

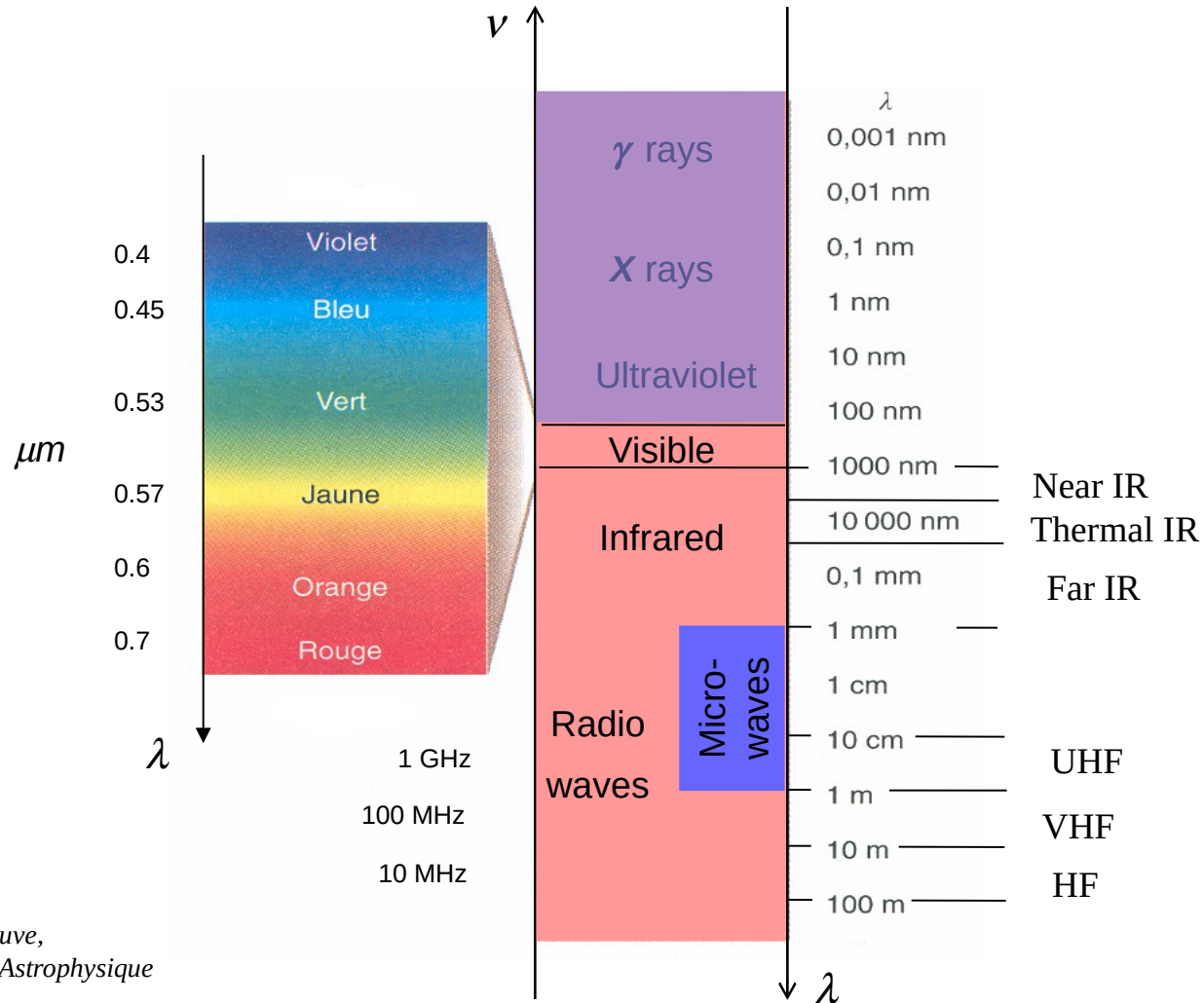
A world map in a light blue color, centered on the Atlantic Ocean, serving as a background for the slide.

# SAR Speckle Filtering

**Pierre-Louis FRISON**  
*[pierre-louis.frison@univ-eiffel.fr](mailto:pierre-louis.frison@univ-eiffel.fr)*

# Electromagnetic coherent wave

## Electromagnetic spectrum

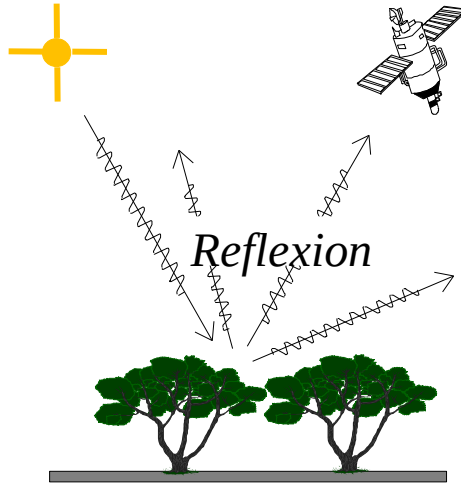


From Seguin & Villeneuve,  
Astronomie et Astrophysique

# Radar Fundamentals

## Remote Sensing observations mode

Solar radiation



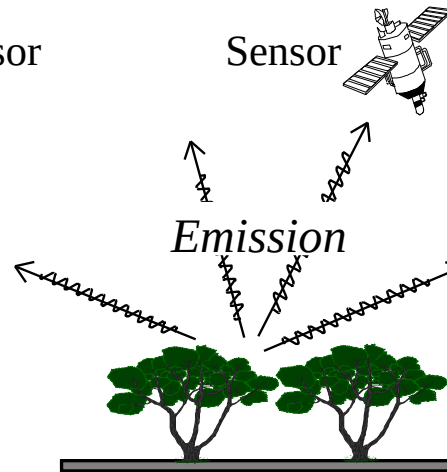
**Visible**

**Near/mid-Infrared**

VIS + NIR + MIR

0.4-0.7  $\mu$  0.9  $\mu$  1.5  $\mu$

Sensor



**Emission**

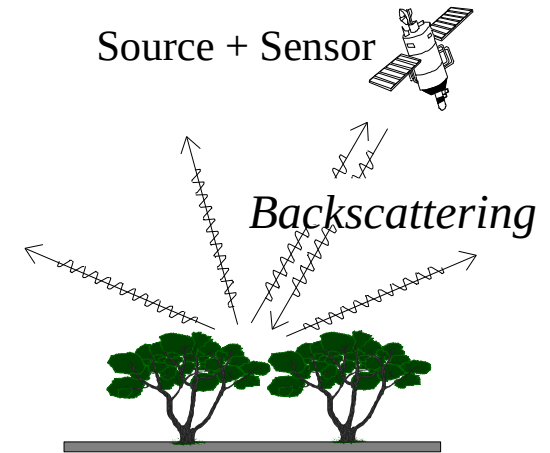
**Thermal Infrared**

**Microwaves**

IRT

> 5  $\mu$

Sensor



**Backscattering**

**Radar**

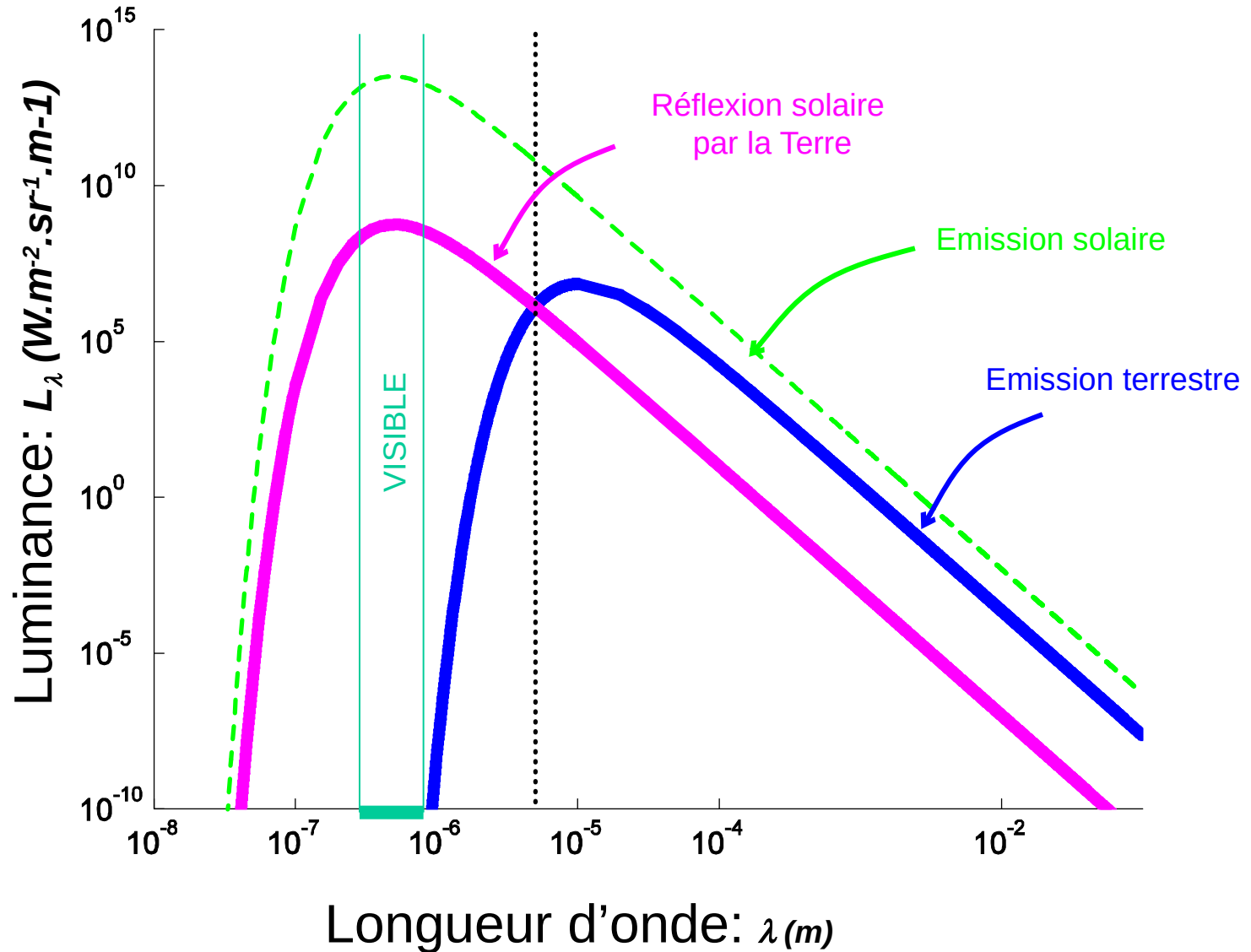
= active microwaves

Microwaves

0.75-150 cm

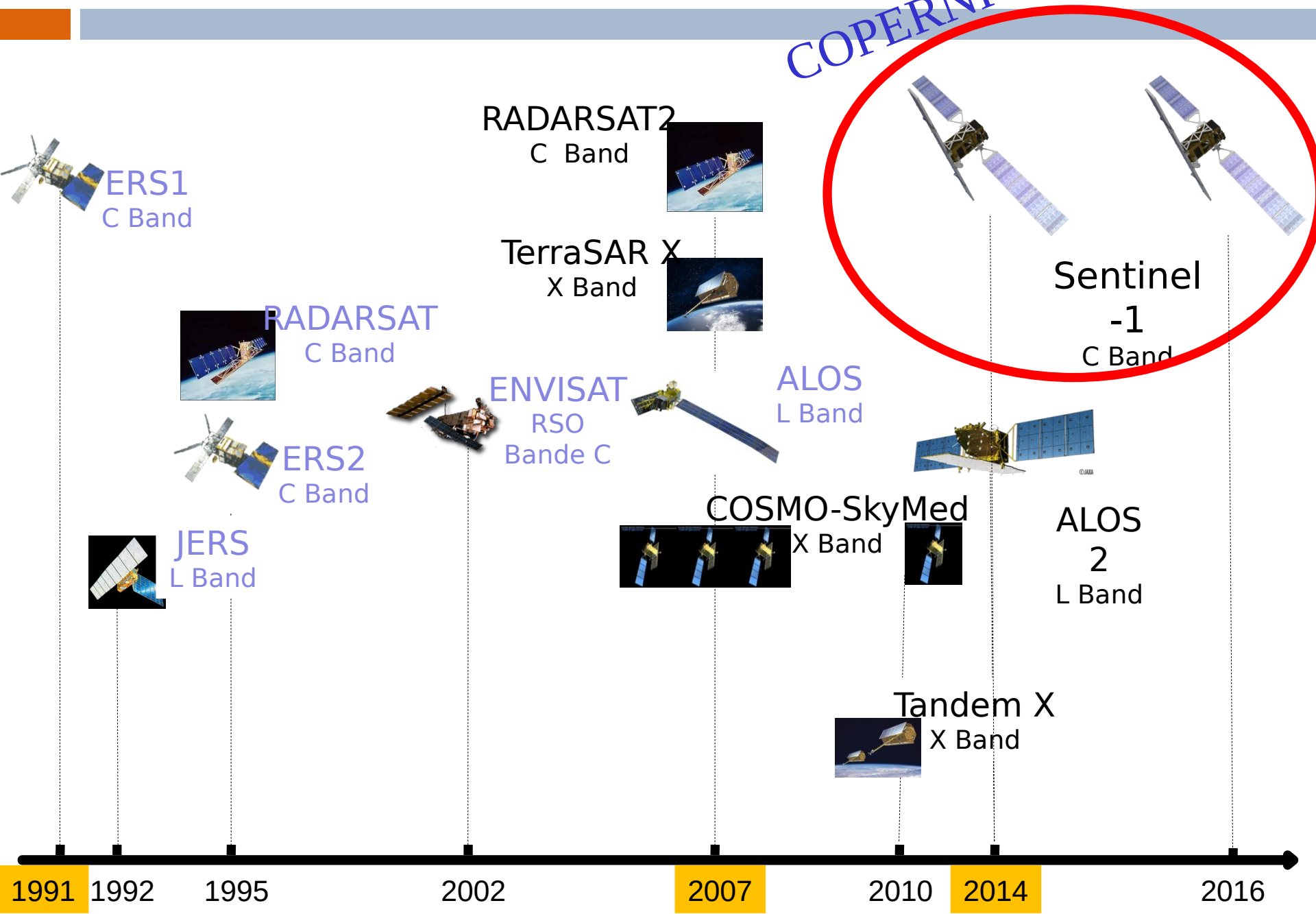
$\lambda$

# Le Rayonnement électromagnétique en provenance de la Terre



# SPACEBORNE SAR SENSORS

COPERNICUS



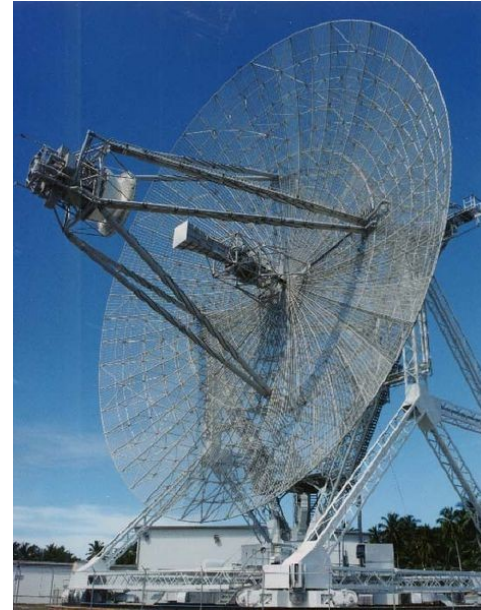
# **RADAR:** **R**adio **D**etection **A**nd **R**anging

*Emission* of emw  
*Reception* backscattered echoes



Road RADAR

(© US police)



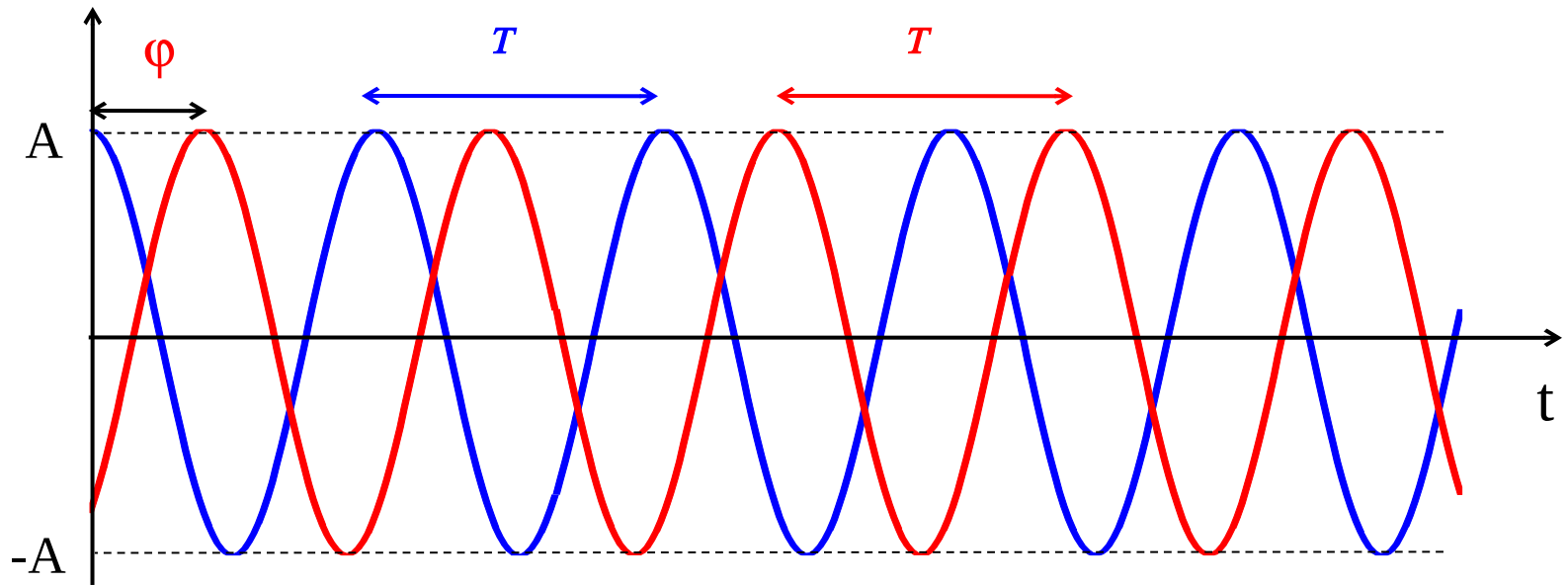
US Army



Imaging RADAR PALSAR

(© NASDA)

# Coherent wave: temporal behaviour



$$y(t) = A \cos\left(\frac{2\pi}{T}t\right)$$

$$T = \frac{1}{f_0}$$

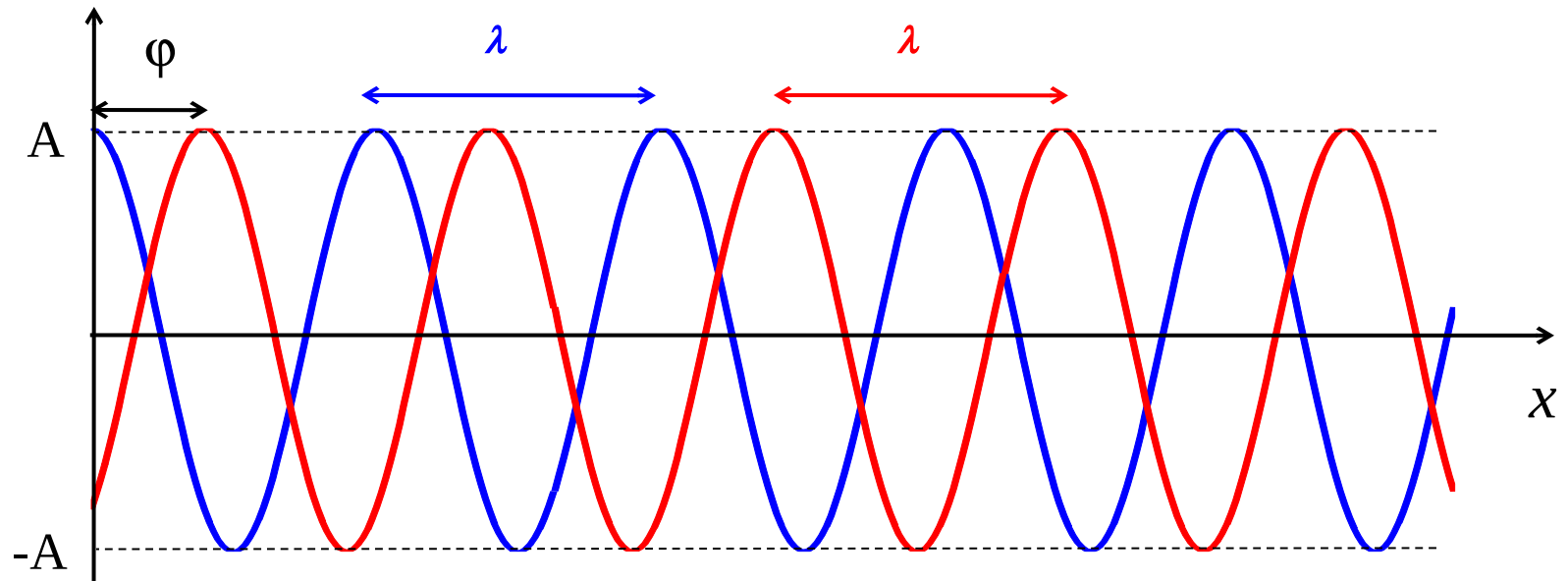
$$y(t) = A \cos\left(\frac{2\pi}{T}t - \varphi\right)$$

$A$ : amplitude

$T$ : Temporal period

$\varphi$ : dephasage

# Coherent wave: spatial behaviour



$$y(x) = A \cos\left(\frac{2\pi}{\lambda} x\right) \quad \lambda = cT = \frac{c}{f_0}$$

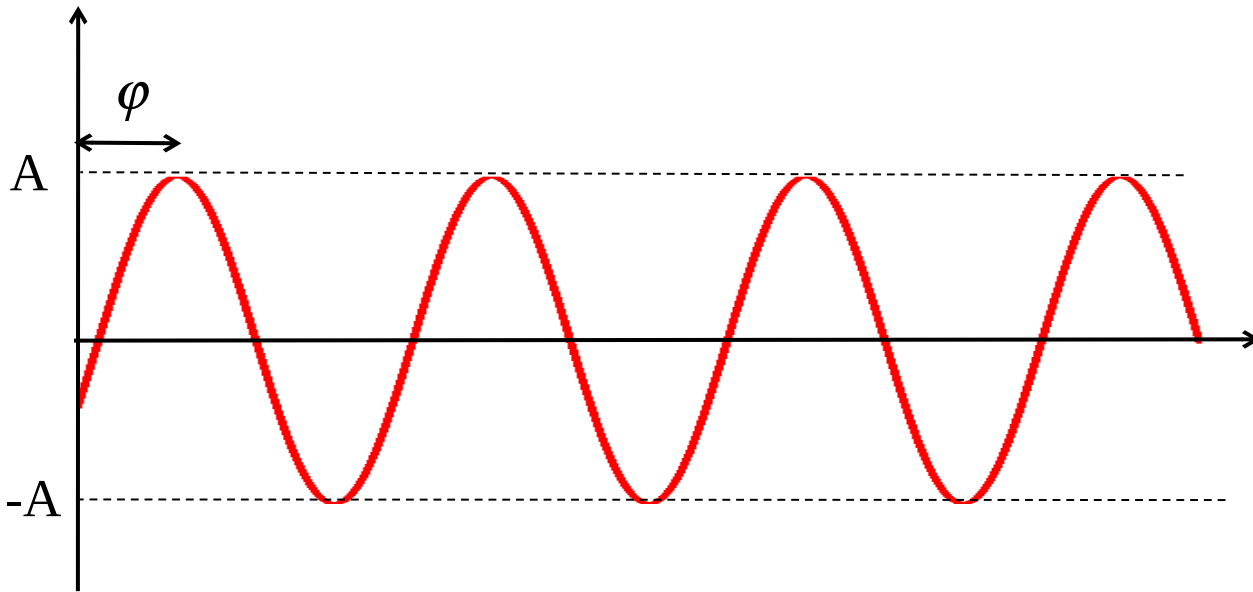
$$y(x) = A \cos\left(\frac{2\pi}{\lambda} x - \varphi\right)$$

A: amplitude  
 $\lambda$ : spatial period = wavelength  
 $\varphi$ : dephasage



# Coherent wave

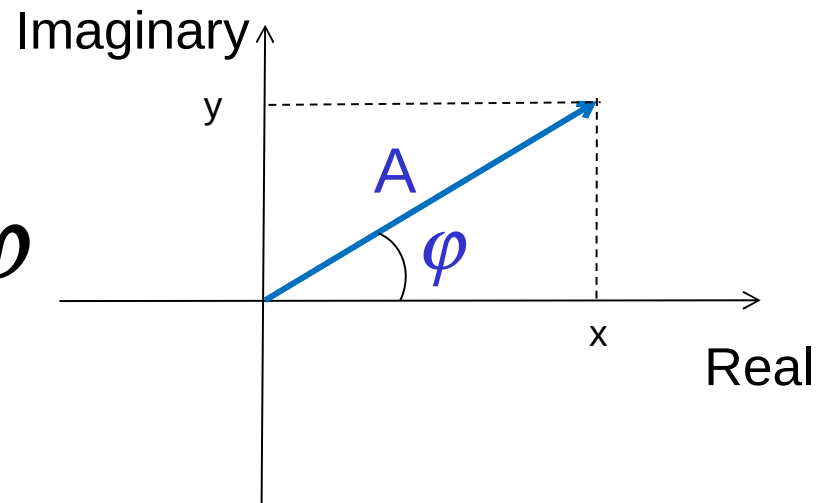
$$y = A \cos\left(\frac{2\pi}{T}t + \frac{2\pi}{\lambda}x + \varphi\right)$$



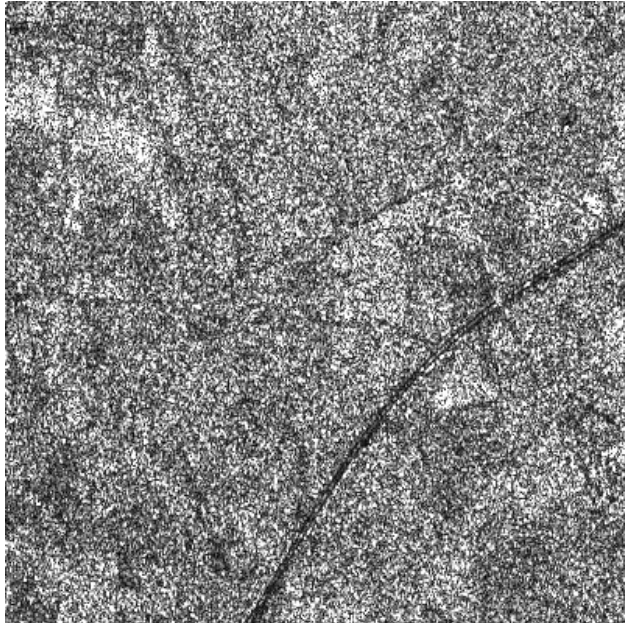
$$\lambda = cT = \frac{c}{f_0}$$

For given frequency  $f_0$  (or  $\lambda$ )

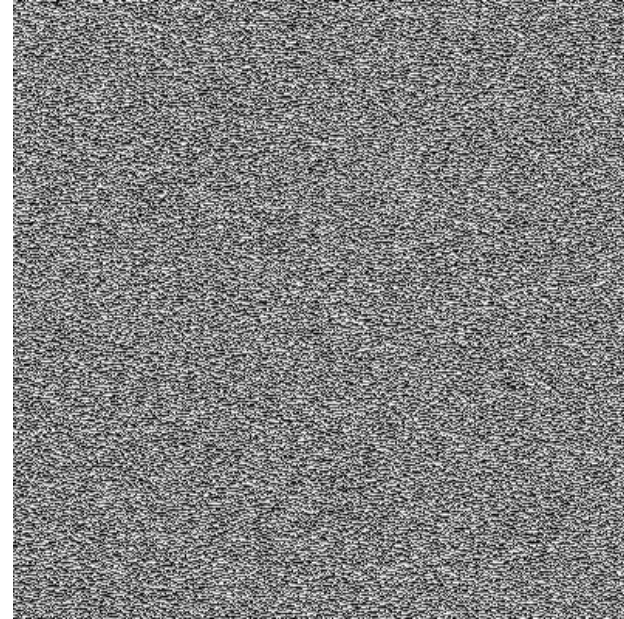
characterized by  $A$  and  $\varphi$



# RADAR DATA = COMPLEX DATA



Amplitude image

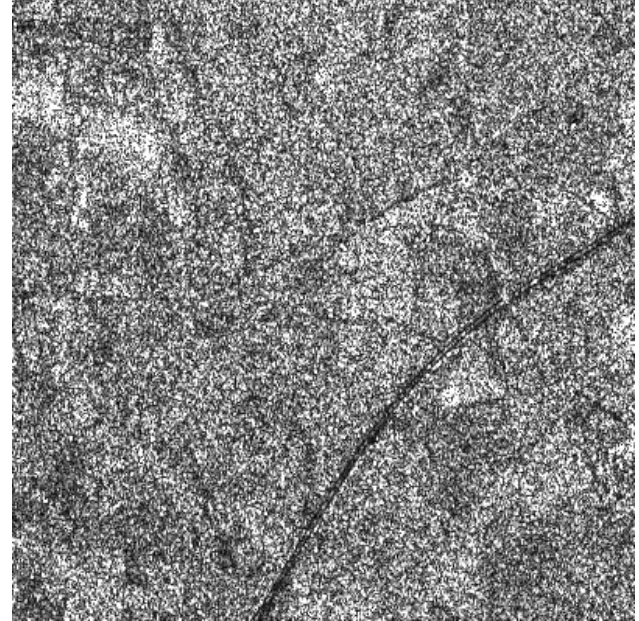
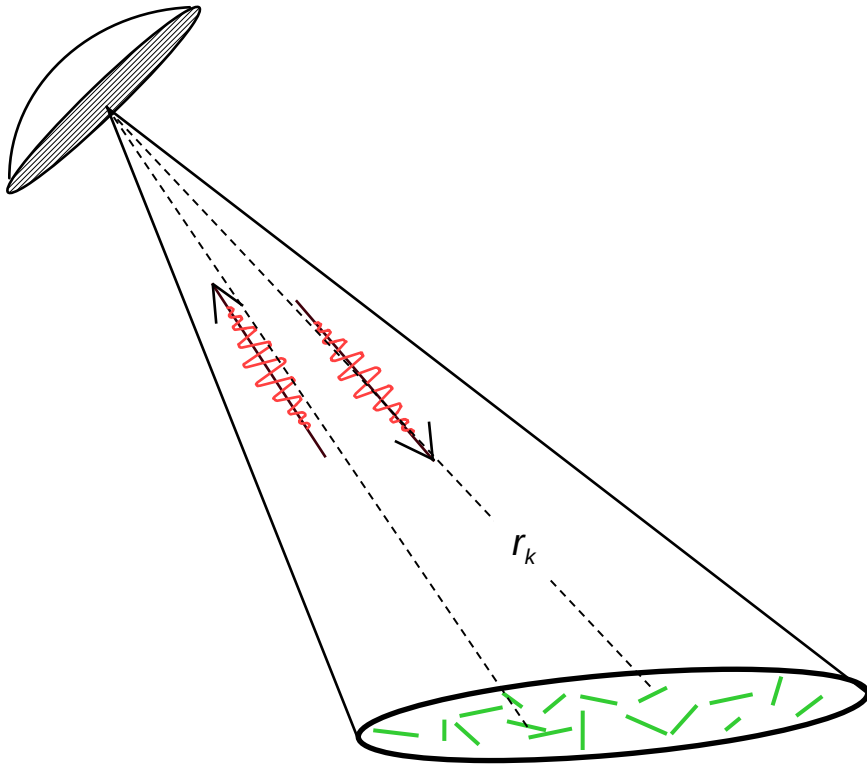


