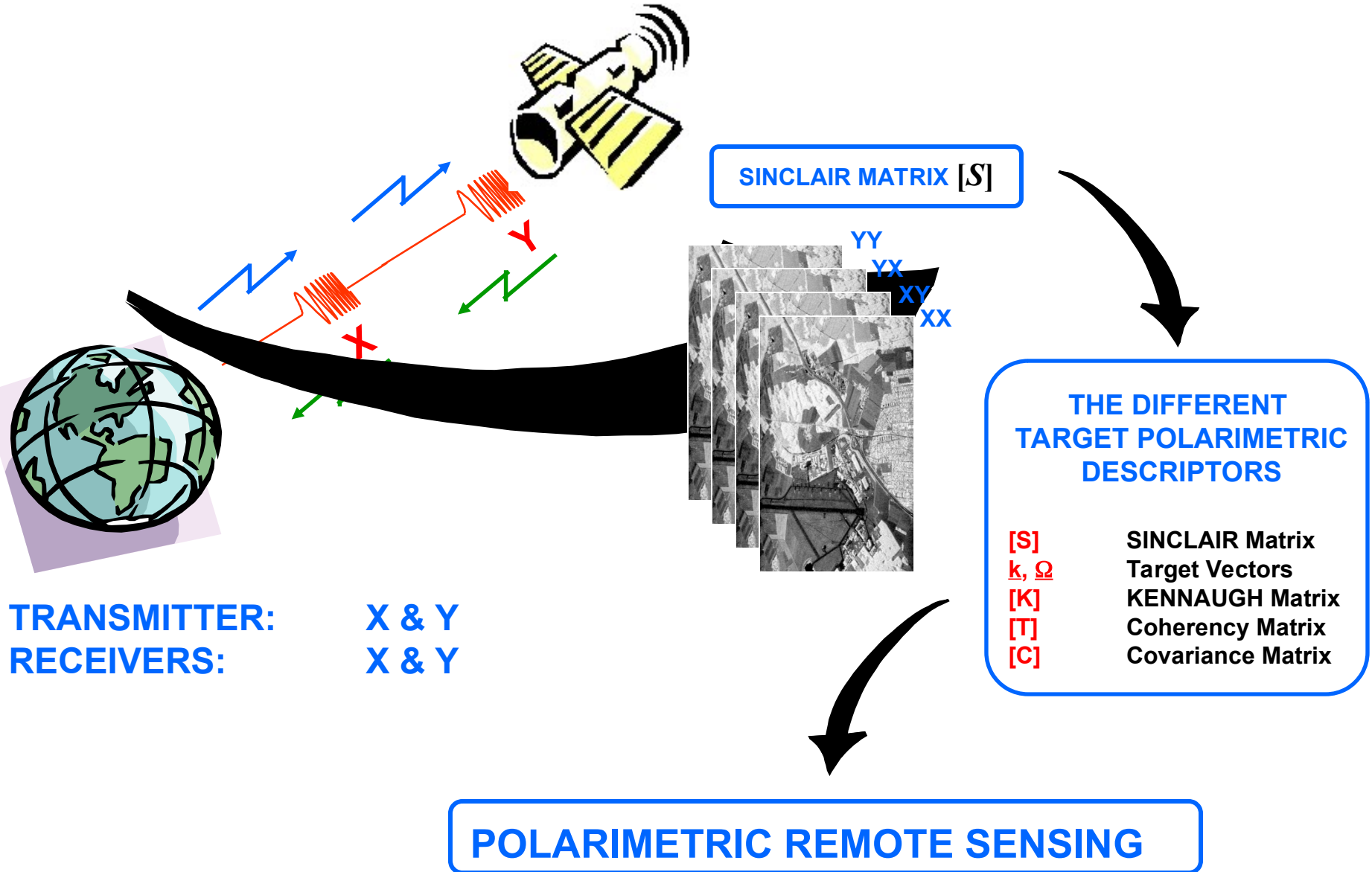


# ADVANCED CONCEPTS



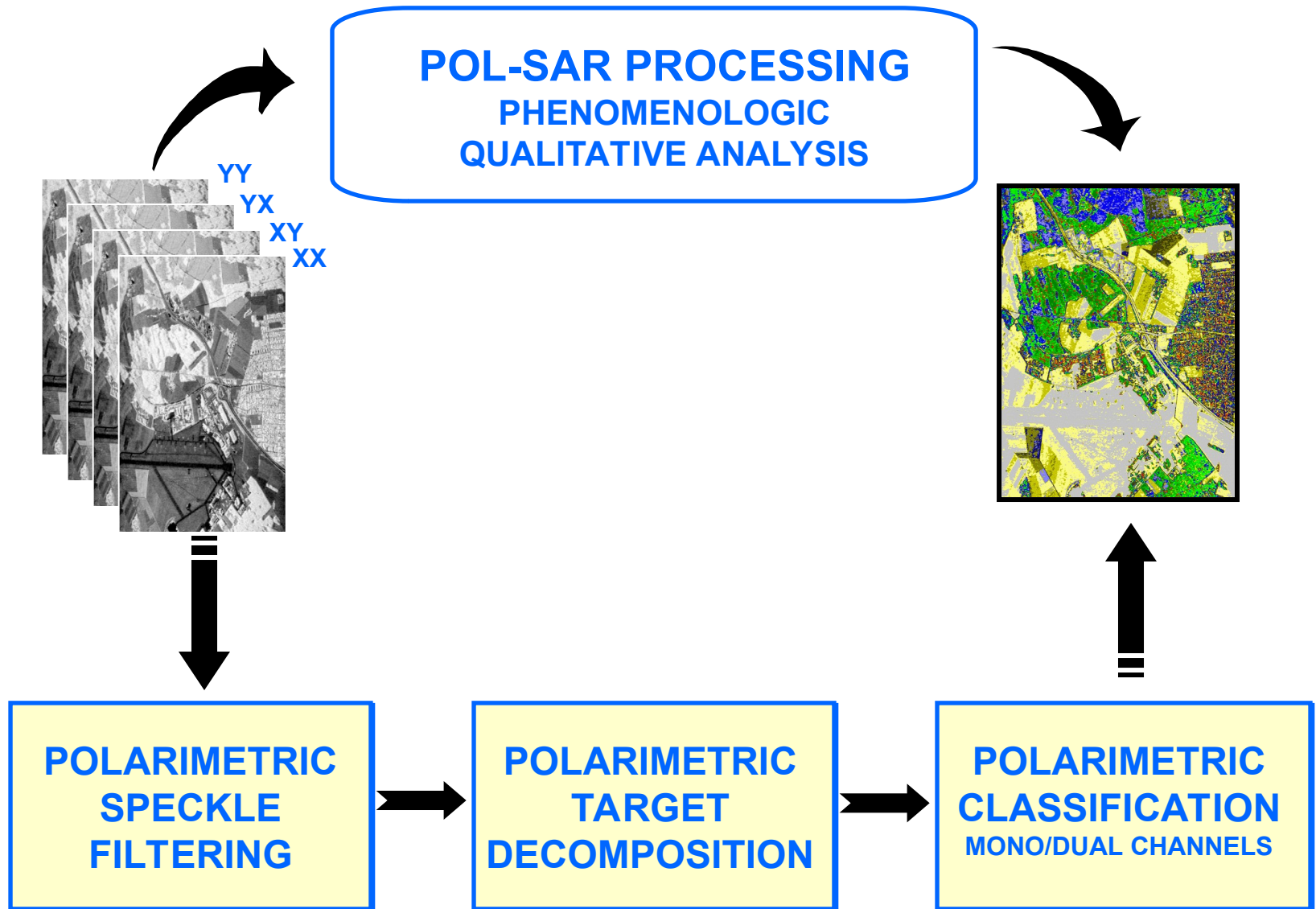
# POLARIMETRIC REMOTE SENSING

# SCATTERING POLARIMETRY

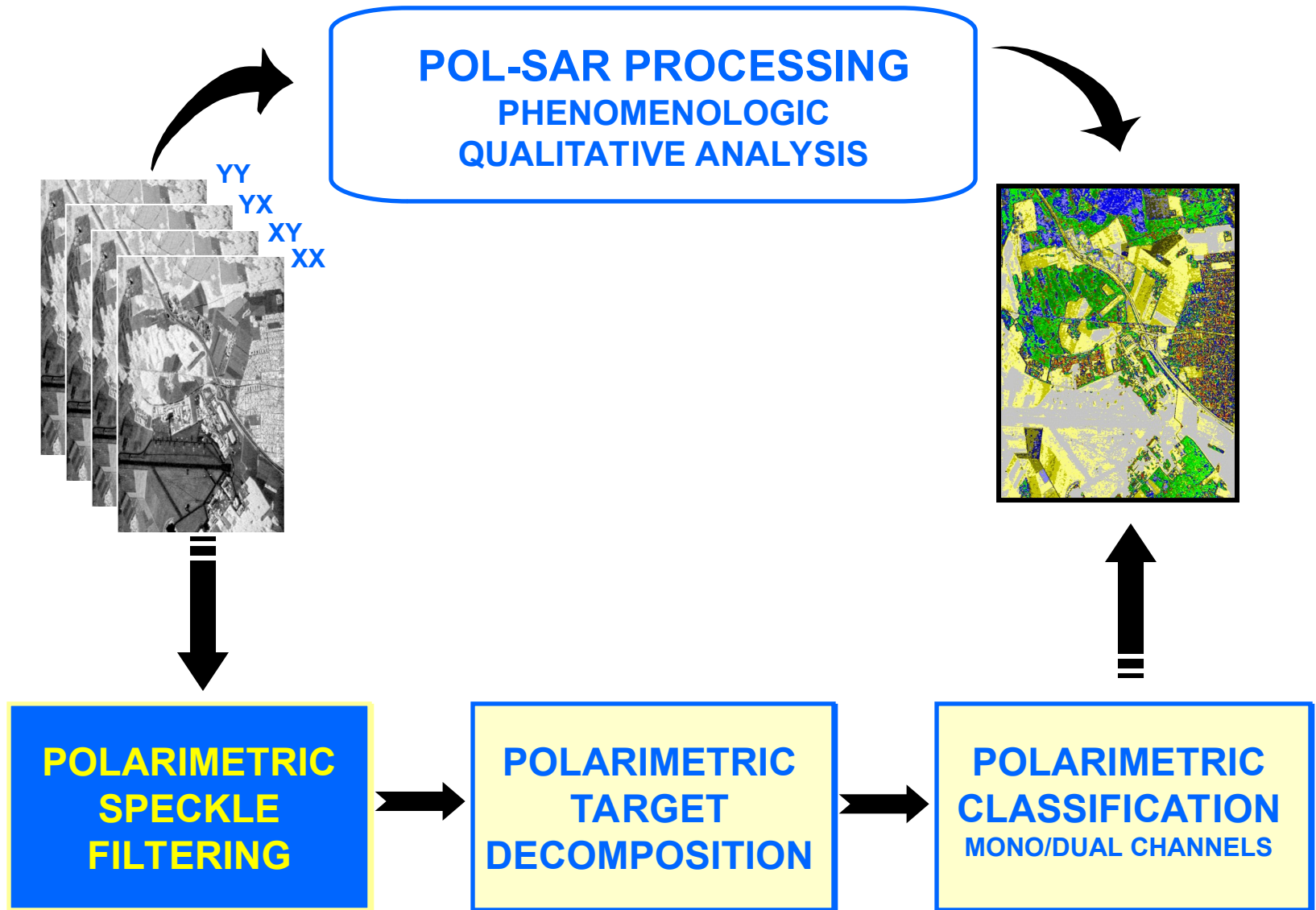


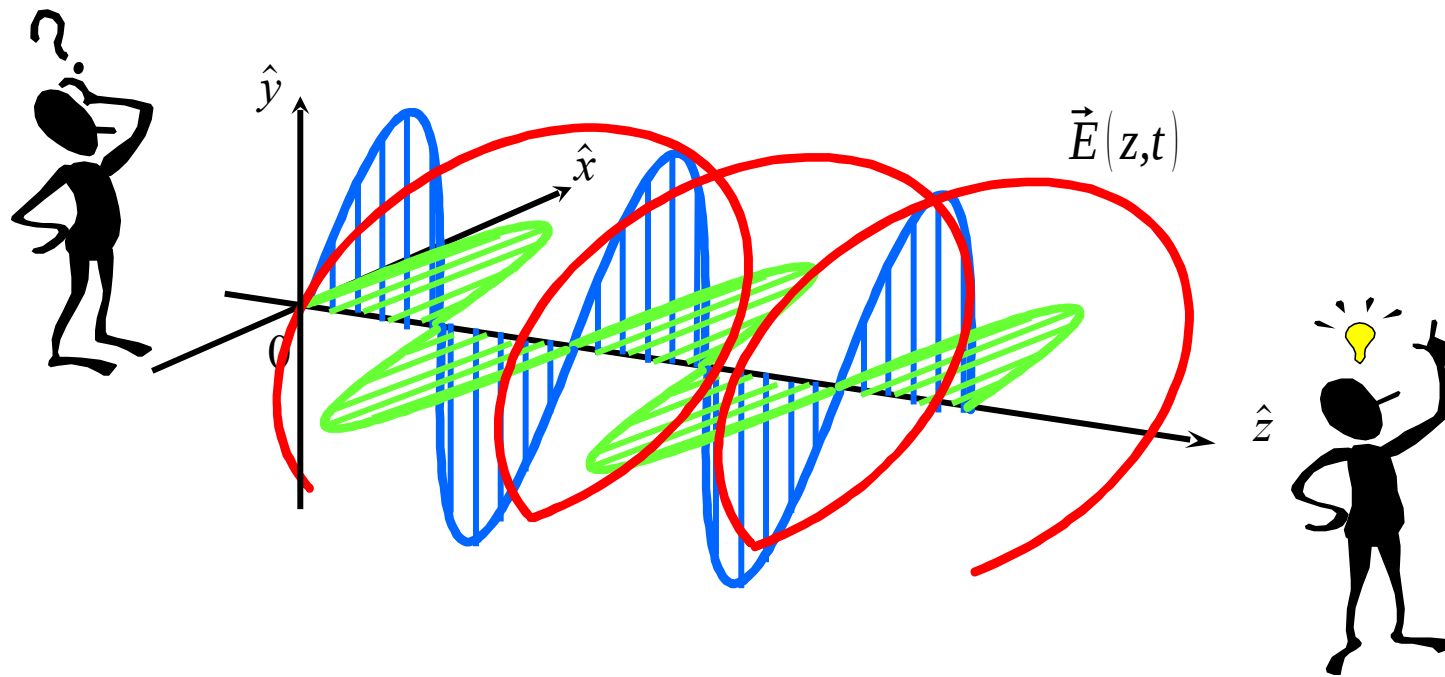


# POLARIMETRIC REMOTE SENSING



# POLARIMETRIC REMOTE SENSING



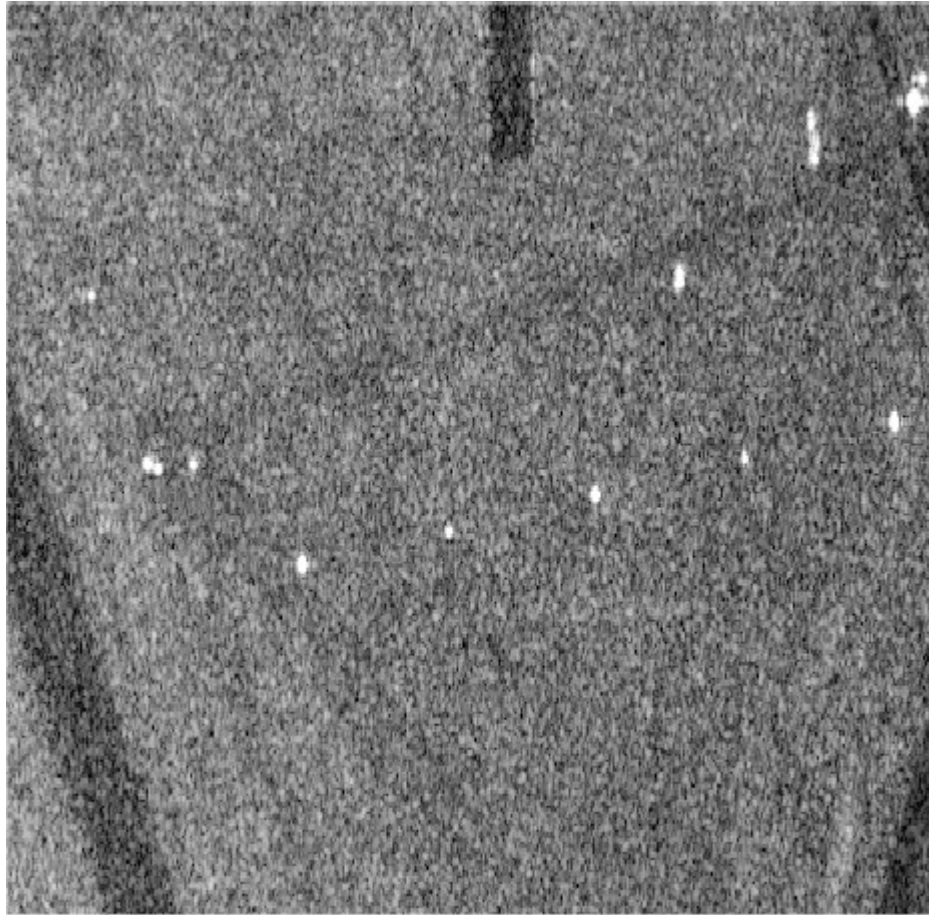


# POLARIMETRIC SPECKLE FILTERING

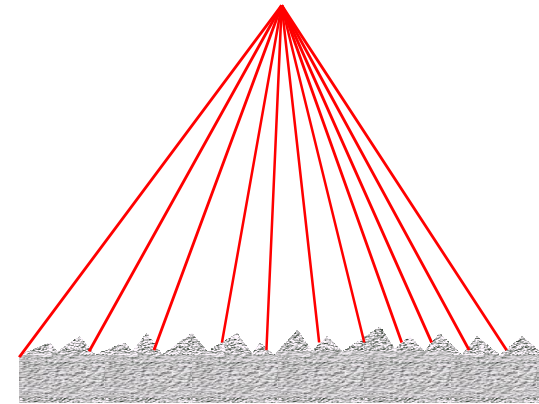
## An Introduction



# SPECKLE PHENOMENON



OBSERVATION POINT



SURFACE ROUGHNESS  
WAVELENGTH

SCATTERING FROM DISTRIBUTED  
SCATTERERS



COHERENT INTERFERENCES OF WAVES  
SCATTERED FROM MANY RANDOMLY  
DISTRIBUTED ELEMENTARY SCATTERERS  
INSIDE THE RESOLUTION CELL



GRANULAR NOISE



SPECKLE PHENOMENON

# SPECKLE FILTERING

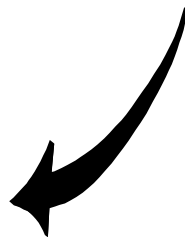
SPECKLE PHENOMENON



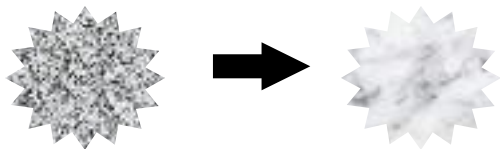
DISTORTION OF THE INTERPRETATION



SPECKLE FILTERING

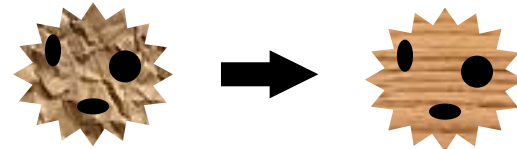


HOMOGENEOUS AREA



SPECKLE REDUCTION  
(RADIOMETRIC RESOLUTION)

HETEROGENEOUS AREA



DETAILS PRESERVATION  
(SPATIAL RESOLUTION)

# SPECKLE FILTERING

## SPECKLE : MULTIPLICATIVE NOISE MODEL

« **SPECKLE is a scattering phenomenon and not a noise. However, from the image SAR processing point of vue, the speckle can be modeled as multiplicative noise for extended target** » (Lee, IGARSS-98)

$$y = \begin{bmatrix} y_{HH} \\ y_{HV} \\ y_{VV} \end{bmatrix} = \begin{bmatrix} n_{HH} & 0 & 0 \\ 0 & n_{HV} & 0 \\ 0 & 0 & n_{VV} \end{bmatrix} \begin{bmatrix} x_{HH} \\ x_{HV} \\ x_{VV} \end{bmatrix} = \begin{bmatrix} x_{HH} n_{HH} \\ x_{HV} n_{HV} \\ x_{VV} n_{VV} \end{bmatrix}$$



**SCATTERING  
FIELD**



**NOISE**



**REFLECTIVITY  
DENSITY**

$$I_{pqpq} = y_{pq} y_{pq} = X_{pqpq} v_{pqpq}$$

**INTENSITY**

$$A_{pqpq} = \sqrt{I_{pqpq}} = \sqrt{y_{pq} y_{pq}}$$

**AMPLITUDE**



# SPECKLE FILTERING

## LINEAR SPECKLE FILTERS

**Intensity / Amplitude – Single / Multi Look – Single Pol Channel**

**Median Filter**

**MAP Filter (Kuan)**

**Gradient Filter**

**Nagao Filter (Nagao)**

**Sigma Filter (Lee)**

**Frost Filter (Frost)**

**Geometrical Filter (Crimmins)**

**Morphological Filter (Safa, Flouzat)**

**Local Statistics Filter (Lee 80)**

**Refined Lee Filter (Lee 81)**

J.S. Lee, et al. "Speckle Filtering of SAR images: A Review," Remote Sensing Reviews, Vol. 8, pp. 313-340, 1994.

J.S. Lee, "Speckle analysis and smoothing of SAR images," Computer Graphics and Image Processing, Vol. 17, 1981.

J.S. Lee, "Digital image enhancement and noise filtering by use of local statistics," IEEE PAMI, Vol. 2 No. 2, 1980.

J.S. Lee, "Refined filtering of image noise using local statistics," CVGIP, vol.15, 380-389, 1981.