Phase image

RADARSAT - Fine 1  
SLC product

# Speckle Origin

Coherent Wave  $E_0 \cos(\omega_0 t - kr + \psi)$

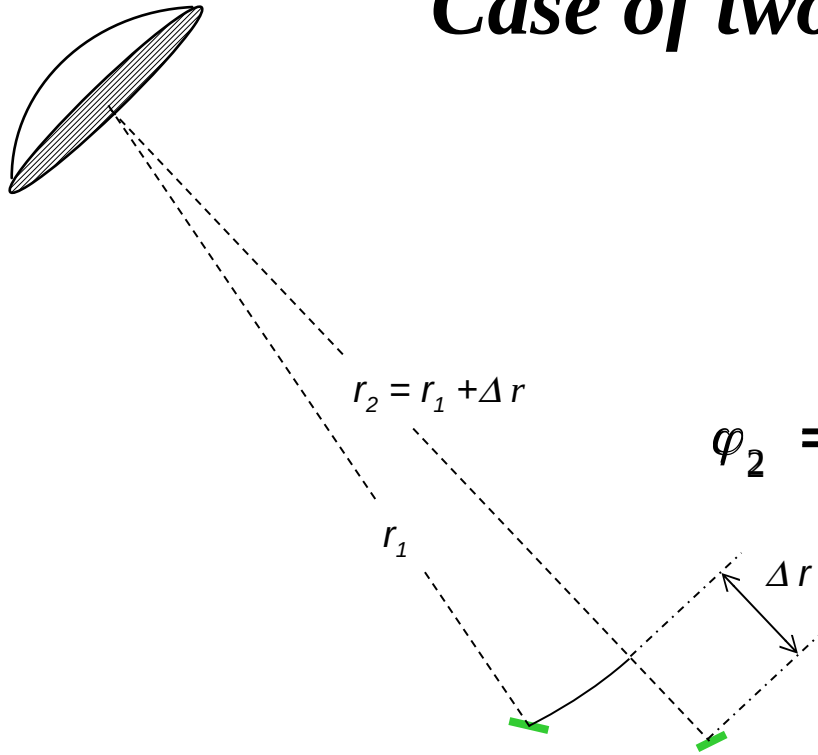


Homogeneous scene :

N elementary scatterers  $a_k, \varphi_k$   
*randomly oriented*

$$\varphi_k = \psi_k + \frac{4\pi r_k}{\lambda}$$

# Case of two scatterers



$$A \cos(\omega_0 t - \varphi_1)$$

$$A \cos(\omega_0 t - \varphi_2)$$

$$\varphi_2 = \psi + \frac{4\pi r_2}{\lambda} = \psi + \frac{4\pi (r_1 + \Delta r)}{\lambda} = \varphi_1 + \frac{4\pi \Delta r}{\lambda}$$

$$\varphi_1 = \psi + \frac{4\pi r_1}{\lambda}$$

$$\varphi_2 = \varphi_1 + \frac{4\pi \Delta r}{\lambda}$$

$$\Delta r = \frac{\lambda}{2} \Rightarrow \frac{4\pi}{\lambda} \Delta r = 2\pi \quad \text{et} \quad \varphi_2 = \varphi_1 + 2\pi$$

$$\Delta r = \frac{\lambda}{4} \Rightarrow \frac{4\pi}{\lambda} \Delta r = \pi \quad \text{et} \quad \varphi_2 = \varphi_1 + \pi$$

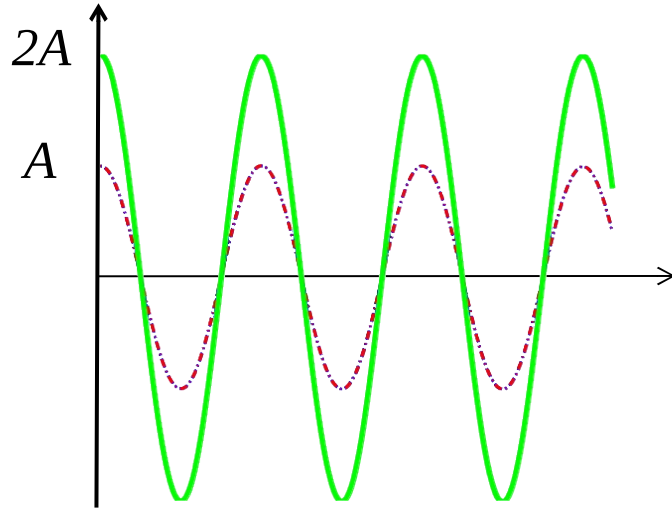
$$\Delta r = \frac{3\lambda}{8} \Rightarrow \frac{4\pi}{\lambda} \Delta r = \frac{3\pi}{2} \quad \text{et} \quad \varphi_2 = \varphi_1 + \frac{3\pi}{2}$$

# 2 coherent waves sum

$$y(t) = A \cos\left(\frac{2\pi}{T}t - \frac{4\pi}{\lambda}r_1 + \varphi\right) + A \cos\left(\frac{2\pi}{T}t - \frac{4\pi}{\lambda}r_2 + \varphi\right)$$

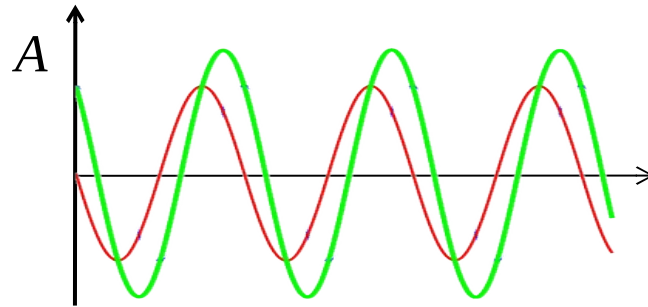
$$r_2 = r_1 + \frac{\lambda}{2}$$

$$\varphi_2 = \varphi_1 + 2\pi$$



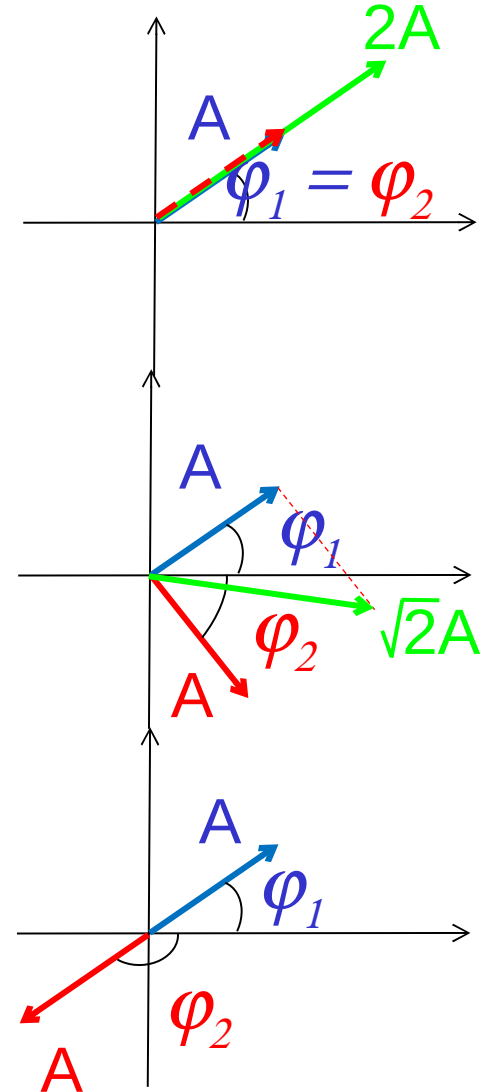
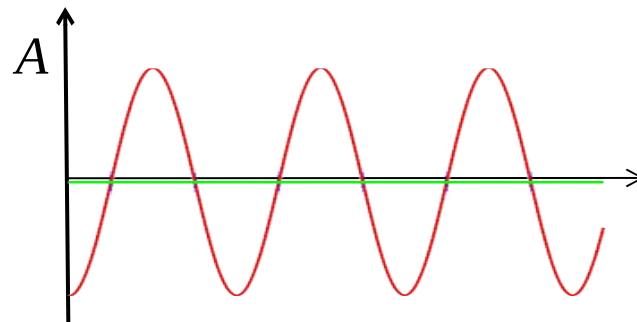
$$r_2 = r_1 + \frac{3\lambda}{8}$$

$$\varphi_2 = \varphi_1 + \frac{3\pi}{2}$$



$$r_2 = r_1 + \frac{\lambda}{4}$$

$$\varphi_2 = \varphi_1 + \pi$$

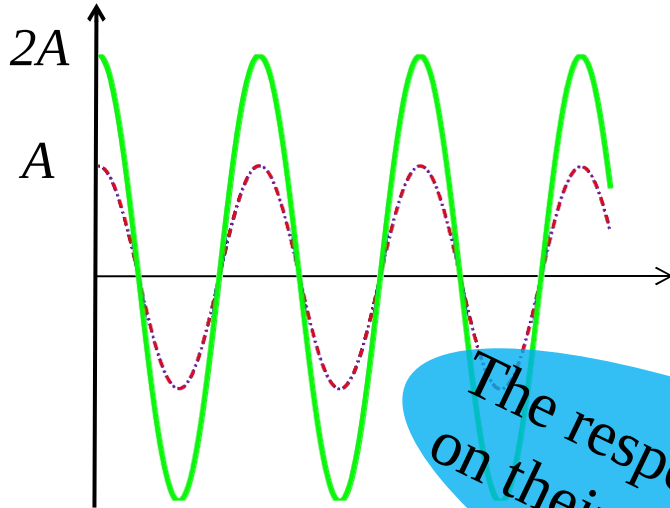


# 2 coherent waves sum

$$y(t) = A \cos\left(\frac{2\pi}{T}t - \frac{4\pi}{\lambda}r_1 + \varphi\right) + A \cos\left(\frac{2\pi}{T}t - \frac{4\pi}{\lambda}r_2 + \varphi\right)$$

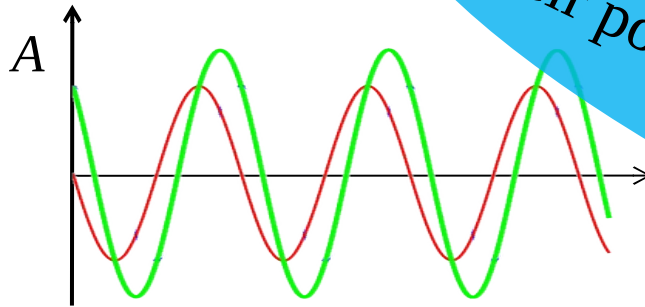
$$r_2 = r_1 + \frac{\lambda}{2}$$

$$\varphi_2 = \varphi_1 + 2\pi$$



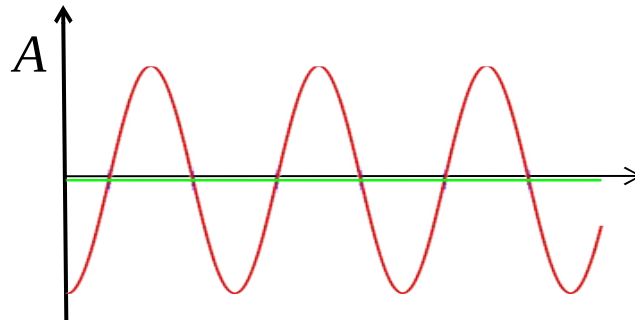
$$r_2 = r_1 + \frac{3\lambda}{8}$$

$$\varphi_2 = \varphi_1 + \frac{3\pi}{2}$$

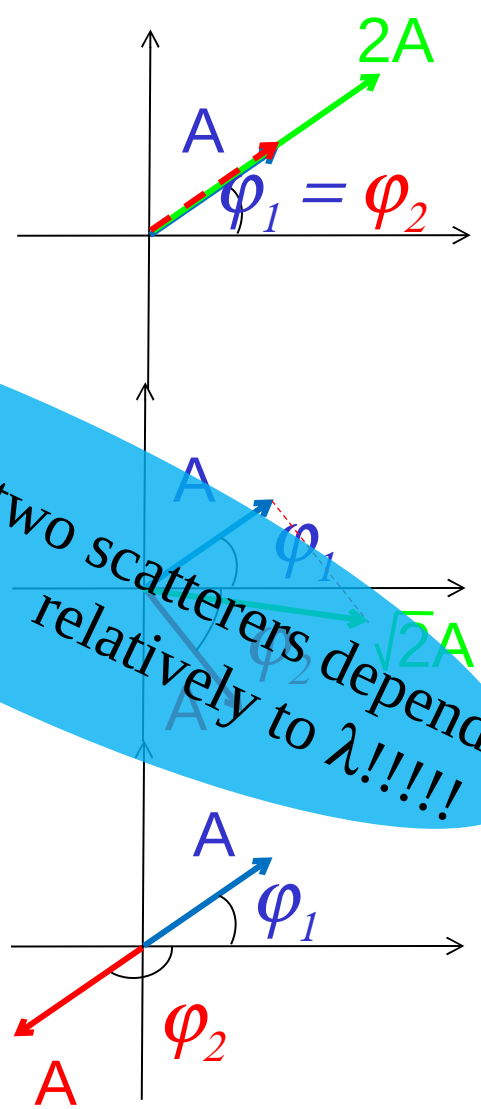


$$r_2 = r_1 + \frac{\lambda}{4}$$

$$\varphi_2 = \varphi_1 + \pi$$



The response of two scatterers depends on their position... relatively to  $\lambda$ !!!!



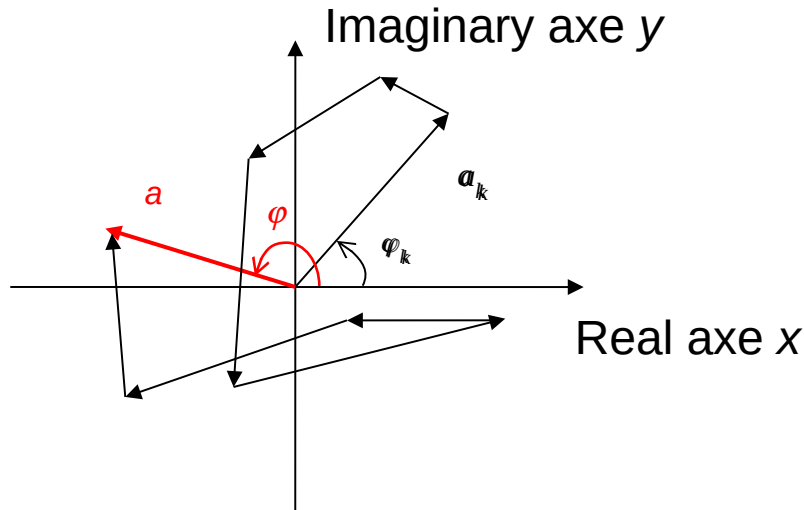
**Ideal Radar reflectivity image**



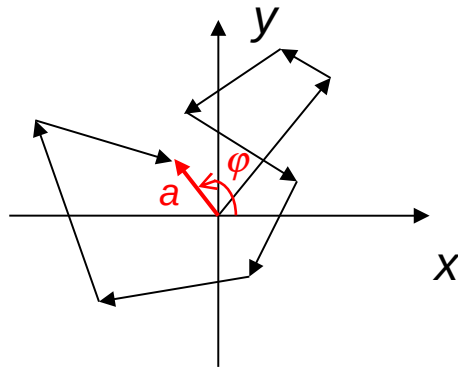
**Radar acquisition**



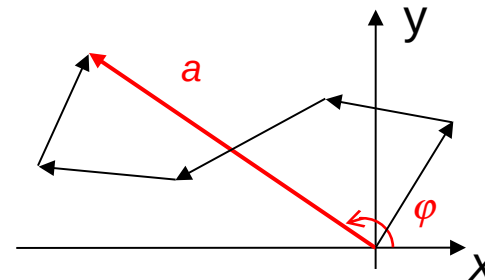
# Speckle origin: coherent sum



$$\mathbf{z} = \begin{cases} \sum_{k=1}^N a_k e^{j\varphi_k} = A e^{j\psi} \\ \sum_{k=1}^N x_k + jy_k = X + jY \end{cases}$$



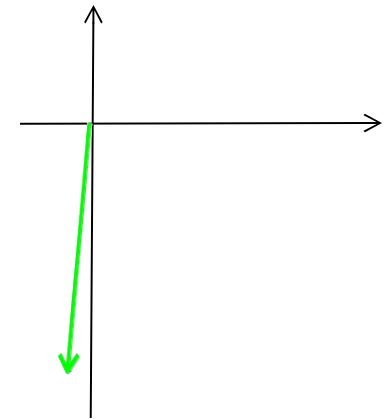
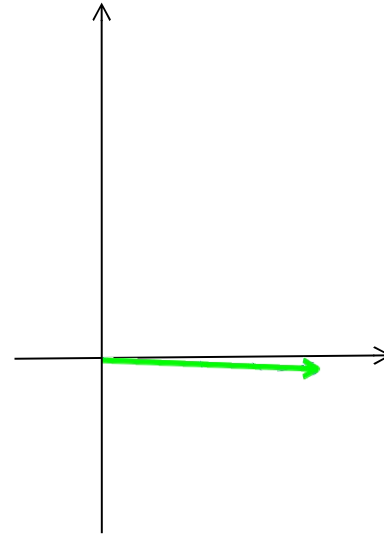
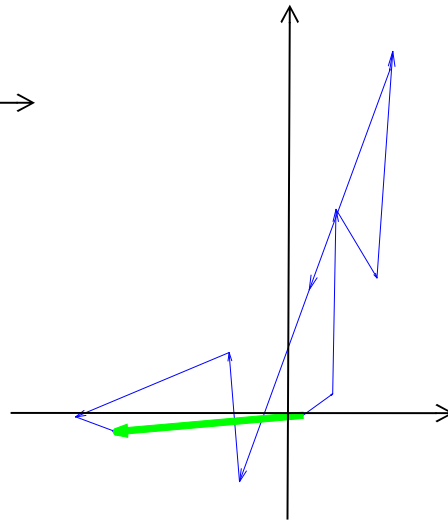
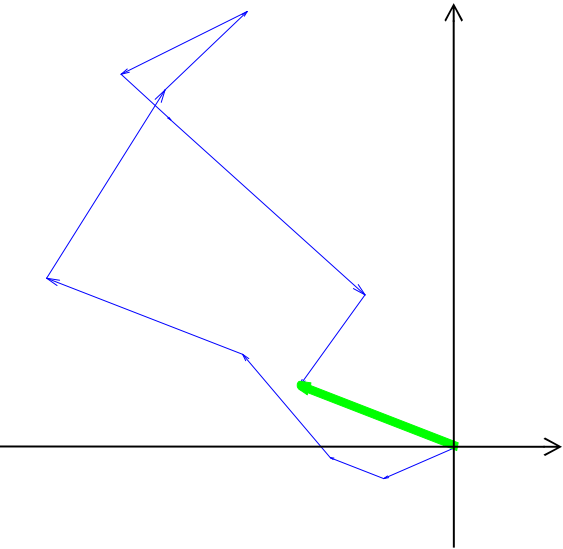
Destructive arrangement



Constructive arrangement

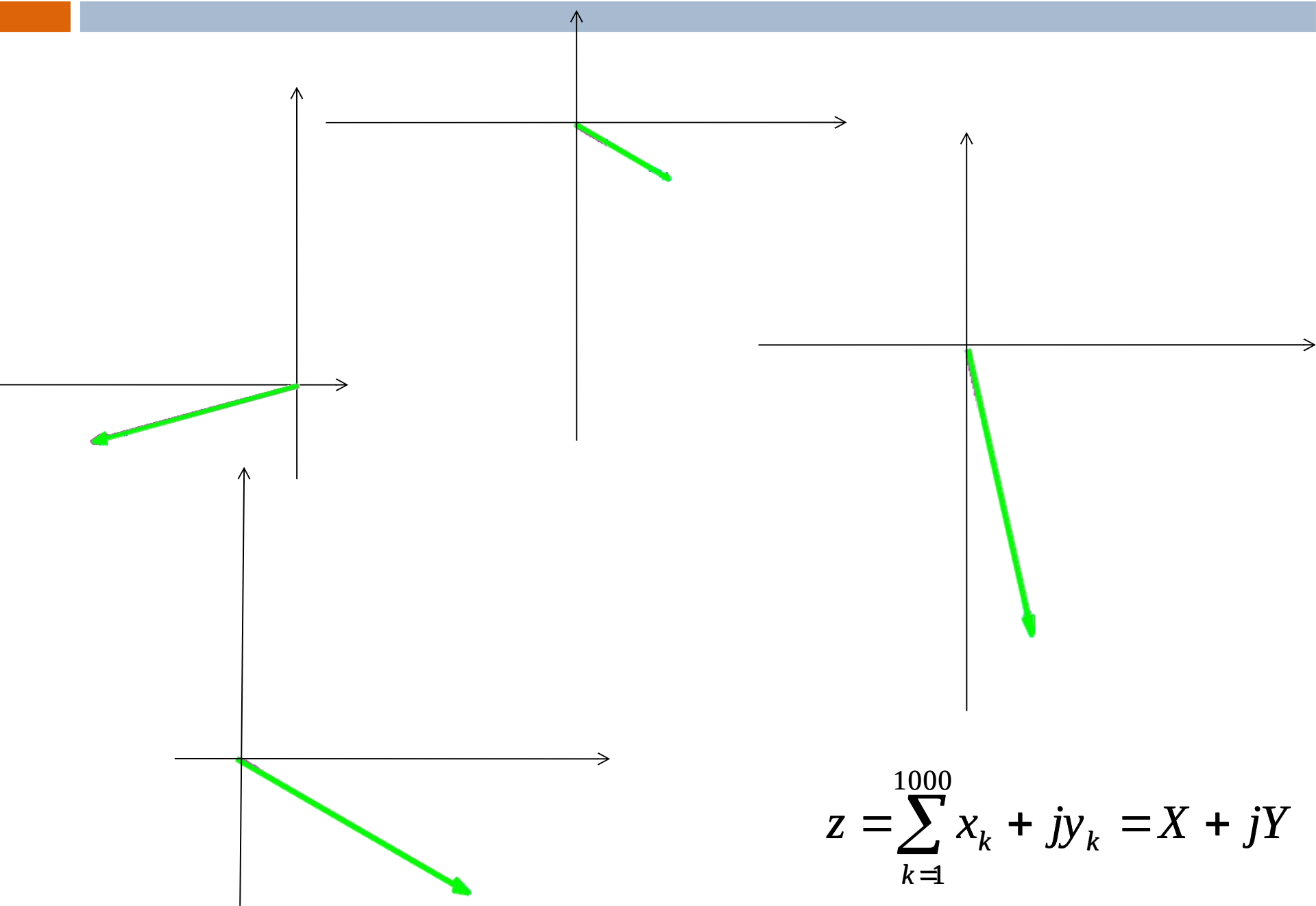


# Speckle origin: Coherent sum



$$z = \sum_{k=1}^9 x_k + jy_k = X + jY$$

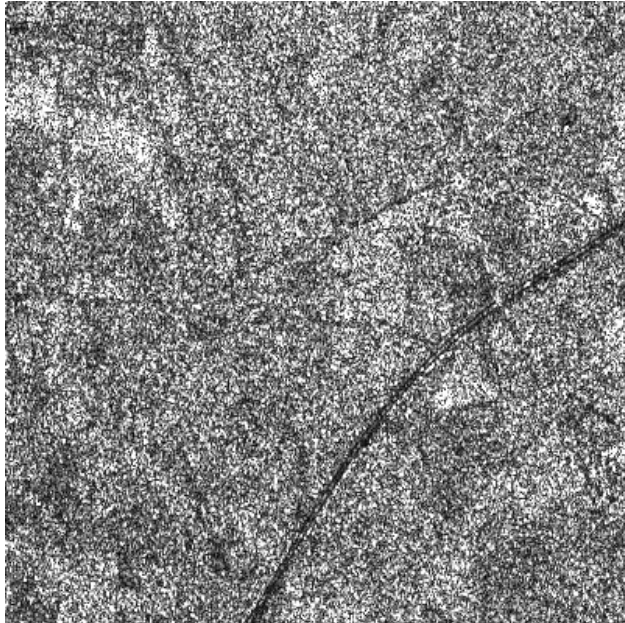
# Coherent sum



$$z = \sum_{k=1}^{1000} x_k + jy_k = X + jY$$

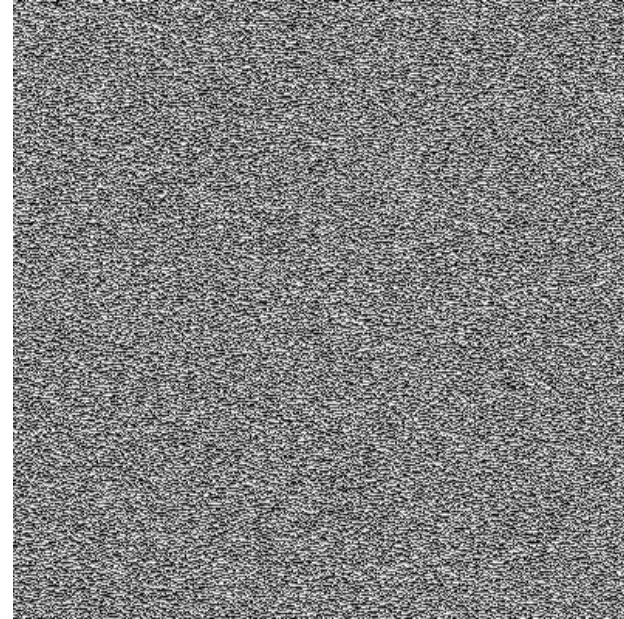
# RADAR DATA = Amplitude + Phase DATA

A



Amplitude image

$\phi$



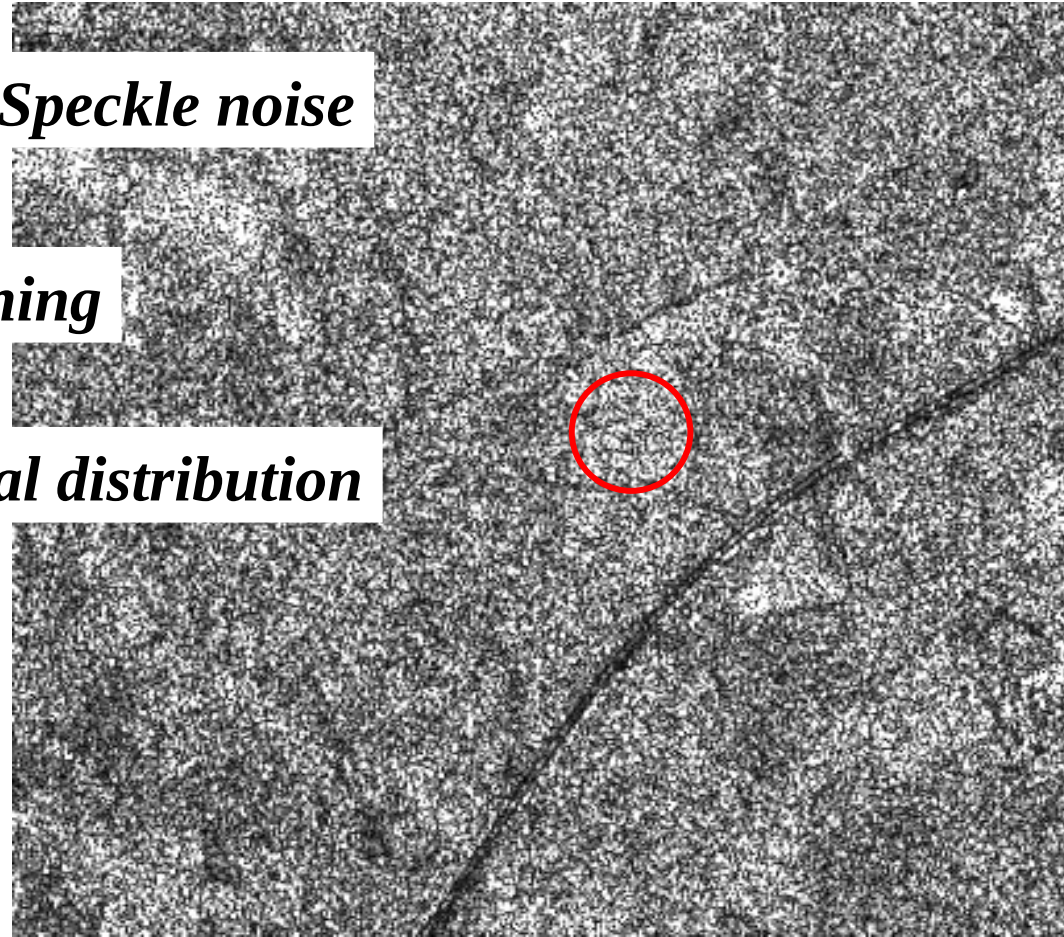
Phase image

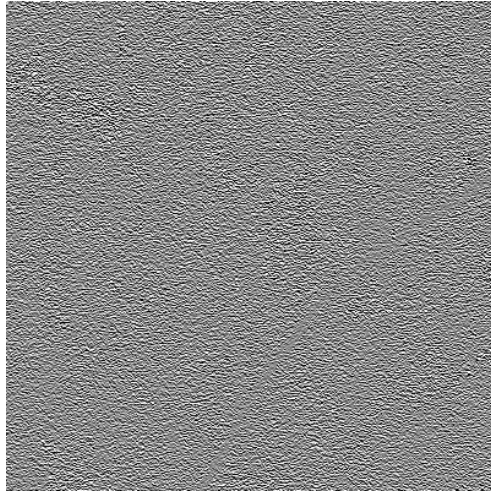
RADARSAT - Fine 1  
SLC product

Coherent Imagery System □ *Speckle noise*

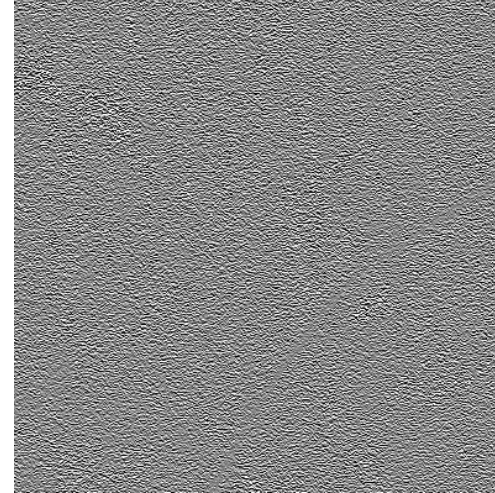
*Single pixel value = no meaning*

Homogeneous are = *statistical distribution*

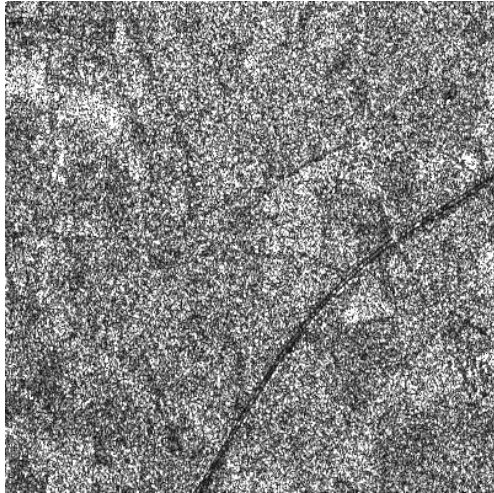




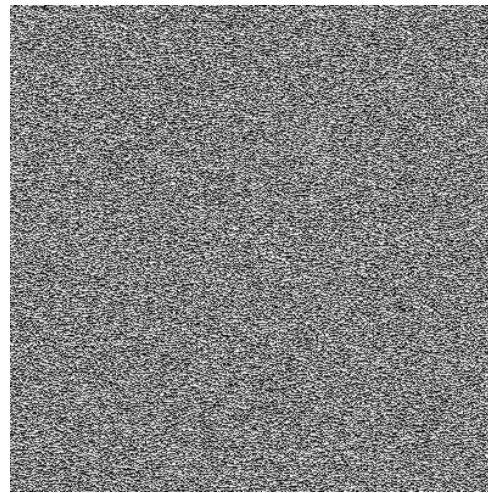
Real part



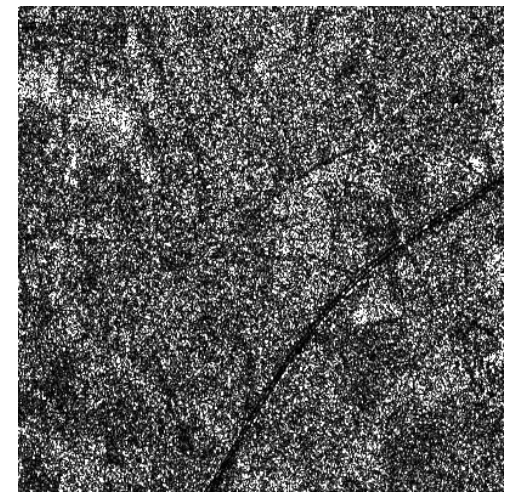
Imaginary part



Amplitude



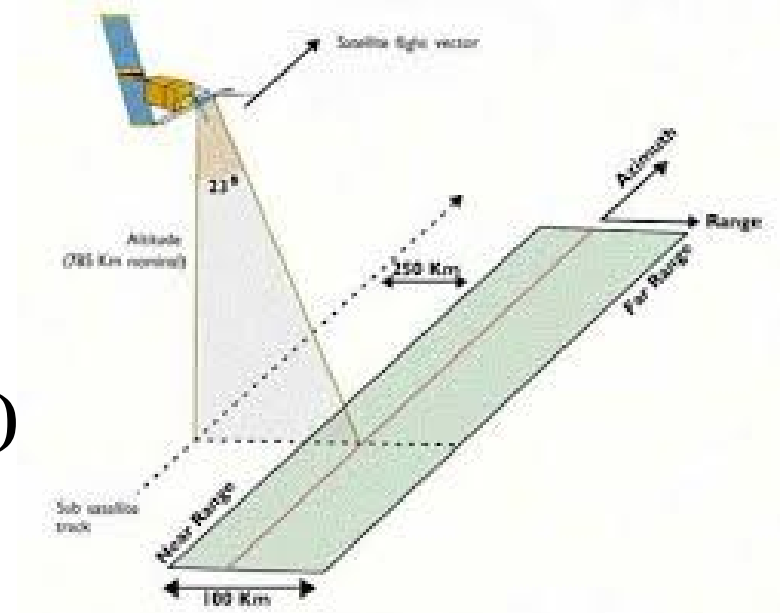
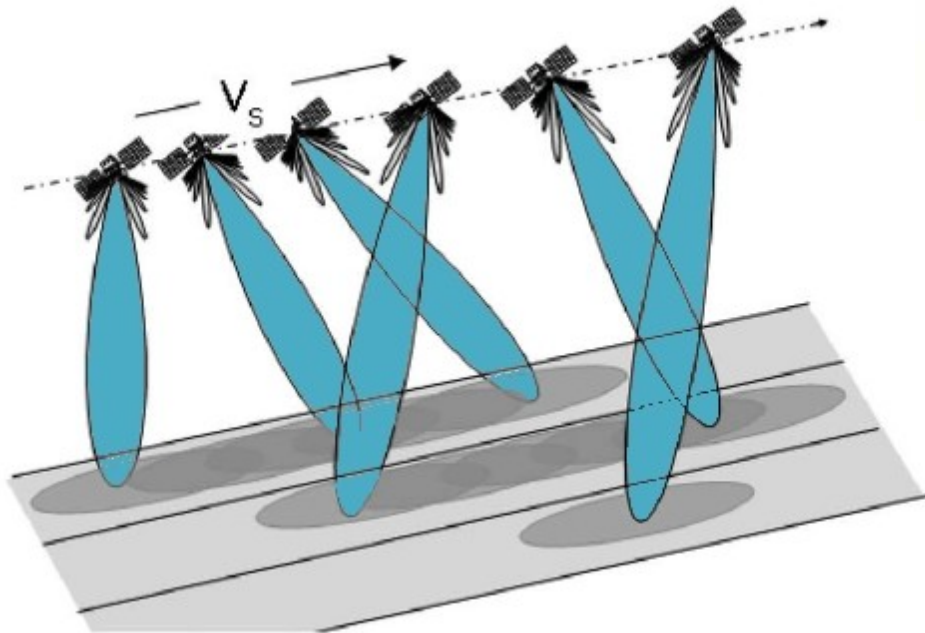
Phase



Intensity

# SENTINEL-1 ACQUISITION MODES

## INTERFEROMETRICWIDE (IW)



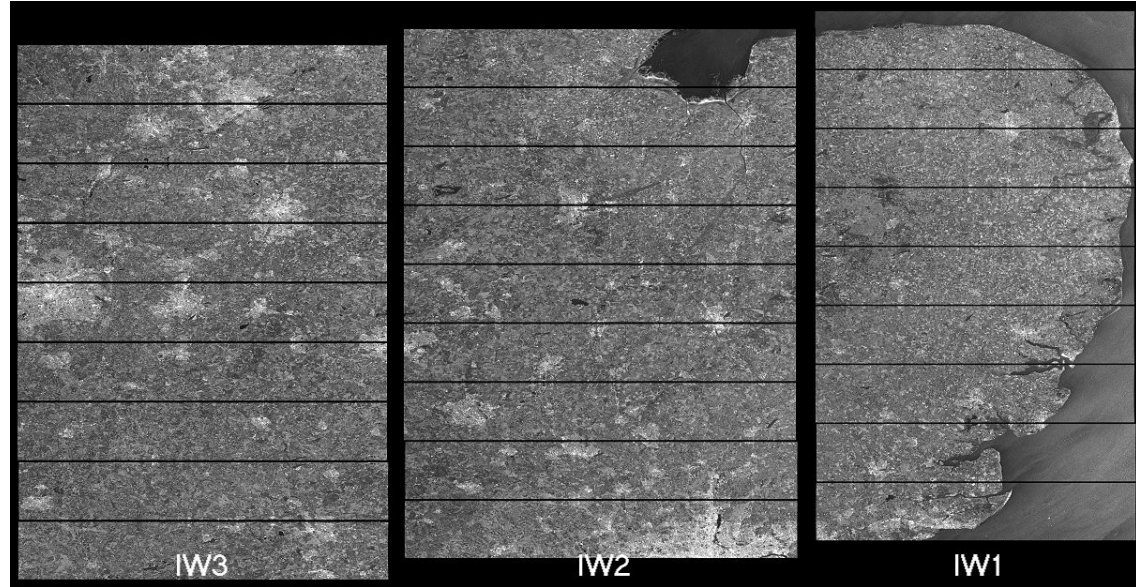
## STRIPMAP

# SENTINEL-1 INTERFEROMETRIC WIDE MODE

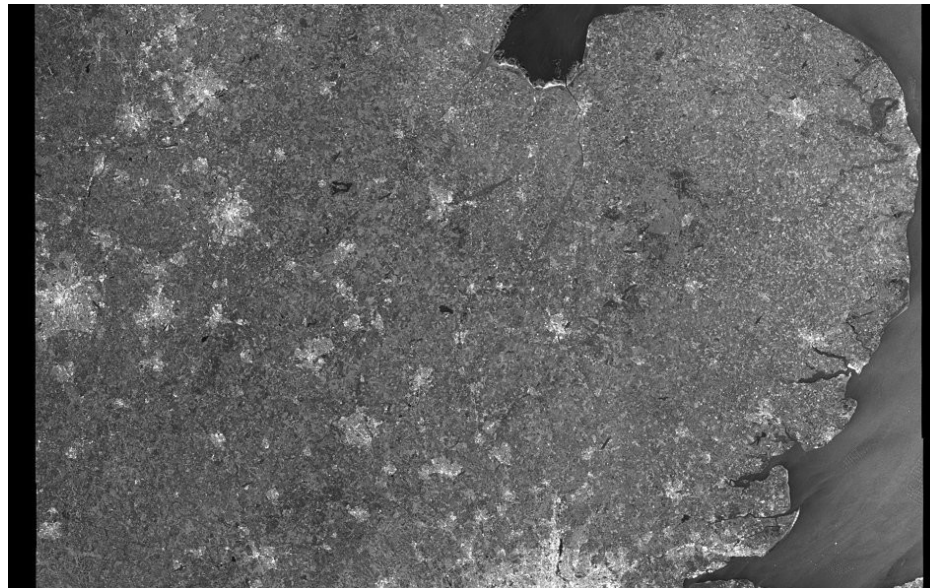
3 subswaths

SLC products

8 bursts

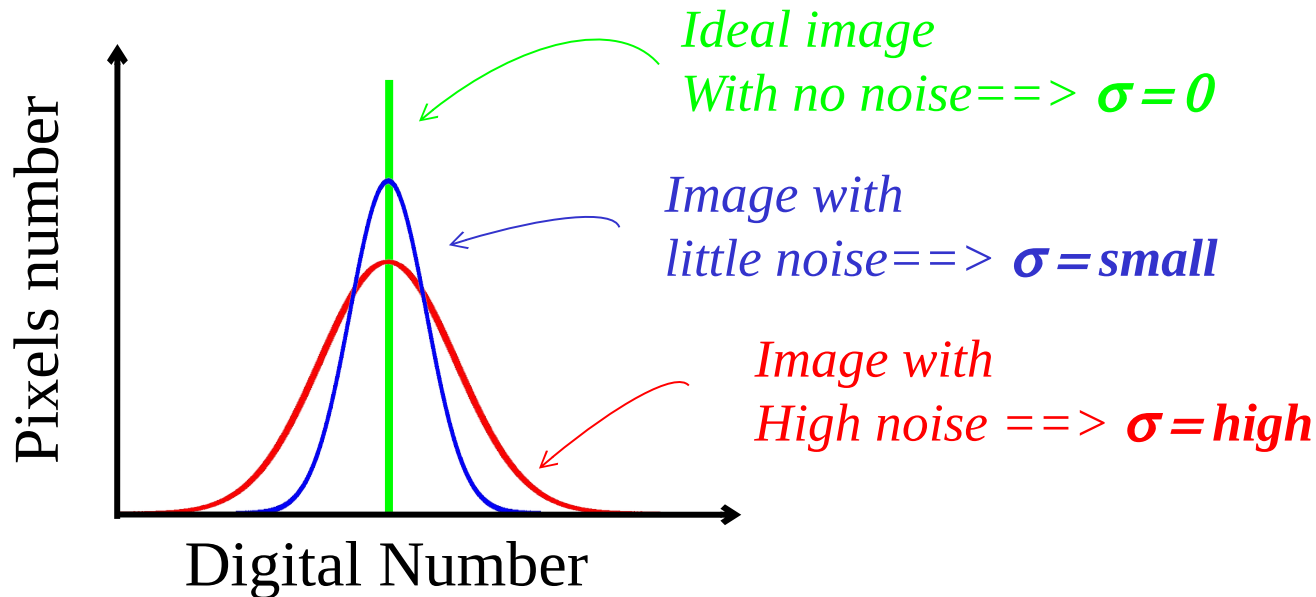


GRD products



# *Goal of radar image filtering:*

Histogram over an homogeneous area



***Decrease the standard deviation  $\sigma$  (noise)  
without modify the mean  $m$  ( radar reflectivity)***





© Camille Pissaro



© Camille Pissaro



© Camille Pissaro

A distant vision allows to blur the pointillist effect  
and to see the homogeneous areas

→ The ***average process*** effect!!!

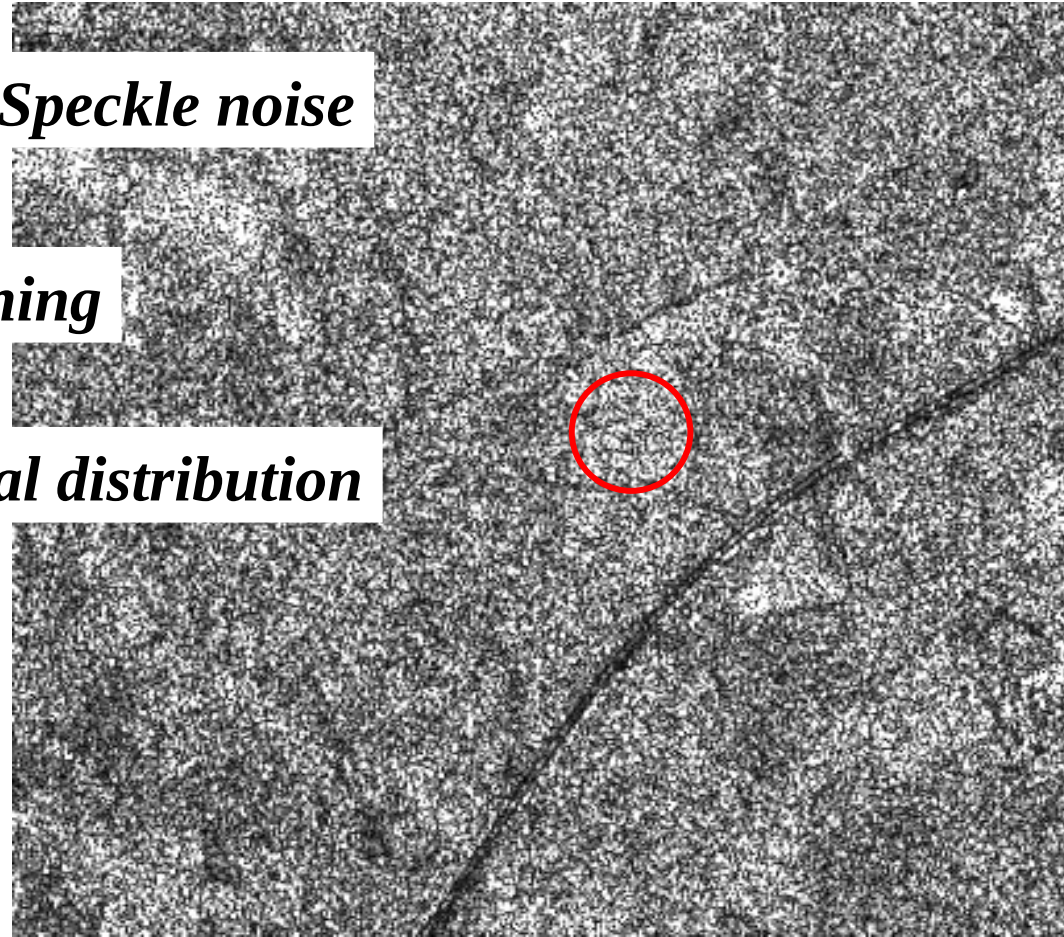
Reduces the noise (*standard deviation*)

doesn't change the average radiometry (*mean*)

Coherent Imagery System □ *Speckle noise*

*Single pixel value = no meaning*

Homogeneous are = *statistical distribution*



# Speckle “*fully developed*” (Goodman hypothesis)

Valid for natural surfaces

Homogeneous areas

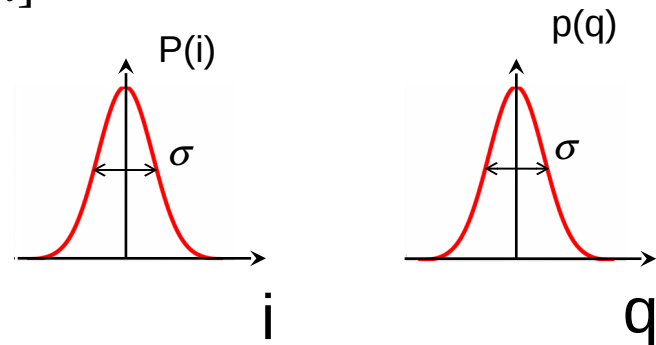
- A lot of scatterer: N is big
- Ampl. and phase of scatterer ‘k’ are independent regard to N-1 others
- Each scatterer amplitude and phase are independent

$a_k$  are identically distributed ( $E(a)$ ,  $E(a^2)$ )

$\varphi_k$  are uniformly distributed over  $[-\pi, \pi]$

$\Rightarrow z = i + j \cdot q$  is normally distributed  
*i and q are independent*

$$p_i(i/\sigma) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{\left(\frac{-i^2}{2\sigma^2}\right)}$$



$$E(i) = E(q) = 0$$

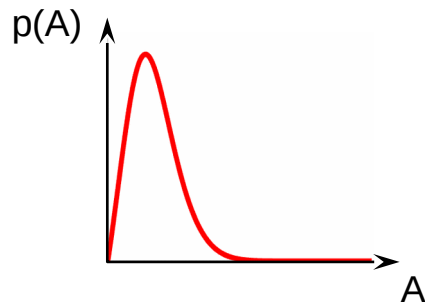
$$E(i^2) = E(q^2) = \sigma^2 = N \frac{E(a^2)}{2}$$

Homogeneous  
areas

Amplitude:  $A$

$$p_A(A/\sigma) = \frac{A}{\sigma^2} \exp\left(\frac{-A^2}{2\sigma^2}\right)$$

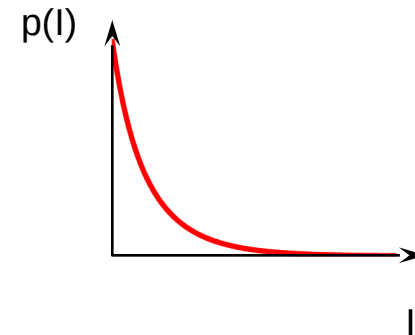
$$E(A) = \sigma \sqrt{\frac{\pi}{2}}, \quad E(A^2) = 2\sigma^2$$



Intensity:  $I$

$$p_I(I/\sigma) = \frac{1}{2\sigma^2} \exp\left(\frac{-I}{2\sigma^2}\right)$$

$$E(I) = 2\sigma^2 = R, \quad E(I^2) = 8\sigma^4 = 2R^2$$



Radar reflectivity:  $R \propto \sigma^2$

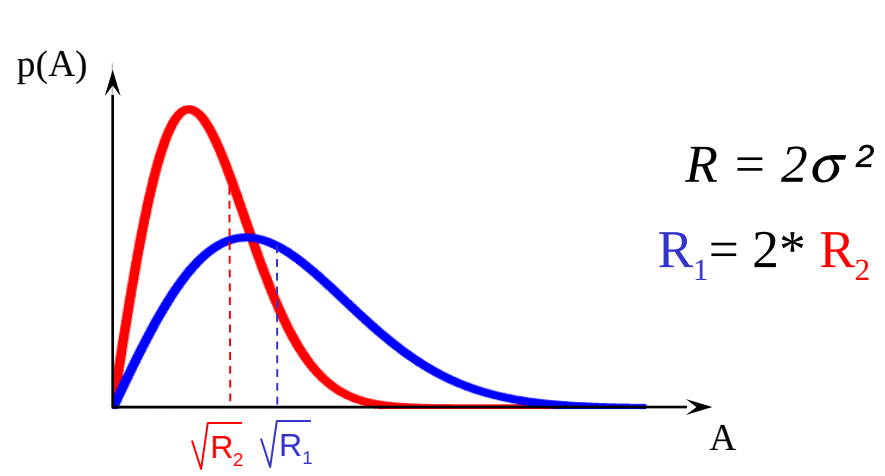
$$E(I) = E(i^2 + q^2) = 2\sigma^2 = R$$

Homogeneous areas

### Amplitude: $A$

$$p_A(A/\sigma) = \frac{A}{\sigma^2} \exp\left(\frac{-A^2}{2\sigma^2}\right)$$

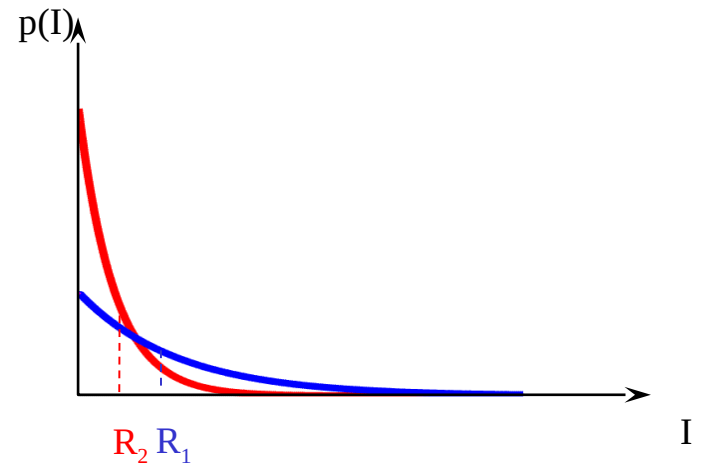
$$E(A) = \sigma \sqrt{\frac{\pi}{2}}, \quad E(A^2) = 2\sigma^2$$



### Intensity: $I$

$$p_I(I/\sigma) = \frac{1}{2\sigma^2} \exp\left(\frac{-I}{2\sigma^2}\right)$$

$$E(I) = 2\sigma^2, \quad E(I^2) = 8\sigma^4$$



The higher is  $R$ , the more data are spread over

# Speckle: multiplicative noise



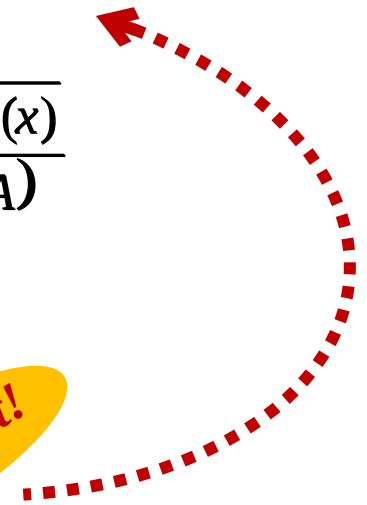
RADARSAT - Mode Fine 1

Variation coefficient:  $C_v = \frac{\sqrt{\text{var}(x)}}{E(A)}$

$$C_A = \frac{\sqrt{\text{var}(A)}}{E(A)} = \sqrt{\frac{4}{\pi} - 1} \approx 0.5227$$

$$C_I = \frac{\sqrt{\text{var}(I)}}{E(I)} = 1$$

**constant!**



multilook data

$$y = \frac{1}{N} (x_1 + x_2 + \dots + x_N) \Rightarrow \begin{cases} \text{var}(y) = \frac{\text{var}(x)}{N} \\ E(y) = E(x) \end{cases}$$

Look number:  $N$

$$C_{ML} = \frac{C_{1L}}{\sqrt{N}} \Leftrightarrow N = \left( \frac{C_{1L}}{C_{ML}} \right)^2$$

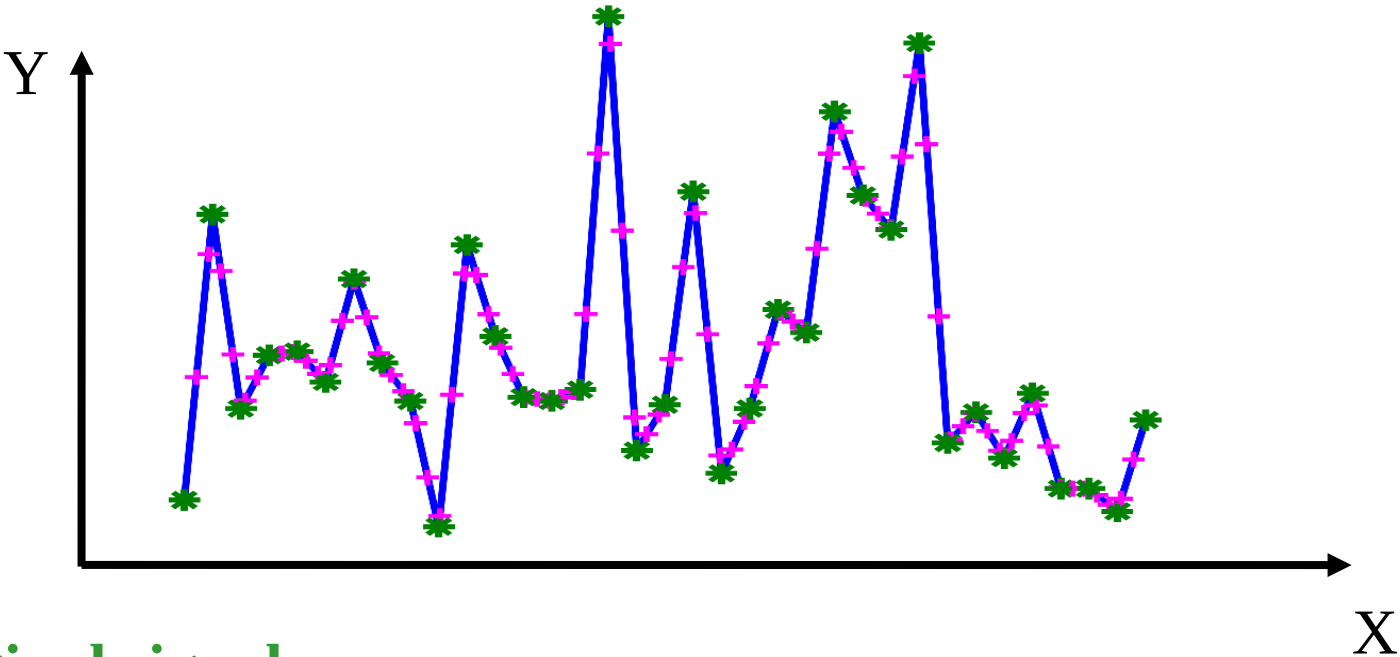
$$\Rightarrow N = \begin{cases} \left( \frac{1}{C_{ML}} \right)^2 \\ \left( \frac{0.5227}{C_{ML}} \right)^2 \end{cases}$$