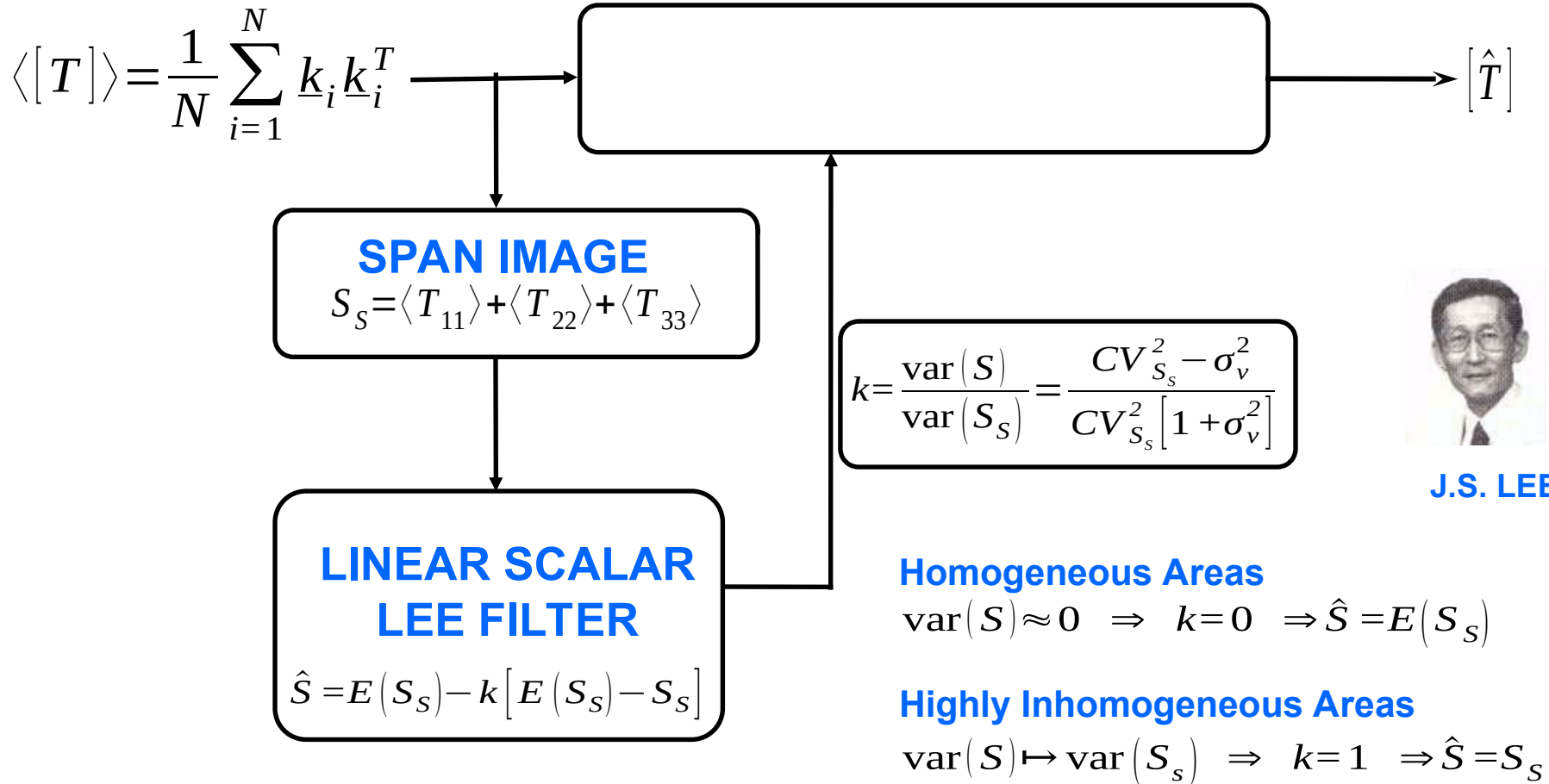
# POLSAR SPECKLE FILTERING

- **Preserving polarimetric properties**
  - **Filter all elements equally like multi-look Processing**
  - **Select pixels with the same scattering property**
- **Introduce no cross-talk**
  - **Filter each element separately but equally**
- **Reduce speckle while preserving image quality**

J.S. Lee, M.R. Grunes and G. De Grandi, "Polarimetric SAR Speckle Filtering and Its Impact on Terrain Classification" *IEEE TGRS*, September 1999

# POLSAR SPECKLE FILTERING

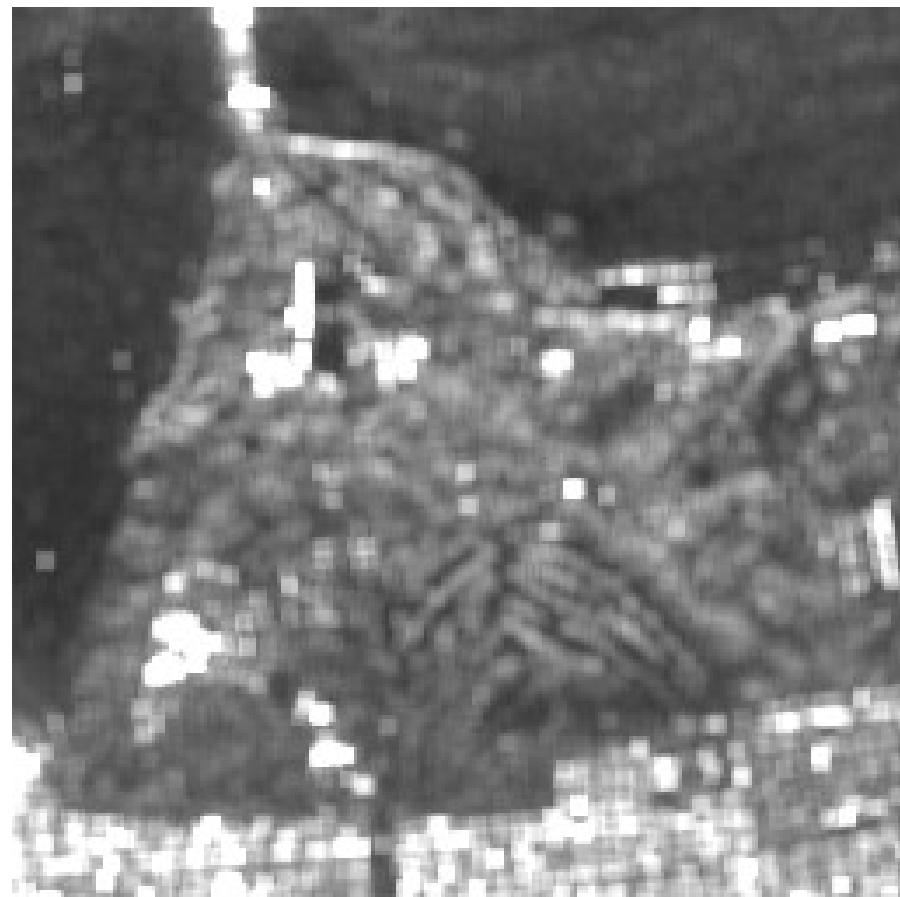
## POLARIMETRIC VECTORIAL SPECKLE FILTER



## REFINED FILTER



# POLSAR SPECKLE FILTERING



**SAN FRANCISCO BAY JPL - AIRSAR L-band 1988**

**BoxCar Filter**

# POLSAR SPECKLE FILTERING



## SAN FRANCISCO BAY JPL - AIRSAR L-band 1988

J.S. Lee, M.R. Grunes and G. De Grandi, "Polarimetric SAR Speckle Filtering and Its Impact on Terrain Classification" *IEEE TGRS*, September 1999

# POLSAR SPECKLE FILTERING

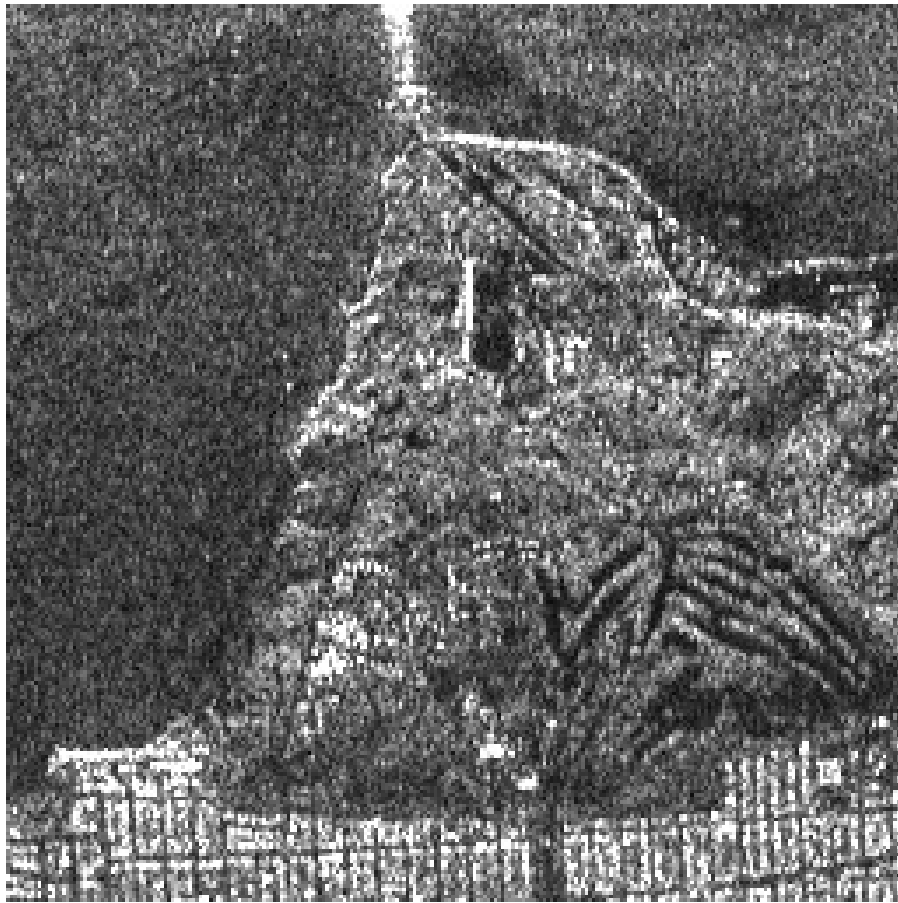


## SAN FRANCISCO BAY JPL - AIRSAR L-band 1988

J.S. Lee, D.L. Schuler, T.L. Ainsworth, M.R. Grunes, E Pottier, L. Ferro-Famil, "Scattering Model Based Speckle Filtering of Polarimetric SAR Data" IEEE – TGRS, vol 1, January 2006



# POLSAR SPECKLE FILTERING



## SAN FRANCISCO BAY JPL - AIRSAR L-band 1988

J.S. Lee, J.H. Wen, T.L. Ainsworth, K.S. Chen, A.J. Chen, "Improved Sigma Filter for Speckle Filtering of SAR Imagery" IEEE – TGRS, vol 1, January 2009

# POLSAR SPECKLE FILTERING

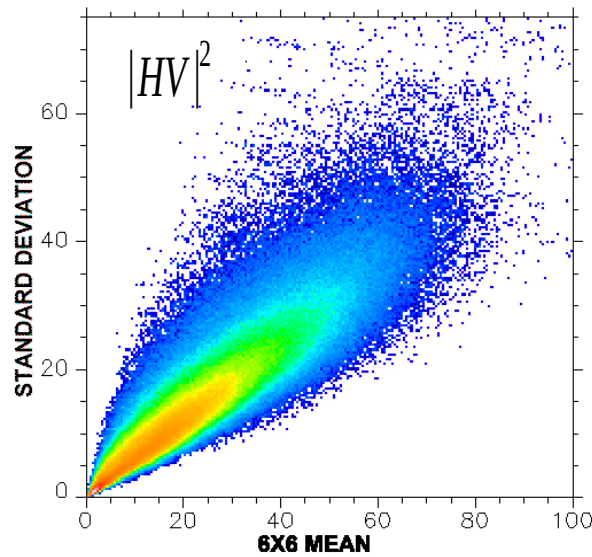
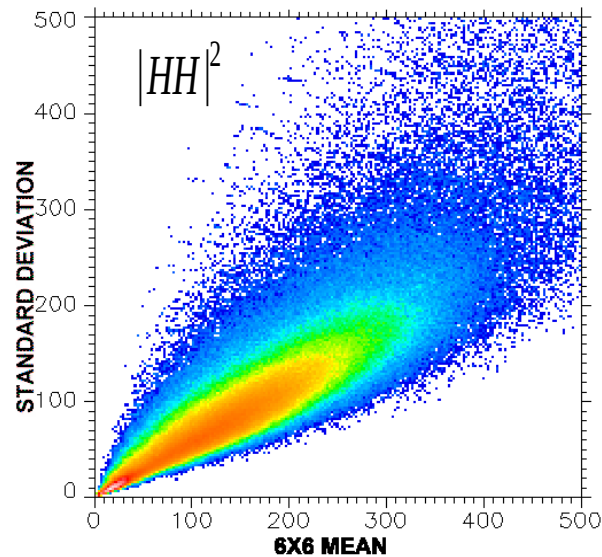
## POLARIMETRIC SPECKLE FILTERING IS NOT AN EXACT SCIENCE SUBJECTIVE, IMAGE DEPENDENT

### Quantitative Criteria (J.S. Lee - IGARSS 98)

- Speckle Reduction (E.N.L)
- Edge Sharpness Preservation
- Line and Point Target Contrast Preservation
- Retention of Mean Values in Homogeneous Regions
- Retention of Texture Information
- Retention of Polarimetric Information (co, cross-correlations)
- Computational Efficiency
- Implementation Complexity

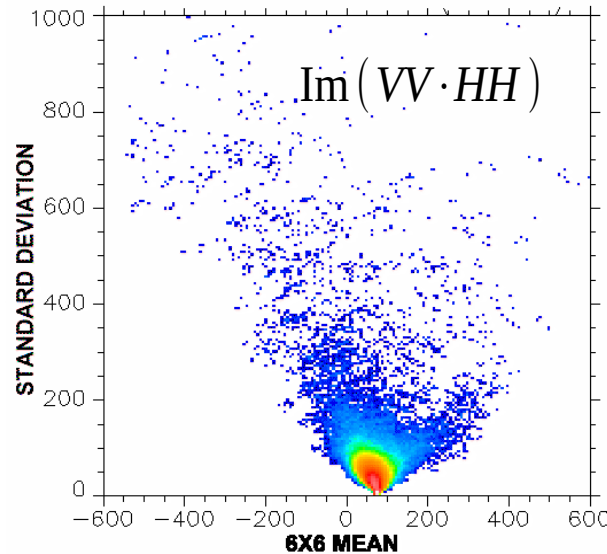
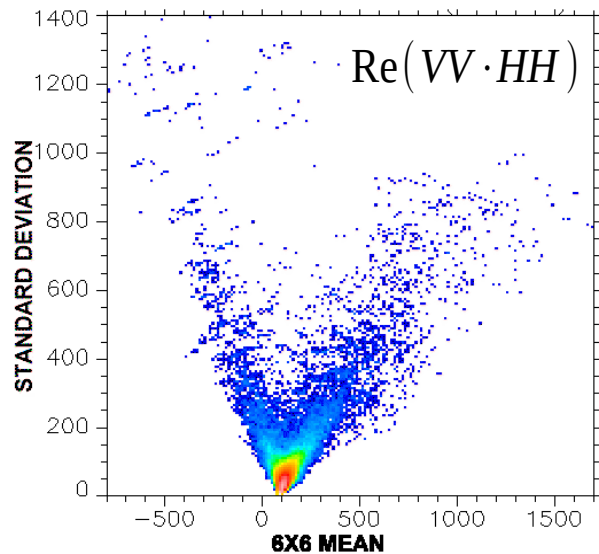
**THE POLARIMETRIC SPECKLE LEE FILTER  
IS TODAY A GOOD COMPROMISE**

# POLSAR SPECKLE NOISE MODEL



Diagonal  
Terms

Multiplicative



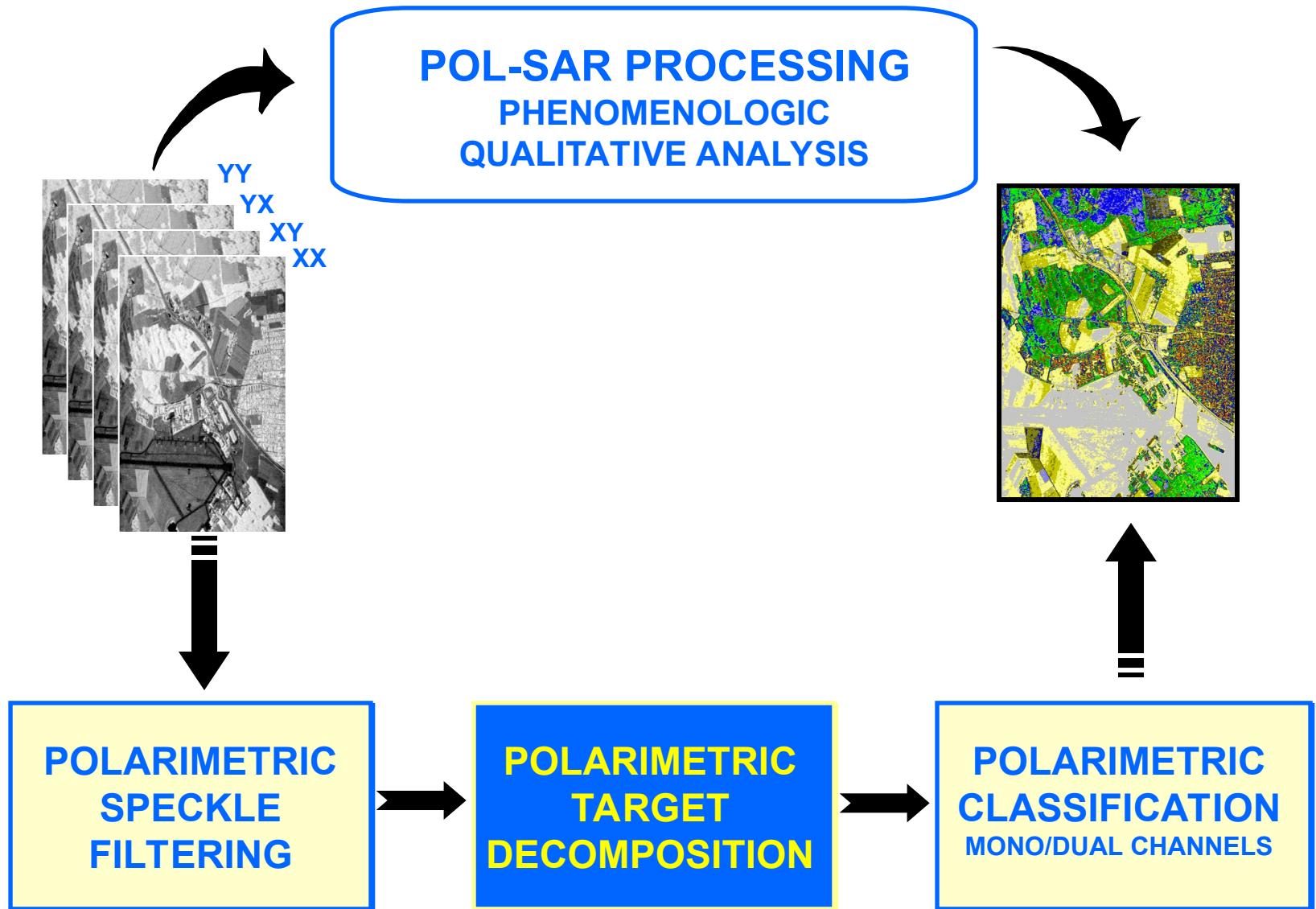
Off-Diagonal  
Terms

Additive/Multiplicative

J.S. Lee, M.R. Grunes and G. De Grandi, "Polarimetric SAR Speckle Filtering and Its Impact on Terrain Classification" *IEEE TGRS*, vol. 37, N°5, September 1999



# POLARIMETRIC REMOTE SENSING



# SPECKLE FILTERING



$$[T]' = k k^T$$



AVERAGING DATA



SECOND ORDER  
STATISTICS

COHERENCY MATRICES

$$\langle [T] \rangle = \frac{1}{N} \sum_{i=1}^N k_i k_i^T$$

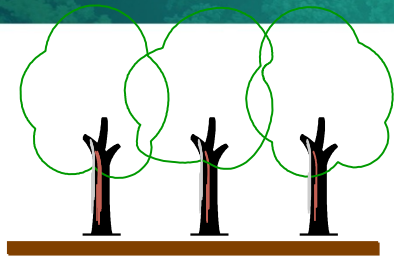


SMOOTHING AVERAGING



CONCEPT OF THE DISTRIBUTED TARGET

# TARGET DECOMPOSITIONS



**PURE TARGET**

**POLARIMETRIC DISTRIBUTED  
TARGET « DIMENSION » = 5**

**COHERENCY MATRIX [T]**

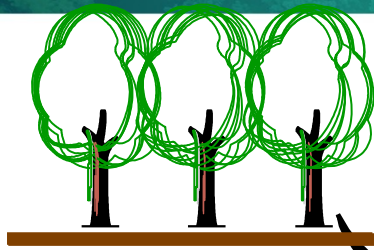
**9 REAL DEPENDANT  
HUYNEN PARAMETERS  
(A<sub>0</sub>,B<sub>0</sub>,B,C,D,E,F,G,H)**

**9 - 5 = 4 TARGET EQUATIONS**

$$\begin{array}{ll} 2 A_0 (B_0 + B) & C^2 + D^2 \\ 2 A_0 (B_0 - B) & G^2 + H^2 \\ 2 A_0 E & CH - DG \\ 2 A_0 F & CG + DH \end{array}$$



# TARGET DECOMPOSITIONS



**DISTRIBUTED TARGET**

**COHERENCY MATRIX  $\langle [T] \rangle$**

**POLARIMETRIC DISTRIBUTED TARGET « DIMENSION » = 9**

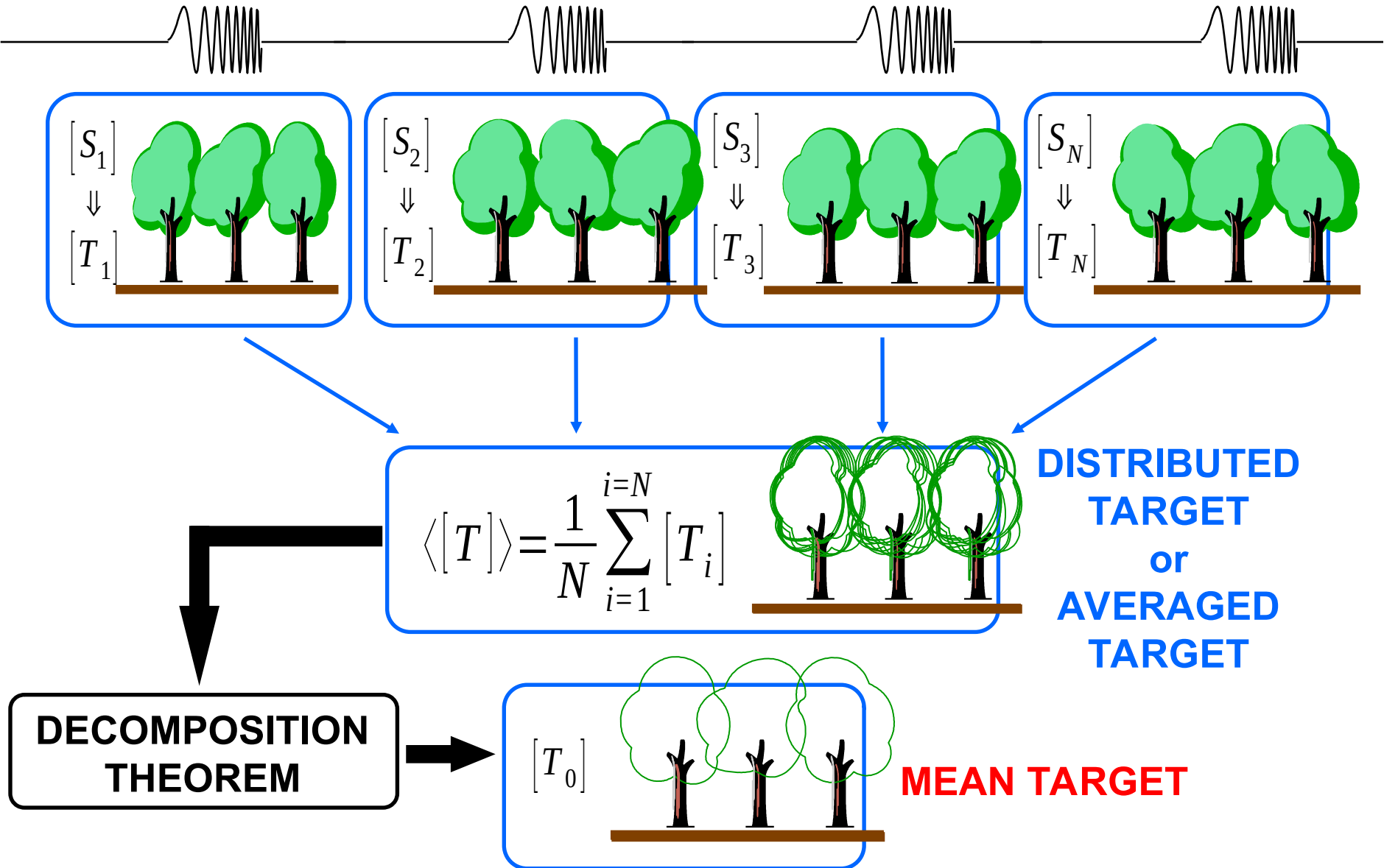
**9 REAL INDEPENDANT HUYNEN PARAMETERS**

**$(\langle A_0 \rangle, \langle B_0 \rangle, \langle B \rangle, \langle C \rangle, \langle D \rangle, \langle E \rangle, \langle F \rangle, \langle G \rangle, \langle H \rangle)$**

## 9 TARGET INEQUATIONS

$$\begin{array}{ll}
 2\langle A_0 \rangle (\langle B_0 \rangle + \langle B \rangle)^3 \langle C \rangle^2 + \langle D \rangle^2 & \langle H \rangle (\langle B_0 \rangle + \langle B \rangle)^3 \langle C \rangle \langle E \rangle + \langle D \rangle \langle F \rangle \\
 2\langle A_0 \rangle (\langle B_0 \rangle - \langle B \rangle)^3 \langle G \rangle^2 + \langle H \rangle^2 & \langle G \rangle (\langle B_0 \rangle + \langle B \rangle)^3 \langle C \rangle \langle F \rangle - \langle D \rangle \langle E \rangle \\
 2\langle A_0 \rangle \langle E \rangle^3 \langle C \rangle \langle H \rangle - \langle D \rangle \langle G \rangle & \langle C \rangle (\langle B_0 \rangle - \langle B \rangle)^3 \langle H \rangle \langle E \rangle + \langle F \rangle \langle G \rangle \\
 2\langle A_0 \rangle \langle F \rangle^3 \langle C \rangle \langle G \rangle + \langle D \rangle \langle H \rangle & \langle D \rangle (\langle B_0 \rangle - \langle B \rangle)^3 \langle F \rangle \langle H \rangle - \langle G \rangle \langle E \rangle \\
 \langle B_0 \rangle^2 \langle B \rangle^2 + \langle E \rangle^2 + \langle F \rangle^2 &
 \end{array}$$

# TARGET DECOMPOSITIONS



# TARGET DECOMPOSITIONS

[S]

## COHERENT DECOMPOSITION

E. KROGAGER  
(1990)

W.L. CAMERON  
(1990)

[K]

## TARGET DICHOTOMY

J.R. HUYNEN  
(1970)

R.M. BARNES  
(1988)

[T]

## EIGENVECTORS BASED DECOMPOSITION

S.R. CLOUDE  
(1985)

W.A. HOLM  
(1988)

## EIGENVECTORS / EIGENVALUES ANALYSIS ENTROPY / ANISOTROPY

S.R. CLOUDE - E. POTTIER  
(1996-1997)

[C]

## AZIMUTHAL SYMMETRY

## MODEL BASED DECOMPOSITION

A.J. FREEMAN – S.L. DURDEN (1992)  
Y. YAMAGUSHI (2005 - 2012), AN  
(2010)

## EIGENVECTORS / EIGENVALUES ANALYSIS & MODEL BASED DECOMPOSITION

J.J. VAN ZYL (1992-2008), M. ARII (2010)  
TSVM (R. TOUZI – 2007)



## TARGET DECOMPOSITION FOR TARGETS WITH REFLECTION SYMMETRY

MODEL BASED DECOMPOSITION

A. FREEMAN – S. DURDEN (1992)



*A. Freeman and S.L. Durden, "A Three-Component Scattering Model for Polarimetric SAR Data"  
IEEE TGRS, vol. 36, no. 3, May 1998*