Intensity data

Amplitude data



# Signal Processing principles



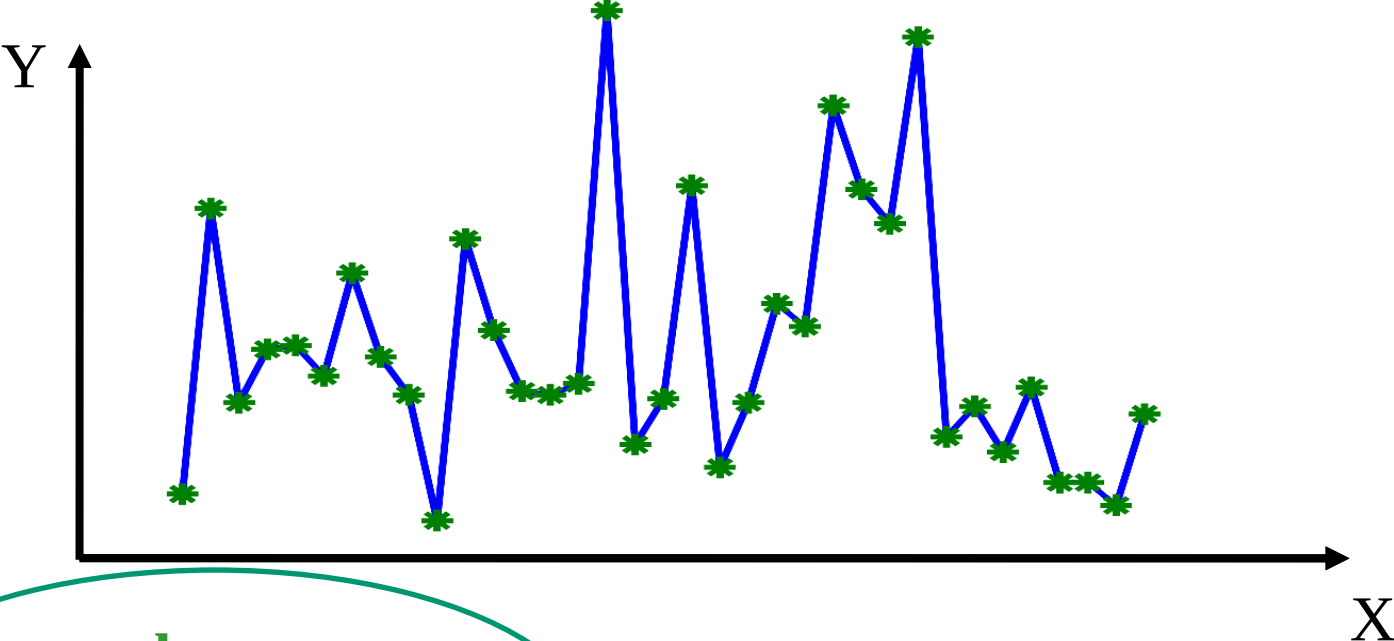
**Original signal**

34 samples  
34 indep<sup>t</sup> measurements

**Resampled signal**

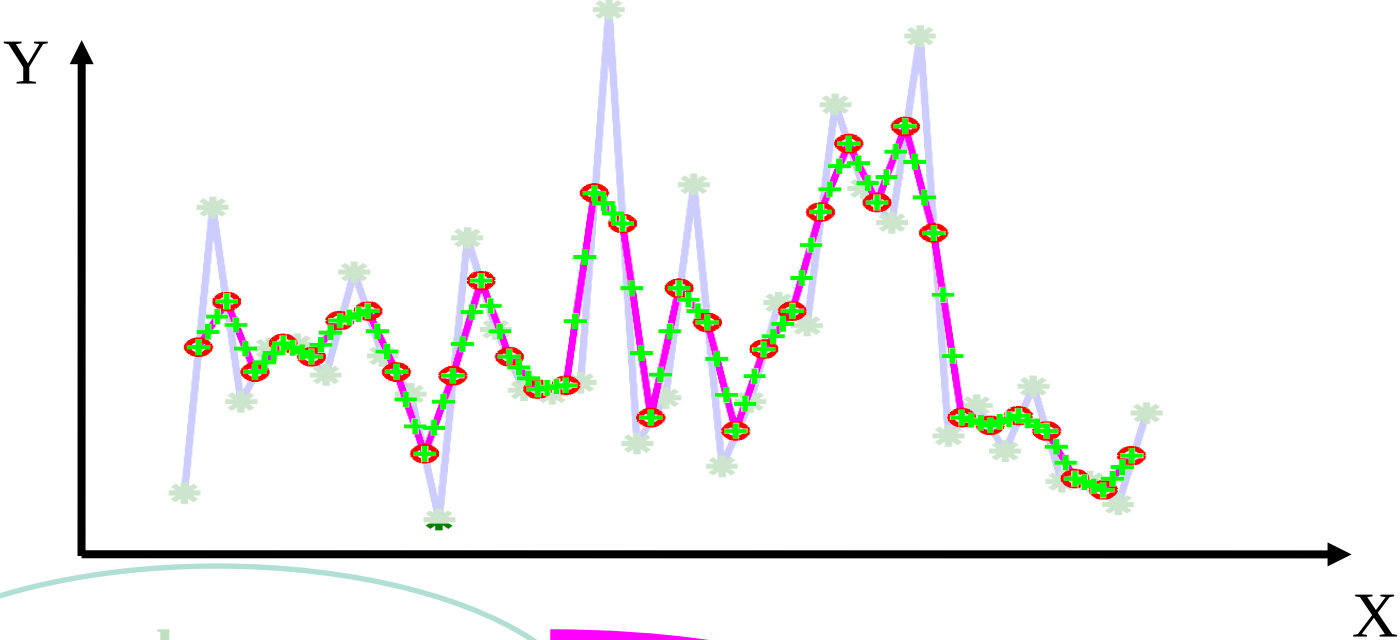
78 points (linear interpolation)  
still 34 **independant samples**  
Same information

# Signal Processing principles



**34 samples**  
**34 indep<sup>t</sup> measurements**  
**1 look signal**

# Signal Processing principles

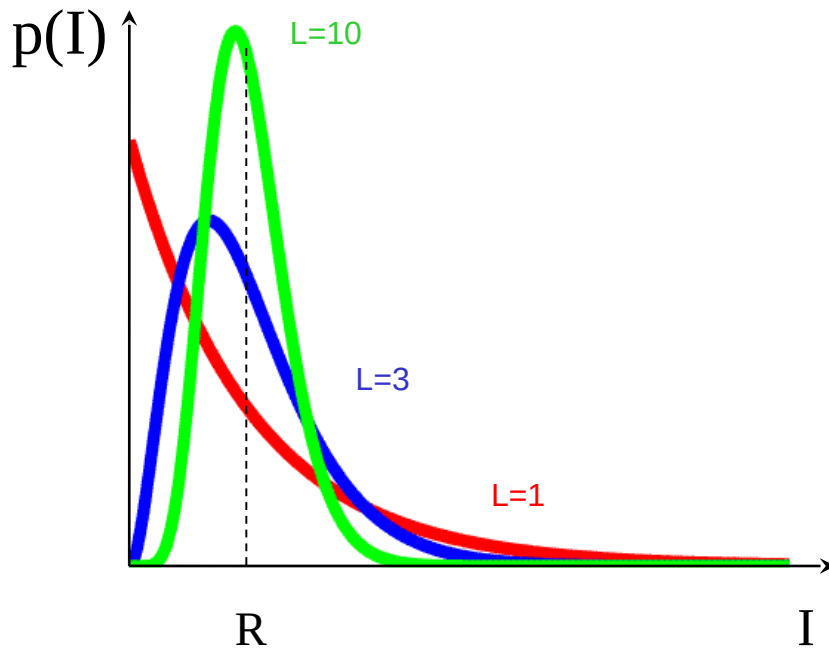


34 samples  
34 indep<sup>t</sup> measurements  
1 look serie

33 points  
2 samples 1 new sample  
==> 2-looks signal

linear resampling  
2-looks signal  
No additional information

# multilook data



$$I_{ml} = \frac{1}{L} \sum_{k=1}^L I_k$$

$$p(I_{ml} / R) = \left( \frac{L}{R} \right)^L \frac{1}{\Gamma(L)} \exp\left( - \frac{LI_{ml}}{R} \right) I_{ml}^{L-1}$$

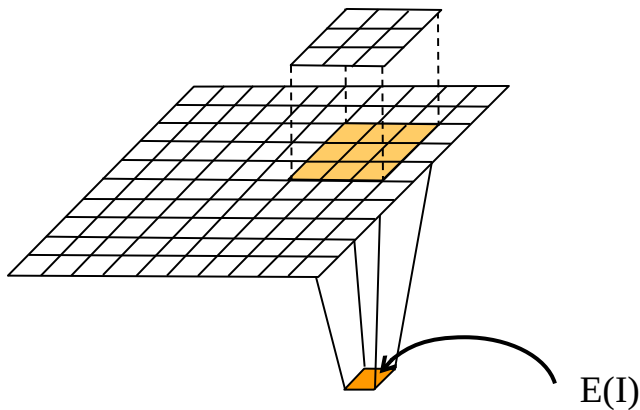
$$E(I_{ml}) = R, \quad E(I_{ml}^2) = \frac{L+1}{L} R^2$$

$$C_{v_{I_{ml}}} = \frac{C_{v_I}}{\sqrt{L}}$$

# MULTILOOK OBTENTION

in spatial domain

*Sliding window: image \* window*

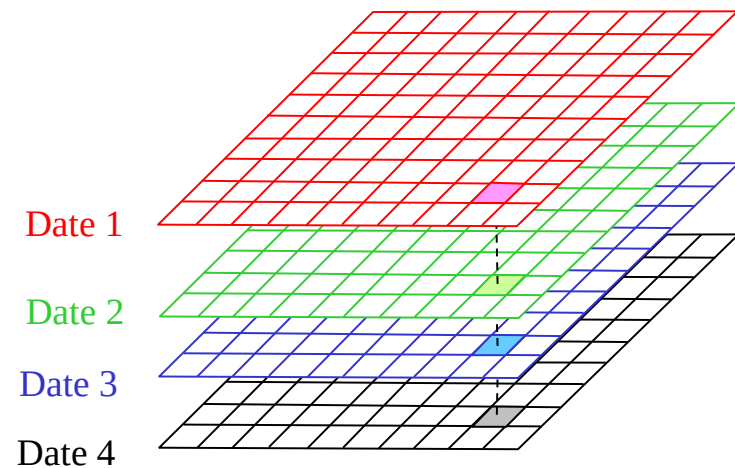


**9 looks if pixel sare not correlated**

Example: ERS data - PRI products :  $\times$  3 looks

**☞ Loss of spatial resolution**

in temporal domain



4 looks if surface  
has not changed

**☞ Preservation of spatial res.  
Loss temporal information**

# Speckle: multiplicative noise



RADARSAT - Mode Fine 1

Variation coefficient:  $C_v = \frac{\sqrt{\text{var}(x)}}{E(A)}$

$$C_A = \frac{\sqrt{\text{var}(A)}}{E(A)} = \sqrt{\frac{4}{\pi} - 1} \approx 0.5227$$

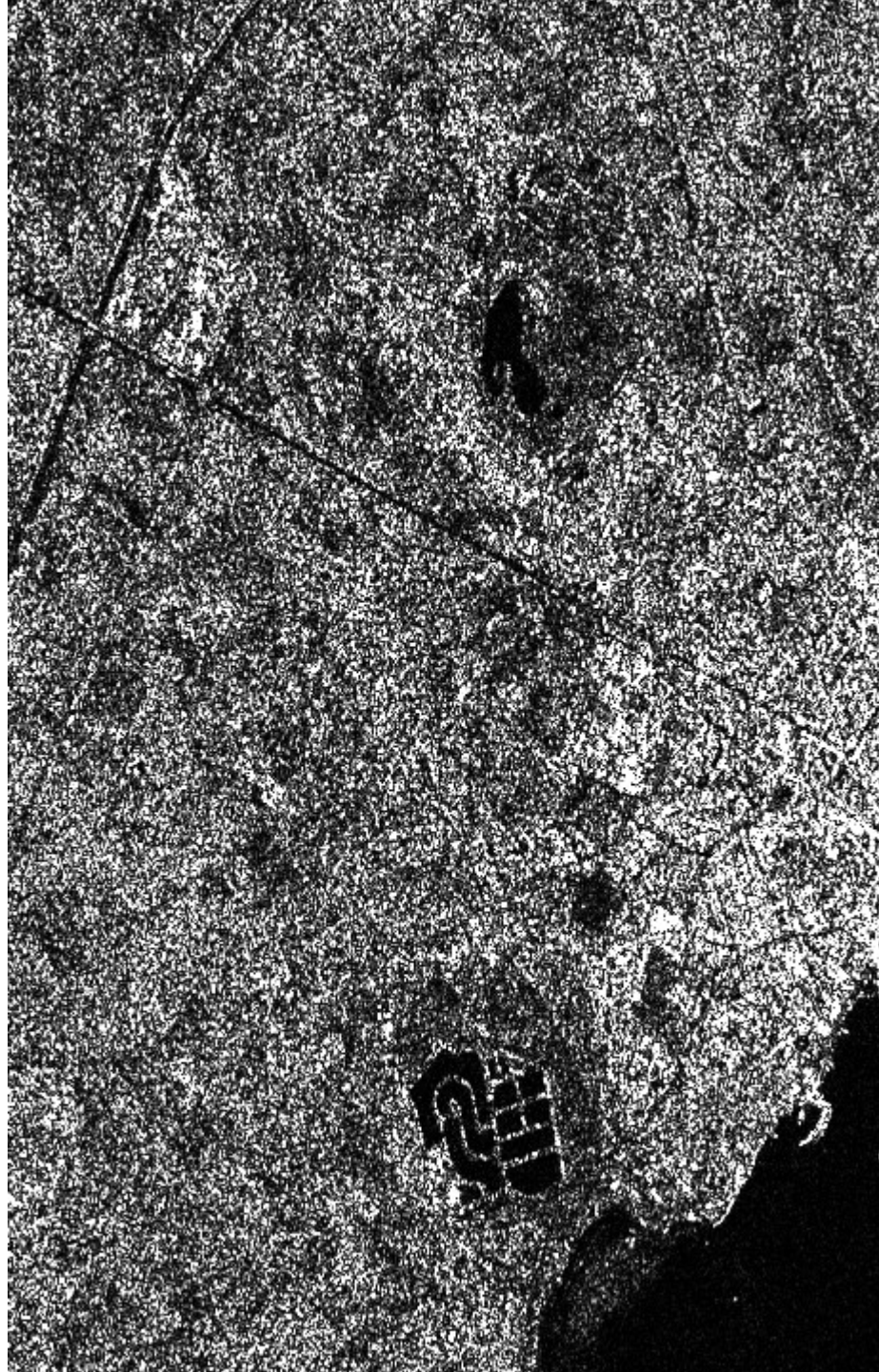
$$C_I = \frac{\sqrt{\text{var}(I)}}{E(I)} = 1$$

$$y = \frac{1}{N} (x_1 + x_2 + \dots + x_N) \Rightarrow \begin{cases} \text{var}(y) = \frac{\text{var}(x)}{N} \\ E(y) = E(x) \end{cases}$$

==> multilook data  
Look number:  $N$

$$C_{ML} = \frac{C}{\sqrt{N}} \Leftrightarrow N = \left( \frac{C}{C_{ML}} \right)^2$$

$$\Rightarrow N = \begin{cases} \left( \frac{1}{C_{ML}} \right)^2 & \text{Intensity data} \\ \left( \frac{0.5227}{C_{ML}} \right)^2 & \text{Amplitude data} \end{cases}$$

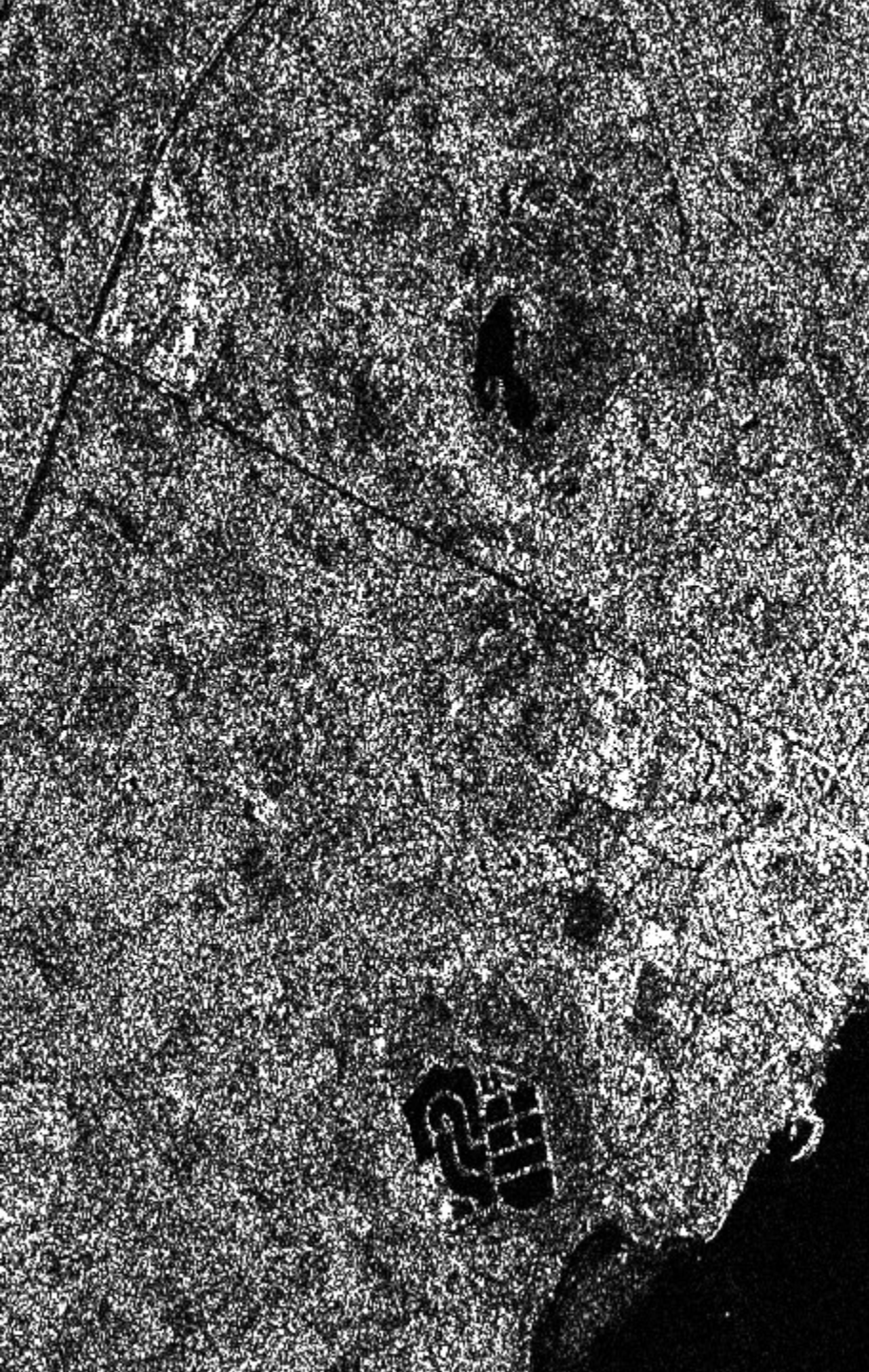


## *Intensity image*

(from SLC product)

Sète - France: 21.06.2001

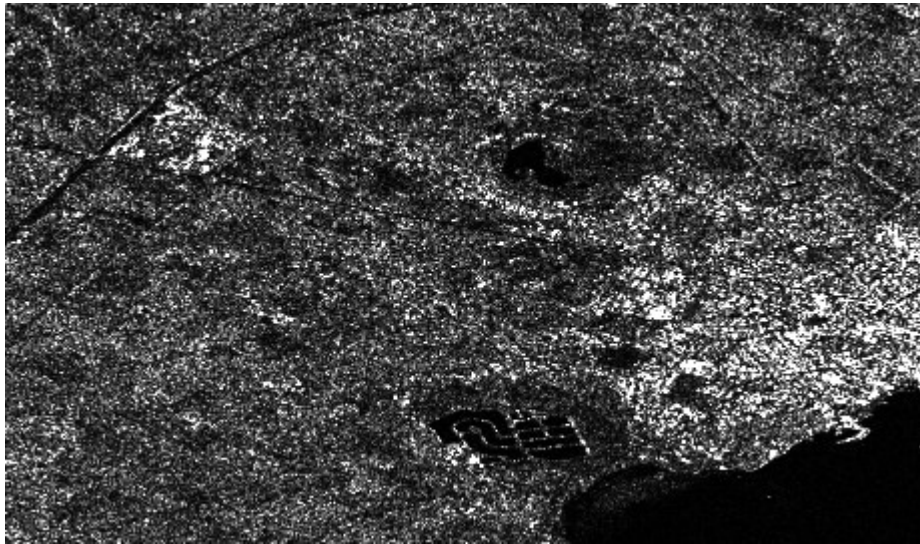
RADARSAT - FINE 1  
INCIDENCE 38°, 4 x9 m





# *Spatial Multilook (=average) Processing*

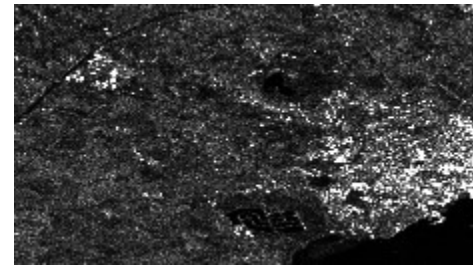
3x1 average window



< 3 Look

Sète - France: 21.06.2001

6x2 average window



< 12 Look

RADARSAT FINE 1  
INCIDENCE 38°, 9 x9 m

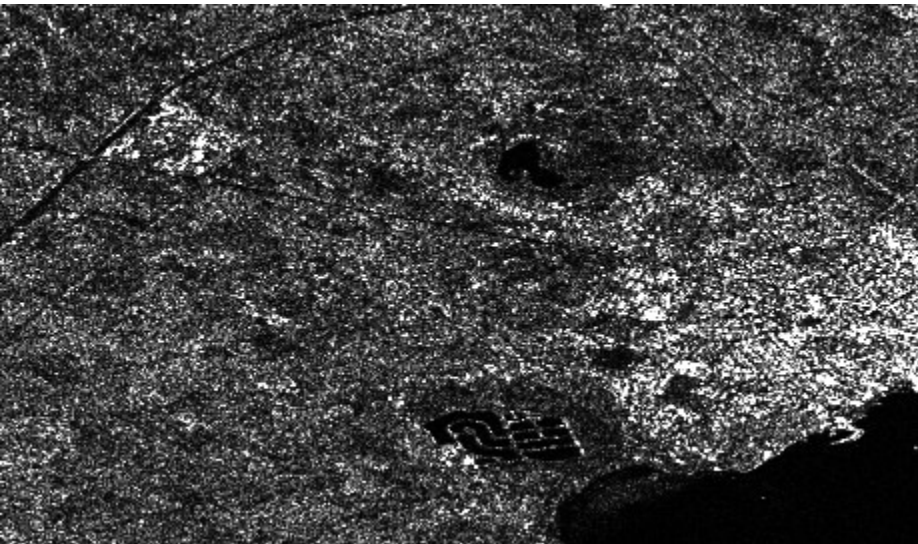
Due to pixels correlation!

# ***SPATIAL MULTILOOK PROCESSING***

Sète - France: 21.06.2001 - RADARSAT FINE 1 - INCIDENCE 38°, 9 x9 m

3x1 average window

< 3 Look



Due to pixels correlation!

6x2 average window

< 12 Look

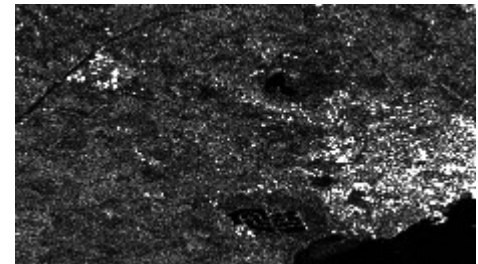
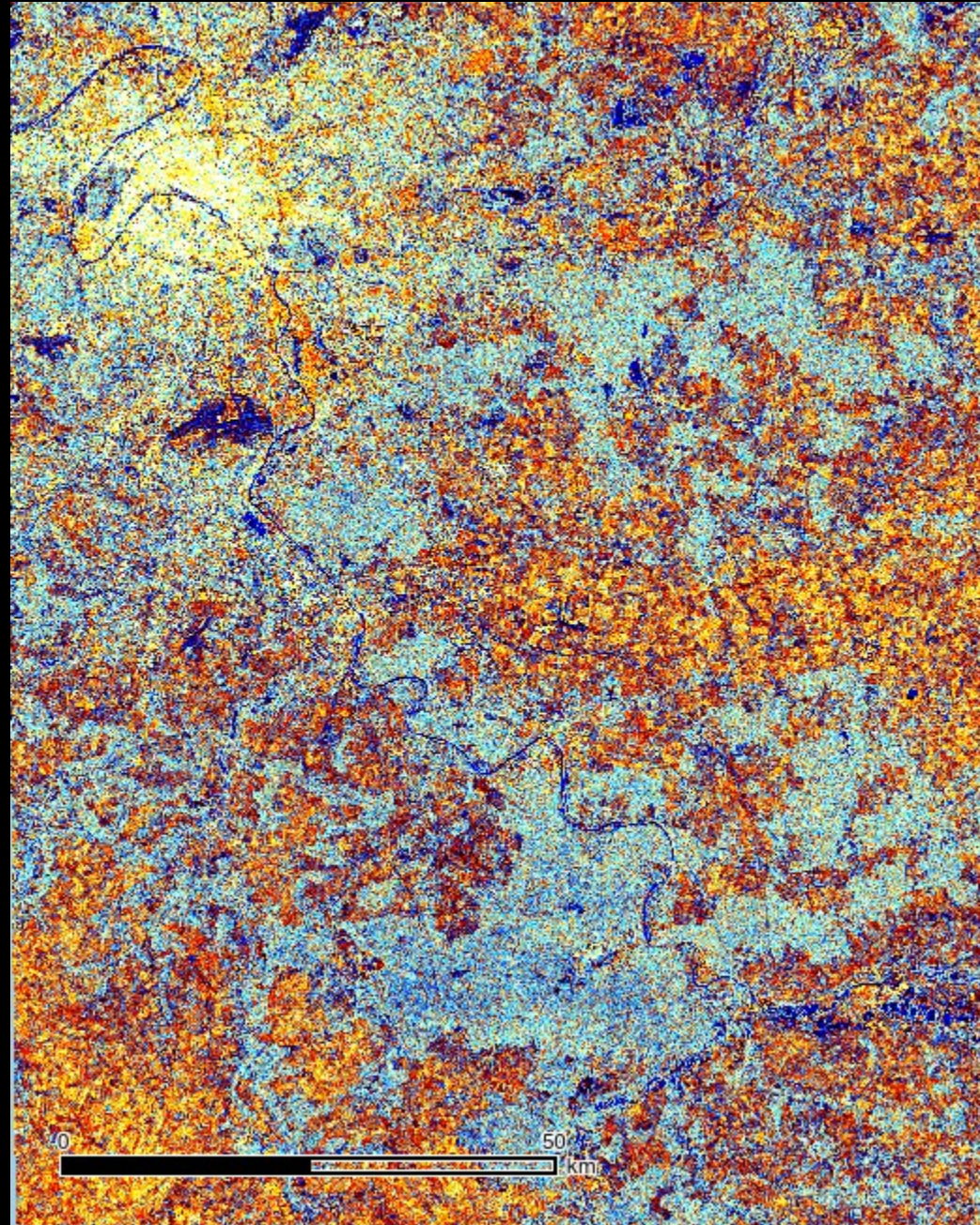


Photo aérienne ([www.géoportail.fr](http://www.géoportail.fr))

# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015

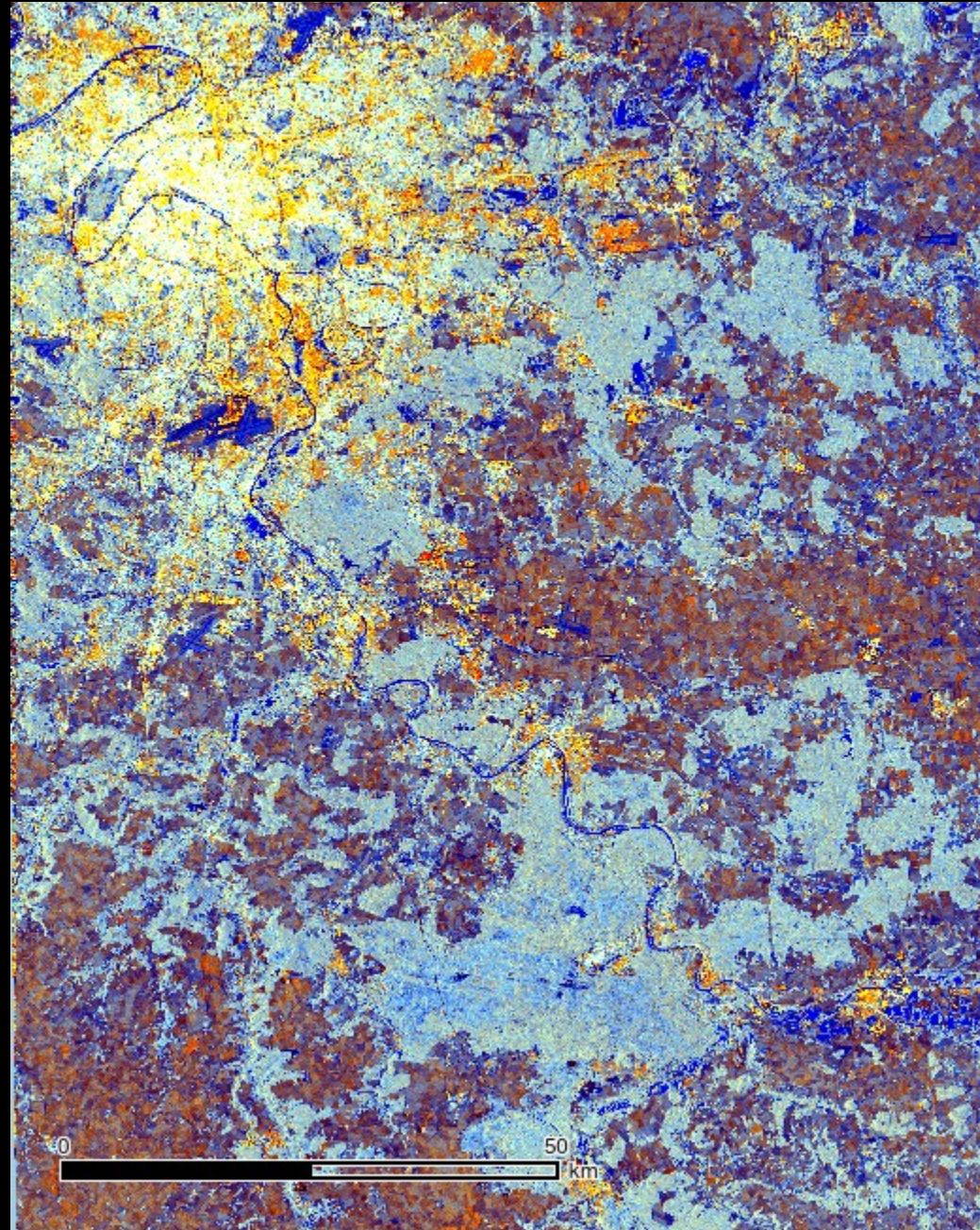
Parisian region



VV  
VH  
VH/VV

# Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average 2015/03/02 - 2017/01/26

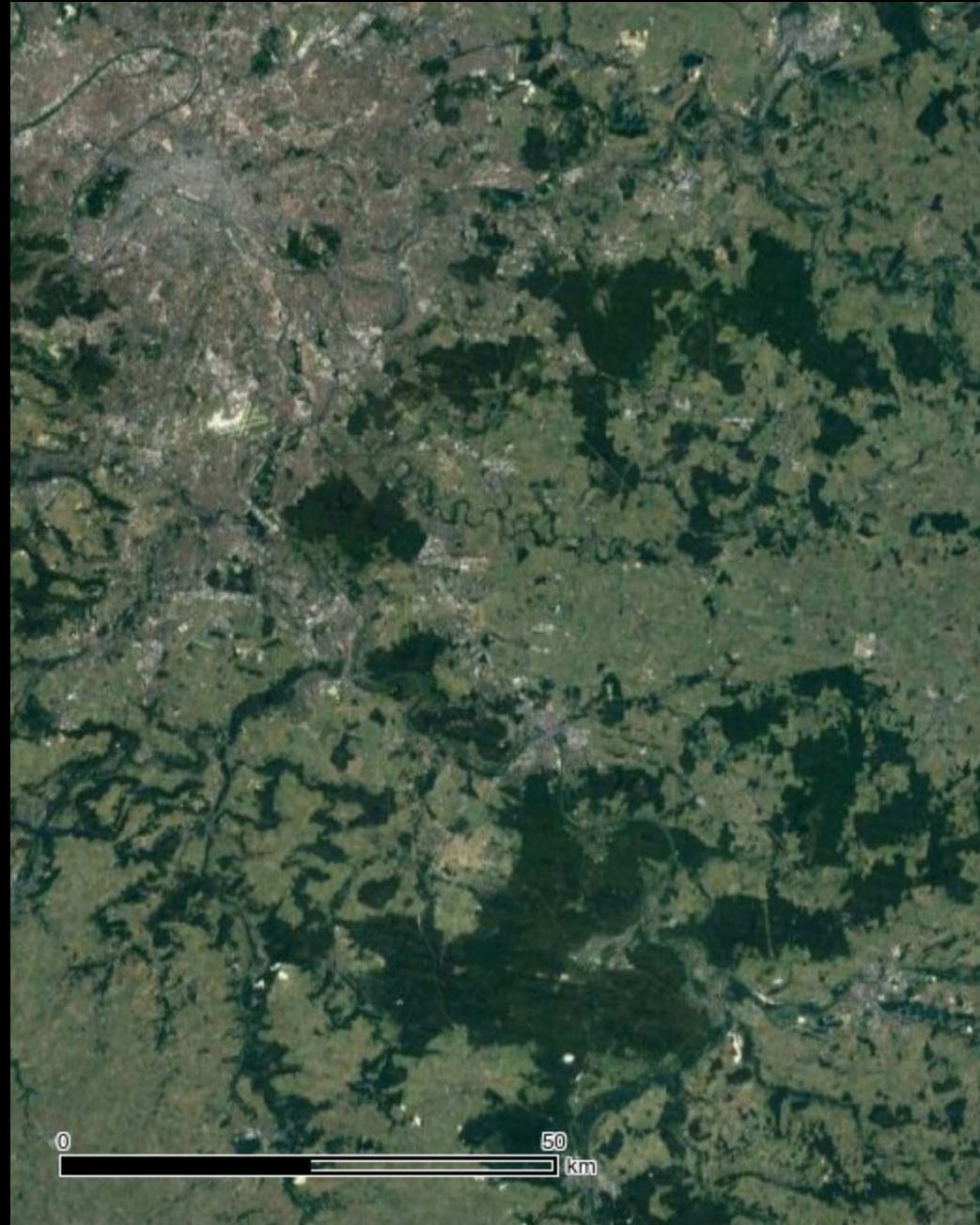
## Parisian region



VV  
VH  
VH/VV

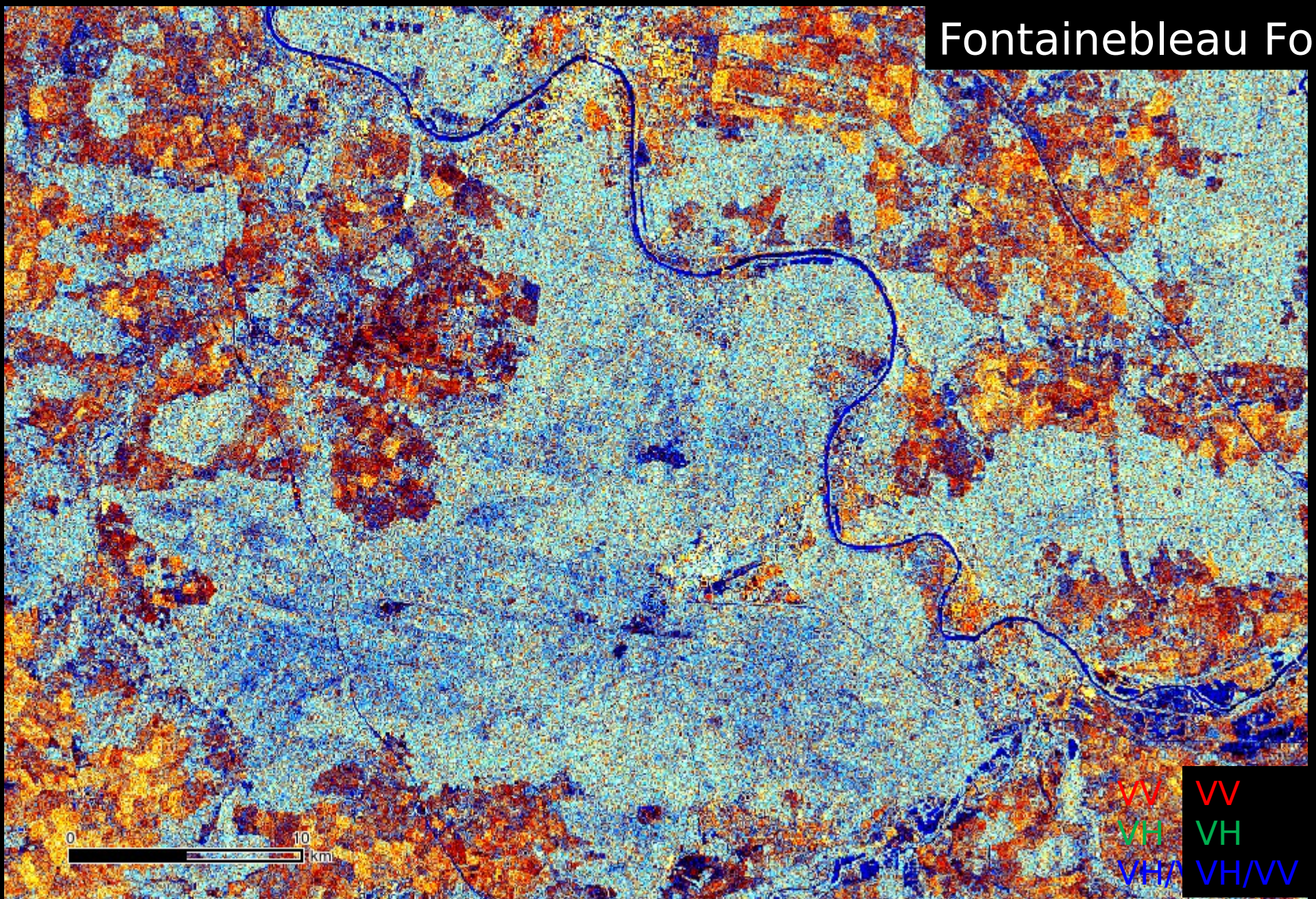
GoogleEarth Image

Parisian region



# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015

Fontainebleau Fo

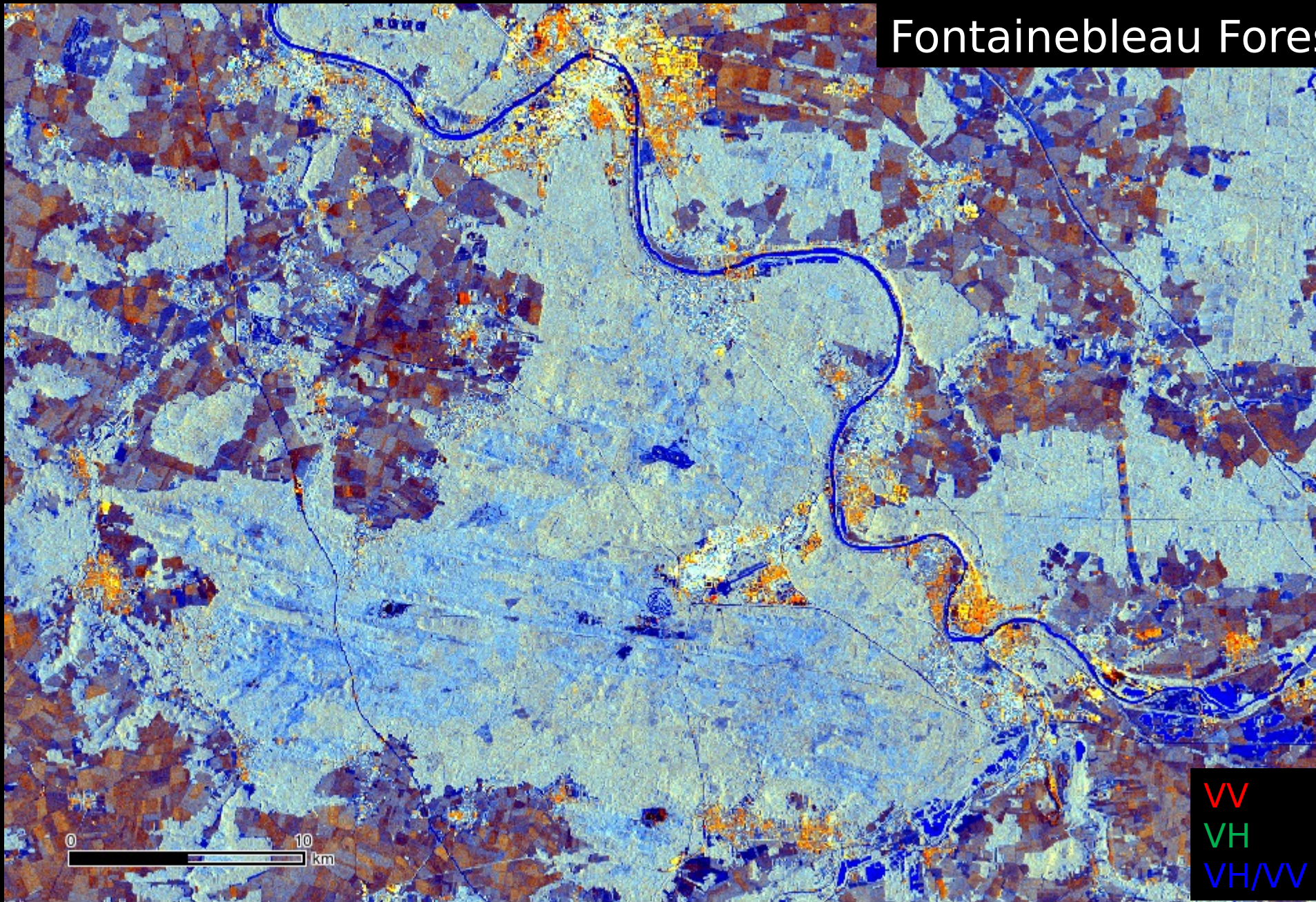


0 10 km

VV VV  
VH VH  
VH/VV VH/VV

Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average  
2015/03/02 - 2017/01/26