# MODEL BASED DECOMPOSITION

## 3 COMPONENTS SCATTERING MECHANISM MODEL

$$\langle [T] \rangle = [T_S] + [T_D] + [T_V]$$



**SINGLE  
SCATTERING**



**DOUBLE  
SCATTERING**



**VOLUME  
SCATTERING**

# MODEL BASED DECOMPOSITION

## 3 COMPONENTS SCATTERING MECHANISM MODEL

$$\langle [T] \rangle = [T_S] + [T_D] + [T_V]$$



**SINGLE  
SCATTERING**



**DOUBLE  
SCATTERING**



**VOLUME  
SCATTERING**

$$T_{11} = f_S |\beta + 1|^2 + f_D |\alpha - 1|^2 + \frac{4f_V}{3}$$

$$T_{12} = f_S (\beta + 1)(\beta - 1) + f_D (\alpha - 1)(\alpha + 1)$$

$$T_{22} = f_S |\beta - 1|^2 + f_D |\alpha + 1|^2 + \frac{2f_V}{3}$$

$$T_{33} = \frac{2f_V}{3}$$



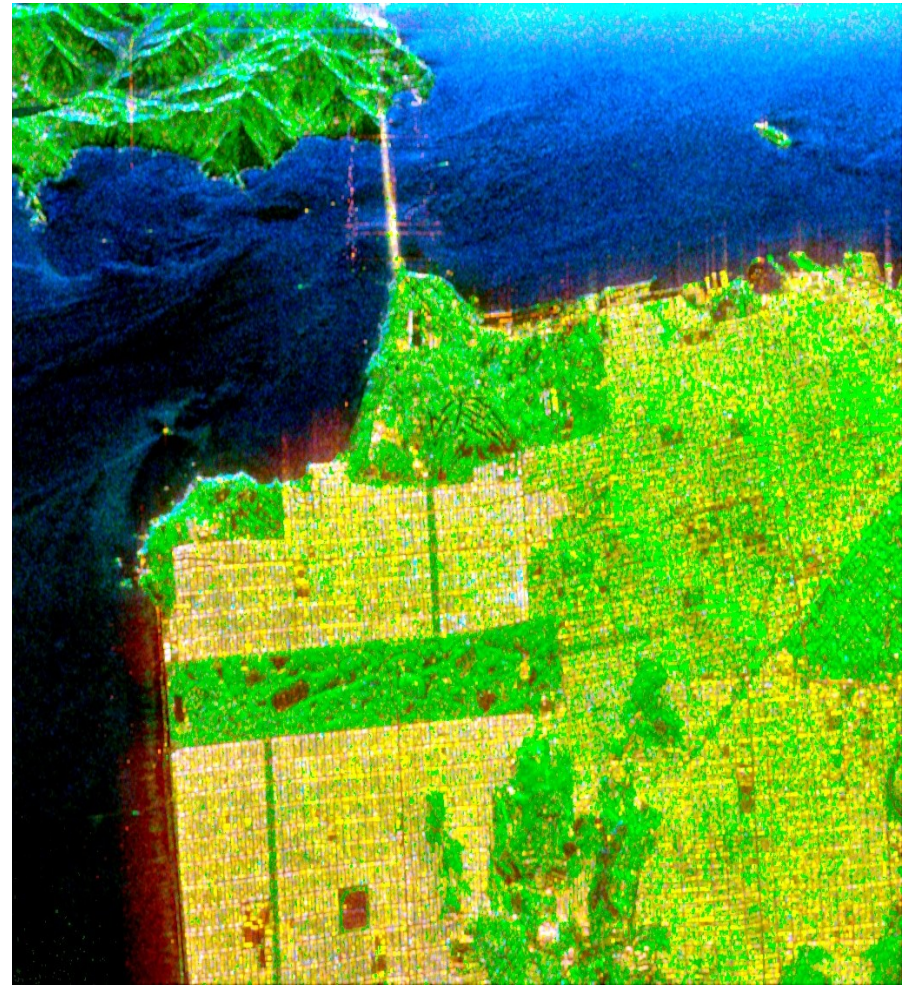
**5 UNKNOWN REAL COEFFICIENTS**



**4 OBSERVED EQUATIONS**



# MODEL BASED DECOMPOSITION



$$2A_0$$

$$B_0 + B$$

$$B_0 - B$$

$$ODD = f_S (1 + \beta^2)$$

$$DBL = f_D (1 + \alpha^2)$$

$$VOL = \frac{2f_V}{3}$$



## TARGET DECOMPOSITION FOR TARGETS WITHOUT REFLECTION SYMMETRY

MODEL BASED - 4 COMPONENTS DECOMPOSITION

Y. YAMAGUCHI et al. (2005 - 2013)



# MODEL BASED DECOMPOSITION

## MEDIUM WITHOUT ANY REFLECTION SYMMETRY

### 4 COMPONENTS SCATTERING MECHANISM MODEL

$$\langle [T] \rangle = [T_S] + [T_D] + [T_V] + [T_H]$$



**SINGLE  
SCATTERING**



**DOUBLE  
SCATTERING**



**VOLUME  
SCATTERING**



**HELIX  
SCATTERING**

$$[S]_{\pm Helix} = \frac{1}{2} \begin{bmatrix} 1 & \pm j \\ \pm j & -1 \end{bmatrix}$$

$$\langle [T] \rangle_{Helix} = \frac{1}{2} \left\langle \begin{bmatrix} 0 & 0 & 0 \\ 0 & 1 & \pm j \\ 0 & \mp j & 1 \end{bmatrix} \right\rangle$$

**Non reflection  
Symmetric cases**

Yamaguchi Y., Moriyama T., Ishido M. and Yamada H., “*Four-Component Scattering Model for Polarimetric SAR Image Decomposition*”, IEEE Trans. Geos. Remote Sens., vol. 43, no. 8, August 2005.

Yamaguchi Y., Yajima Y. and Yamada H., “*A Four-Component Decomposition of POLSAR Images Based on the Coherency Matrix*”, IEEE Geos. Rem. Sens. Letters, vol. 3, no. 3, July 2006.

**2005 - 2006**



# MODEL BASED DECOMPOSITION

**Y. Yamaguchi, A. Sato, W.M. Boerner, R. Sato, H. Yamada, “4-component scattering power decomposition with rotation of coherency matrix”, IEEE TGRS vol. 49, no. 6, June 2011.**

**A. Sato, Y. Yamaguchi, G. Singh, and S.-E. Park, “4-component scattering power decomposition with extended volume scattering model”, IEEE GRS Letters, vol. 9, no. 2, pp. 166–170, Mar. 2012.**

**G. Singh, Y. Yamaguchi, S.E. Park, « General Four-Component Scattering Power Decomposition With Unitary Transformation of Coherency Matrix » IEEE TGRS in press**

**G. Singh, Y. Yamaguchi, S.E. Park, Y. Cui, H. Kobayashi, « Hybrid Freeman/Eigenvalue Decomposition Method With Extended Volume Scattering Model » IEEE GRS Letters, vol. 10, no. 1, Jan. 2013**



# MODEL BASED DECOMPOSITION



$2A_0$

$B_0 + B$

$B_0 - B$

*ODD*

*DBL*

*VOL*



# TARGET DECOMPOSITIONS

[S]

## COHERENT DECOMPOSITION

E. KROGAGER  
(1990)

W.L. CAMERON  
(1990)

[K]

## TARGET DICHOTOMY

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(1970)

R.M. BARNES  
(1988)

[T]

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S.R. CLOUDE  
(1985)

W.A. HOLM  
(1988)

## EIGENVECTORS / EIGENVALUES ANALYSIS ENTROPY / ANISOTROPY

S.R. CLOUDE - E. POTTIER  
(1996-1997)

[C]

## AZIMUTHAL SYMMETRY

## MODEL BASED DECOMPOSITION

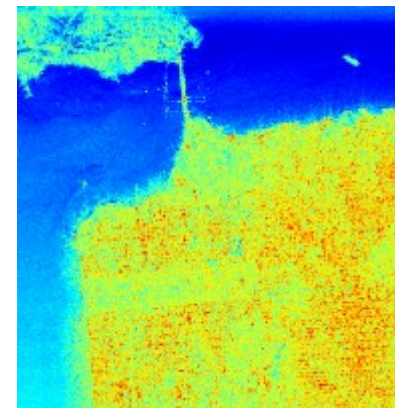
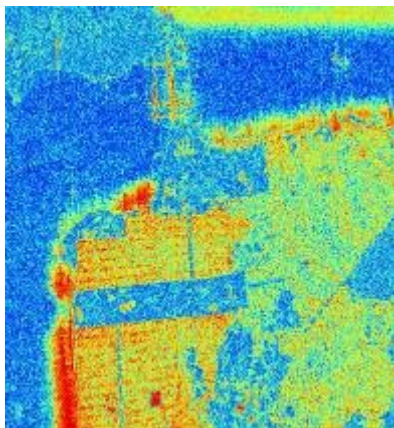
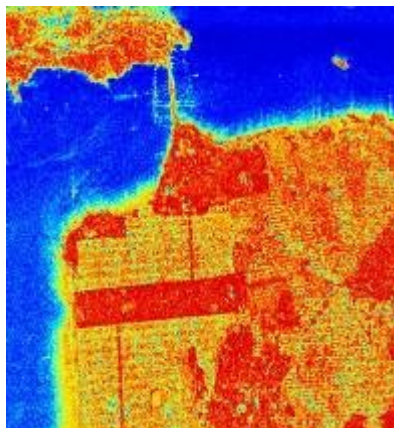
A.J. FREEMAN – S.L. DURDEN (1992)  
Y. YAMAGUSHI (2005 - 2012), AN  
(2010)

## EIGENVECTORS / EIGENVALUES ANALYSIS & MODEL BASED DECOMPOSITION

J.J. VAN ZYL (1992-2008), M. ARII (2010)  
TSVM (R. TOUZI – 2007)



# THE $H/A/\alpha$ POLARIMETRIC TARGET DECOMPOSITION THEOREM



**S.R. CLOUDE - E. POTTIER (1995 - 1996)**

# H / A / $\alpha$ DECOMPOSITION

**TARGET VECTOR**  $\mathbf{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{XX} + S_{YY} & S_{XX} - S_{YY} & 2S_{XY} \end{bmatrix}^T$

**LOCAL ESTIMATE OF THE COHERENCY MATRIX**  $\langle [T] \rangle = \frac{1}{N} \sum_{i=1}^N \mathbf{k}_i \cdot \mathbf{k}_i^T = \frac{1}{N} \sum_{i=1}^N [T_i]$

## EIGENVECTORS / EIGENVALUES ANALYSIS

$$\langle [T] \rangle = [U_3][S][U_3]^{-1} = \begin{bmatrix} \underline{u}_1 & \underline{u}_2 & \underline{u}_3 \end{bmatrix} \begin{bmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \lambda_3 \end{bmatrix} \begin{bmatrix} \underline{u}_1 & \underline{u}_2 & \underline{u}_3 \end{bmatrix}^T$$

**ORTHOGONAL EIGENVECTORS**

**REAL EIGENVALUES**

$$\lambda_1 > \lambda_2 > \lambda_3$$



$$P_i = \frac{\lambda_i}{\sum_{k=1}^3 \lambda_k}$$

# H / A / $\underline{\alpha}$ DECOMPOSITION

$$\langle [T] \rangle = [U_3][S][U_3]^{-1} = \begin{bmatrix} \underline{u}_1 & \underline{u}_2 & \underline{u}_3 \end{bmatrix} \begin{bmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \lambda_3 \end{bmatrix} \begin{bmatrix} \underline{u}_1 & \underline{u}_2 & \underline{u}_3 \end{bmatrix}^T$$

ORTHOGONAL  
EIGENVECTORS

REAL EIGENVALUES

$$\lambda_1 > \lambda_2 > \lambda_3$$



## PARAMETERISATION OF THE SU(3) UNITARY MATRIX

$$[U_3] = \begin{bmatrix} \cos \alpha_1 e^{j\varphi_1} & \cos \alpha_2 e^{j\varphi_2} & \cos \alpha_3 e^{j\varphi_3} \\ \sin \alpha_1 \cos \beta_1 e^{j\varphi_1} e^{j\delta_1} & \sin \alpha_2 \cos \beta_2 e^{j\varphi_2} e^{j\delta_2} & \sin \alpha_3 \cos \beta_3 e^{j\varphi_3} e^{j\delta_3} \\ \sin \alpha_1 \sin \beta_1 e^{j\varphi_1} e^{j\gamma_1} & \sin \alpha_2 \sin \beta_2 e^{j\varphi_2} e^{j\gamma_2} & \sin \alpha_3 \sin \beta_3 e^{j\varphi_3} e^{j\gamma_3} \end{bmatrix}$$

TARGET 1
TARGET 2
TARGET 3



# H / A / $\underline{\alpha}$ DECOMPOSITION

## PROBABILITIES

$$P_i = \frac{\lambda_i}{\sum_{k=1}^3 \lambda_k}$$



## AVERAGED PARAMETERS

$$\begin{aligned} \underline{\alpha} &= P_1 \alpha_1 + P_2 \alpha_2 + P_3 \alpha_3 & \underline{\beta} &= P_1 \beta_1 + P_2 \beta_2 + P_3 \beta_3 \\ \underline{g} &= P_1 g_1 + P_2 g_2 + P_3 g_3 & \underline{d} &= P_1 d_1 + P_2 d_2 + P_3 d_3 \end{aligned}$$



## UNITARY TARGET VECTOR ( $\underline{u}_0$ ) OF THE MEAN DOMINANT MECHANISM

$$\underline{u}_0 = \left[ \cos(\alpha) \quad \sin(\alpha) \cos(\beta) e^{j\underline{d}} \quad \sin(\alpha) \sin(\beta) e^{j\underline{g}} \right]^T$$

# H / A / $\alpha$ DECOMPOSITION

## MEAN SCATTERING MECHANISM

UNITARY VECTOR  $\underline{u}_0$

$$\underline{u}_0 = \begin{bmatrix} \cos(\underline{\alpha}) \\ \sin(\underline{\alpha}) \cos(\underline{\beta}) e^{j\underline{\delta}} \\ \sin(\underline{\alpha}) \sin(\underline{\beta}) e^{j\underline{\nu}} \end{bmatrix}$$

TARGET MAGNITUDE

$$\underline{\lambda} = P_1 \lambda_1 + P_2 \lambda_2 + P_3 \lambda_3 = \frac{\sum_{i=1}^3 \lambda_i^2}{\sum_{k=1}^3 \lambda_k}$$

TARGET VECTOR  $\underline{k}_0$

$$\underline{k}_0 = \frac{1}{\sqrt{\underline{\lambda}}} \begin{bmatrix} \cos(\underline{\alpha}) \\ \sin(\underline{\alpha}) \cos(\underline{\beta}) e^{j\underline{\delta}} \\ \sin(\underline{\alpha}) \sin(\underline{\beta}) e^{j\underline{\nu}} \end{bmatrix}$$



# H / A / $\alpha$ DECOMPOSITION



$$2A_0$$

$$B_0 + B$$

$$B_0 - B$$

$$\sqrt{\lambda} \cos(\alpha)$$

$$\sqrt{\lambda} \sin(\alpha) \cos(\beta)$$

$$\sqrt{\lambda} \sin(\alpha) \sin(\beta)$$



# H / A / $\alpha$ DECOMPOSITION

## ROLL INVARIANCE PROPERTY

**SAME PHYSICAL PHENOMENOUS** WHATEVER THE ANTENNA  
ORIENTATION ANGLE AROUND THE **RADAR LINE OF SIGHT**

**ORIENTED ( $\theta$ ) COHERENCY MATRIX**

$$\langle [T(q)] \rangle = [U_R(q)] \langle [T] \rangle [U_R(q)]^{-1}$$

**SU(3) UNITARY ROTATION MATRIX ( $\theta$ )**

$$[U_R(q)] = \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos 2q & \sin 2q \\ 0 & -\sin 2q & \cos 2q \end{bmatrix}$$



**EIGENVECTORS / EIGENVALUES ANALYSIS**

$$\langle [T(q)] \rangle = [U_3(q)] [S] [U_3(q)]^{-1}$$



**EIGENVALUES  $\lambda_1$   $\lambda_2$   $\lambda_3$  : ROLL INVARIANT**

**PROBABILITIES  $P_1$   $P_2$   $P_3$  : ROLL INVARIANT**

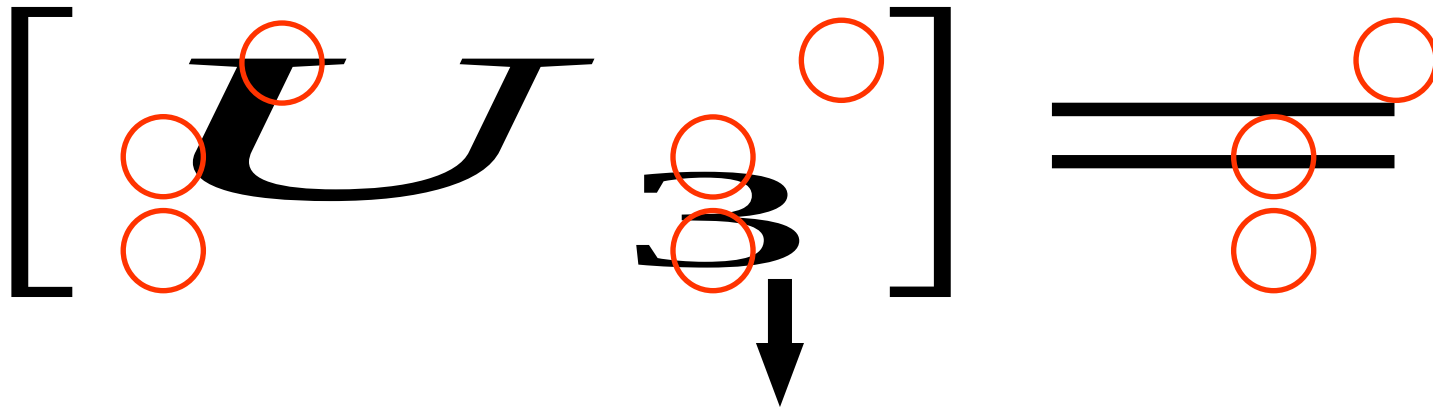
# H / A / $\underline{\alpha}$ DECOMPOSITION

## EIGENVECTORS UNITARY MATRIX

$$[U_3(q)] = [U_R(q)][U_3]$$



## PARAMETERIZATION OF THE UNITARY MATRIX



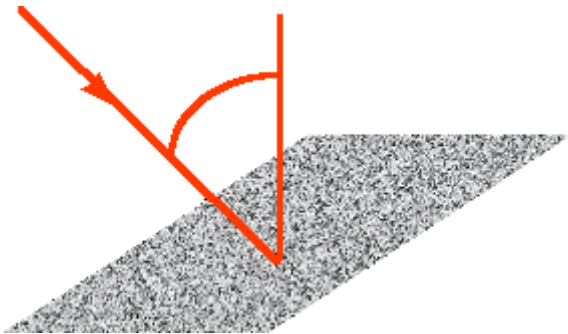
$$\underline{\alpha} = P_1 \alpha_1 + P_2 \alpha_2 + P_3 \alpha_3 \quad : \text{ROLL INVARIANT}$$

## PHYSICAL INTERPRETATION

# H / A / $\alpha$ DECOMPOSITION

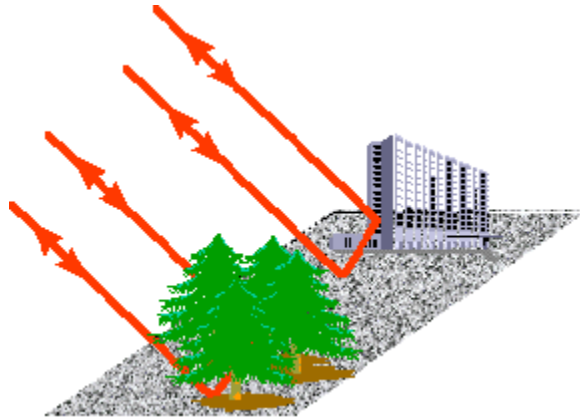
## $\alpha$ PHYSICAL INTERPRETATION

**SINGLE BOUNCE  
SCATTERING  
(ROUGH SURFACE)**



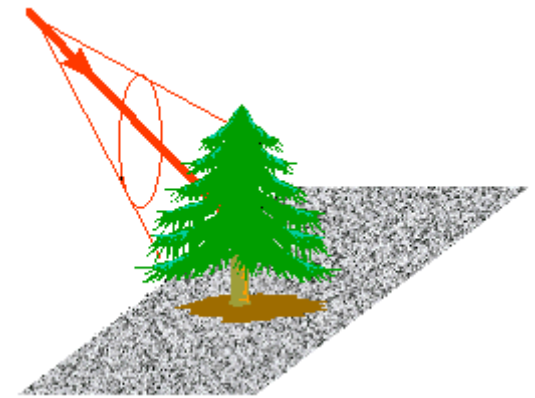
$$\alpha \rightarrow 0$$

**DOUBLE BOUNCE  
SCATTERING**



$$\alpha \rightarrow \frac{\pi}{2}$$

**VOLUME  
SCATTERING**



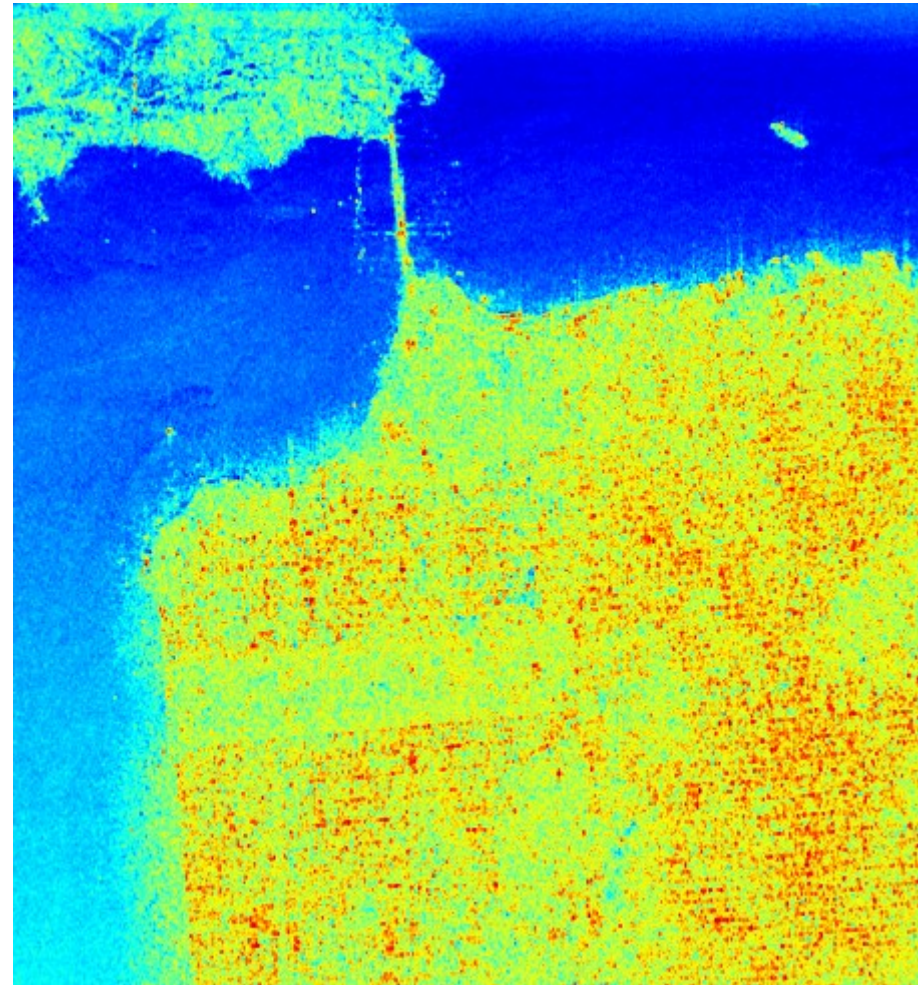
$$\alpha \rightarrow \frac{\pi}{4}$$

$$\underline{k}_0 = \sqrt{\lambda} \begin{bmatrix} \cos(\underline{\alpha}) \\ \sin(\underline{\alpha}) \cos(\underline{\beta}) e^{j\delta} \\ \sin(\underline{\alpha}) \sin(\underline{\beta}) e^{j\gamma} \end{bmatrix}$$

$$\underline{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{XX} + S_{YY} & S_{XX} - S_{YY} & 2S_{XY} \end{bmatrix}^T$$



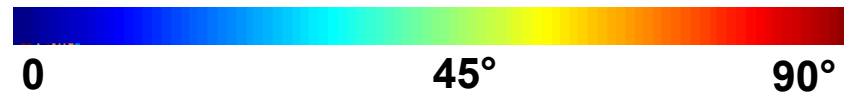
# H / A / $\alpha$ DECOMPOSITION



$2A_0$

$B_0 + B$

$B_0 - B$



$\alpha$  PARAMETER

Isae  
SUPERO

CESBIO

IETR



# H / A / $\alpha$ DECOMPOSITION

EIGENVALUES  $\lambda_1 \lambda_2 \lambda_3$  : ROLL INVARIANT

PROBABILITIES  $P_1 P_2 P_3$  : ROLL INVARIANT



**ENTROPY**

(DEGREE OF RANDOMNESS  
STATISTICAL DISORDER)

$$H = - \sum_{i=1}^3 P_i \log_3(P_i)$$



**PURE TARGET**

$$\lambda_1 = SPAN \quad \lambda_2 = 0 \quad \lambda_3 = 0$$

$$H = 0$$



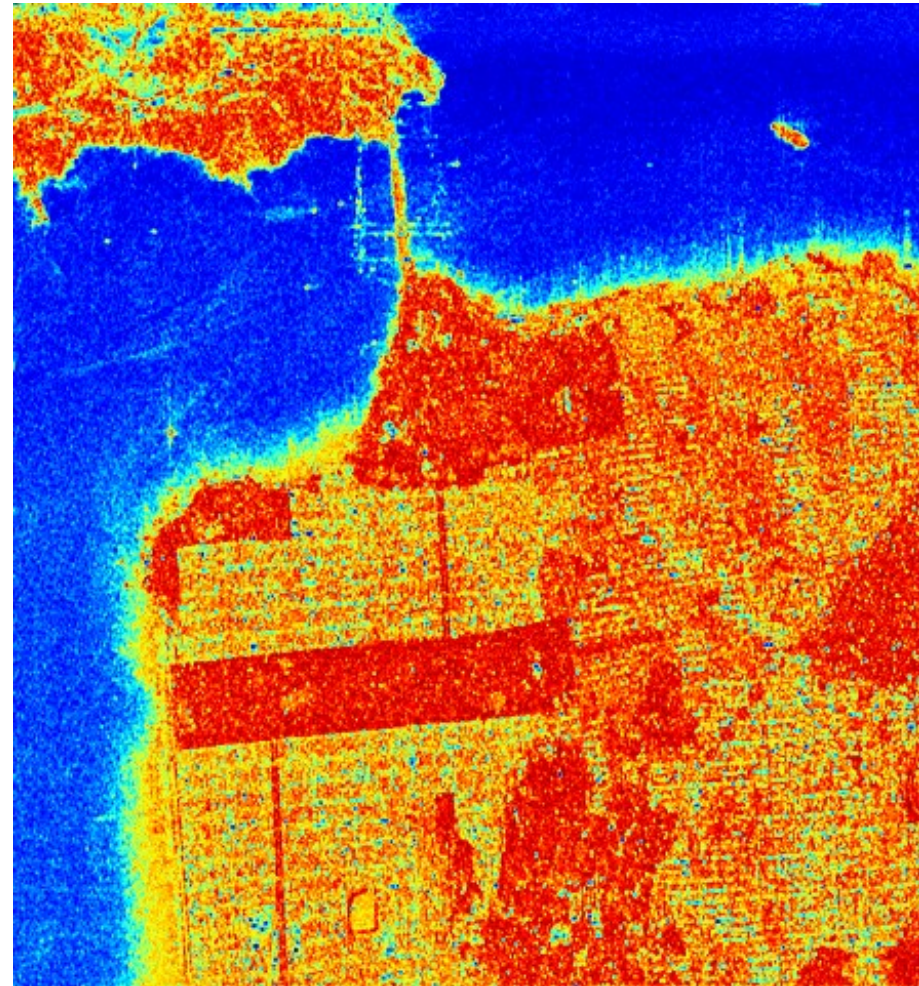
**DISTRIBUTED TARGET**

$$\lambda_1 = \lambda_2 = \lambda_3 = SPAN / 3$$

$$H = 1$$



# H / A / $\alpha$ DECOMPOSITION



$2A_0$

$B_0+B$

$B_0-B$



ENTROPY (H)



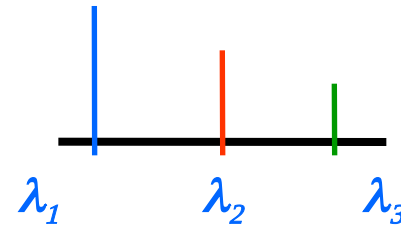
# H / A / $\alpha$ DECOMPOSITION

DIFFICULT MECHANISM DISCRIMINATION WHEN :  $H > 0.7$



**ANISOTROPY**  
(EIGENVALUES SPECTRUM)

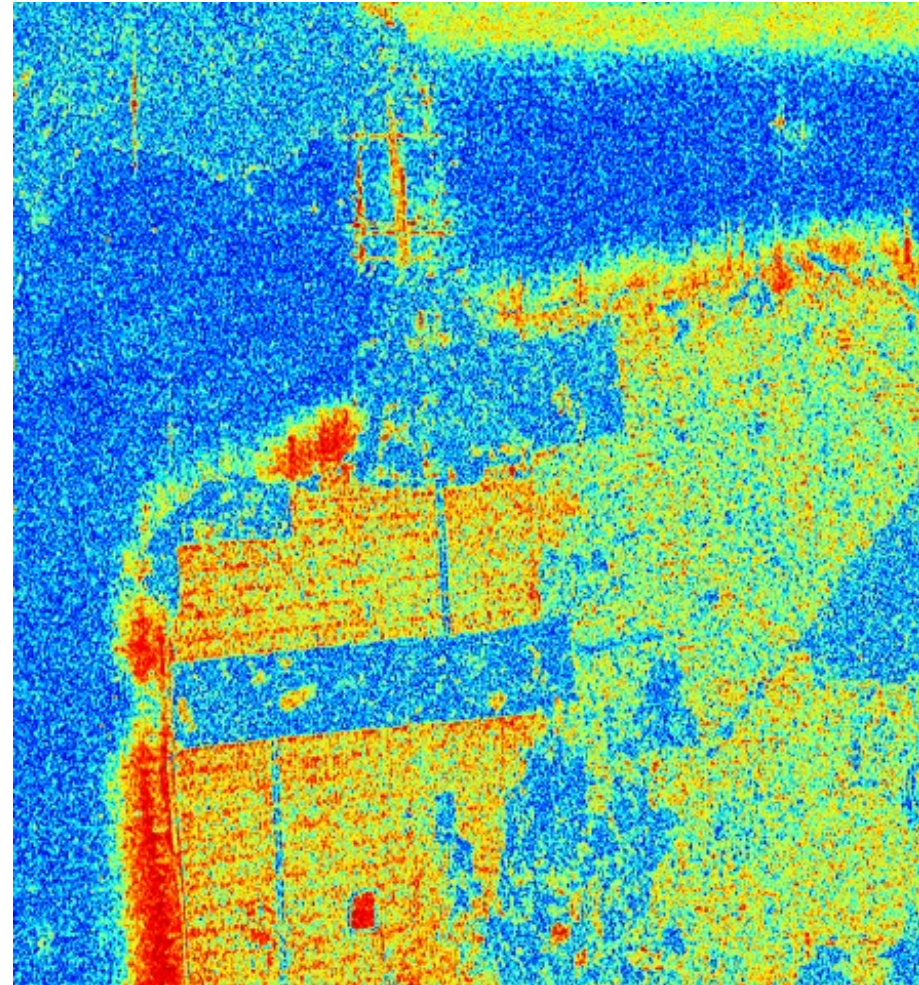
$$A = \frac{\lambda_2 - \lambda_3}{\lambda_2 + \lambda_3}$$



- ➔ **COMPLEMENTARY TO ENTROPY**
- ➔ **DISCRIMINATION WHEN  $H > 0.7$**
- ➔ **ROLL INVARIANT**



# H / A / $\alpha$ DECOMPOSITION



$2A_0$

$B_0 + B$

$B_0 - B$



ANISOTROPY (A)

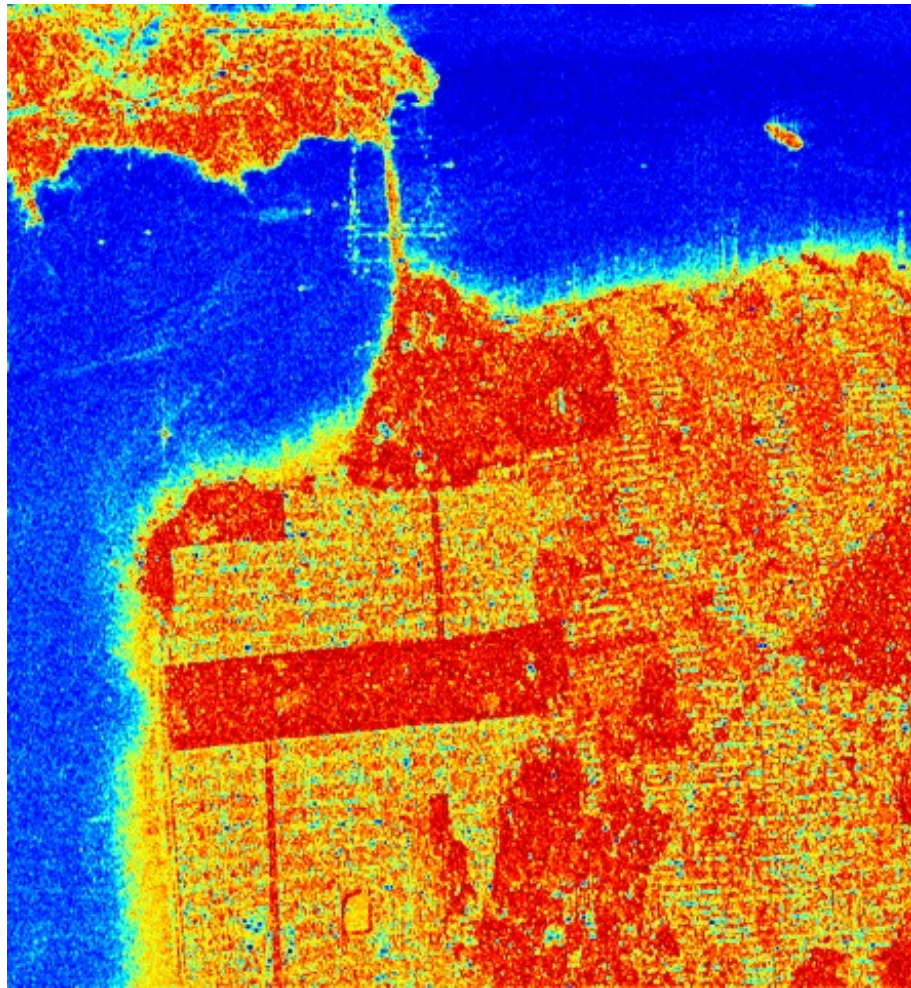
isae  
SUPAERO

CESBIO

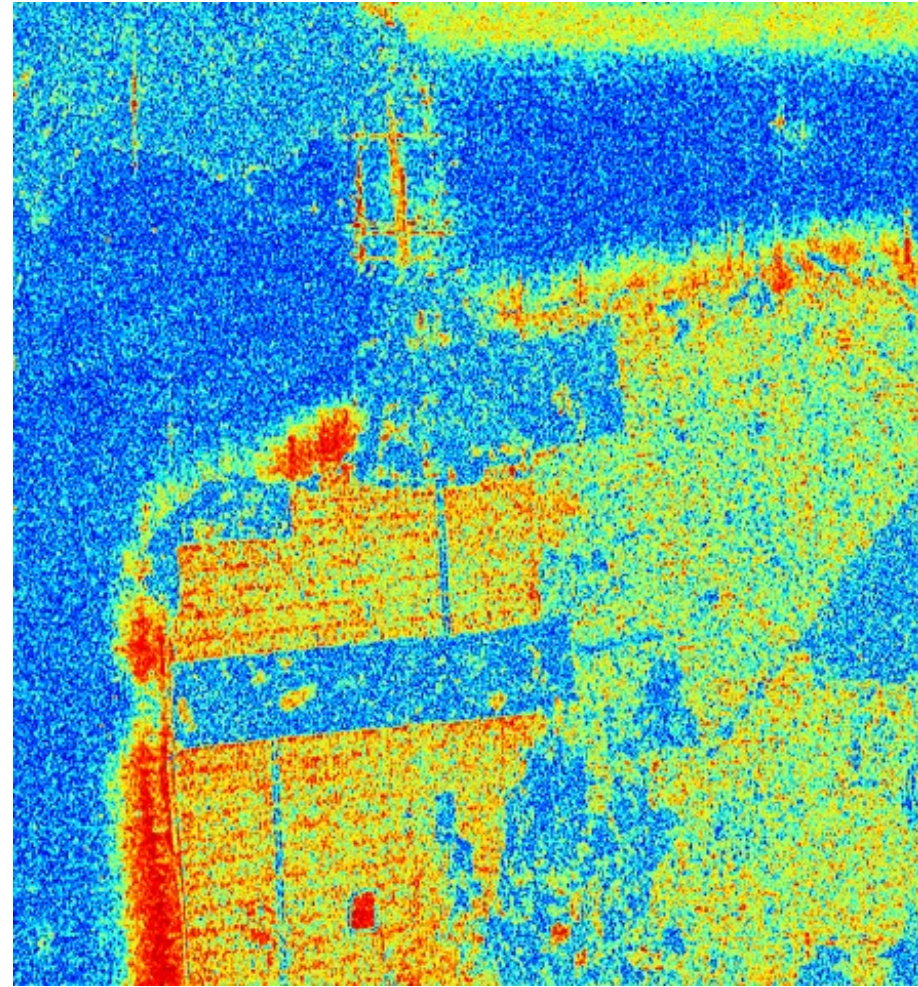
IETR



# H / A / $\alpha$ DECOMPOSITION



ENTROPY (H)

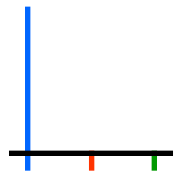


ANISOTROPY (A)



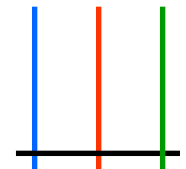
# H / A / $\alpha$ DECOMPOSITION

$(1-H)(1-A)$



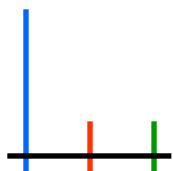
1 MECHANISM

H(1-A)



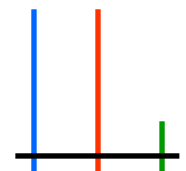
3 MECHANISMS

A(1-H)

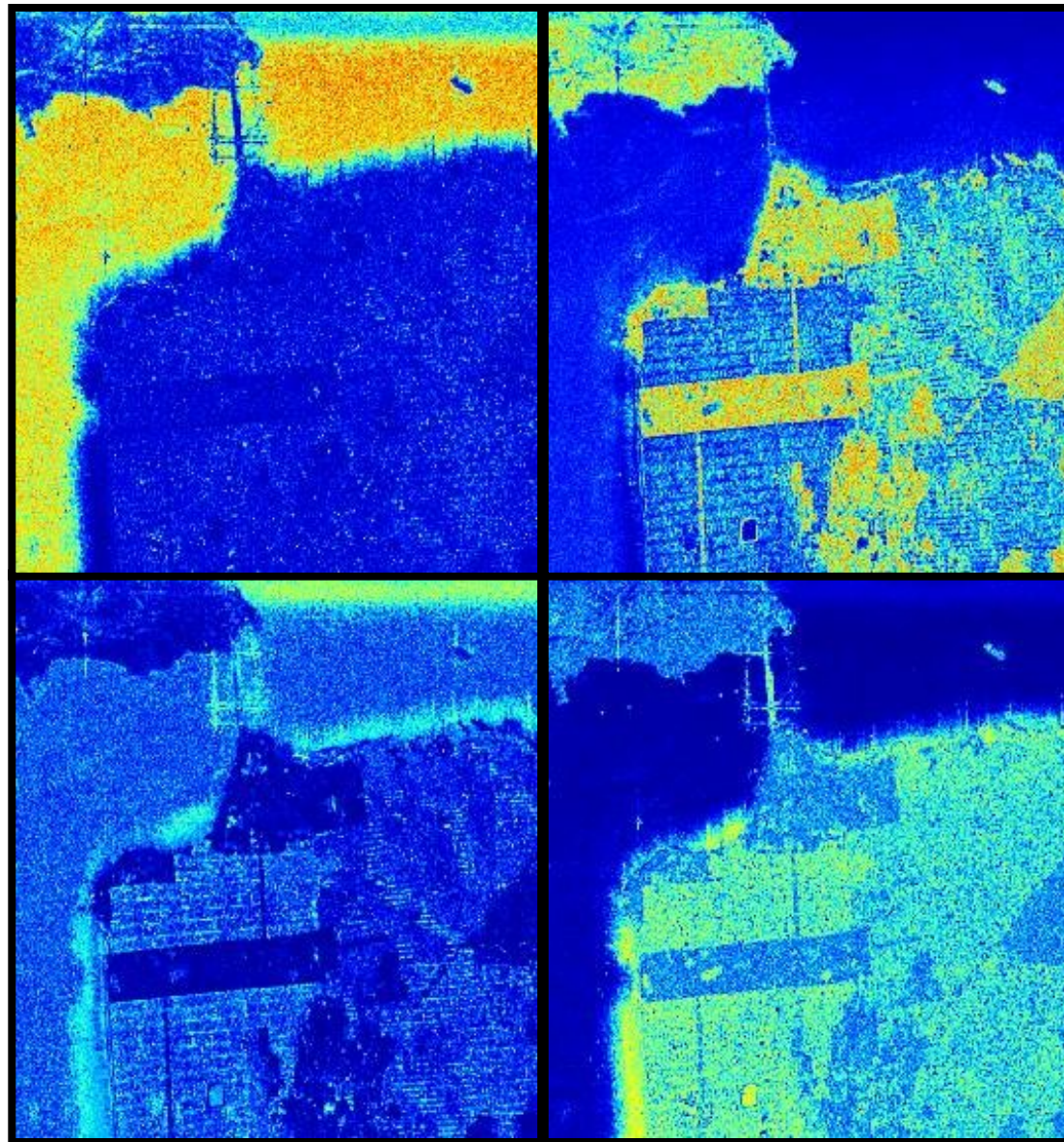


2 MECHANISMS

HA



2 MECHANISMS



# EIGENVALUE-BASED PARAMETERS



S. Allain

## S.E.R.D and D.E.R.D PARAMETERS

(Single- and Double-bounce Eigenvalue Relative Difference)

$$SERD = \frac{\lambda_S - \lambda_{3_{NOS}}}{\lambda_S + \lambda_{3_{NOS}}} \quad DERD = \frac{\lambda_D - \lambda_{3_{NOS}}}{\lambda_D + \lambda_{3_{NOS}}}$$



T. Ainsworth

## POLARIZATION FRACTION

$$PF = 1 - \frac{3\lambda_3}{Span} = 1 - \frac{3\lambda_3}{\lambda_1 + \lambda_2 + \lambda_3} \quad 0 \leq PF \leq 1$$

## POLARIZATION ASYMMETRY

$$PA = \frac{(\lambda_1 - \lambda_3) - (\lambda_2 - \lambda_3)}{(\lambda_1 - \lambda_3) + (\lambda_2 - \lambda_3)} = \frac{\lambda_1 - \lambda_2}{Span - 3\lambda_3} \quad 0 \leq PA \leq 1$$

# EIGENVALUE-BASED PARAMETERS



J. Van Zyl

## RADAR VEGETATION INDEX

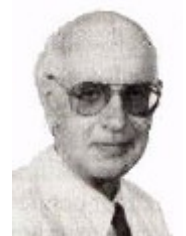
$$RVI = \frac{4 \lambda_3}{\lambda_1 + \lambda_2 + \lambda_3} \quad 0 \leq RVI \leq \frac{4}{3}$$



S.L. Durden

## PEDESTAL HEIGHT

$$PH = \frac{\min(\lambda_1, \lambda_2, \lambda_3)}{\max(\lambda_1, \lambda_2, \lambda_3)} = \frac{\lambda_3}{\lambda_1} \quad 0 \leq PH \leq 1$$



E. Luneburg

## TARGET RANDOMNESS

$$P_R = \sqrt{\frac{3}{2}} \sqrt{\frac{\lambda_2^2 + \lambda_3^2}{\lambda_1^2 + \lambda_2^2 + \lambda_3^2}} \quad 0 \leq P_R \leq 1$$



# EIGENVALUE-BASED PARAMETERS

## ALTERNATIVE ENTROPY PARAMETERS DERIVATION

### Normalized Coherency Matrix

$$N_3 = \langle \mathbf{k}^{T*} \cdot \mathbf{k} \rangle^{-1}$$

$$H \approx 2.52 + 0.78 \log_3 (|N_3 + 0.16 I_{D3}|)$$

ENTROPY

### SHANNON POLARIMETRIC ENTROPY (2006)

$$SE = \log (\pi^3 e^3 |T_3|) = SE_I + SE_P$$

$$SE_I = 3 \log \left( \frac{\pi e I_T}{3} \right) = 3 \log \left( \frac{\pi e \mathbf{Tr}(T_3)}{3} \right)$$

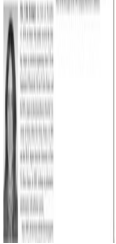
$$SE_P = \log (1 - p_T^2) = \log \left( 27 \frac{|T_3|}{\mathbf{Tr}(T_3)^3} \right)$$

INTENSITY

DEGREE OF  
POLARIZATION



J. Praks



E. Colin



J. Morio



P. Réfrégier



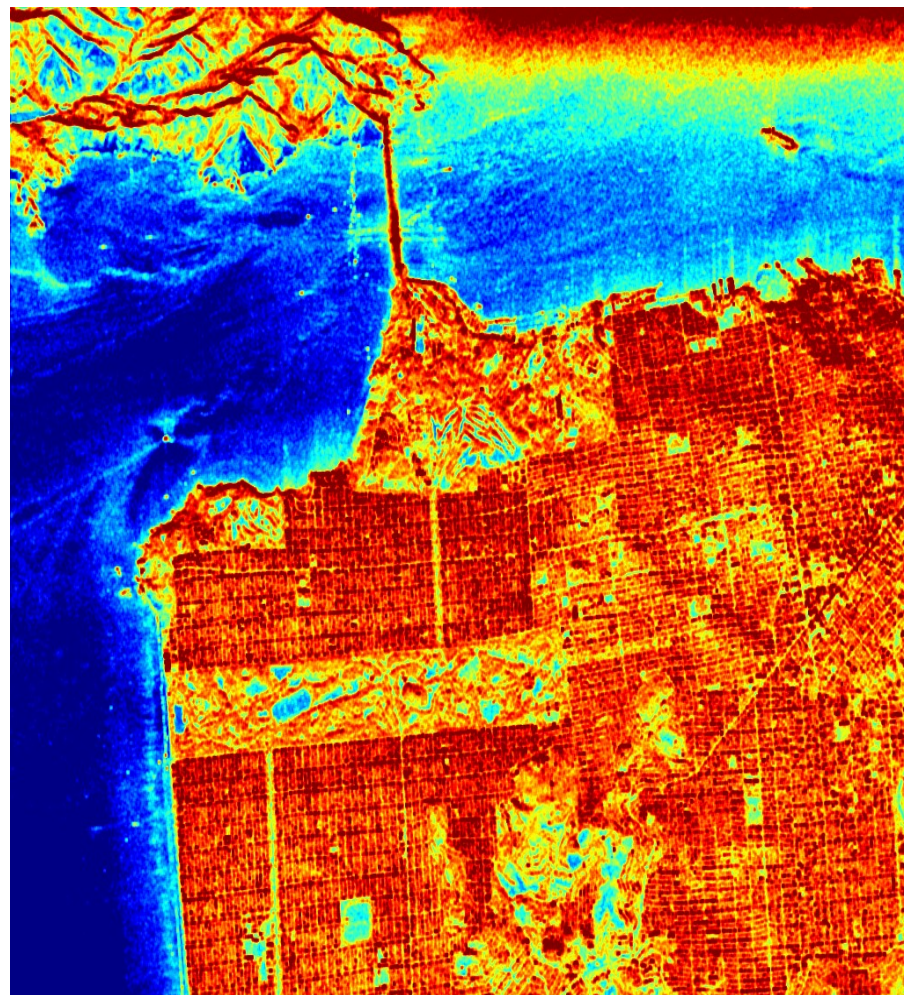
# EIGENVALUE-BASED PARAMETERS



$2A_0$

$B_0 + B$

$B_0 - B$



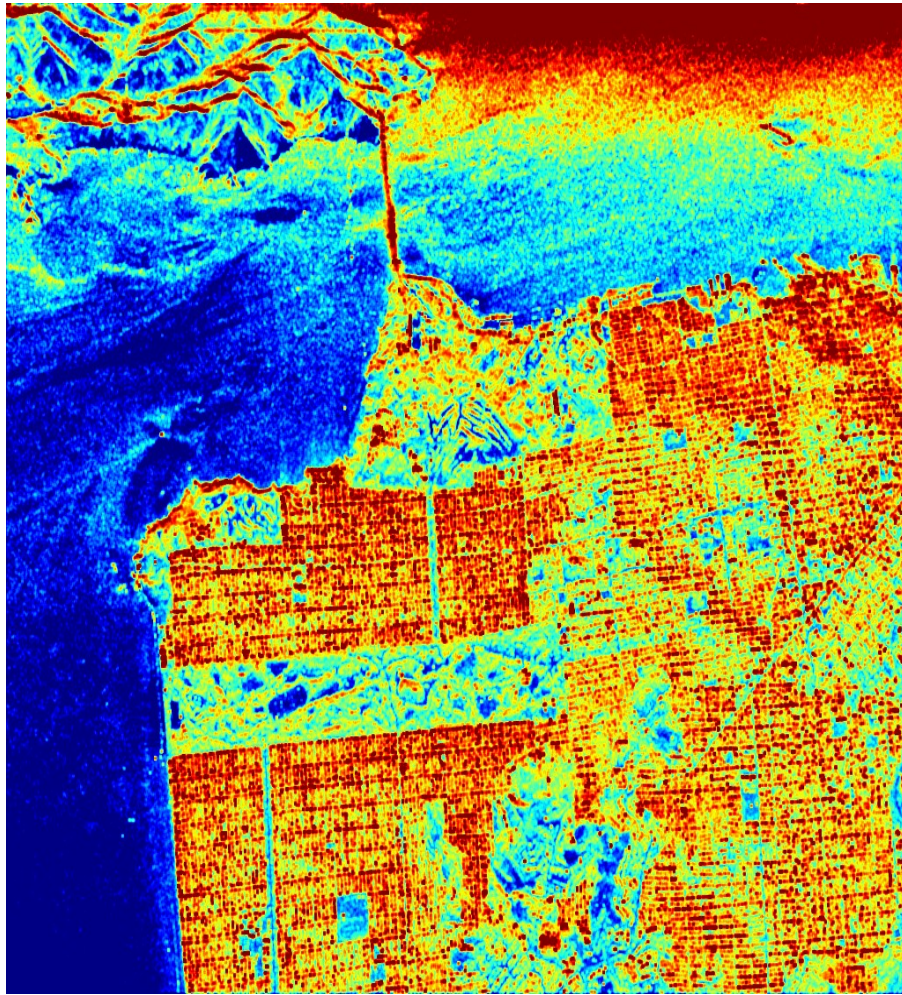
-13.0

1.0

SHANNON ENTROPY (SE-norm)