Fontainebleau Forest



0 10 km

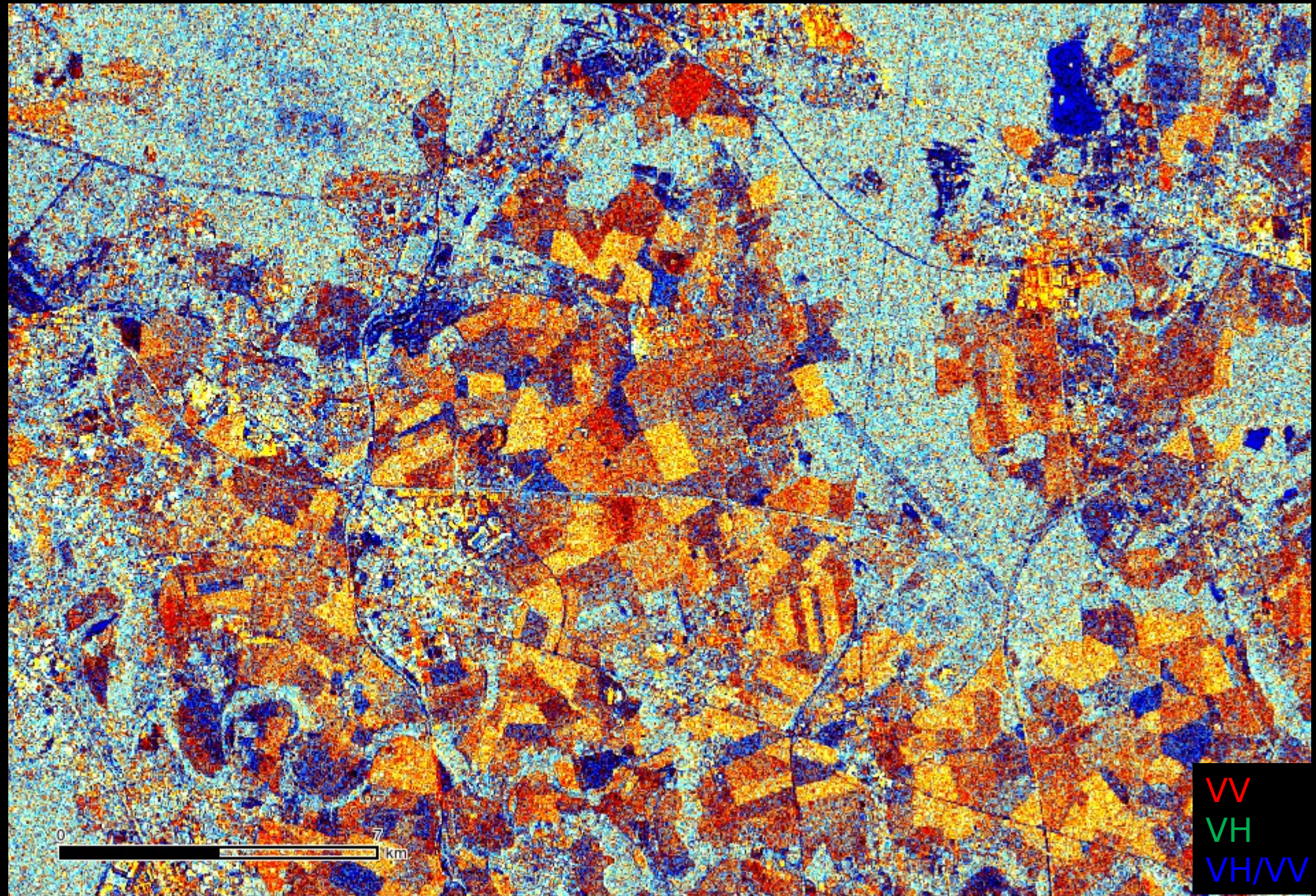
W  
V  
H



0 10 km

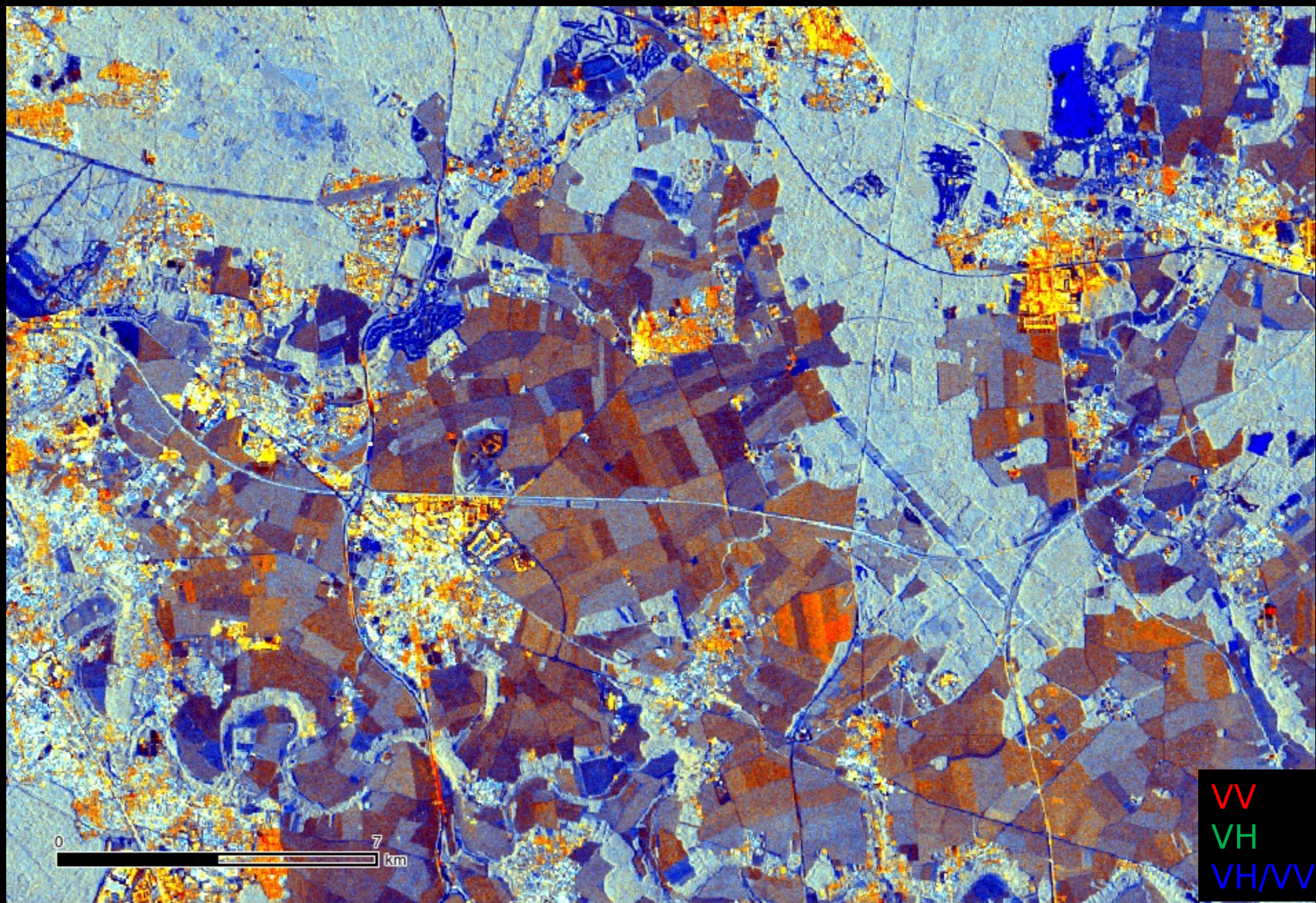


# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015



# Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average

2015/03/02 - 2017/01/26

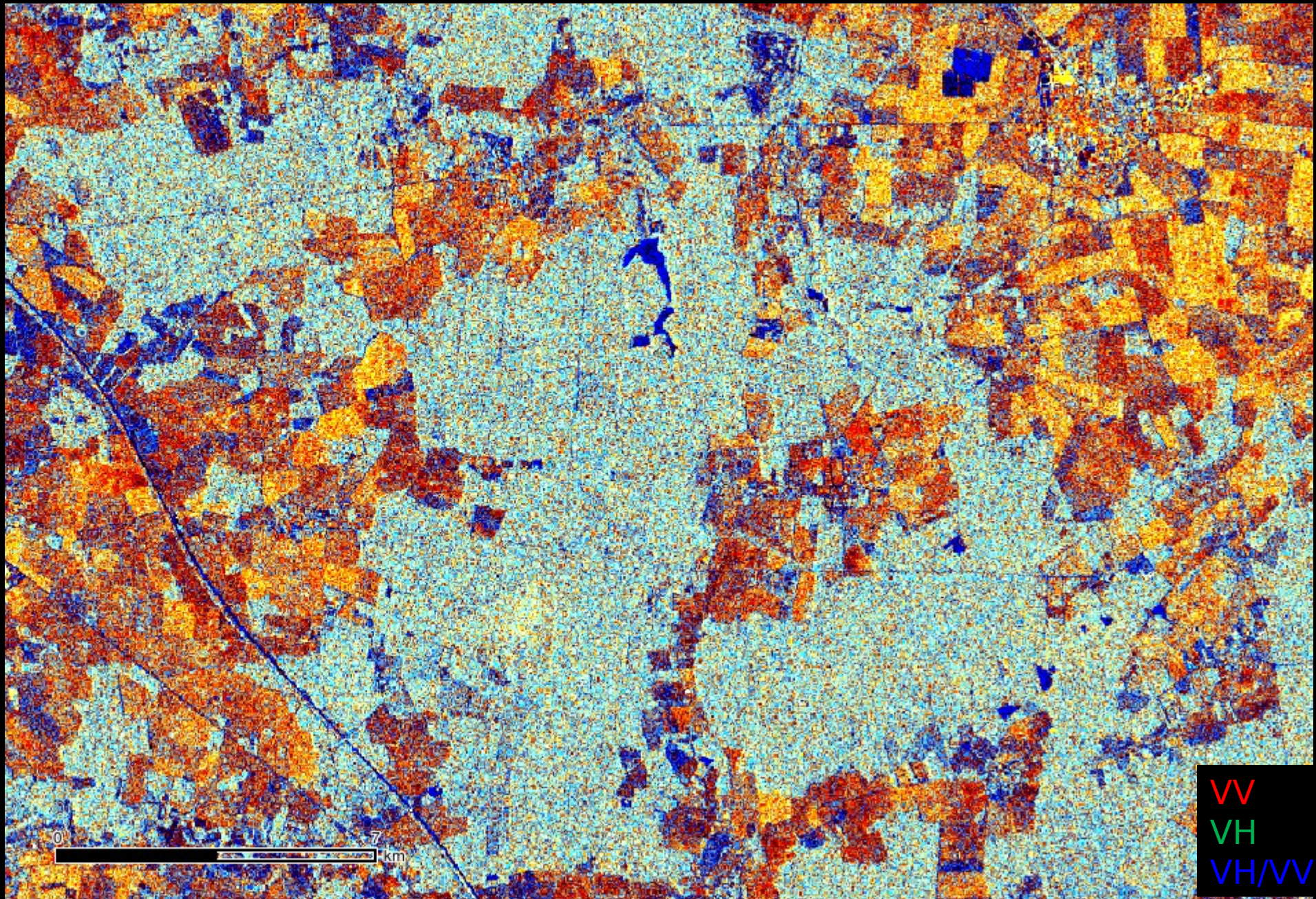


# GoogleEarth Image



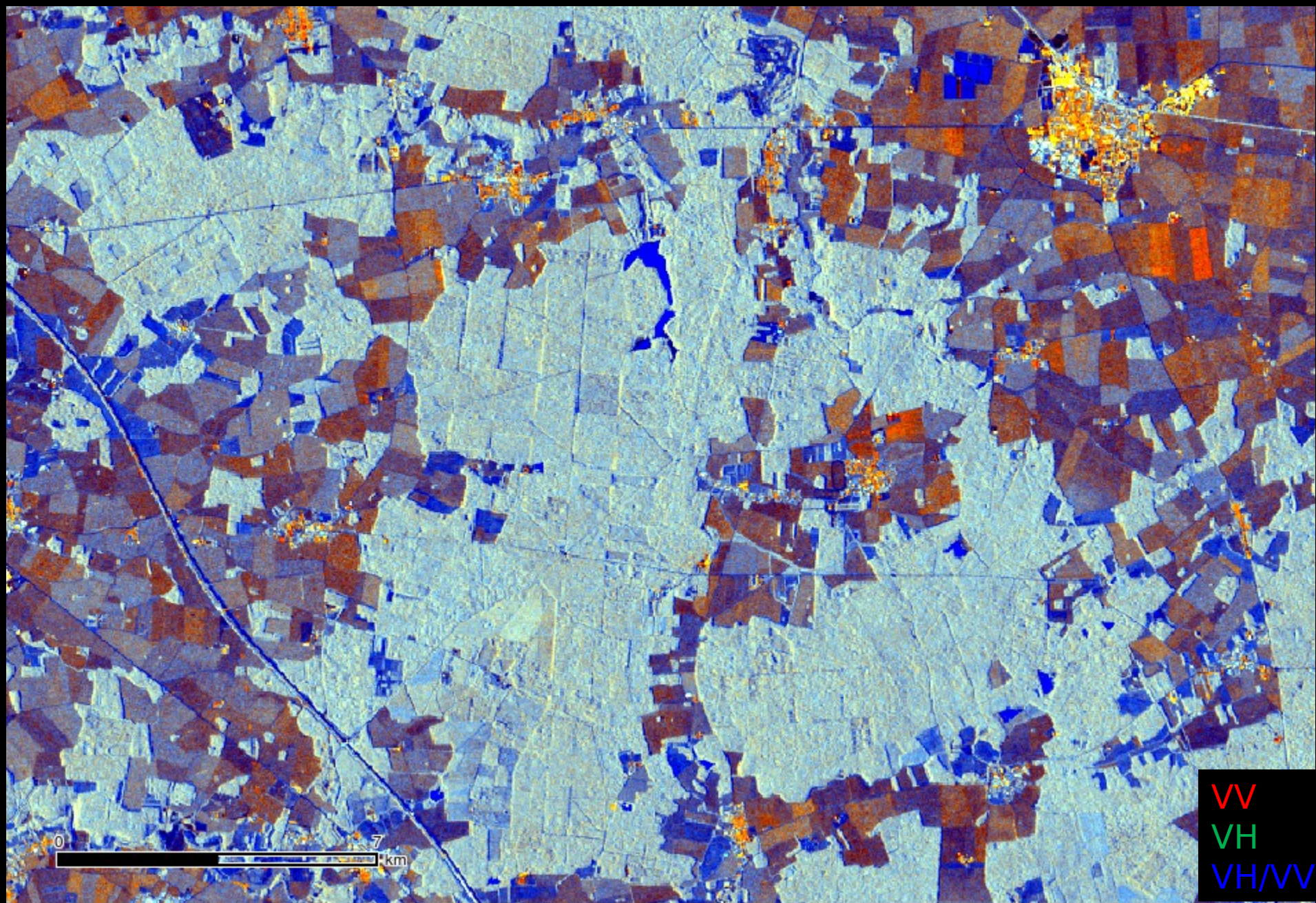
0 7 km

# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015

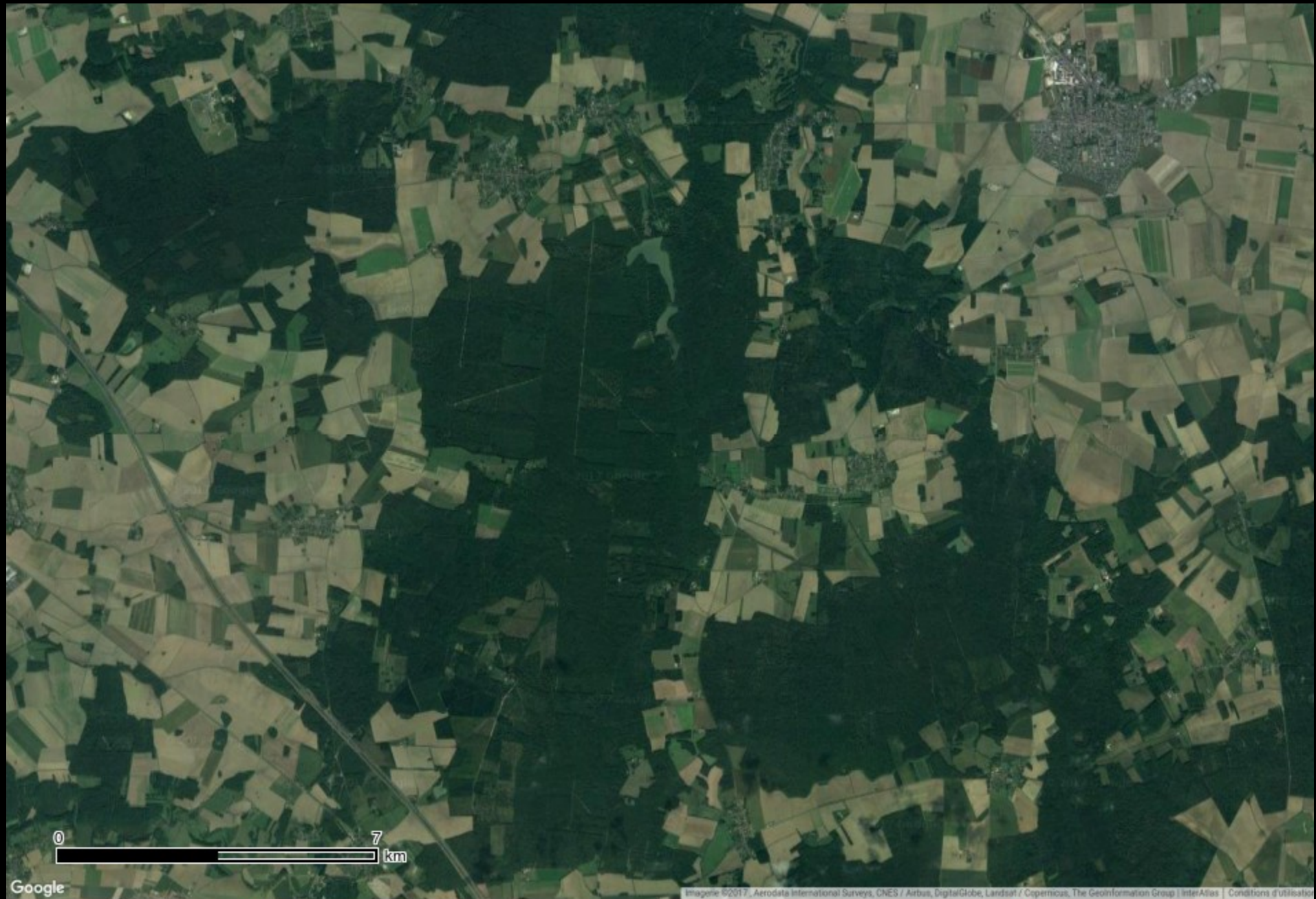


# Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average

2015/03/02 - 2017/01/26

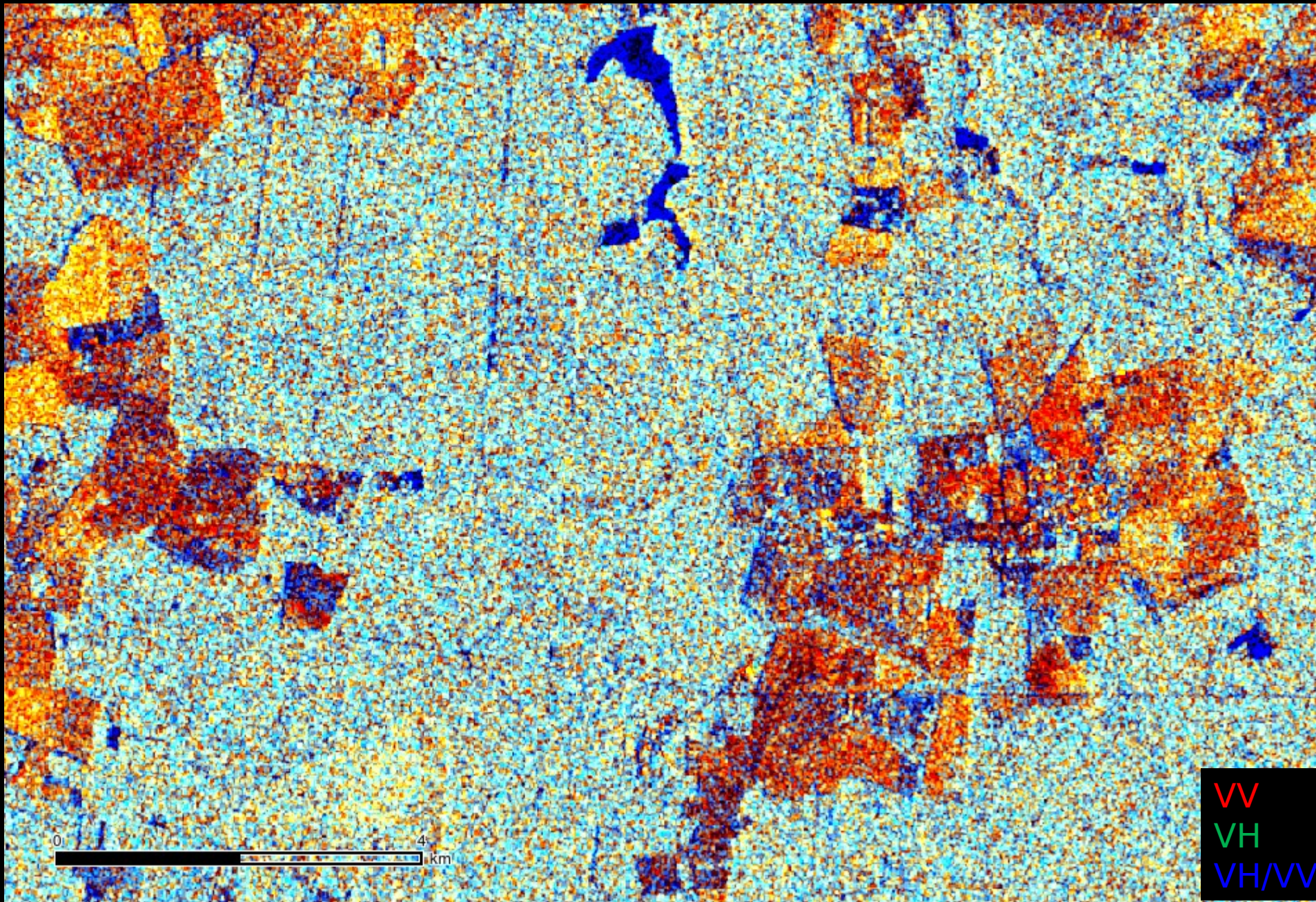


# GoogleEarth Image



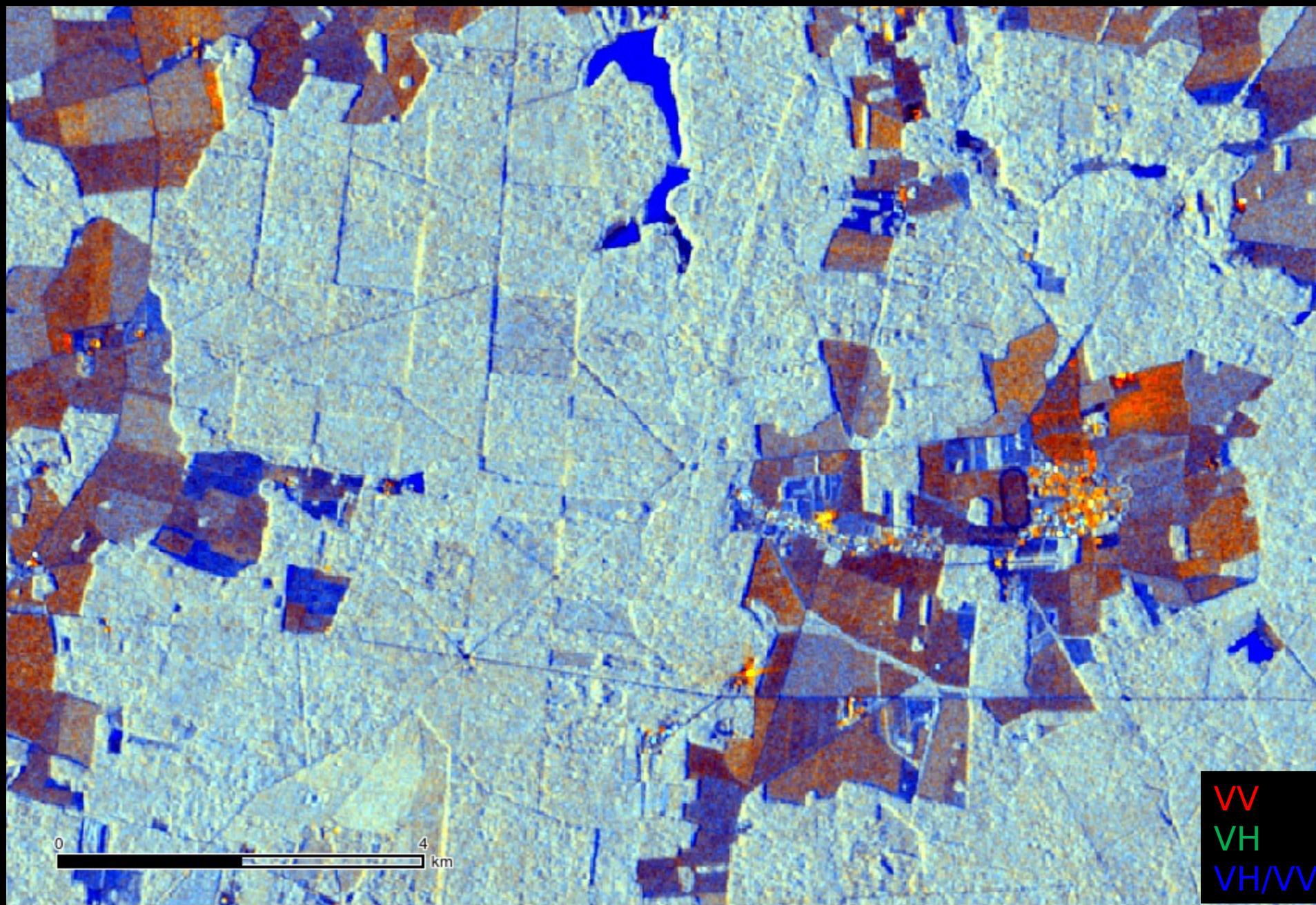
0 7 km

# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015



# Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average

2015/03/02 - 2017/01/26



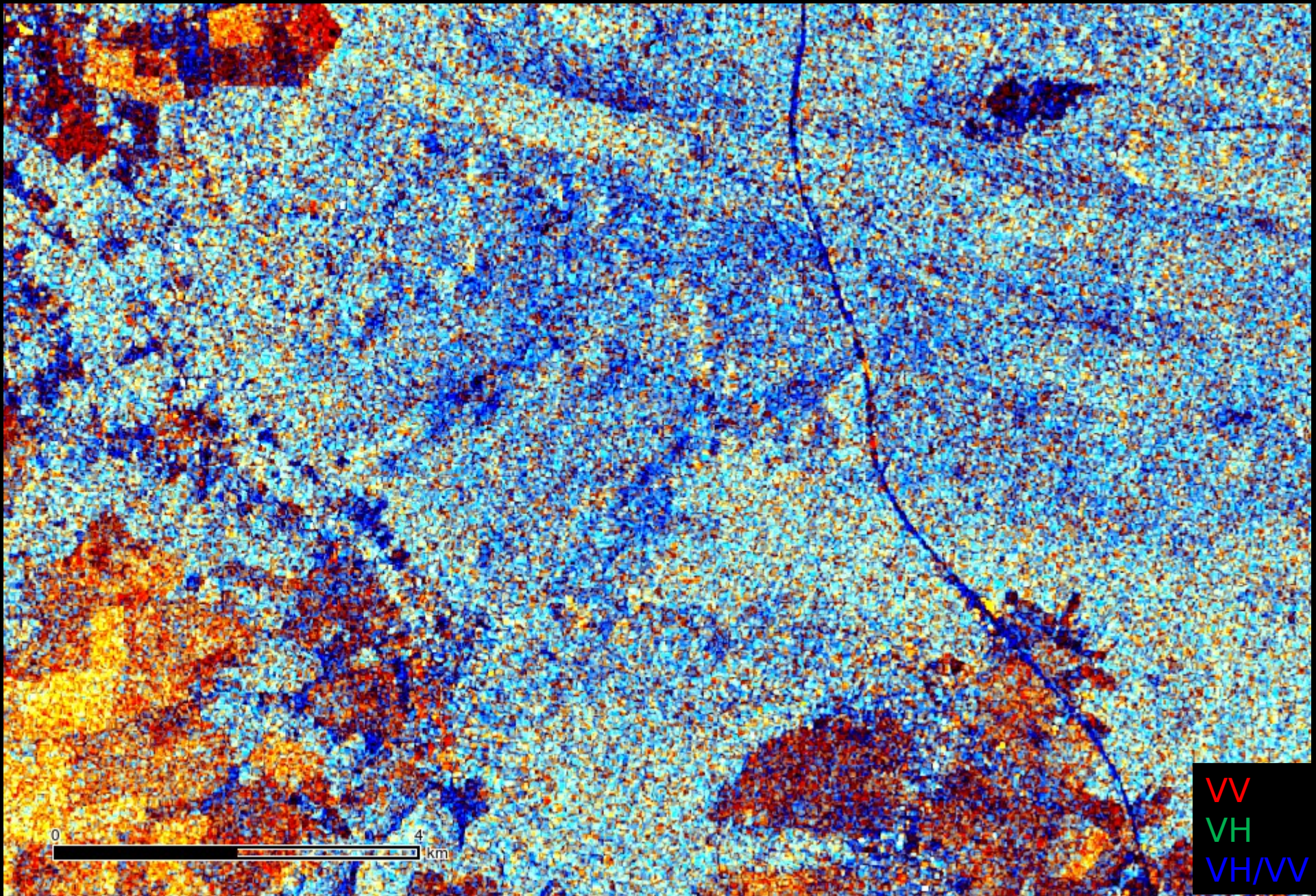


# GoogleEarth Image



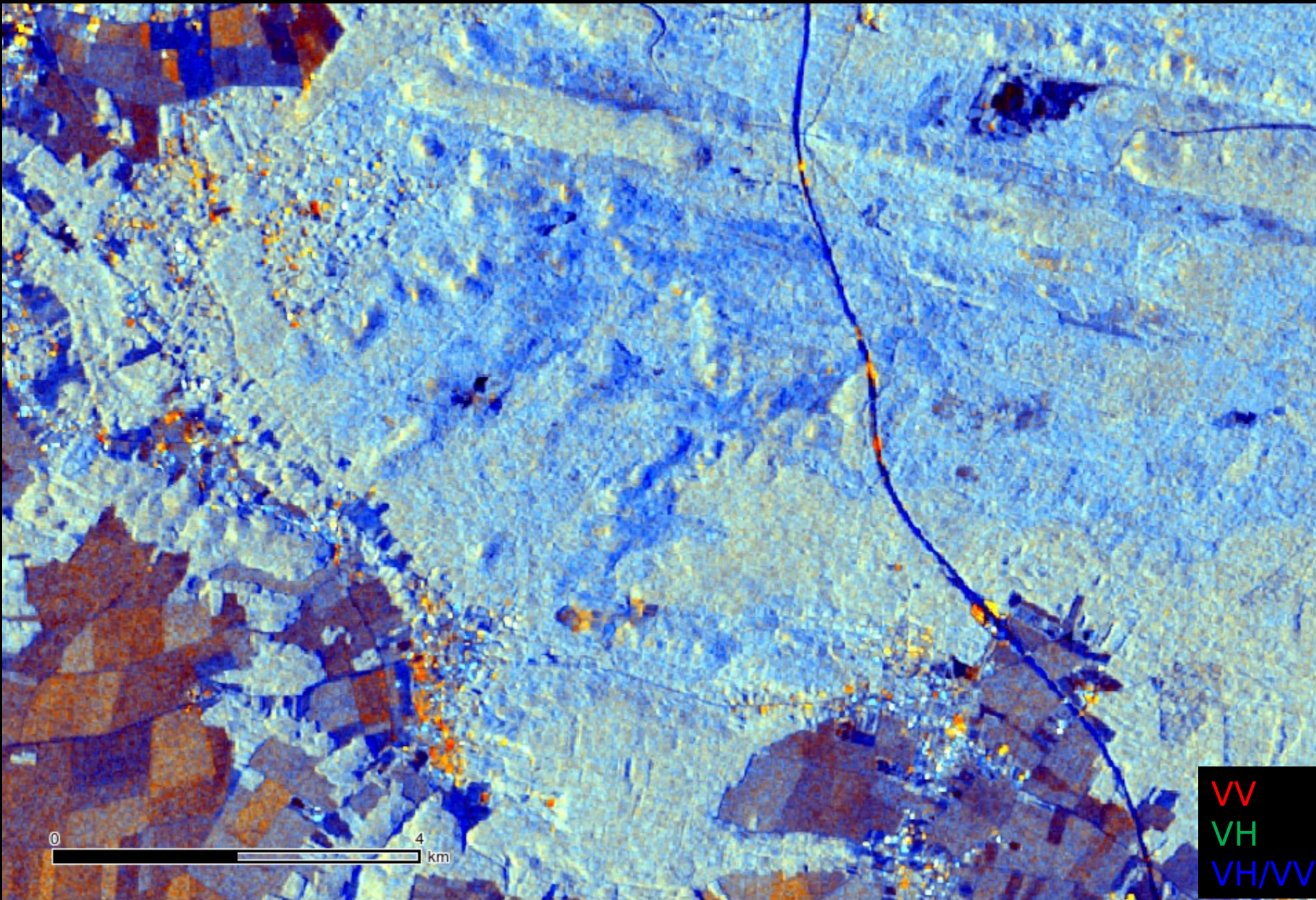
0 4 km

# Sentinel-1 RADAR BACKSCATTERING IMAGE : Acquisition 2015



# Sentinel-1 RADAR BACKSCATTERING IMAGE : Temporal average

2015/03/02 - 2017/01/26



0 4 km

VV  
VH  
VH/VV

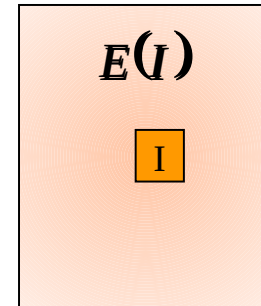
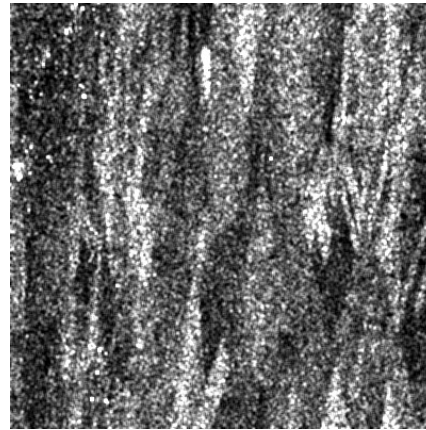
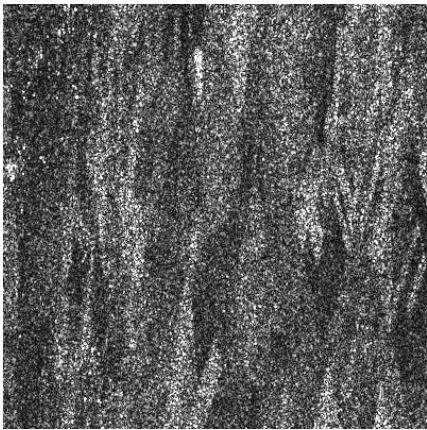
# GoogleEarth Image



0 4 km

*Goal: estimate  $R$   $\times$   $\sigma$*

Most simple: Box Filtering:  $I \longleftrightarrow E(I)$



Advantages: simple + best estimation (*MMSE*) over homogeneous area

Inconvenients: Details lost, fuzzy introduction

Other classical filters: (median, Sigma, math. morph.....): WORST!

**==> Need to introduce specific filters taken into account speckle statistics**

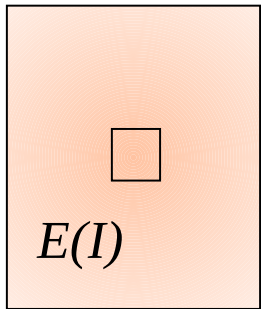
Neighbourhood size depends on local scene characteristics

**==> Adaptive filters**

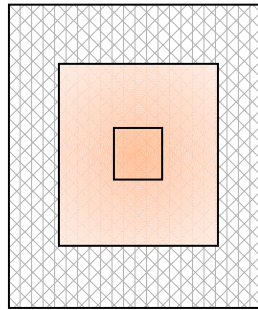
# Adaptative Filters

Goal: adapt the size of the neighbourhood before average

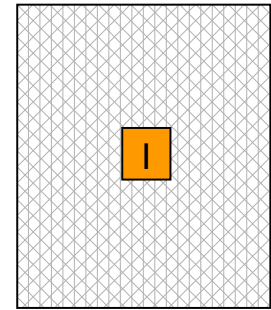
Homogeneous area



Heterogeneous area



Very Heterogeneous area



Average over the whole neighbourhood

Reduce the neighbourhood size

Keep the central pixel value (no averaging)

👉 necessary to discriminate homogeneity of local neighborhood

Coefficient of variation:

$$c_v = \frac{\text{std dev}}{\text{mean}}$$

$$c_v = \frac{1}{\xi \overline{N}}$$

over *homogeneous* area

$$c_v \geq \frac{1}{\xi \overline{N}}$$

over *heterogeneous* area

# Kuan and Lee Filters

$$\hat{R} = E(I) + a(I - E(I)) \quad \text{with } a = \begin{cases} 0 & \text{over homogeneous area} \\ 1 & \text{over heterogeneous area} \end{cases}$$

**Kuan:**  $a = \frac{c_I^2 - 1/N}{c_I^2 (1 + 1/N)}$

$N$ : looks number

$$c_{v\_speckle}^2 = 1/N$$

*estimated preliminary over an homogeneous area*

**Lee:**  $a = \frac{c_I^2 - 1/N}{c_I^2}$

$c_I$ : coefficient of variation  
of the local neighbourhood

$N < 3 \implies \text{Lee} < \text{Kuan}$

$N \geq 3 \implies \text{Lee} \approx \text{Kuan}$

# Frost Filter

Weighting of the neighbour pixels relative to its distance

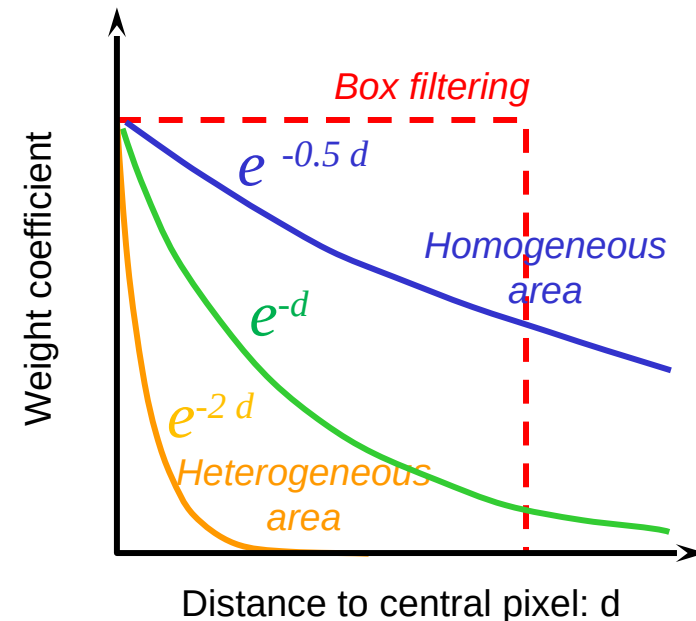
$$\hat{R}(d) = I(d) * m(d) \text{ with } K_1 \cdot c_I \cdot e^{K_2 \cdot c_I \cdot d} \quad (\text{MMSE criteria})$$

$d$ : distance to central pixel

$K_1$  and  $K_2$  set for the whole image

homogeneous area:  $c_I$  low

heterogeneous area:  $c_I$  high





## MAP (Maximum a posteriori) Filters

Maximize Bayesian criteria:  $p(R/I) = \frac{p(I/R) \cdot p(R)}{p(I)}$

Hypothesis on  $p(R)$ :  $\Gamma$  law

$$\Rightarrow \hat{R} = \frac{E(I)(\alpha - N - 1) + \sqrt{E^2(I)(\alpha - N - 1)^2 + 4\alpha N I E(I)}}{2\alpha}$$

homogeneous area:  $\alpha$  high  $\Rightarrow \hat{R} = E(I)$   $\alpha = K/c_I^2$

$p(R)$ :  $\Gamma$  law  
 $p(I/R)$ :  $\Gamma$  law

$\} \text{ MAP filter = Gamma-Gamma filter}$

Radar image – 1 Look  
(N=1)



Boxcar 9x9



Lee Filter 9x9

$$C_{v\_ref} = 1$$



Lee Filter 9x9

$C_{v\_ref} = 0.7$

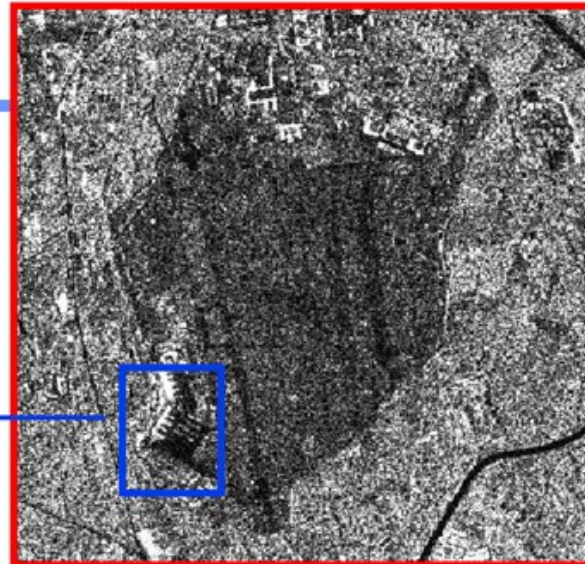


Lee Filter 9x9

$C_{v\_ref} = 1.1$



## Spatial filtering tools test (1/4)



**Radarsat image**  
Over-sampled fine mode (SGX)  
(Aerial base of 'Salon de Provence')  
Resolution (Single Look complex)  
(range x azi.) (m) : **6.0 x 8.9**

Pixel spacing  
(range x azi.) (m) : **3.125 x 3.125**

## Spatial filtering tools test (2/4)

→ Frost filter test



Original image



Filtered image

- **Frost** filter application (analysis window size **9 x 9**)  
Over-sampled Radarsat fine mode (SGX)  
'Salon de Provence' : aerial base extract

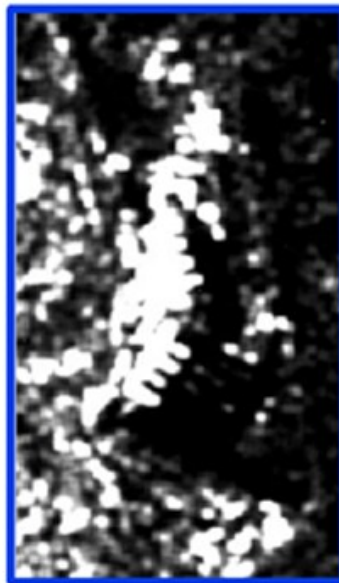


## Spatial filtering tools test (3/4)

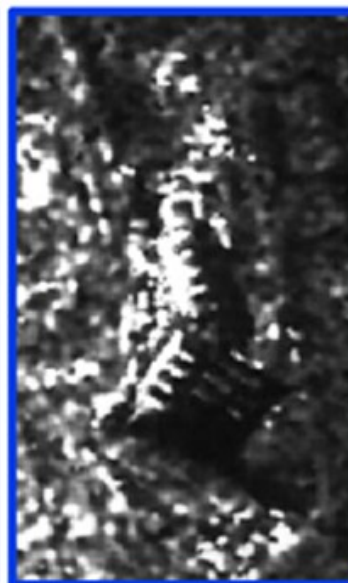
→ Comparison of different adaptive filters



Original image



average 7x7



Frost 7x7



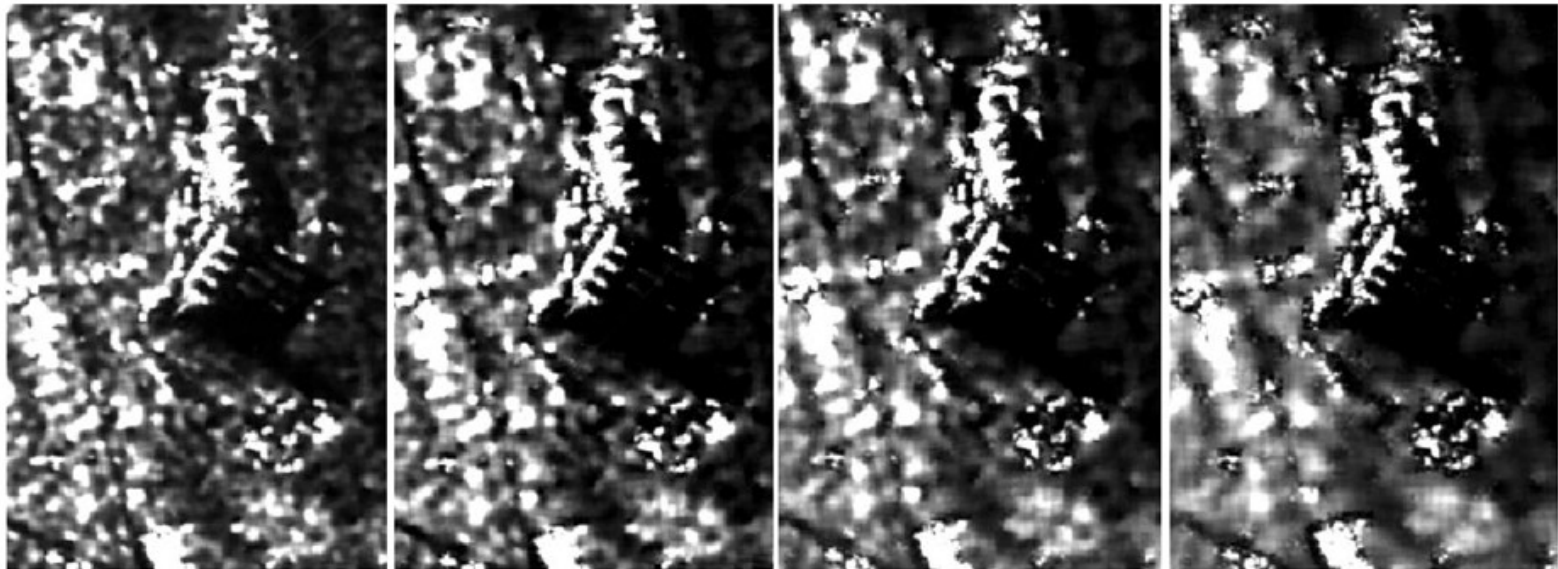
Gamma-Gamma  
MAP 7x7

*Radarsat 1 extract, fine mode,  
'Salon de Provence'*

*Simple average computed from  
the numerical values of neighbor pixels*

## Spatial filtering tools test (4/4)

→ influence of the analysis window size



window 7x7

window 9x9

window 11x11

window 15x15

*Test of a Gamma-Gamma Map filter over square analysis windows of variable size*

*Extract Radarsat 1 Fine mode 'Salon de Provence'*

## Spatial filtering : toward more sophisticated procedures



Original image



Filtered image  
(@ Touzi, CCRS, Canada)