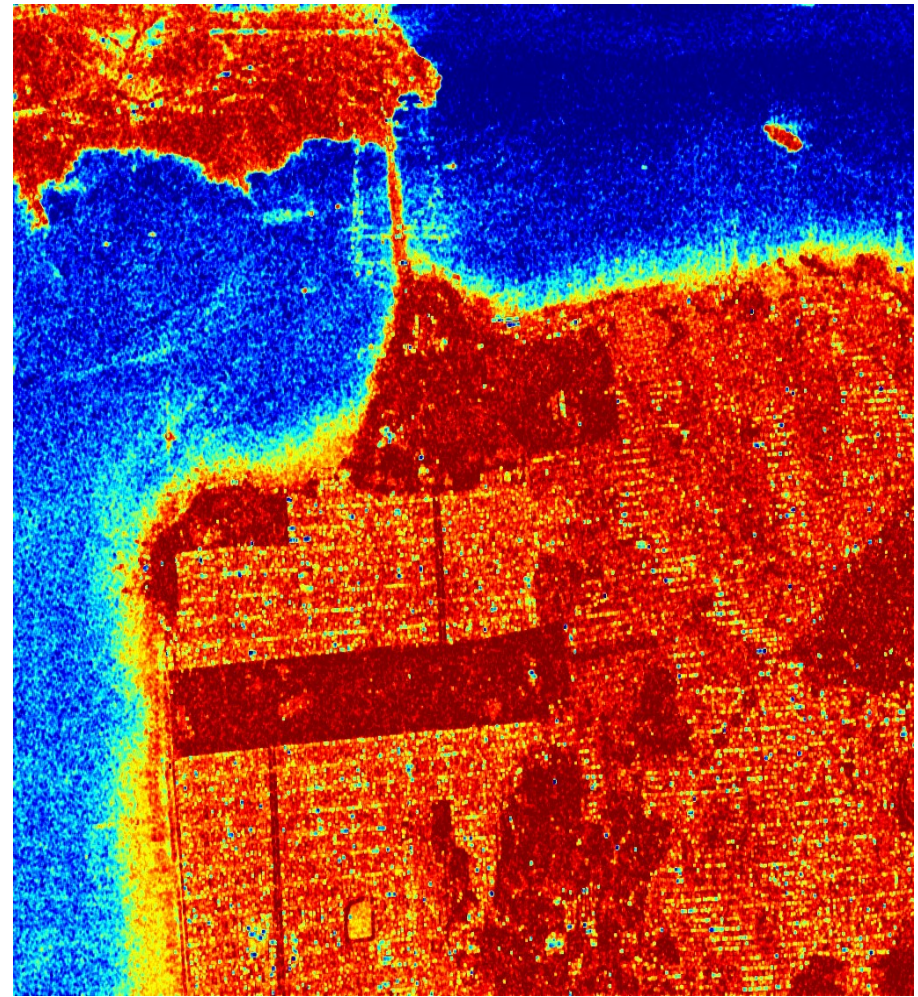
# EIGENVALUE-BASED PARAMETERS



-9.0

3.0

SHANNON ENTROPY (SE-I)



-6.0

0.0

SHANNON ENTROPY (SE-P)



# H / A / $\underline{\alpha}$ DECOMPOSITION

ENTROPY

$$H = - \sum_{i=1}^3 P_i \log_3(P_i)$$

$\underline{\alpha}$  PARAMETER

$$\underline{\alpha} = P_1 \alpha_1 + P_2 \alpha_2 + P_3 \alpha_3$$

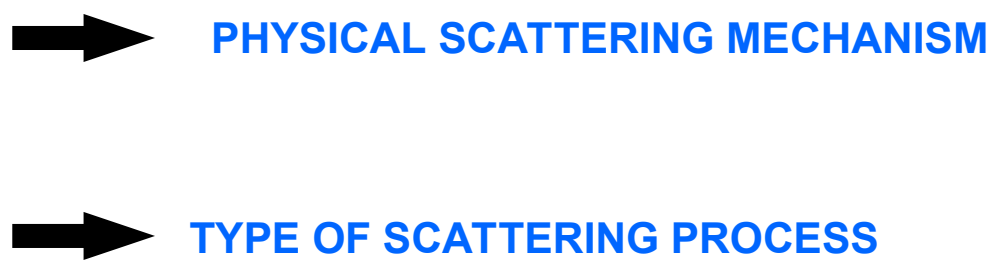
ANISOTROPY

$$A = \frac{\lambda_2 - \lambda_3}{\lambda_2 + \lambda_3}$$



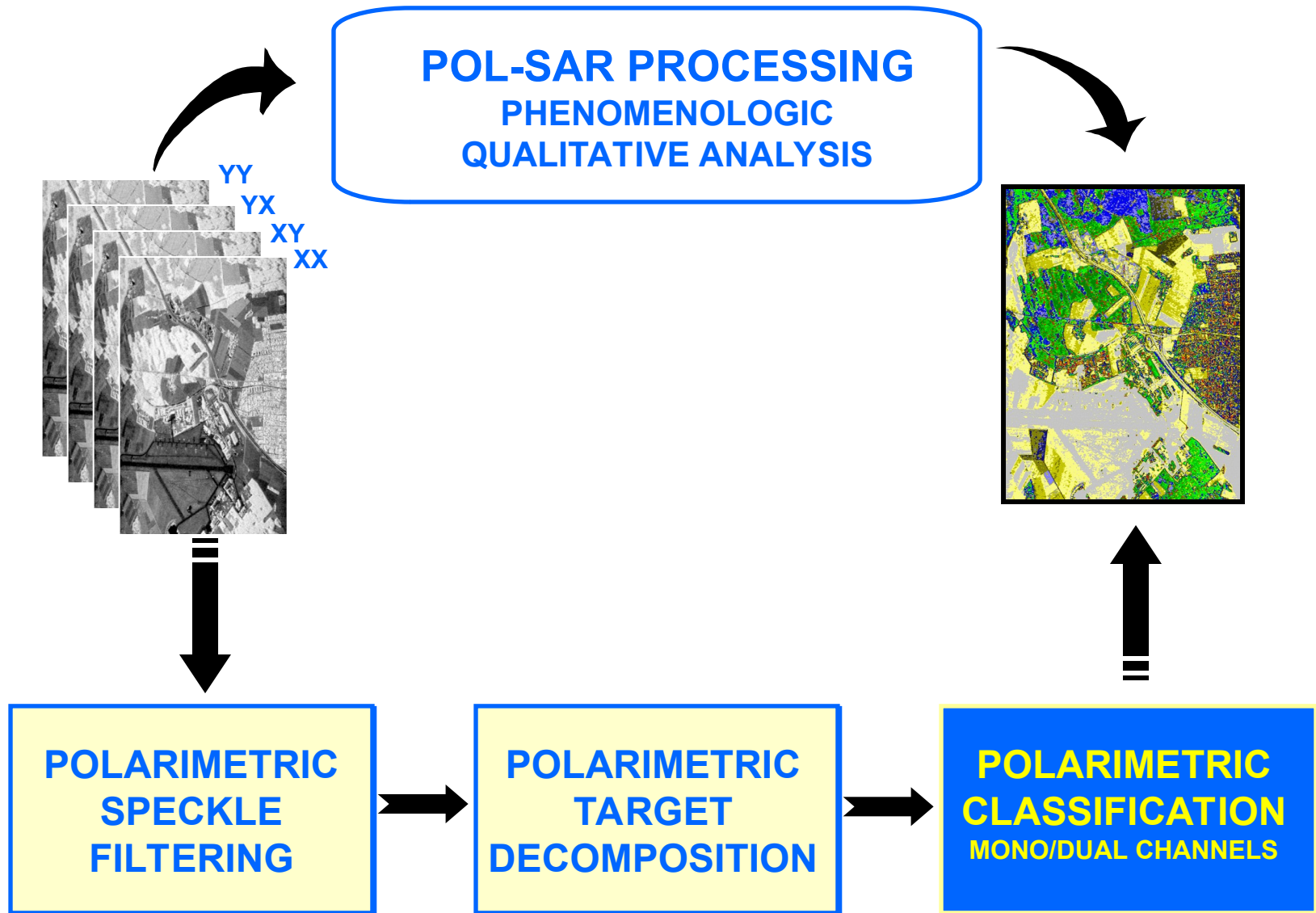
**3 ROLL INVARIANT PARAMETERS**

$$\underline{I} = \begin{bmatrix} \underline{\alpha} \\ H'A \\ H'(1-A) \\ (1-H)'A \\ (1-H)'(1-A) \end{bmatrix}$$



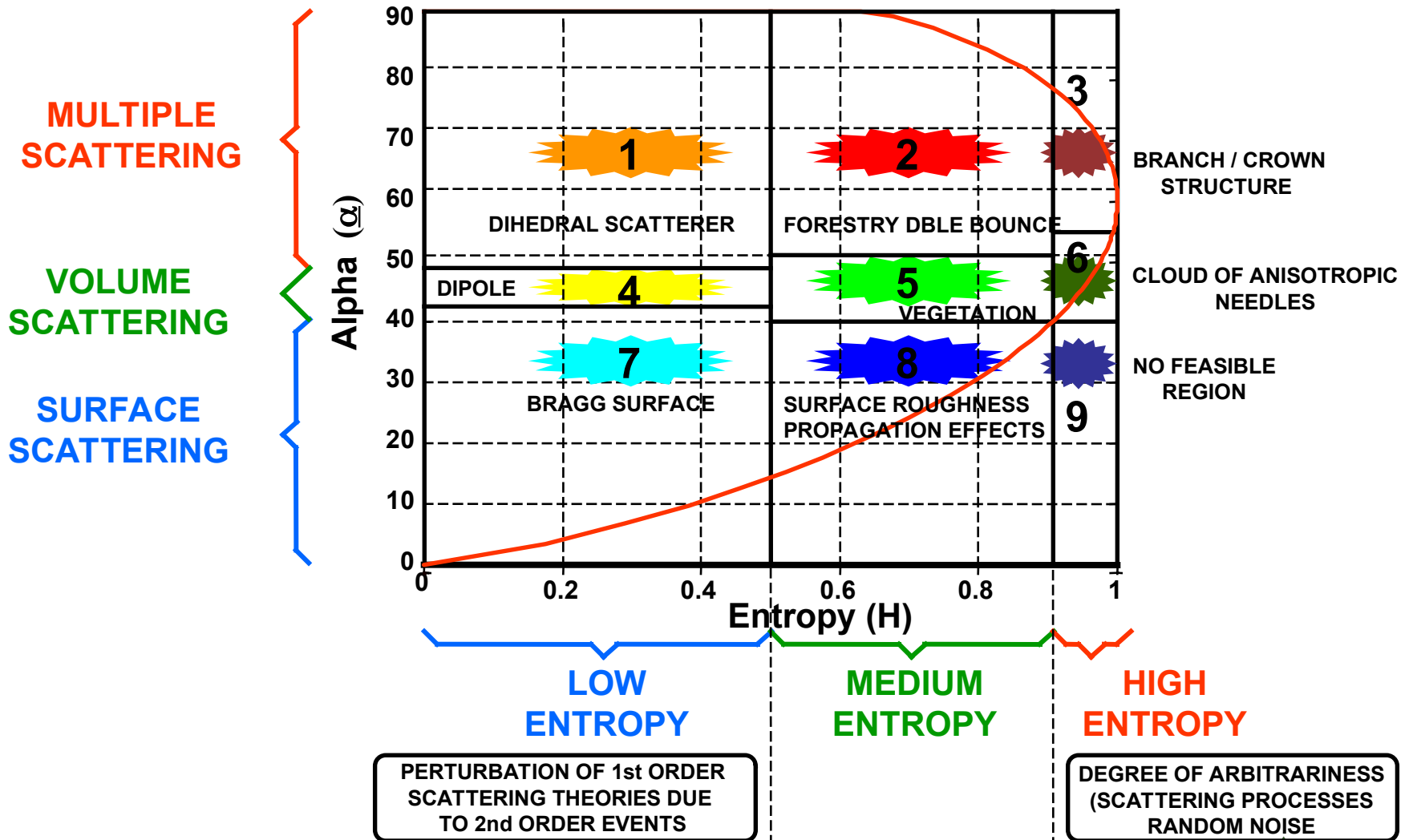
**SEGMENTATION / CLASSIFICATION**

# POLARIMETRIC REMOTE SENSING



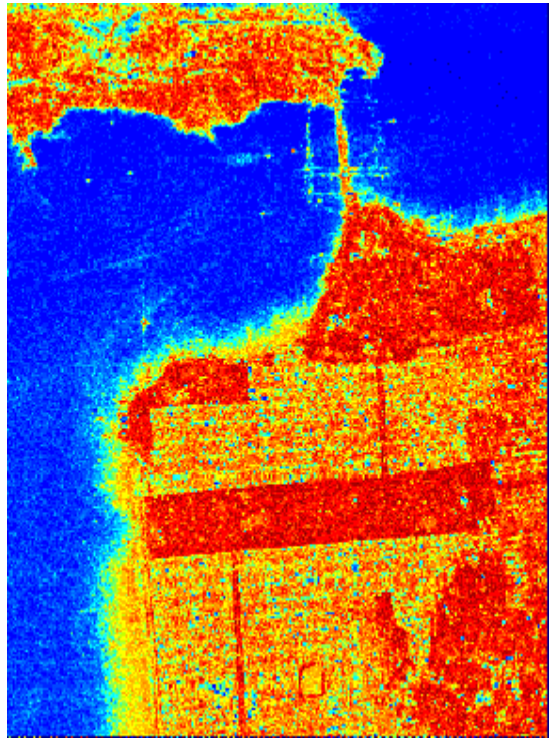
# H / $\alpha$ CLASSIFICATION

## SEGMENTATION OF THE H / $\alpha$ SPACE

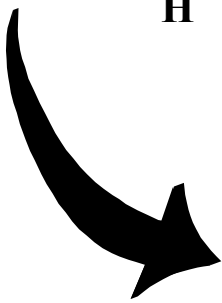




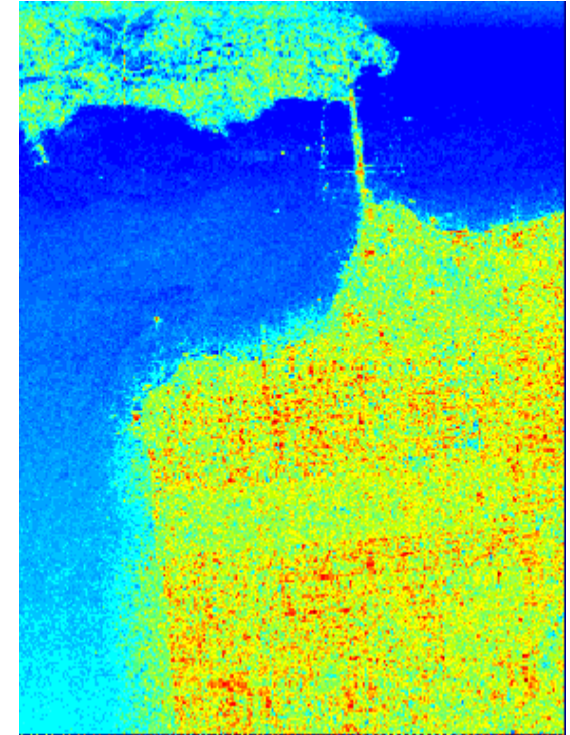
# H / $\alpha$ CLASSIFICATION



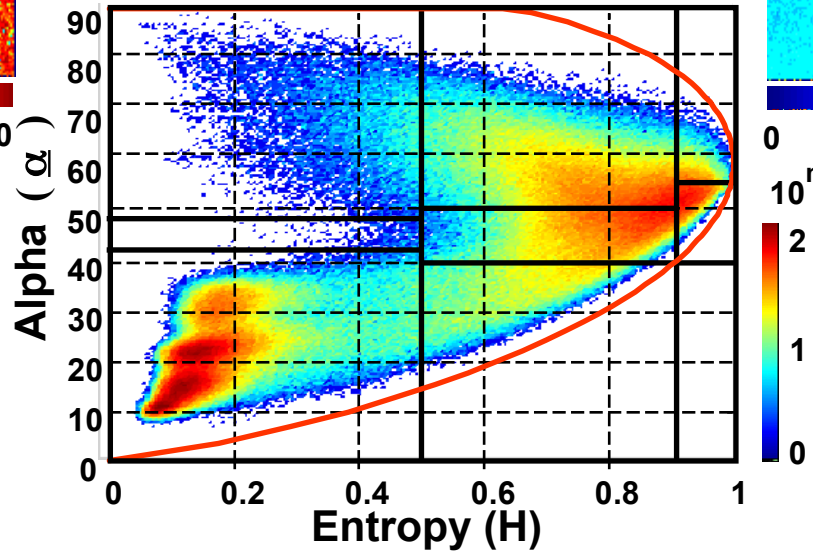
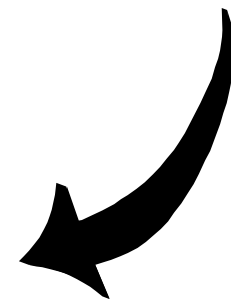
0 0.5 1.0  
H



POLARSAR DATA  
DISTRIBUTION  
IN THE  
H /  $\alpha$  PLANE



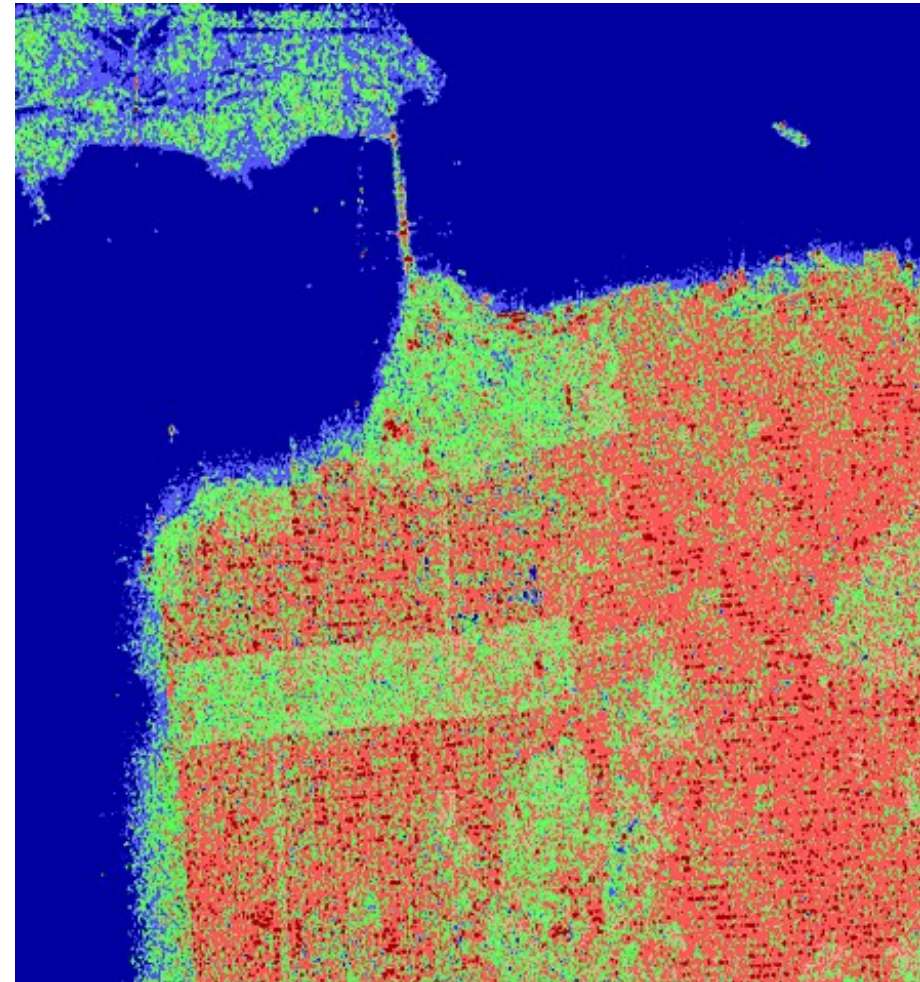
0 45° 90°  
 $\alpha$





# H / $\alpha$ CLASSIFICATION

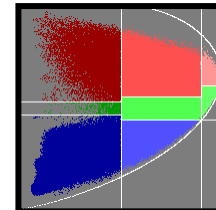
H -  $\alpha$  classification



$2A_0$

$B_0 + B$

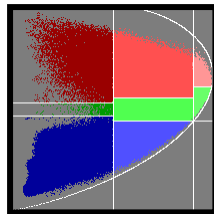
$B_0 - B$





# H / $\alpha$ CLASSIFICATION

H- $\alpha$  classification



H /  $\alpha$  Classification Space  
Sub-divided into 9 basic zones



Location of the boundaries  
is arbitrary and generically

Degree of arbitrariness on the  
setting of these boundaries



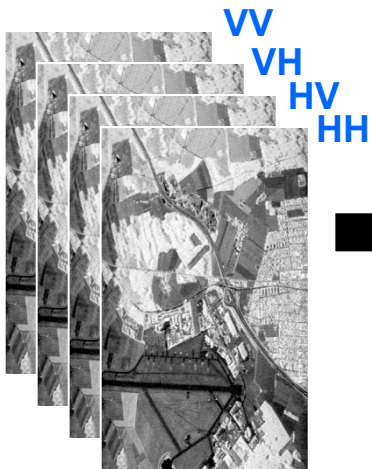
Segmentation is offered merely  
to illustrate the unsupervised  
classification strategy and to  
emphasize the geometrical  
segmentation of physical scattering  
processes



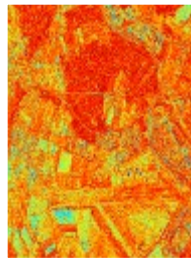
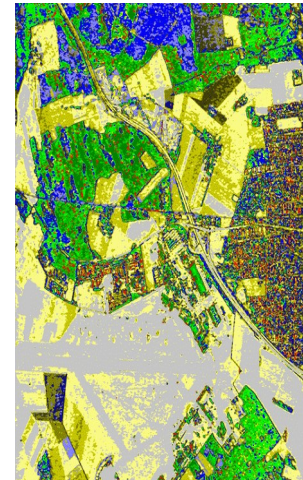
# POLARIMETRIC REMOTE SENSING

WISHART PDF

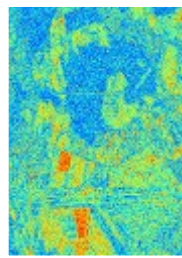
$$P(\langle [T] \rangle | [T_m]) = \frac{L^p |\langle [T] \rangle|^{L-p} e^{-L \text{Tr}([T_m]^{-1} \langle [T] \rangle)}}{\pi^{\frac{p(p-1)}{2}} \Gamma(L) \dots \Gamma(L-p+1) |[T_m]|^L}$$



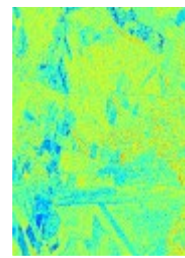
**UNSUPERVISED  
POLAR  
CLASSIFICATION**  
E.POTTIER, J.S LEE (2000)



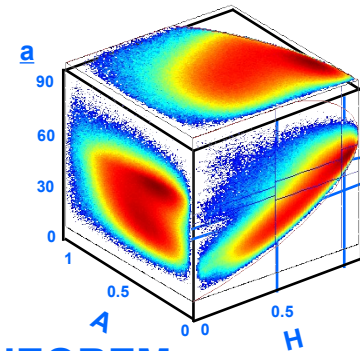
H



A



$\alpha$



H / A /  $\alpha$  DECOMPOSITION THEOREM

# WISHART CLASSIFIER

## Target Vector

$$\underline{\mathbf{X}} = \begin{bmatrix} S_{HH} & \sqrt{2} S_{HV} & S_{VV} \end{bmatrix}^T$$

$$P(\underline{\mathbf{X}}) = \frac{1}{\pi^3 \|\mathbf{C}\|} e^{-\mathbf{X}^T [\mathbf{C}]^{-1} \mathbf{X}}$$

$$\mathbf{k} = \frac{1}{\sqrt{2}} \begin{bmatrix} S_{HH} + S_{VV} & S_{HH} - S_{VV} & 2 S_{HV} \end{bmatrix}^T$$

$$P(\mathbf{k}) = \frac{1}{\pi^3 \|\mathbf{T}\|} e^{-\mathbf{k}^T [\mathbf{T}]^{-1} \mathbf{k}}$$

## Coherency Matrix

$$\langle [\mathbf{T}] \rangle = \frac{1}{N} \sum_{i=1}^N \underline{\mathbf{k}}_i \cdot \underline{\mathbf{k}}_i^T = \frac{1}{N} \sum_{i=1}^N [\mathbf{T}_i]$$