- Contour detection, linear structures detection, punctual target detection (analysis window of adaptive shape)
- Multi-scale analysis
- Integration of the non-stationary property of the radar signature

Extract image :  
SETHI C band.  
VV polarization :  
3m resolution  
Eiffel tower, Paris

© copyright CNE

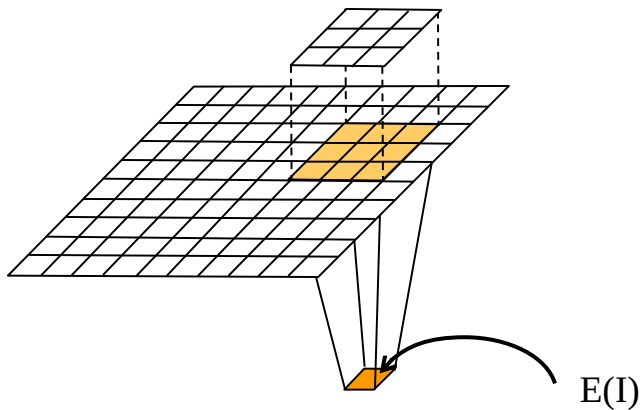
# CONCLUSION

- Radar images (coherent waves):  $\implies$  **SPECKLE**  
 $\implies$  single pixel value not significant (random)  
 $\implies$  *main drawback for classification algorithms*
- Best processing for speckle reduction: **AVERAGE** *i.e.*  $E(I)$
- Over **homogeneous** area: All the filters:  $\hat{R} = E(I)$
- **Adaptive** filters (Lee, Frost, Kuan,...)  
**heterogeneous** areas: average over **smallest neighbourhood**

# MULTILOOK OBTENTION

in spatial domain

*Sliding window: image \* window*

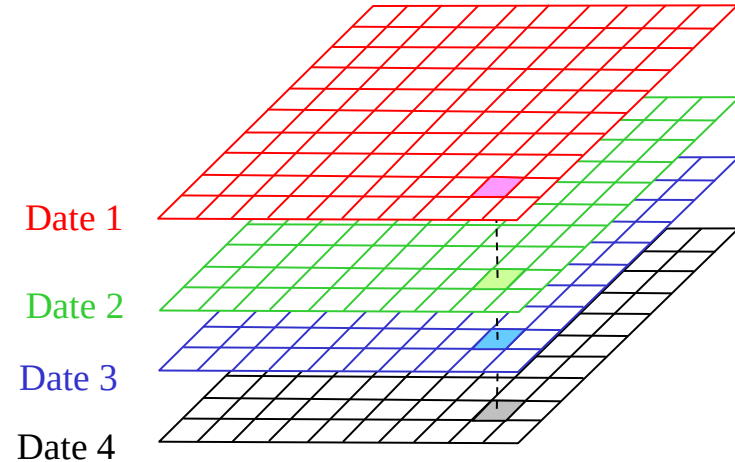


**9 looks if pixel sare not correlated**

Example: ERS data - PRI products :  $\times$  3 looks

**☞ Loss of spatial resolution**

in temporal domain

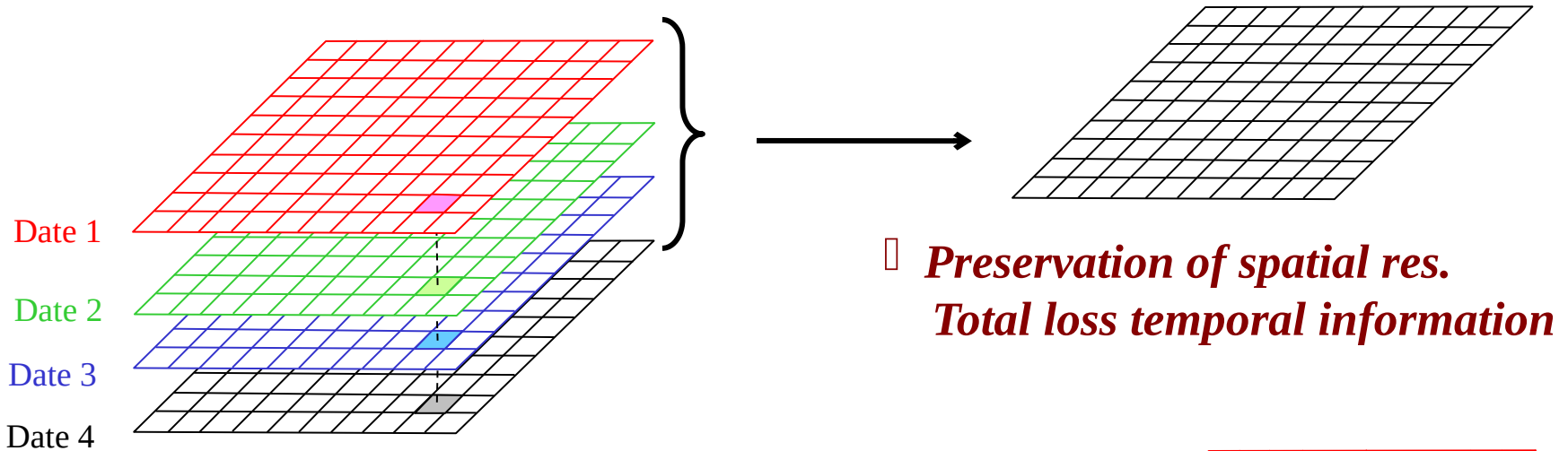


4 looks if surface has not changed

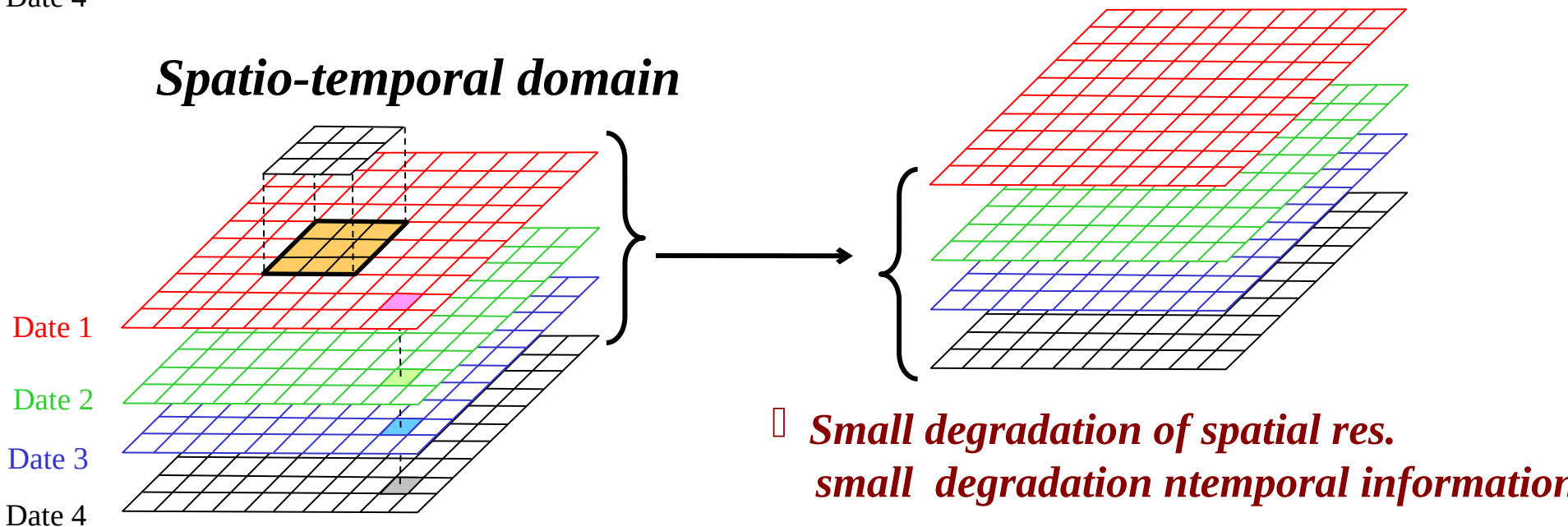
**☞ Preservation of spatial res.  
Loss temporal information**

# Spatio-temporal Filter (Sentinel-1)

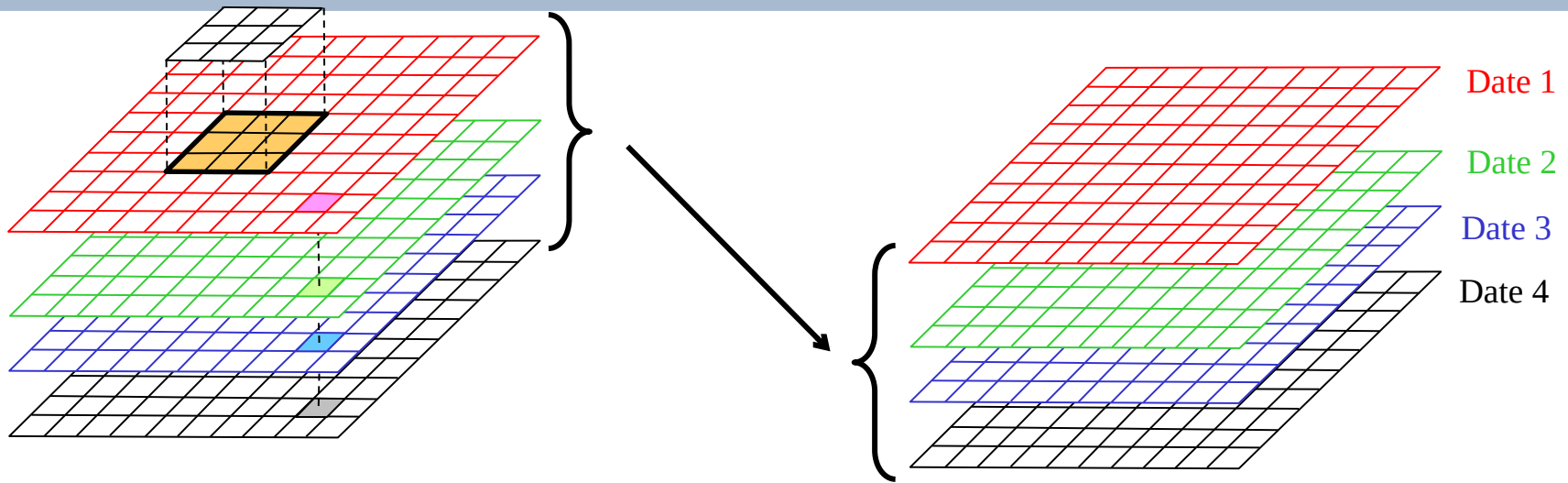
*temporal domain*



*Spatio-temporal domain*



# Spatio-temporal Filter (Sentinel-1)



□ *Small degradation spatial resolution*  
*Small degradation temporal resolution*

Date k:

$$J_k = \frac{I_k}{\frac{1}{N} \sum_{t=1}^N I_t}$$

temporal average:  
*i.e. same for a pixel at any date*

N: acquisitions number (different dates)

$J_k$ : pixel value of the output (filtered) image

$I_k$ : pixel value of acquisition k

$\langle I_k \rangle$ : spatial average over a local neighbor. around  $I_k$

# TAKE HOME MESSAGE- 1

- Radar images: coherent waves ( $A, \varphi$ ):  $\implies$  **SPECKLE**
- **SLC products**: (Single Look Products:  $A, \varphi$ )  
 $\varphi$  image: (not useful except for interferometry)  
use of  $A$  (or  $I = A^2$ ) image, similar to optical image
- Speckle  $\implies$   $A$  or  $I$  value of a single pixel: no meaning!  
 $\implies$  **main drawback for classification algorithms**  
⊘ need to apply a speckle filter
- **Sentinel-1 GRD Products (Ground Range Detected)**  
**Multilook products (5 looks)**  
(pixel size:  $10 * 10m^2$  - spatial resolution:  $\approx 20 \times 20 m^2$ )  
⊘ steel need to reduce the speckle for classification algorithms



# TAKE HOME MESSAGE - 2

- Best processing for speckle reduction: ***pixels AVERAGE***  
(i.e. *multilooking creation*)

***Single acquisition: local average*** (loss spatial resolution)

***Temporal serie:***

***temporal average*** (loss temporal information)

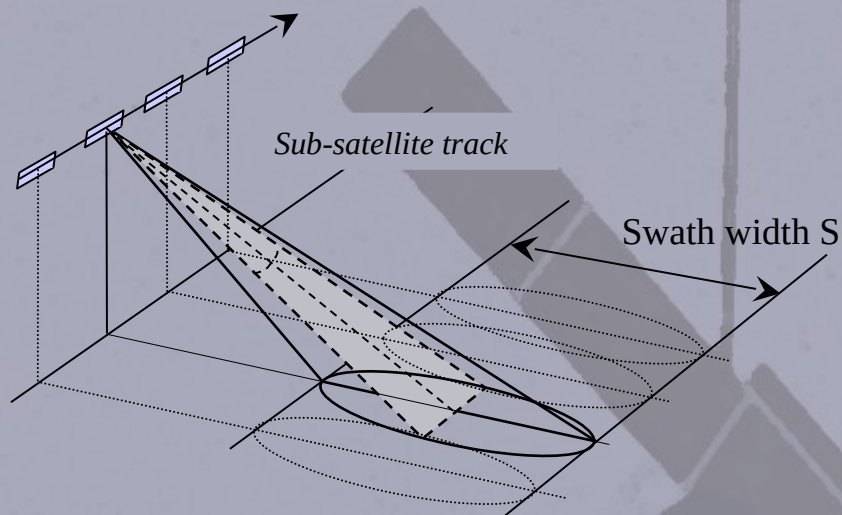
***spatio temporal filter*** (better preservation of spatio-temp. info)

- ***Adaptative*** filters (Lee, Frost, Kuan,...): ***E(I)***

***homogeneous*** areas: average over ***all the neighbourhood***

***heterogeneous*** areas: average over ***smallest neighbourhood***

# Side looking radar sensors ( $\lambda > cm$ )



## Scatterometers

## SAR: Synthetic Aperture Radar

*Incoherent sum ( $I$ )*

*Coherent sum ( $A, \phi$ )*

*Low (25 – 50 km)*

*fine (1 - 30 m)*

*High (400 Looks)*

*Low (speckle)*

*sea (winds)*

*Land - sea*

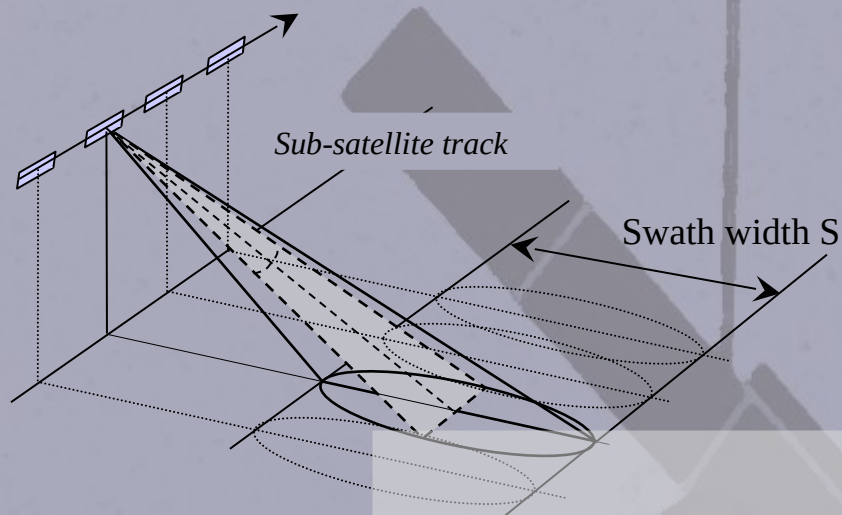
Raw echoes recording

Spatial resolution

Radiometric resolution

Original application

# Side looking radar sensors ( $\lambda > cm$ )



## Scatterometers

*Incoherent sum ( $I$ )*

*Low (25 – 50 km)*

*High (400 Looks)*

*sea (winds)*

## SAR: Synthetic Aperture Radar

Raw echoes recording

*Coherent sum ( $A, \phi$ )*

Spatial resolution

*fine (1 - 30 m)*

Radiometric resolution

*Low (speckle)*

Original application

*Land - sea*

# The radar equation

Transmitted power:

$$P_i = \frac{P_e G_e}{4\pi} d\Omega \quad (\text{W})$$

Receiving irradiance at distance R:

$$E_i = \frac{P_e G_e}{4\pi R^2} \quad (\text{W} / \text{m}^2)$$

Intercepted power from the target (W):

$$P_s = \frac{P_e G_e}{4\pi R^2} \text{RCS}$$

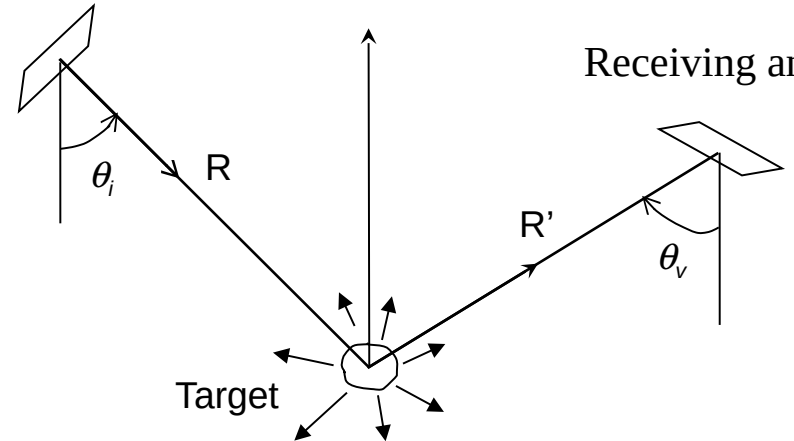
Radar Cross Section ( $\text{m}^2$ )

Intensity emitted from the target (isotrope):

$$I = \frac{P_s}{4\pi} = \frac{P_e G_e}{4\pi R^2} \frac{\text{RCS}}{4\pi} \quad (\text{W} / \text{sr})$$

Power received by surface  $dS$  at distance  $R'$ :  $P_r = I d\Omega = I \frac{dS}{R'^2} = \frac{P_e G_e}{4\pi R^2} \frac{\text{RCS}}{4\pi R'^2} dS \quad (\text{W})$

Transmitting antenna



# The radar equation

Power received by dS at distance R'

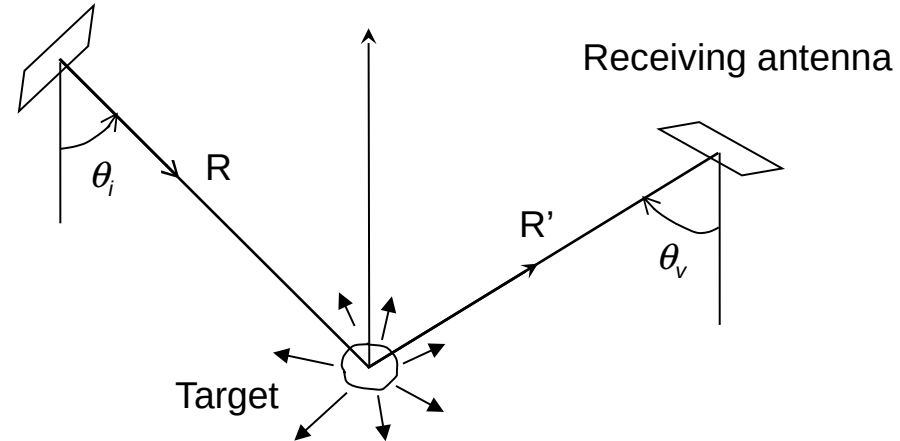
$$P_r = \frac{P_e G_e}{4\pi R^2} \frac{RCS}{4\pi R'^2} dS \quad (W)$$

Received irradiance at distance R'

$$E_r = \frac{P_e G_e}{4\pi R^2} \frac{RCS}{4\pi R'^2} \quad (W / m^2)$$

Power received by the antenna: 
$$P_r = E_r dA = E_r \frac{G_r \lambda^2}{4\pi} = \frac{P_e G_e}{4\pi R^2} \frac{RCS}{4\pi R'^2} \frac{G_r \lambda^2}{4\pi} \quad (W)$$

Transmitting antenna



# The RADAR equation

Received power by the antenna (*monostatic case*):

$$P_r = \frac{P_e G_e(\mathbf{r})}{4\pi r^2} \frac{RCS}{4\pi r^2} \frac{G_r(\mathbf{r}) \lambda^2}{4\pi} \quad (\text{point target})$$

**Over extended surfaces** (*N elementary scatterers*):

$$\langle P_r \rangle = \frac{\lambda^2}{(4\pi)^3} \sum_{k=1}^N P_{ek} G_{ek}(\mathbf{r}_k) G_{rk}(\mathbf{r}_k) \frac{1}{r_k^4} RCS$$

**Radar Backscattering Coefficient:  $\sigma^0$**

$$\sigma^0 = \left\langle \frac{RCS}{dS_k} \right\rangle \quad (m^2/m^2)$$

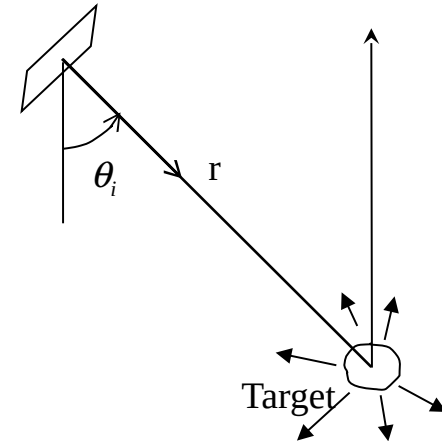
□ Analogous to the reflectance in Optical domain

$$\langle P_r \rangle = \frac{\lambda^2}{(4\pi)^3} P_e \int_{\text{surf. obs.}} G_e(\mathbf{r}) G_r(\mathbf{r}) \frac{1}{r^4} \sigma^0 dS$$

$$\langle P_r \rangle = \frac{\lambda^2}{(4\pi)^3} P_e \frac{1}{r_0^4} \sigma^0 G_e(\mathbf{r}_0) G_r(\mathbf{r}_0) S_{\text{eff}}$$

with  $\left\{ \begin{array}{l} r = r_0 \text{ et } \sigma^0 = \text{cste over obs. surf.} \\ \int_{\text{Obs. Surf.}} G_e(\mathbf{r}) G_r(\mathbf{r}) dS = G_e(\mathbf{r}_0) G_r(\mathbf{r}_0) S_{\text{eff}} \end{array} \right.$

Transmit  
Receive



# The RADAR equation

over extended surfaces:

$$\langle P_r \rangle = \frac{\lambda^2}{(4\pi)^3} P_e \frac{1}{r_0^4} \sigma^0 G_e(r_0) G_r(r_0) S_{\text{eff}}$$

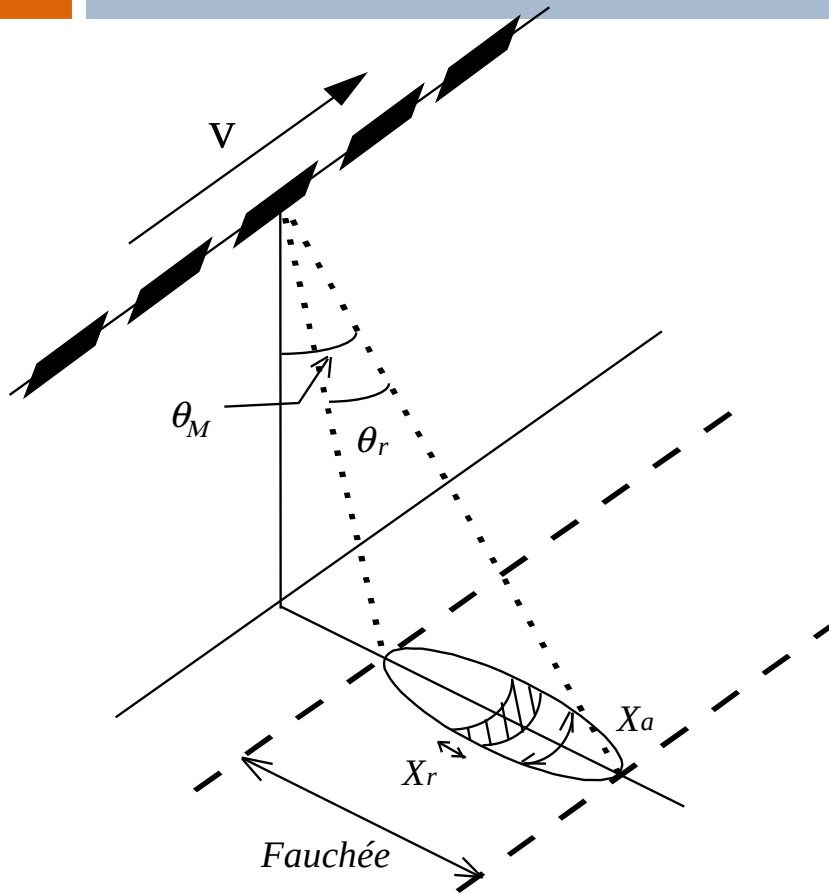
$$\Rightarrow \sigma^0 = \frac{(4\pi)^3 r_0^4}{\lambda^2} \frac{1}{G_e(r_0) G_r(r_0)} \frac{\langle P_r \rangle}{P_e} \frac{1}{S_{\text{eff}}} \quad (m^2/m^2)$$

$\sigma^0$  high dynamic

$\Rightarrow$  dB units (*log. scale*)

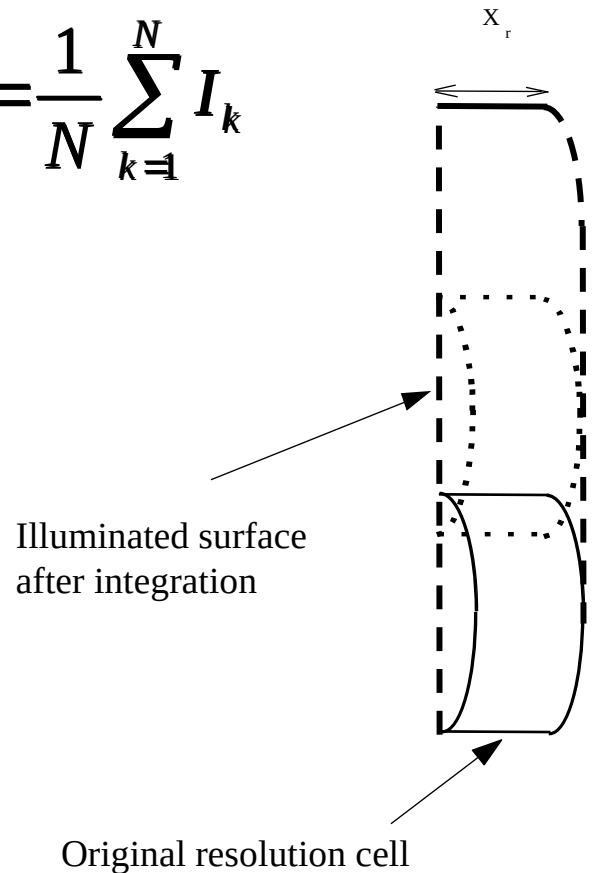
$$\sigma_{dB}^0 = 10 \cdot \log_{10} (\sigma_{Nat}^0)$$

# Scatterometer principle



👉 **Incoherent average ( $I$ ) of received echoes during a given integration time  $t_c$**

$$I = \frac{1}{N} \sum_{k=1}^N I_k$$





# Radiometric resolution

Given by the parameter  $k_p \equiv \frac{\sqrt{\text{var}(P_r)}}{\langle P_r \rangle} = \frac{\sqrt{\text{var}(\sigma^0)}}{\sigma^0} = \frac{1}{\sqrt{M}}$   $M$ : Looks number