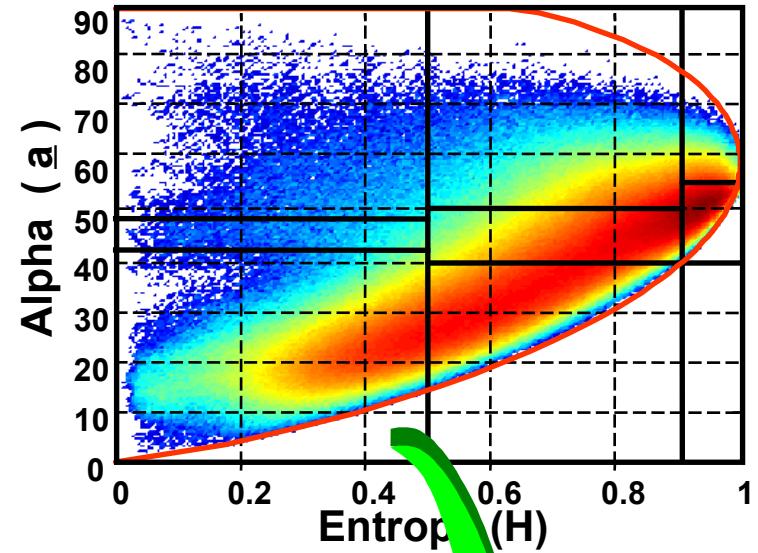
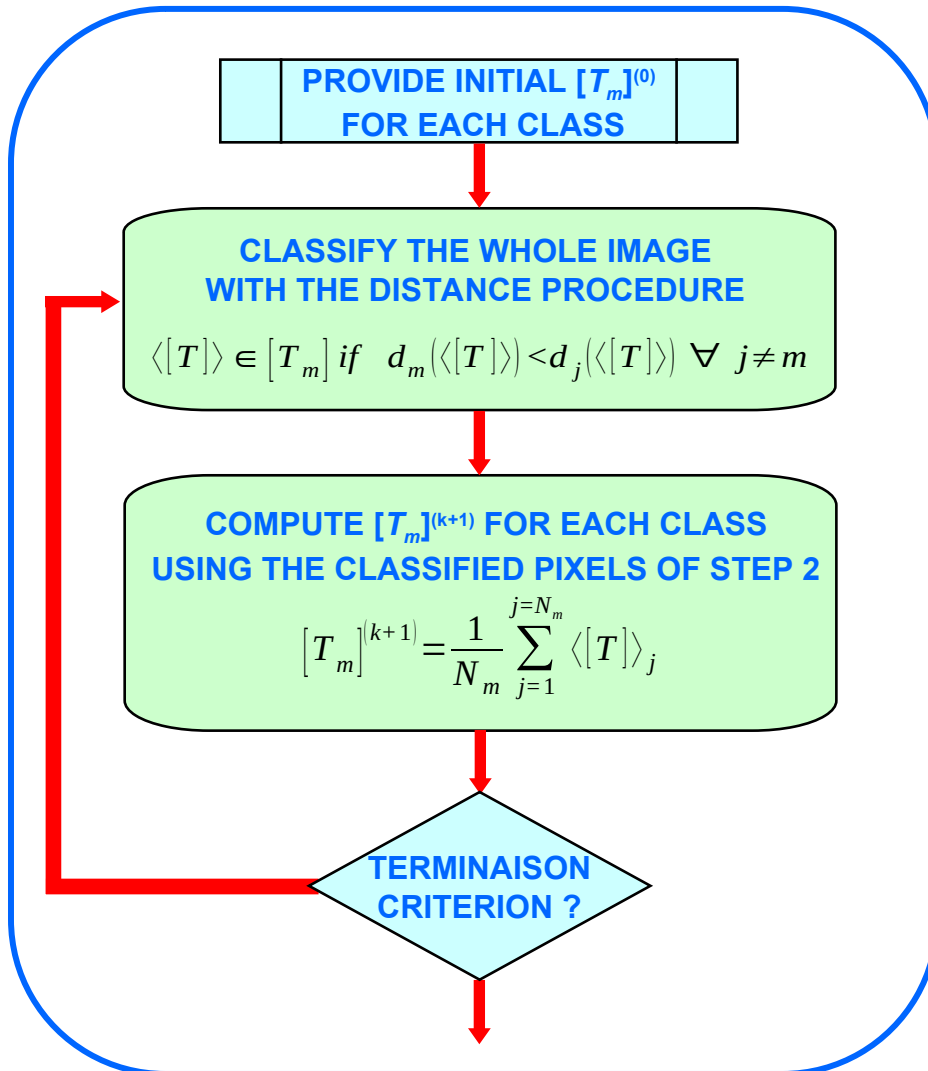
$$P(\langle [\mathbf{T}] \rangle / [\mathbf{T}_m]) = \frac{L^{Lp} |\langle [\mathbf{T}] \rangle|^{L-p} e^{-L \text{Tr}([\mathbf{T}_m]^{-1} \langle [\mathbf{T}] \rangle)}}{\pi^{\frac{p(p-1)}{2}} \Gamma(L) \dots \Gamma(L-p+1) \|\mathbf{T}_m\|^L}$$

## COMPLEX WISHART DISTRIBUTION

L: Number of Look      p: Polarimetric Dimension

# H / $\alpha$ - WISHART CLASSIFIER

## k - mean CLASSIFICATION PROCEDURE



$$[T_m]^{(0)} = \frac{1}{N_m} \sum_{k=1}^{k=N_m} \langle [T] \rangle_k$$

Cluster Center of the class  $m$   
(Lee 1998)



# H / $\alpha$ - WISHART CLASSIFIER

SAN FRANCISCO BAY JPL - AIRSAR L-band 1988



4th ITERATION



$2A_0$

$B_0 + B$

$B_0 - B$

C1

C2

C3

C4

C5

C6

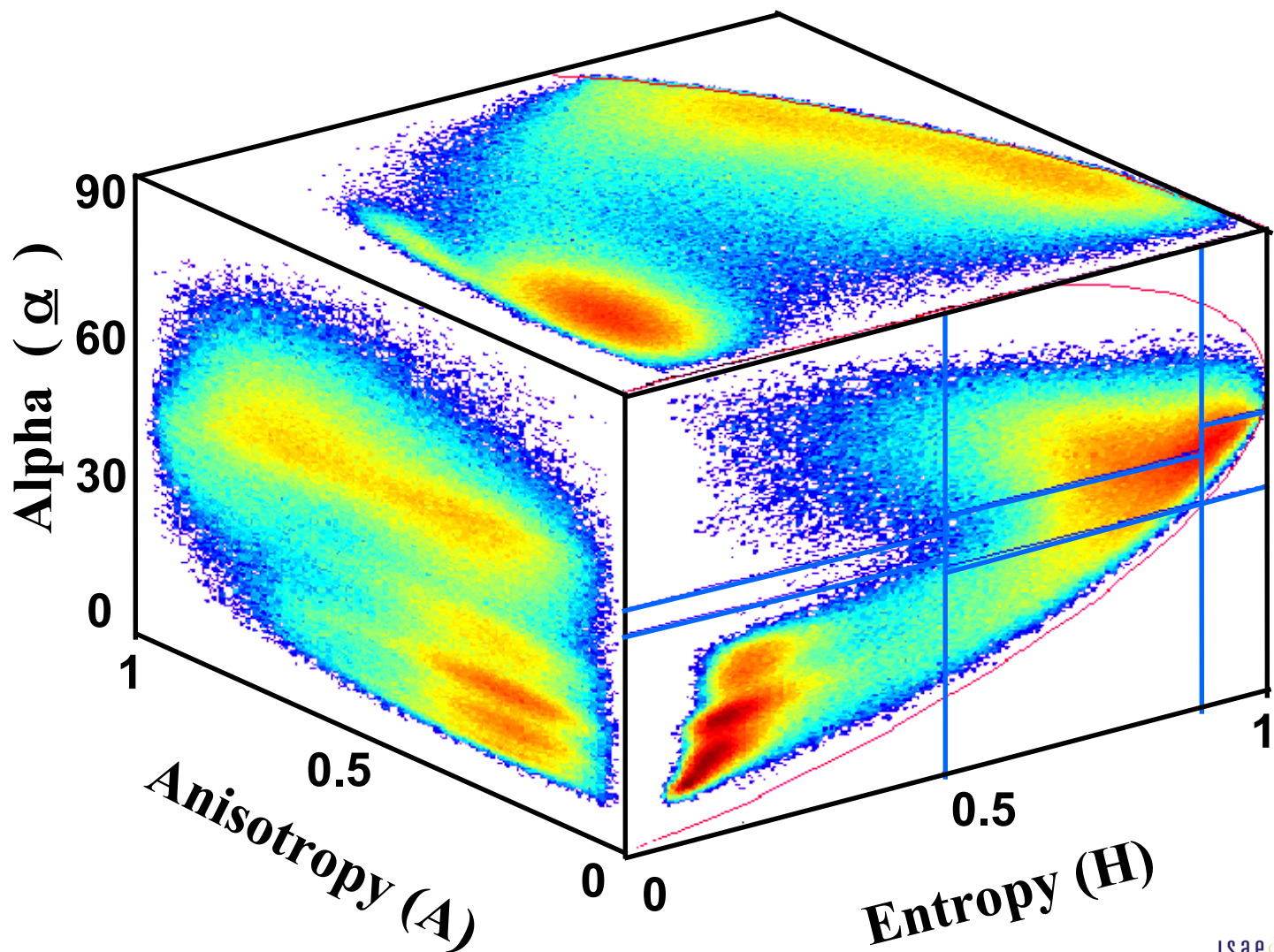
C7

C8



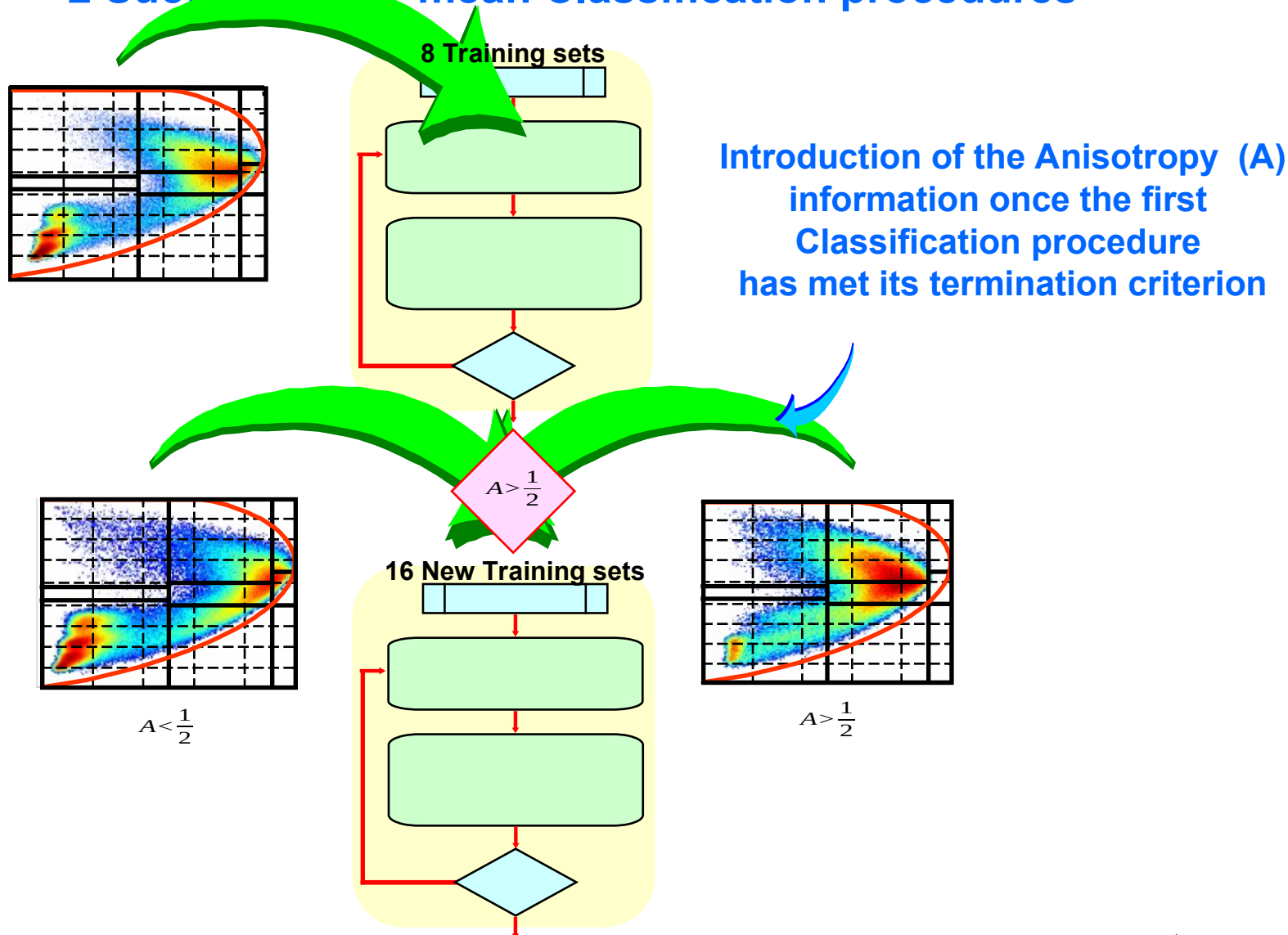
# H / A / $\alpha$ - WISHART CLASSIFIER

## POLSAR DATA DISTRIBUTION IN THE H / A / $\alpha$ SPACE



# H / A / $\alpha$ - WISHART CLASSIFIER

## 2 Successive k - mean Classification procedures



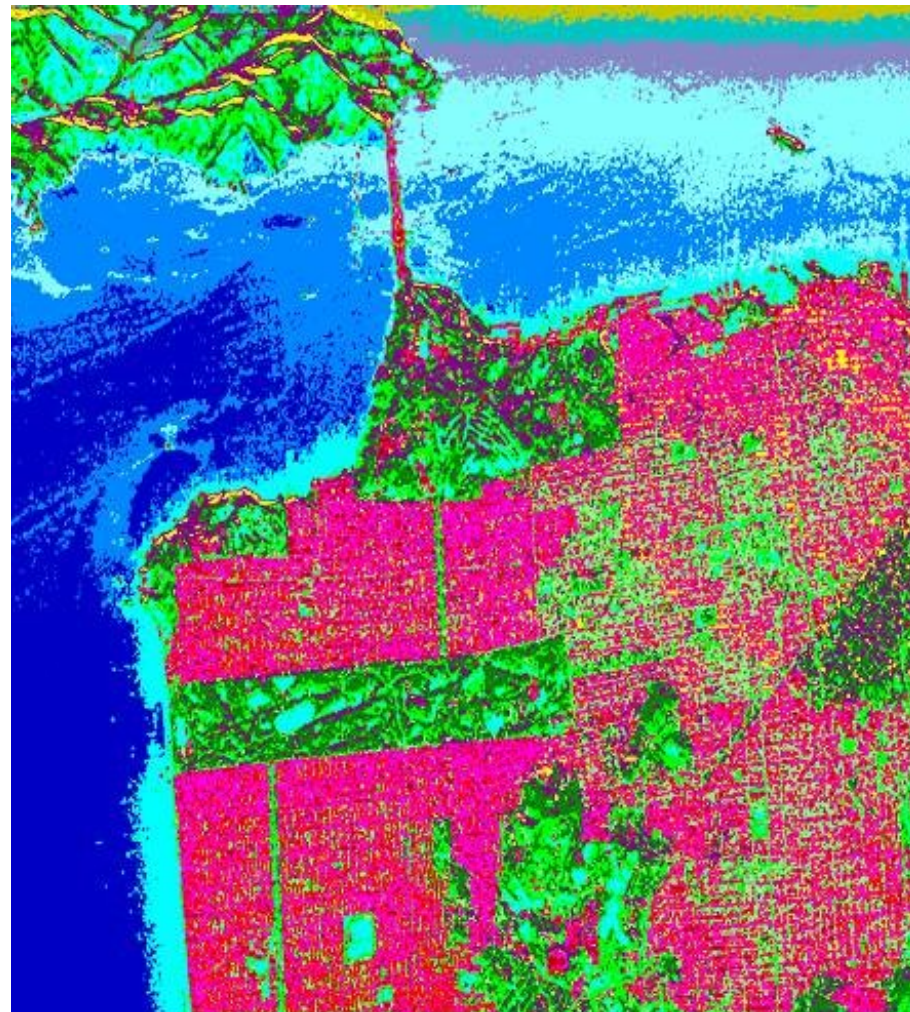


# H / A / $\alpha$ - WISHART CLASSIFIER

SAN FRANCISCO BAY JPL - AIRSAR L-band 1988



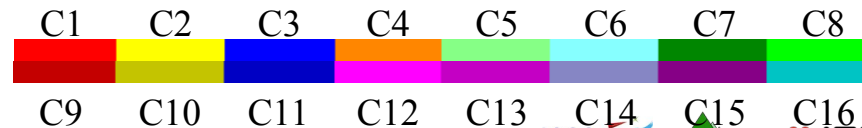
4th ITERATION



$2A_0$

$B_0 + B$

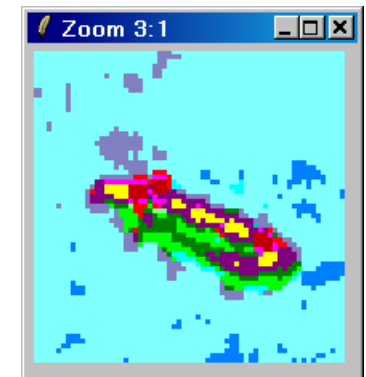
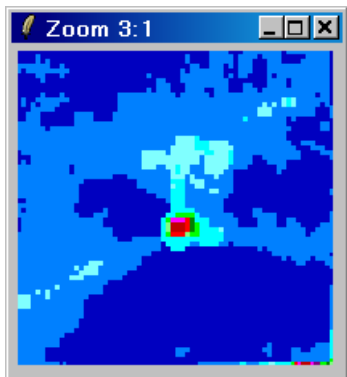
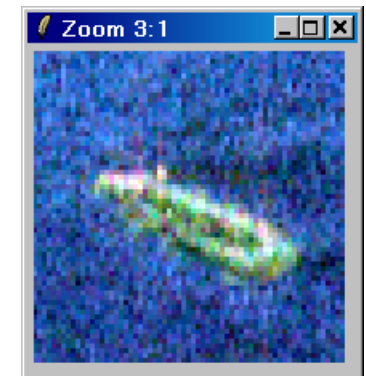
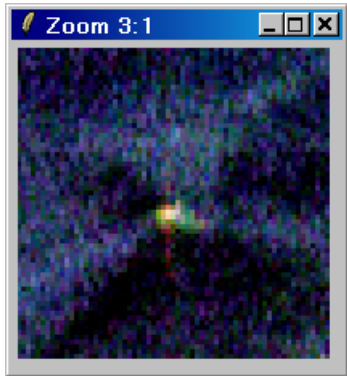
$B_0 - B$





# H / A / $\alpha$ - WISHART CLASSIFIER

SAN FRANCISCO BAY JPL - AIRSAR L-band 1988



$$2A_0$$

$$B_0 + B$$

$$B_0 - B$$

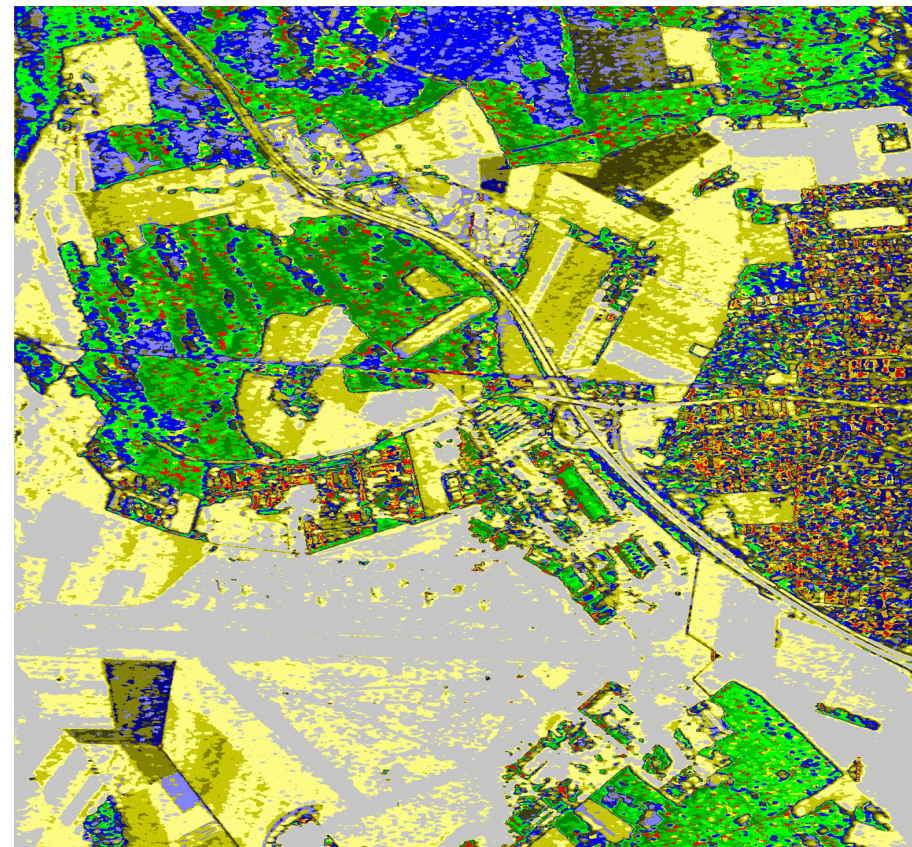


# H / A / $\alpha$ - WISHART CLASSIFIER

OBERPFAFFENHOFEN - ESAR L-band



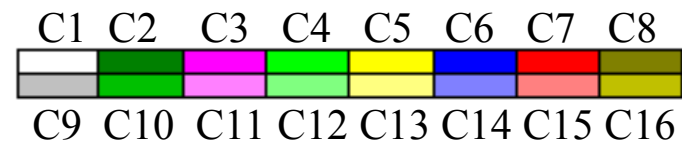
H / A /  $\alpha$  and WISHART CLASSIFIER



$2A_0$

$B_0 + B$

$B_0 - B$



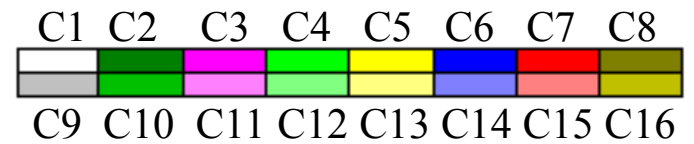


# H / A / $\alpha$ - WISHART CLASSIFIER

OBERPFAFFENHOFEN - ESAR L-band



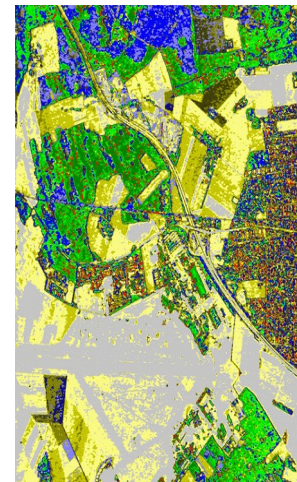
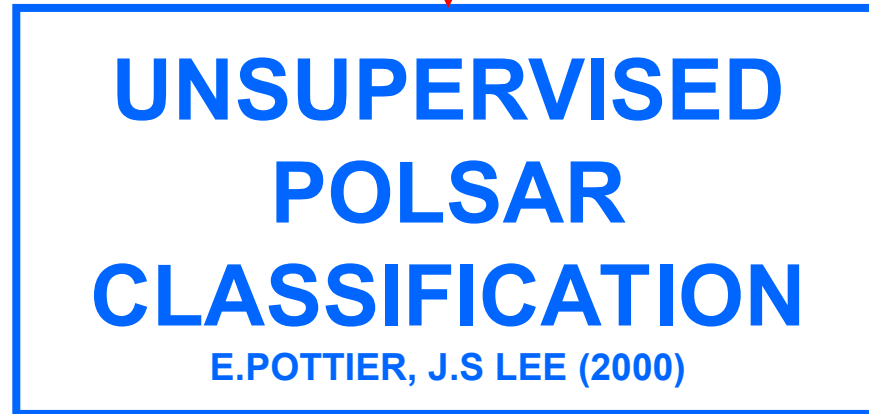
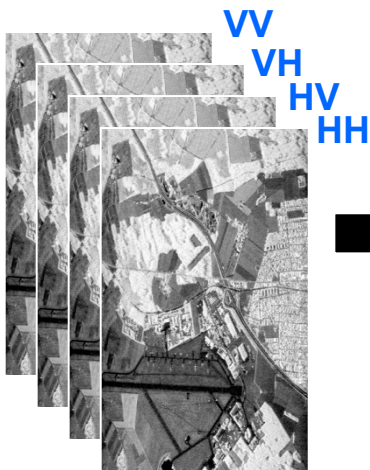
H / A /  $\alpha$  and WISHART CLASSIFIER



# POLARIMETRIC REMOTE SENSING

WISHART PDF

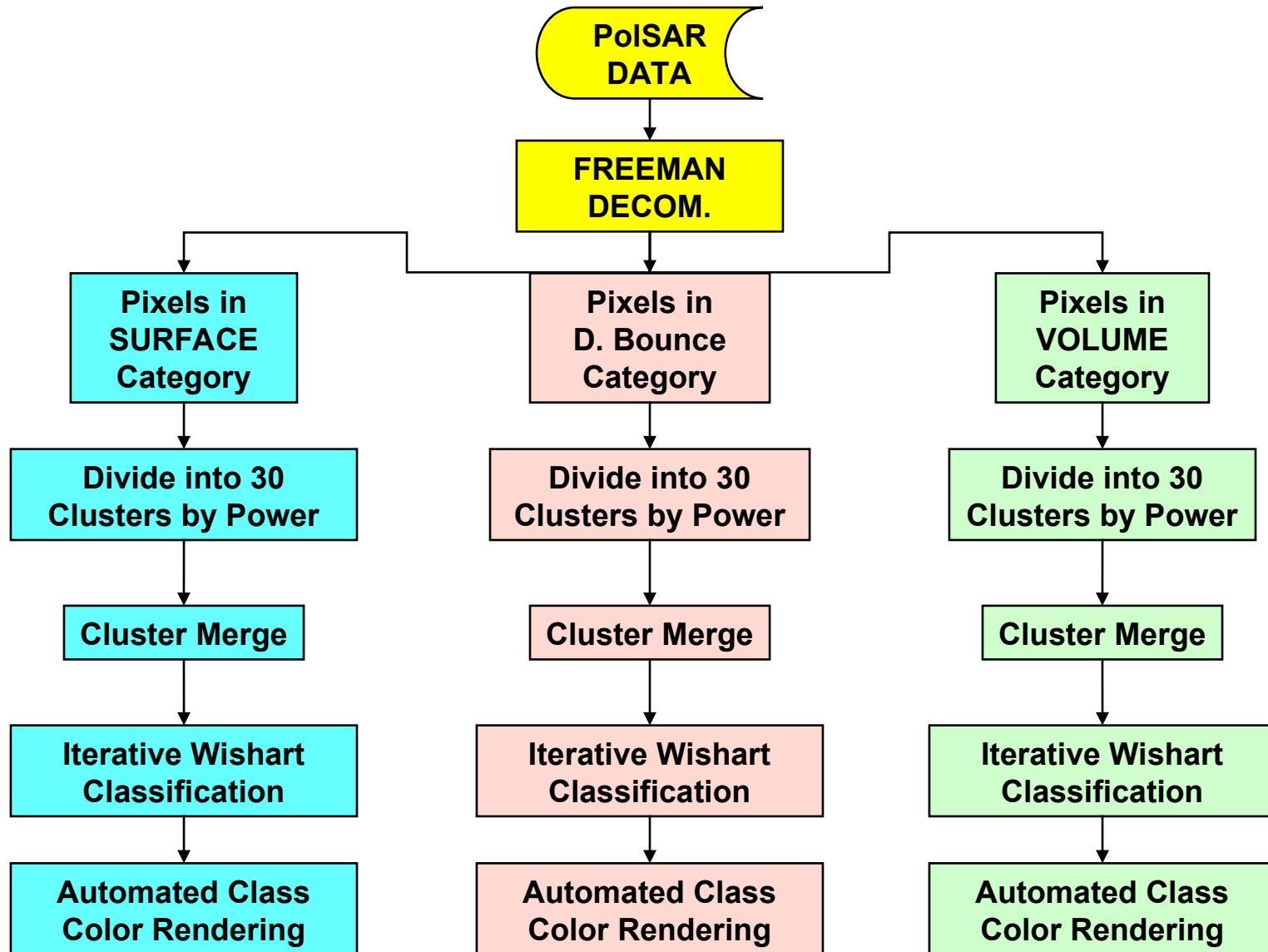
$$P(\langle [T] \rangle | [T_m]) = \frac{L^p |\langle [T] \rangle|^{L-p} e^{-L \text{Tr}([T_m]^{-1} \langle [T] \rangle)}}{\pi^{\frac{p(p-1)}{2}} \Gamma(L) \dots \Gamma(L-p+1) |[T_m]|^L}$$



## Unsupervised Classification Preserving Scattering Mechanisms

*J.S. Lee, M.R. Grunes, E. Pottier and L. Ferro-Famil, "Segmentation of polarimetric SAR images that preserves scattering mechanisms" Proceedings of EUSAR2002*

# PROCEDURE – FLOW CHART



**Cluster Merging** 
$$D_{ij} = \frac{1}{2} \left\{ \ln(|V_i|) + \ln(|V_j|) + \text{Tr}(V_i^{-1}V_j + V_j^{-1}V_i) \right\}$$



# FREEMAN - WISHART CLASSIFIER

Courtesy of Dr J.S Lee

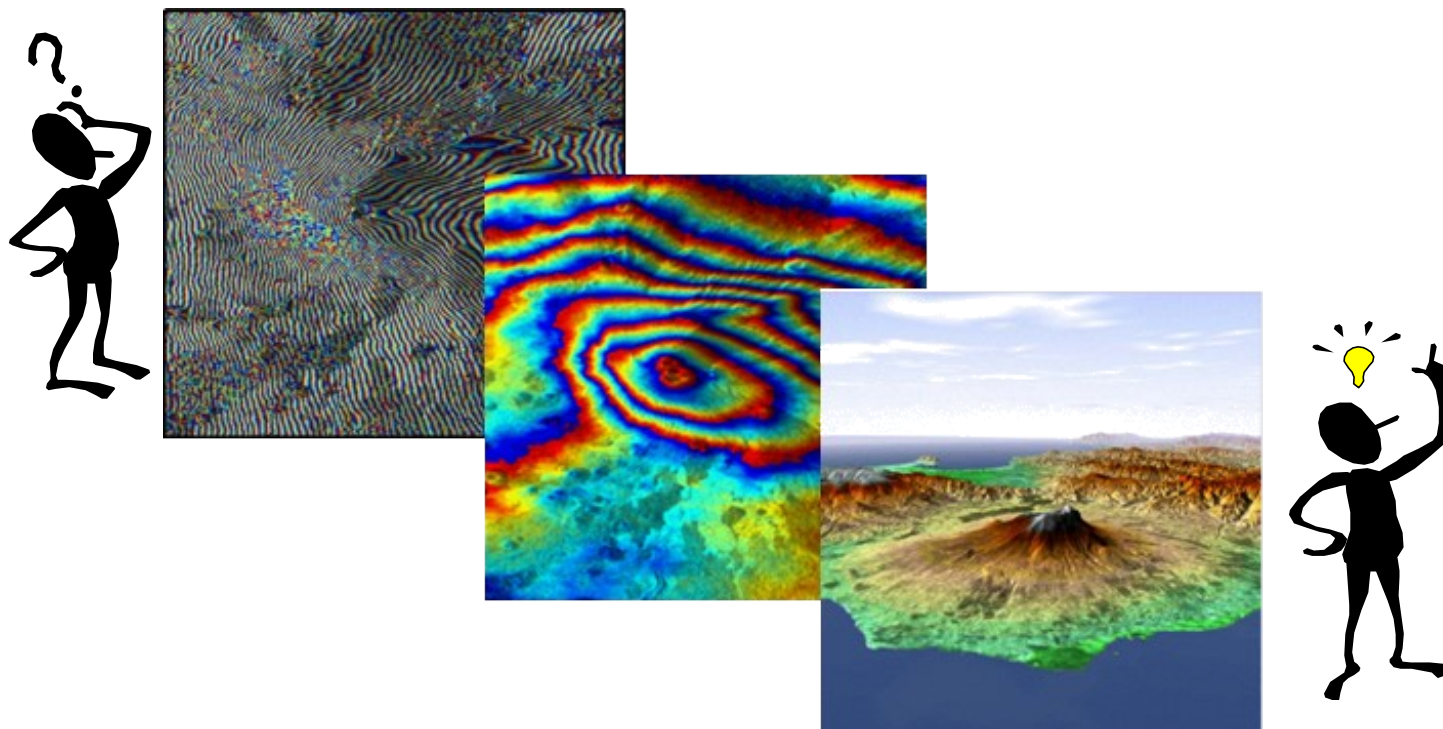


$|HH-VV|$ ,  $|HV|$ ,  $|HH+VV|$



4<sup>th</sup> Iteration (15 classes)

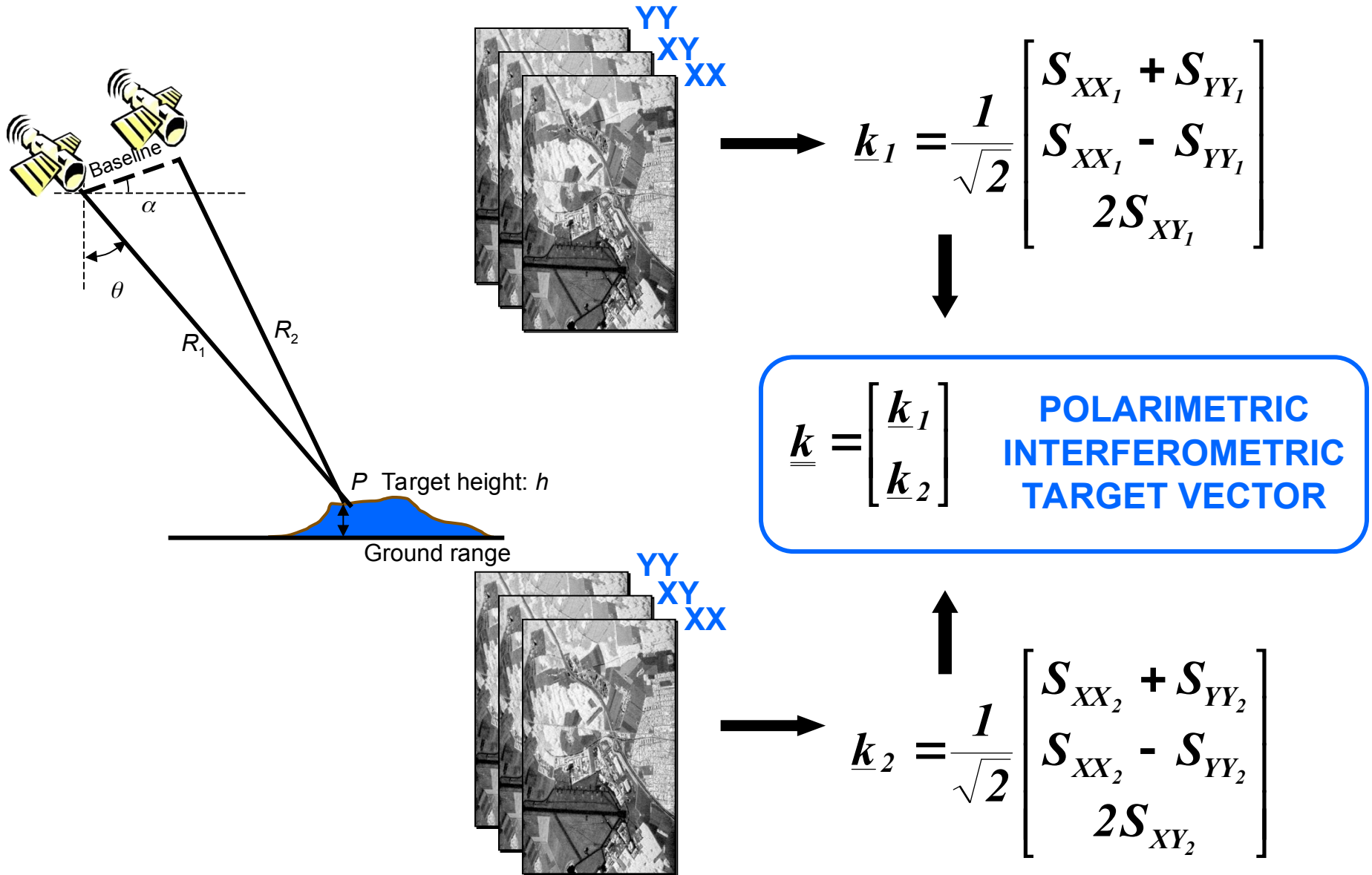




# **POLARIMETRIC INTERFEROMETRIC SAR POL-InSAR**



# POL-InSAR





# POL-InSAR

$$\underline{\underline{\mathbf{k}}} = \begin{bmatrix} \underline{\mathbf{k}}_1 \\ \underline{\mathbf{k}}_2 \end{bmatrix}$$

**POLARIMETRIC  
INTERFEROMETRIC  
TARGET VECTOR**



$$\langle [\mathbf{T}_6] \rangle = \langle \underline{\underline{\mathbf{k}}} \cdot \underline{\underline{\mathbf{k}}}^{T*} \rangle = \begin{bmatrix} \langle \underline{\mathbf{k}}_1 \cdot \underline{\mathbf{k}}_1^{T*} \rangle & \langle \underline{\mathbf{k}}_1 \cdot \underline{\mathbf{k}}_2^{T*} \rangle \\ \langle \underline{\mathbf{k}}_2 \cdot \underline{\mathbf{k}}_1^{T*} \rangle & \langle \underline{\mathbf{k}}_2 \cdot \underline{\mathbf{k}}_2^{T*} \rangle \end{bmatrix} = \begin{bmatrix} \langle [\mathbf{T}_1] \rangle & \langle [\mathbf{\Omega}_{12}] \rangle \\ \langle [\mathbf{\Omega}_{12}]^{T*} \rangle & \langle [\mathbf{T}_2] \rangle \end{bmatrix}$$

**POLARIMETRIC INTERFEROMETRIC COHERENCY MATRIX (6x6)**

$$\langle [\mathbf{T}_1] \rangle$$

**HERMITIAN POLARIMETRIC COHERENCY MATRIX (3x3)**

$$\langle [\mathbf{T}_2] \rangle$$

**HERMITIAN POLARIMETRIC COHERENCY MATRIX (3x3)**

$$\langle [\mathbf{\Omega}_{12}] \rangle$$

**NON HERMITIAN POLARIMETRIC INTER-COHERENCY MATRIX (3x3)**

# POL-InSAR

## DUAL CHANNELS POLINSAR UNSUPERVISED SEGMENTATION

$$\langle [T_6] \rangle =$$

POLARIMETRIC INTERFEROMETRIC COHERENCY MATRIX (6x6)



$$\langle [T_6] \rangle$$

FOLLOWS A WISHART DISTRIBUTION

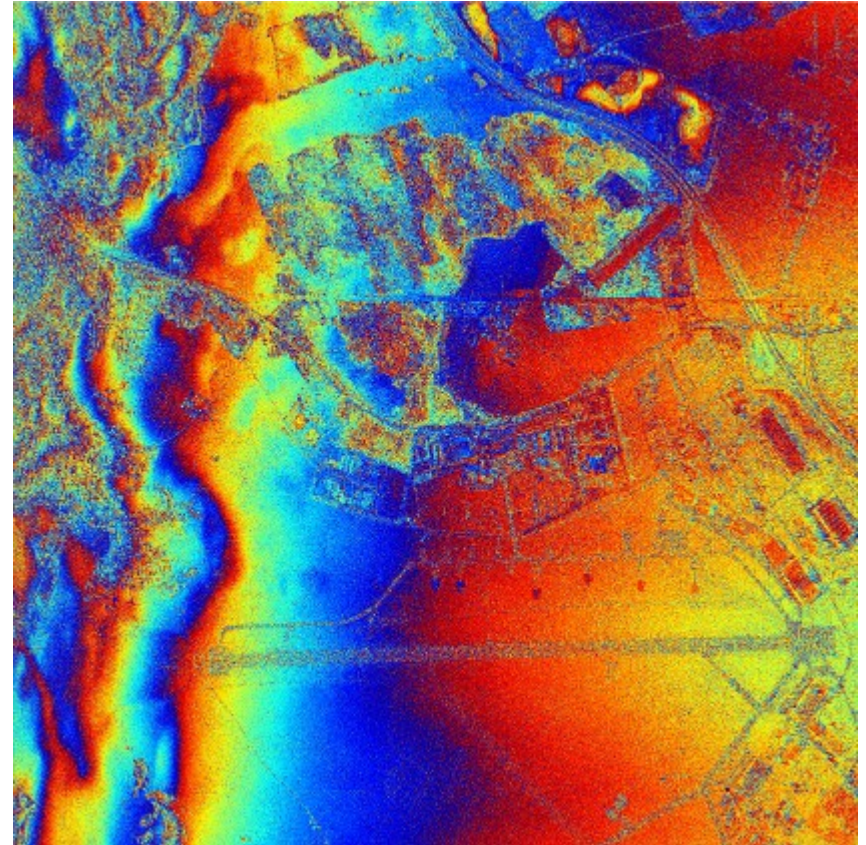
$$P(\langle [T_6] \rangle / [\Sigma_m]) = \frac{|\langle [T_6] \rangle|^{L-p} \exp\left(-\text{tr}\left([\Sigma_m]^{-1} \langle [T_6] \rangle\right)\right)}{K(L,p) |[\Sigma_m]|^L} = W_C(L, [\Sigma_m])$$

L: Number of Look  
p: Polarimetric Dimension

With: 
$$K(L,p) = \frac{\pi^{\frac{p(p-1)}{2}}}{L^{Lp}} \Gamma(L) \dots \Gamma(L-p+1)$$

$[\Sigma_m]$  : Cluster Center of the class m

# POL-InSAR



DLR E-SAR L Band  
Pol-In SAR (1.5m x 3m) – Baseline 15m



**POL-SAR INFORMATION**



**IN-SAR INFORMATION  $\text{Arg}(\gamma)$**



# POL-InSAR



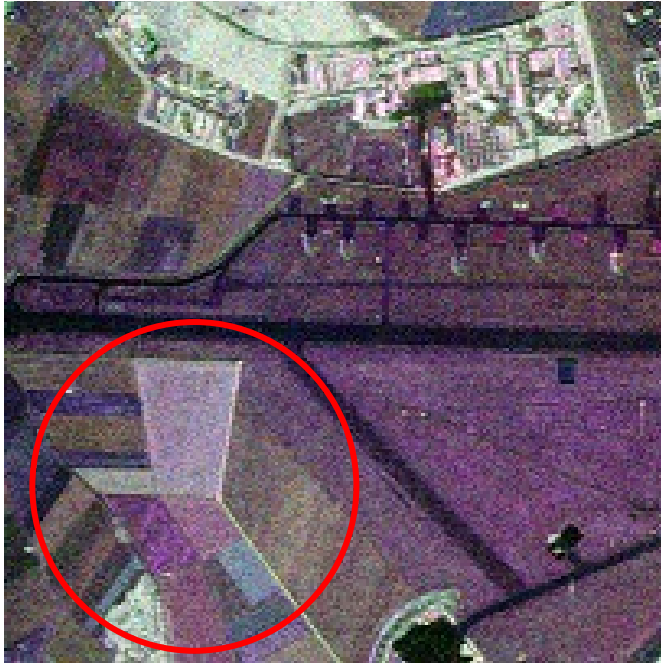
DLR E-SAR L Band  
Pol-In SAR (1.5m x 3m) – Baseline 5m

**POL-SAR INFORMATION**

**IN-SAR INFORMATION**  $|\gamma|$

**COMPLEMENTARY INFORMATION**

# POL-InSAR



**HETEROGENEOUS AREA**

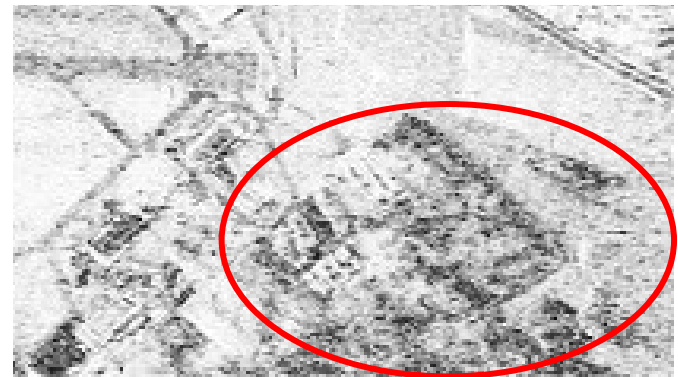
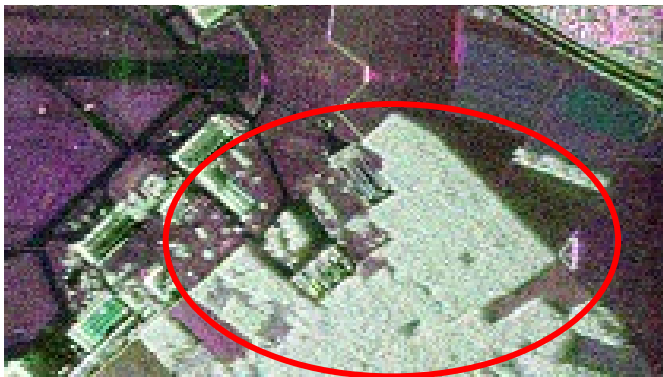
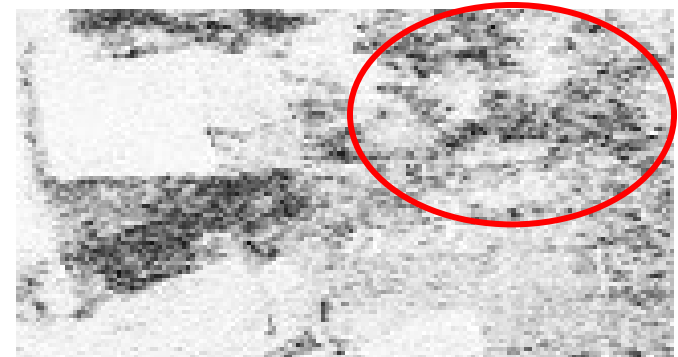
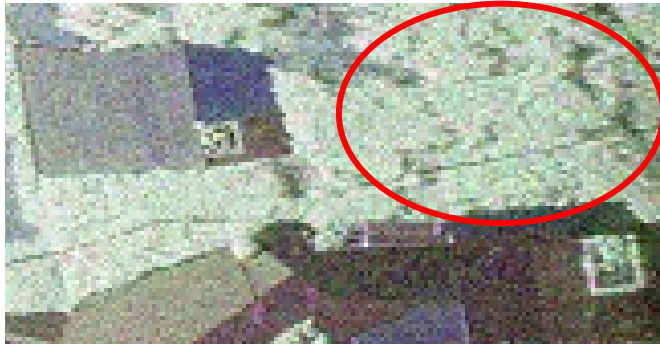
**DIFFERENT POLARIMETRIC  
SCATTERING MECHANISMS**



**HOMOGENEOUS AREA**

**CONSTANT INTERFEROMETRIC  
COHERENCE**

# POL-InSAR



**HOMOGENEOUS AREA**

**HETEROGENEOUS AREA**

**SAME POLARIMETRIC  
SCATTERING MECHANISMS**

**DIFFERENT INTERFEROMETRIC  
COHERENCE**



# POL-InSAR



INTERFEROMETRIC COHERENCE  $\gamma$



$2A_0$

$B_0 + B$

$B_0 - B$

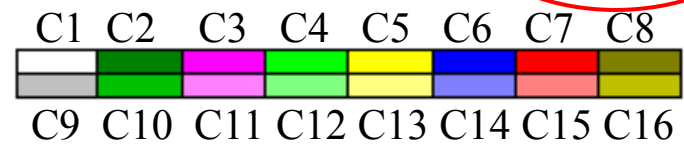
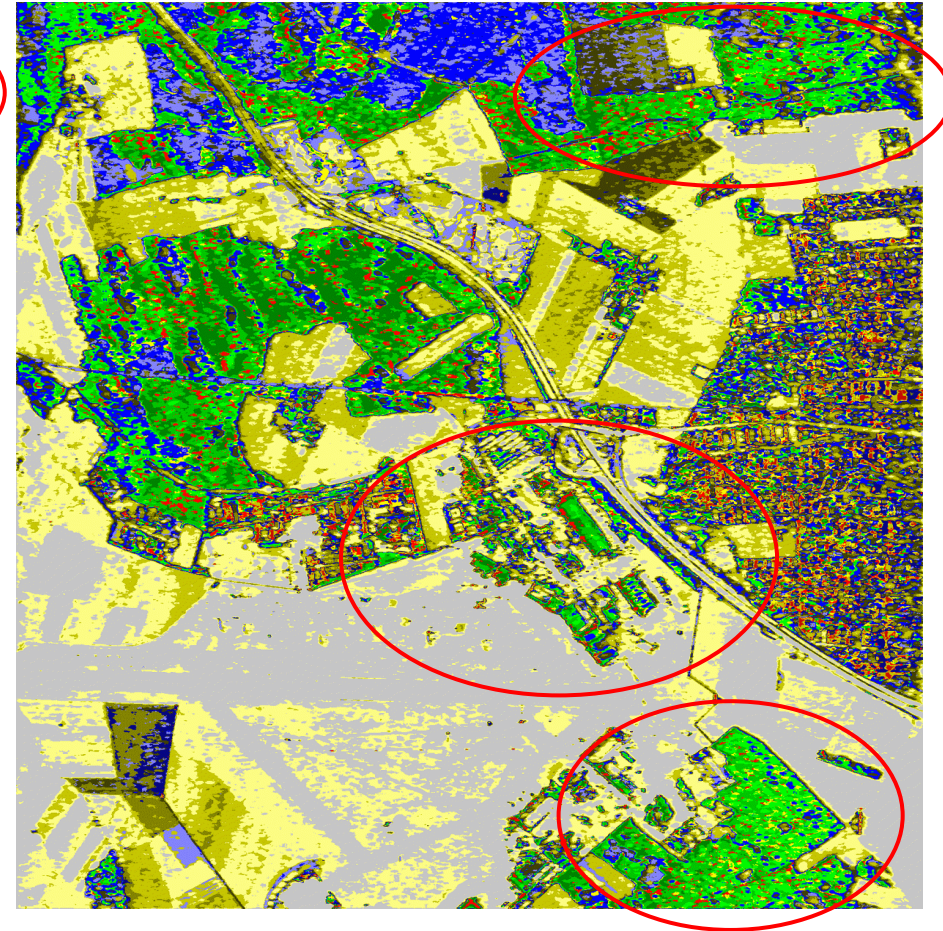


# POL-InSAR

## Wishart H-A- $\alpha$ segmentation



INTERFEROMETRIC COHERENCE  $\gamma$





# POL-InSAR

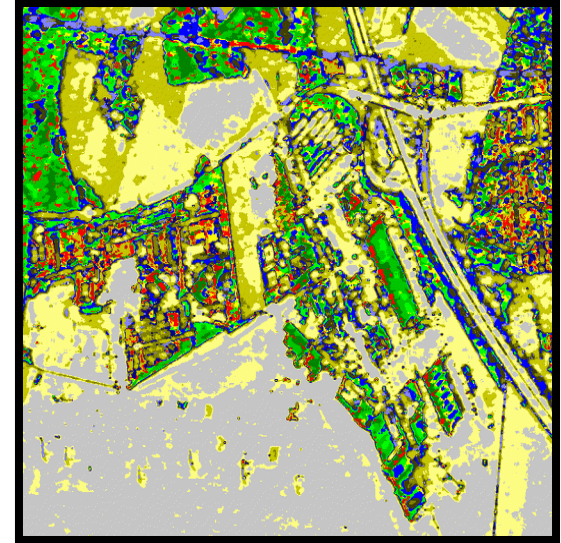
Optical Image



POLSAR Image



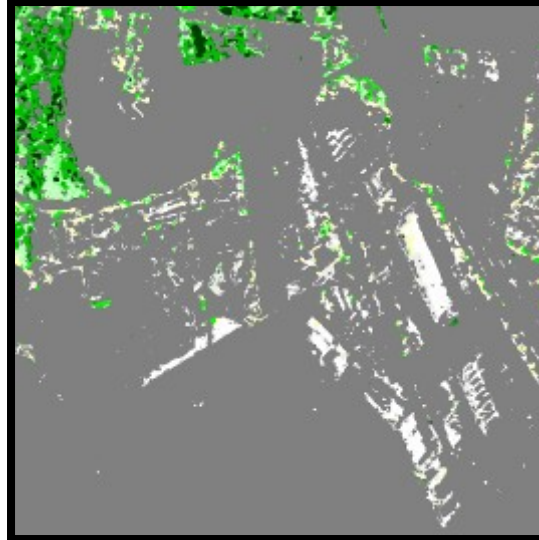
POLSAR Segmentation



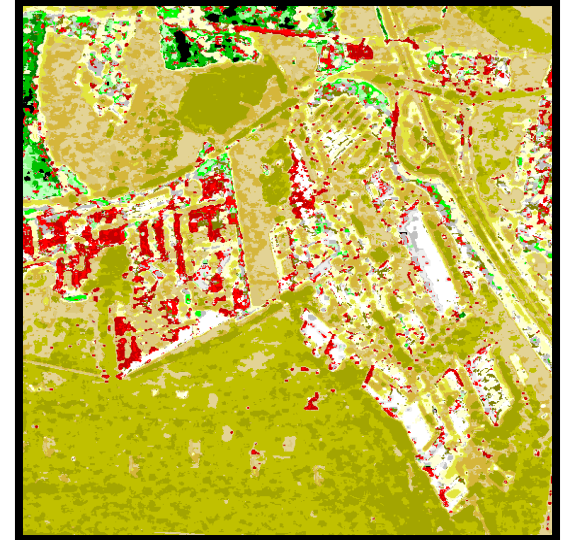
INSAR Image



VOL POLINSAR Segmentation



POLINSAR Segmentation



**Oriented buildings segmented from vegetated areas**



# POL-InSAR

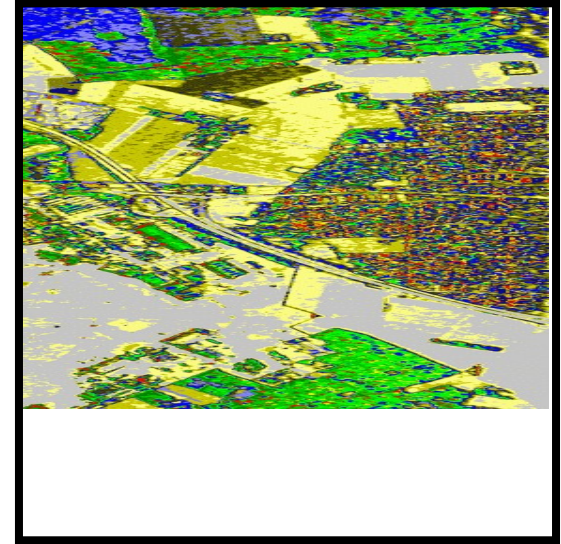
Optical Image



POLSAR Image



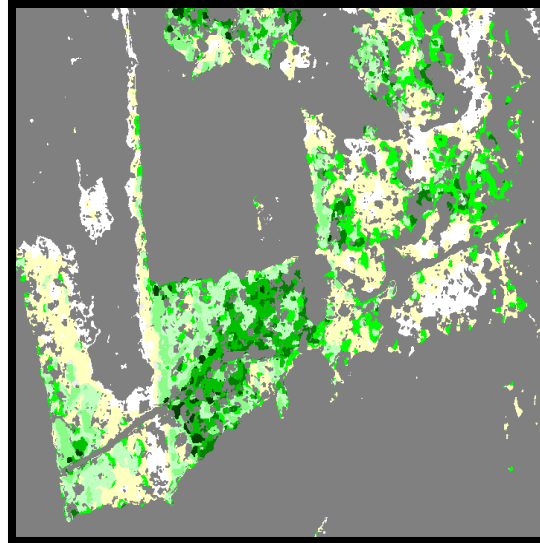
POLSAR Segmentation



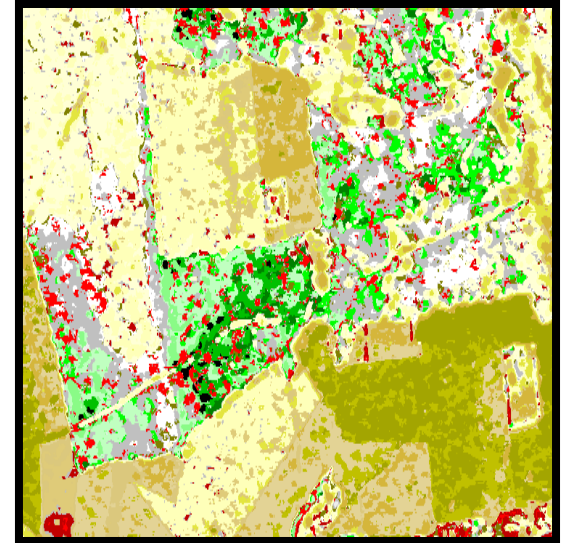
INSAR Image



VOL POLINSAR Segmentation

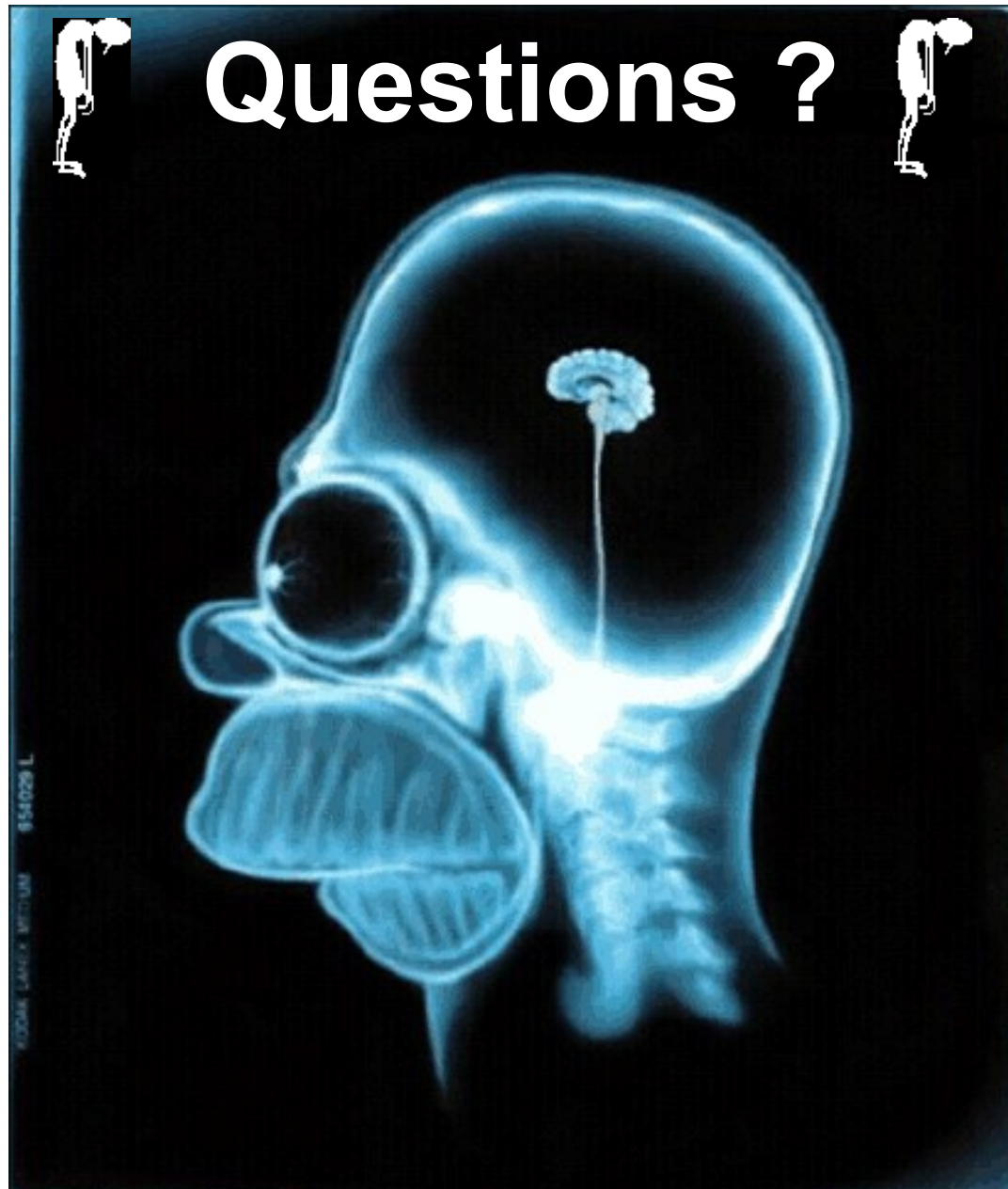


POLINSAR Segmentation



**Low density forested areas segmented from dense forest**

# Questions ?



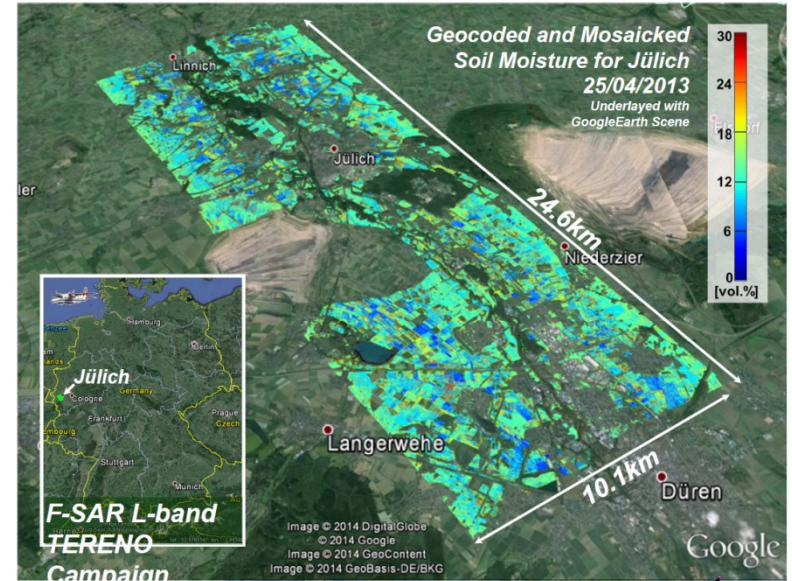
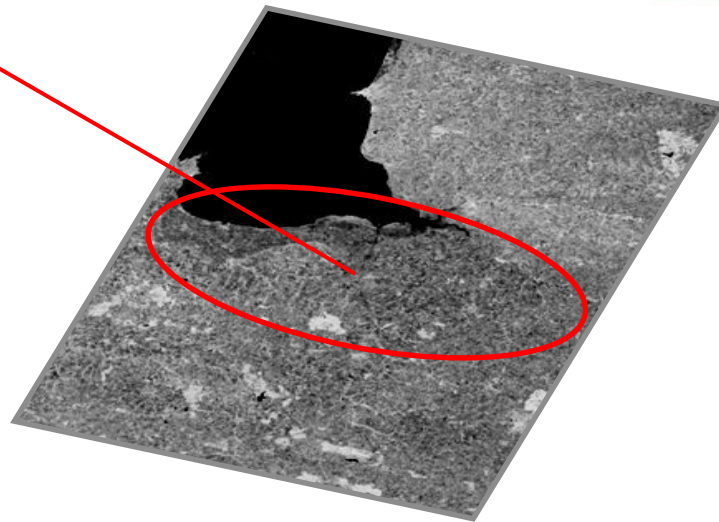
KODAK LAMBDA-MEDUM 954029 L



# POLARIMETRY

## PoISAR

Track<sub>1</sub>



Soil moisture



Urban monitoring    
SUPAERO 



# TIME-SERIES

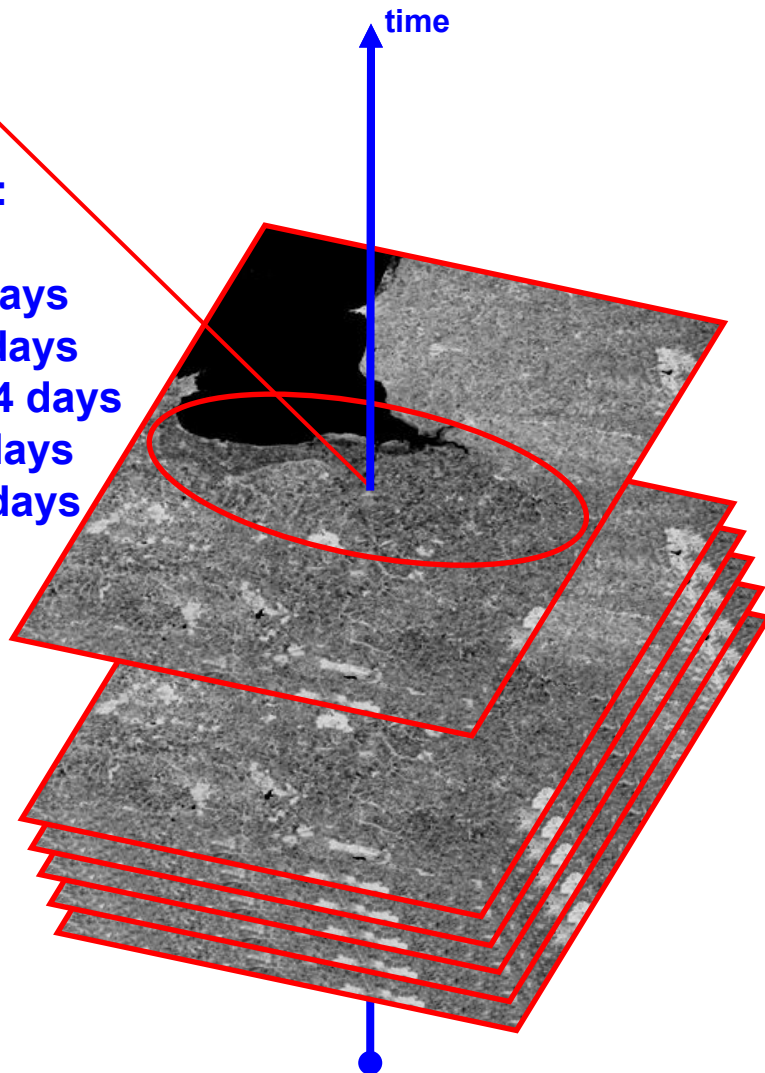
Track<sub>1..N</sub>



## Pol-TimeSAR

Revisit time :

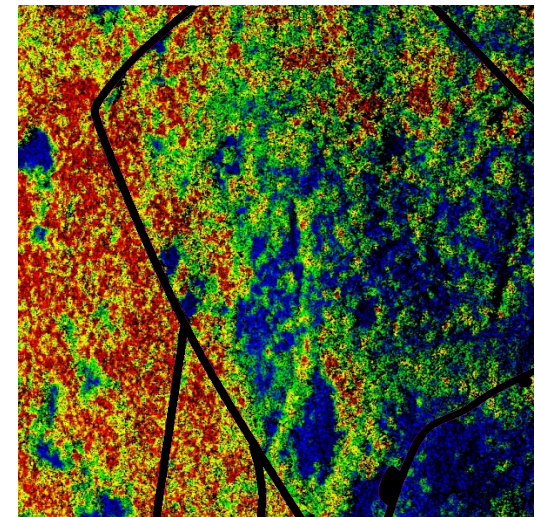
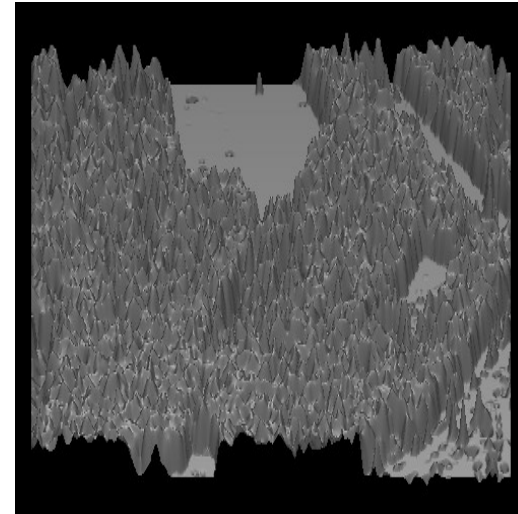
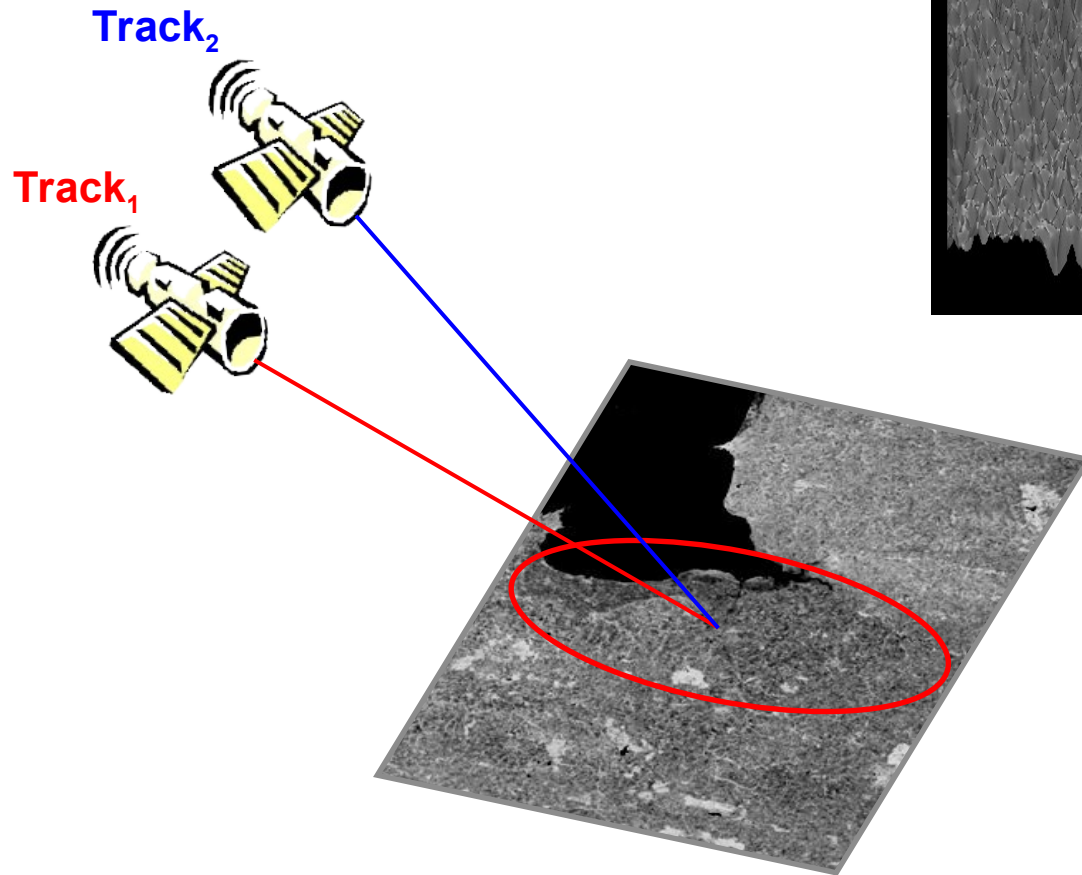
- ALOS-2 = 14 days
- BIOMASS = 4 days
- RADARSAT2 = 24 days
- RISAT-1 = 25 days
- Sentinel-1 = 6 days



Polarimetric feature  
temporal evolution

# POLARIMETRY + INTERFEROMETRY

## Pol-InSAR

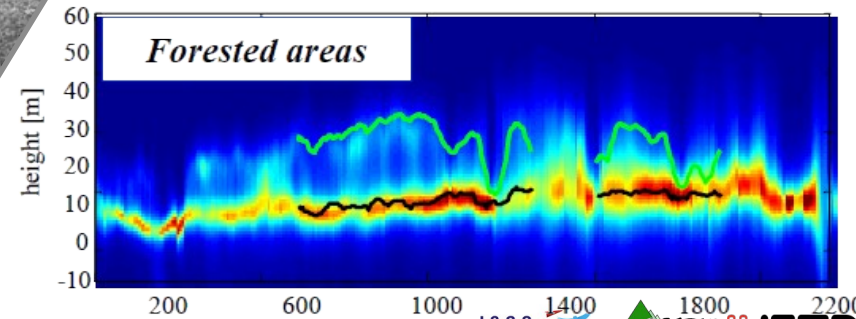
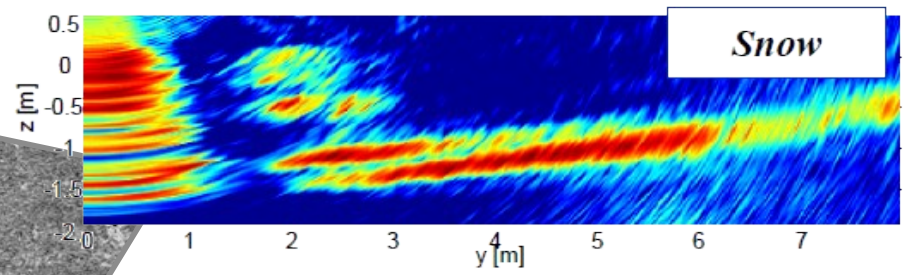
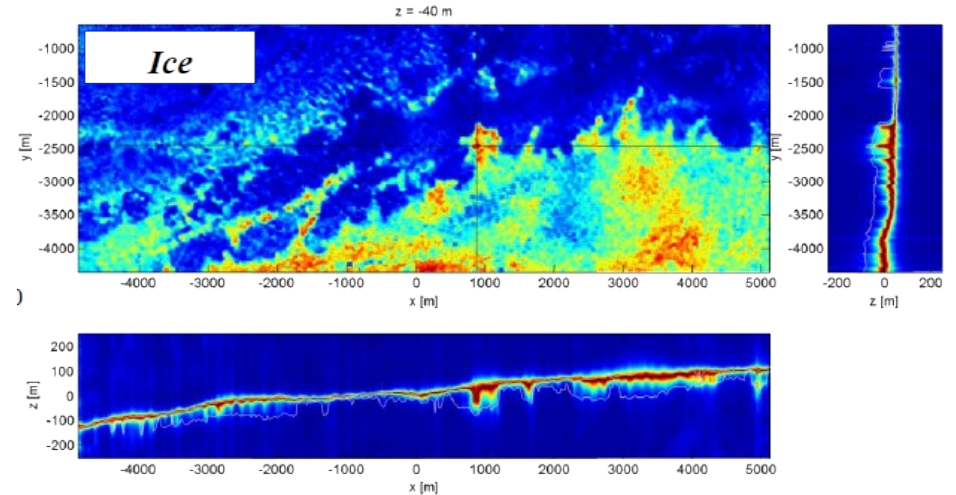
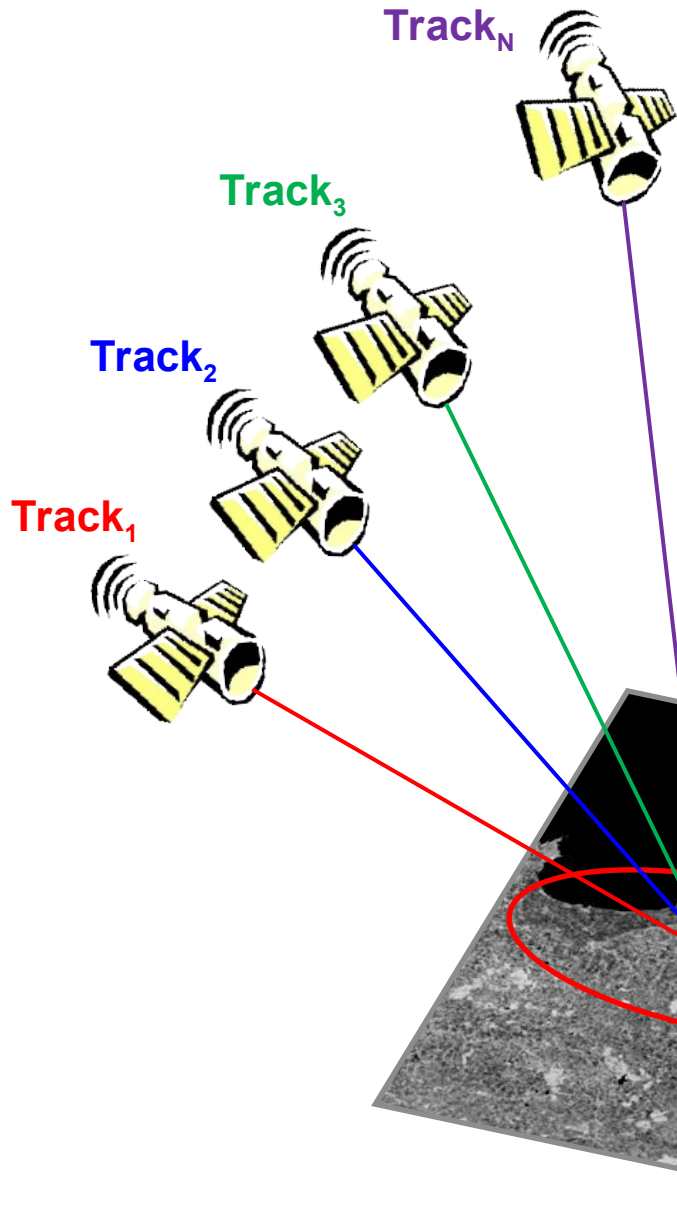


Courtesy of Dr. K. Papathanassiou



# POLARIMETRY + TOMOGRAPHY

## Pol-TomSAR





# Questions ?



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