$\text{PRF} < B_D = \frac{2V}{L}$

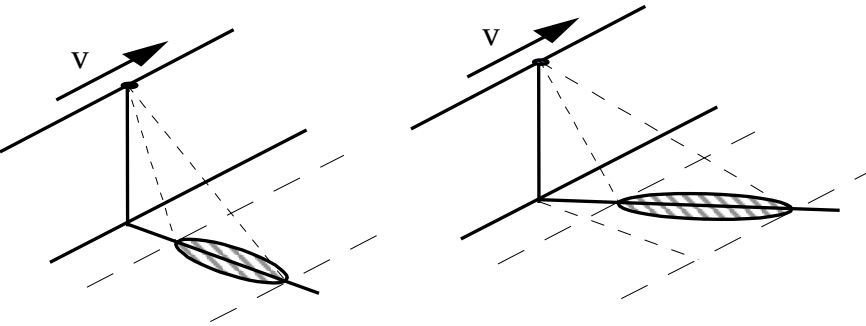
$k_p = \frac{\sqrt{\text{var}(P_r)}}{\langle P_r \rangle} = \frac{\sqrt{\text{var}(\sigma^0)}}{\sigma^0} = \frac{1}{\sqrt{M}}$

$\square$  Shannon not respected

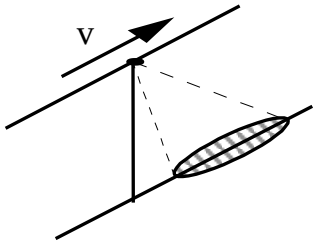
Number of *independant* echoes received:  $M = \text{PRF} \cdot t_c$

**ERS:**  $V=7.7 \text{ km.s}^{-1}$ ;  $L=2.5 \text{ m}$ ;  $\text{PRF}= 115 \text{ Hz}$ ;  
 $\square B_D = 6 \text{ kHz}$   
 $M = 384$   $\square$   $K_p = 5\%$

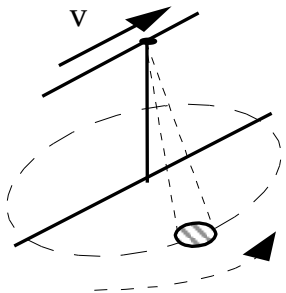
# Scatterometers: acquisitions configurations



*large swath  
combined use  $\square$  several azimuths*



*Large incidence range  
Small swath width*

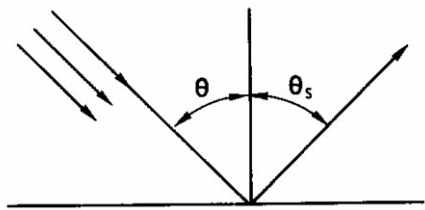


*Large swath  
Constant incidence angle  
Each point looked under 2 azimuths*

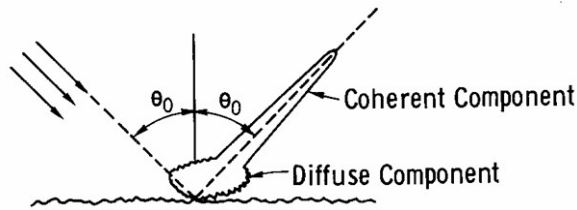
# Diffusion de surface

sol: milieu homogène ==> diffusion à l'interface air/sol

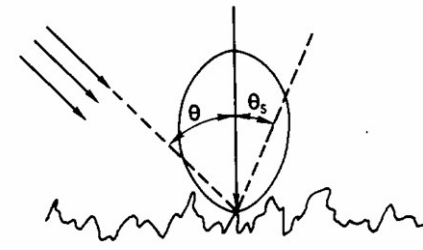
## Influence de la rugosité



surface lisse



surface peu rugueuse



surface rugueuse

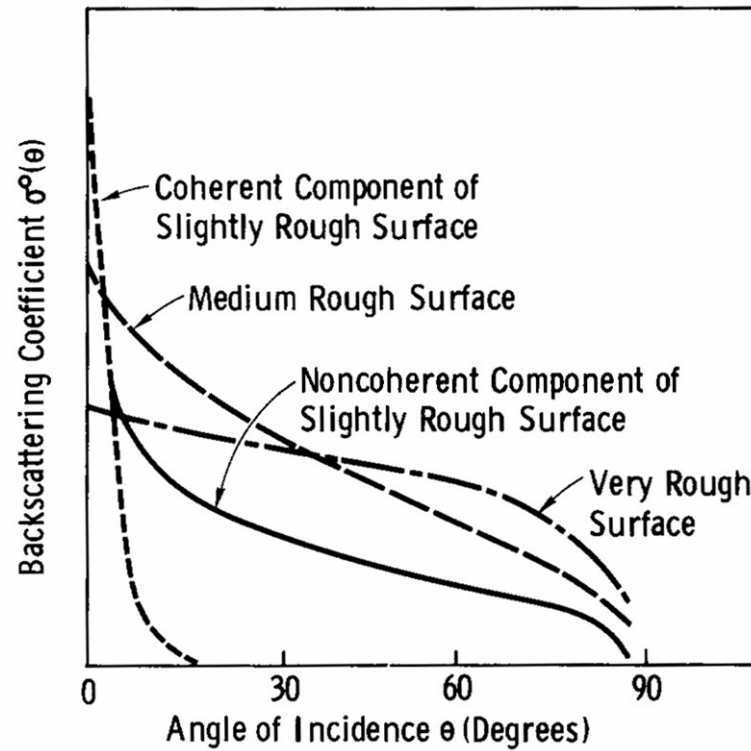
critère de Rayleigh: surface lisse  $\sigma < \frac{\lambda}{32 \cos \theta}$

ERS ( $\lambda = 5 \text{ cm}$ ,  $\theta = 23^\circ$ ):  $\sigma > 2 \cdot 10^{-2}$ : beaucoup de sols rugueux!

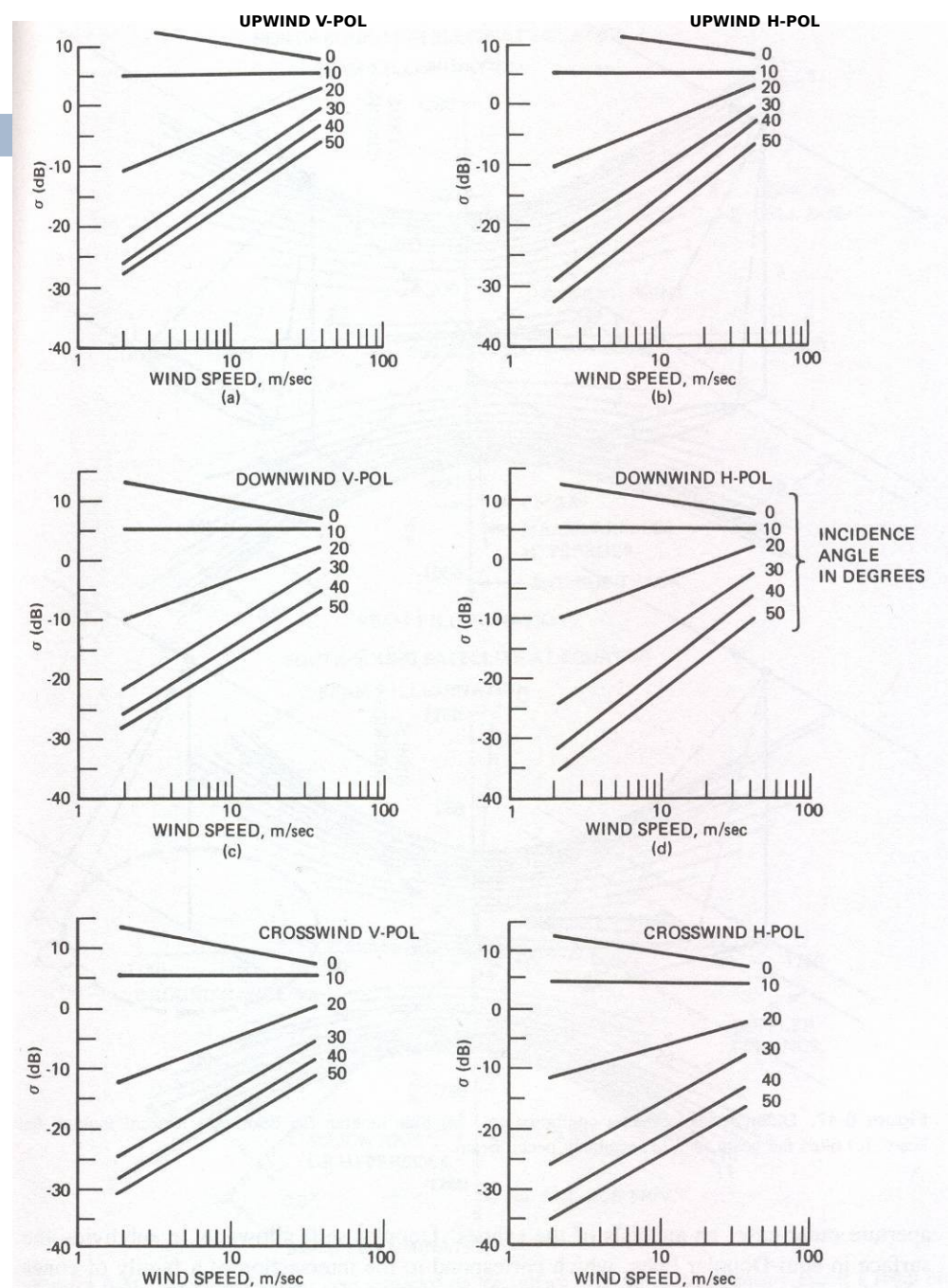


$\sigma$ : rms height

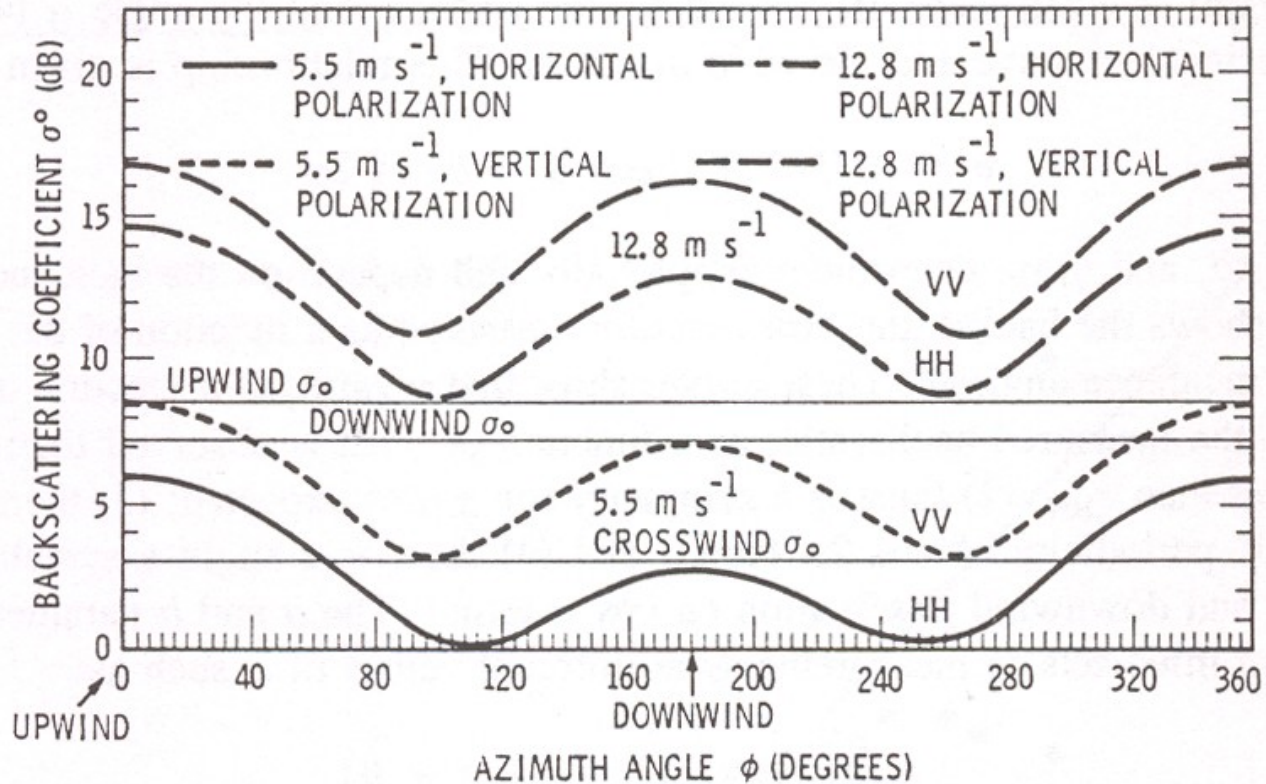
# Diffusion de surface



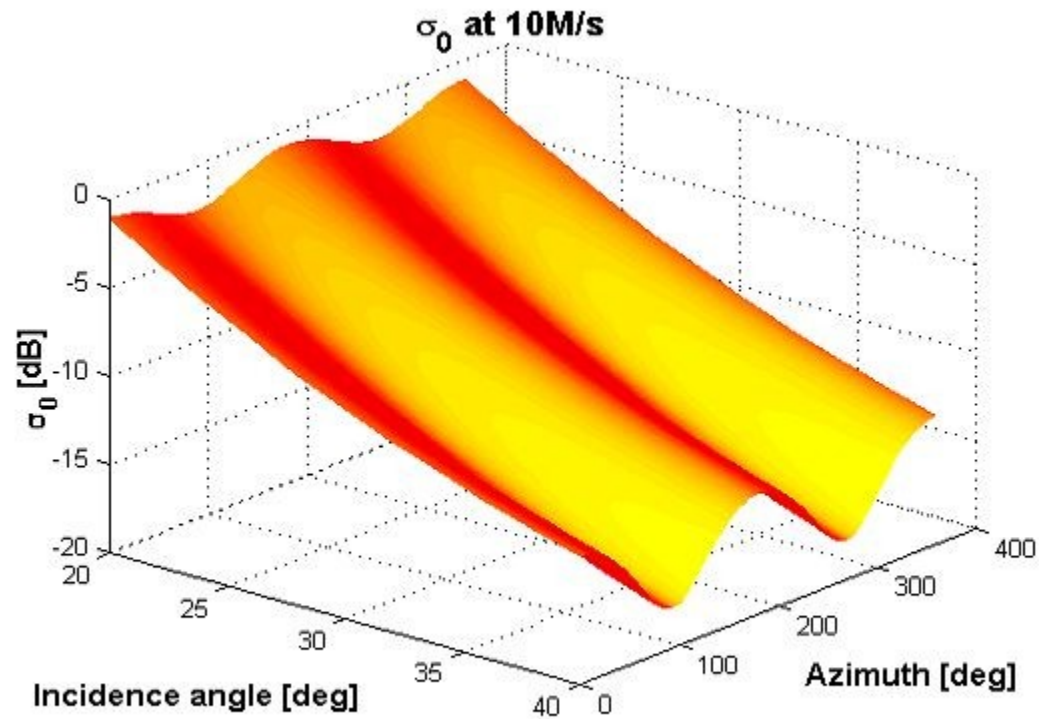
# *réponse radar en fonction de la vitesse du vent*



# Signature azimuthale de la réponse radar sur l'océan

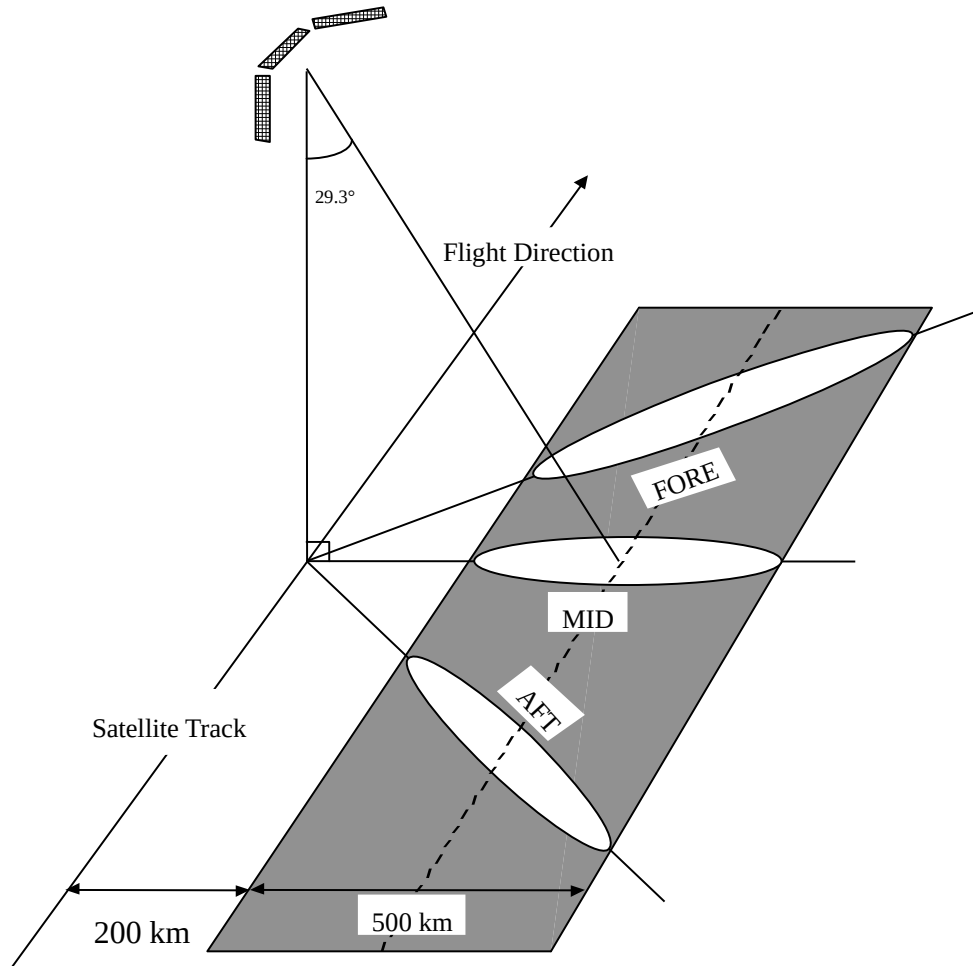


# Signature angulaire de la mer



Arnesen et al., 2004

# Diffusiometre vent ERS



- **Bande C (5.3 GHz)**
- **Polarisation VV**
- **pluri-incidence**  
**18° - 59°**
- **résolution spatiale**  
**~ 50 km**
- **Répétitivité temporelle**  
**~ 5 jours suivant la**  
**latitude**

□ *Destiné à l'estimation de la vitesse et la direction des vents sur les océans*



# COUVERTURE SPATIALE DU DIFFUSIOMETRE ERS SUR LES TERRES EMERGEES

ORBITE MONTANTE

ORBITE DESCENDANTE

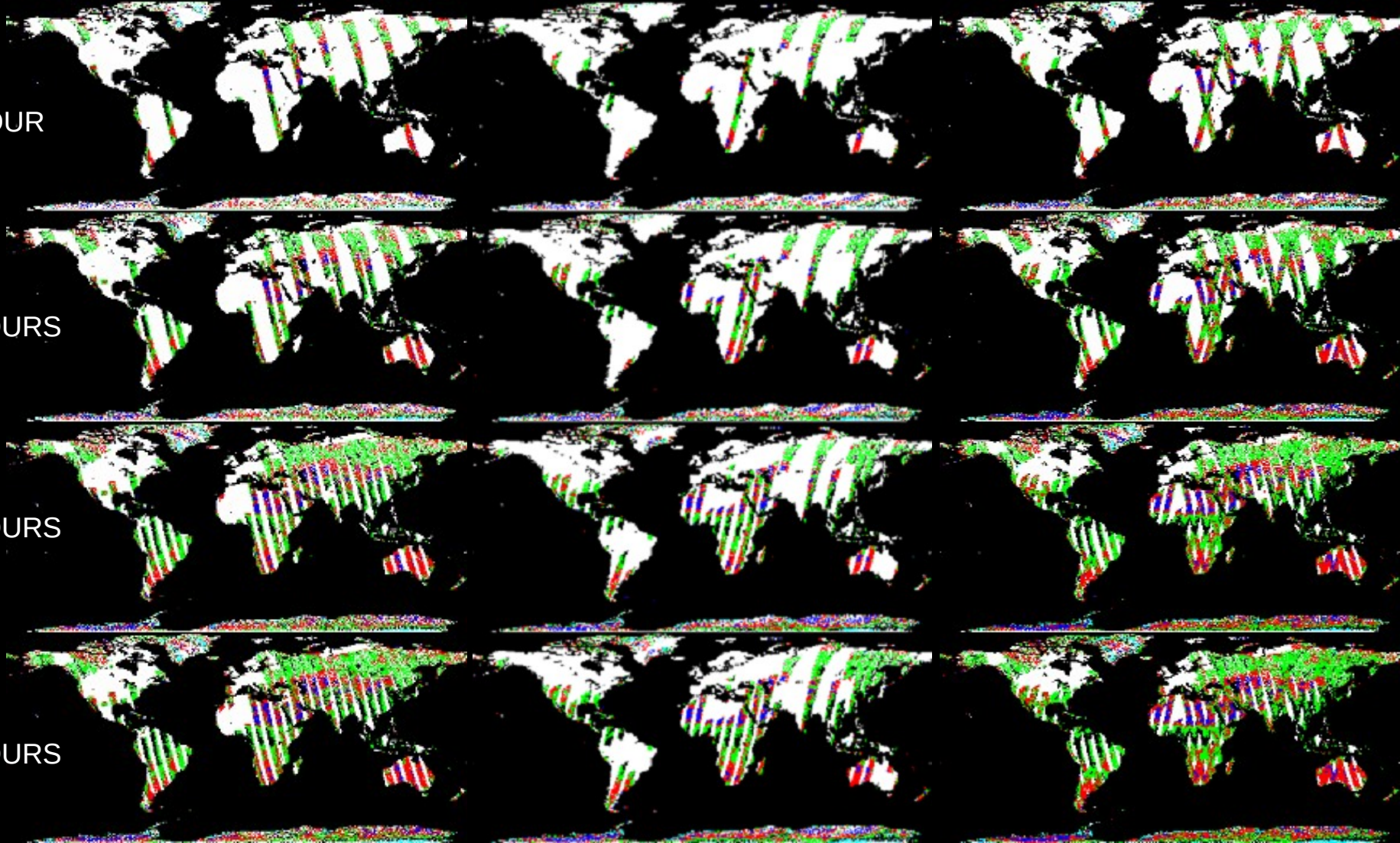
2 ORBITES

1 JOUR

2 JOURS

3 JOURS

4 JOURS



# COUVERTURE SPATIALE DU DIFFUSIOMETRE ERS SUR LES TERRES EMERGEES

ORBITE MONTANTE

ORBITE DESCENDANTE

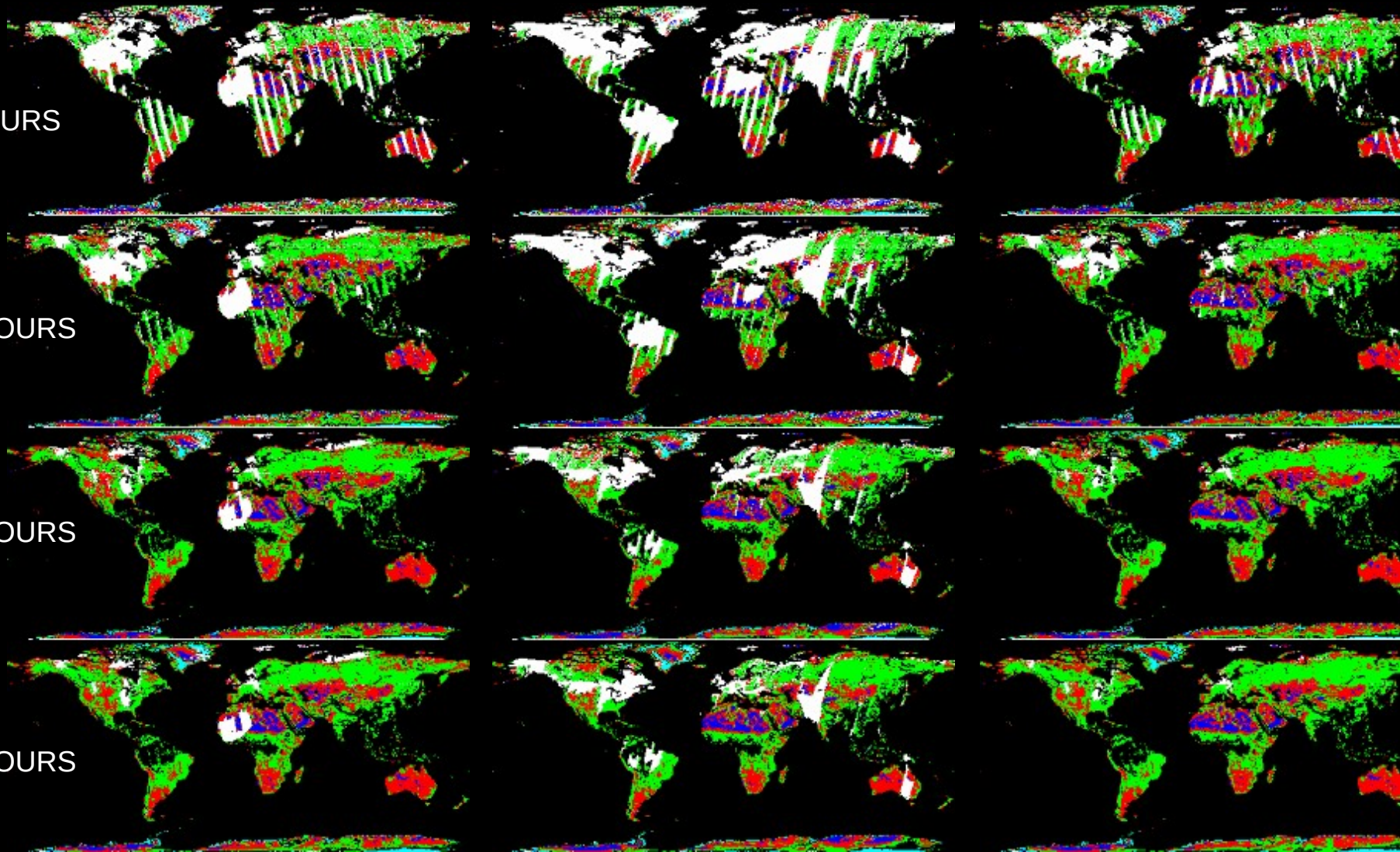
2 ORBITES

5 JOURS

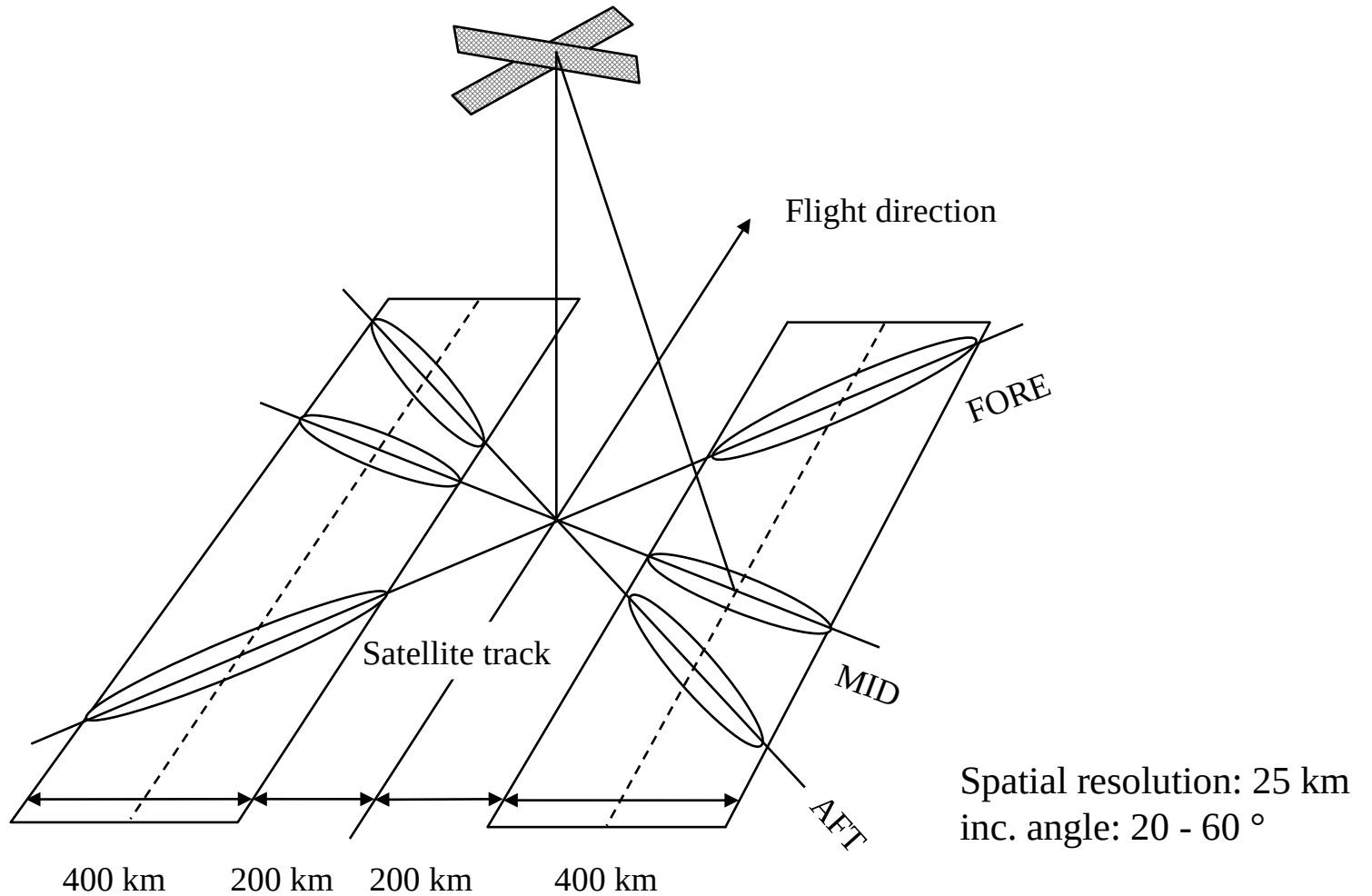
10 JOURS

20 JOURS

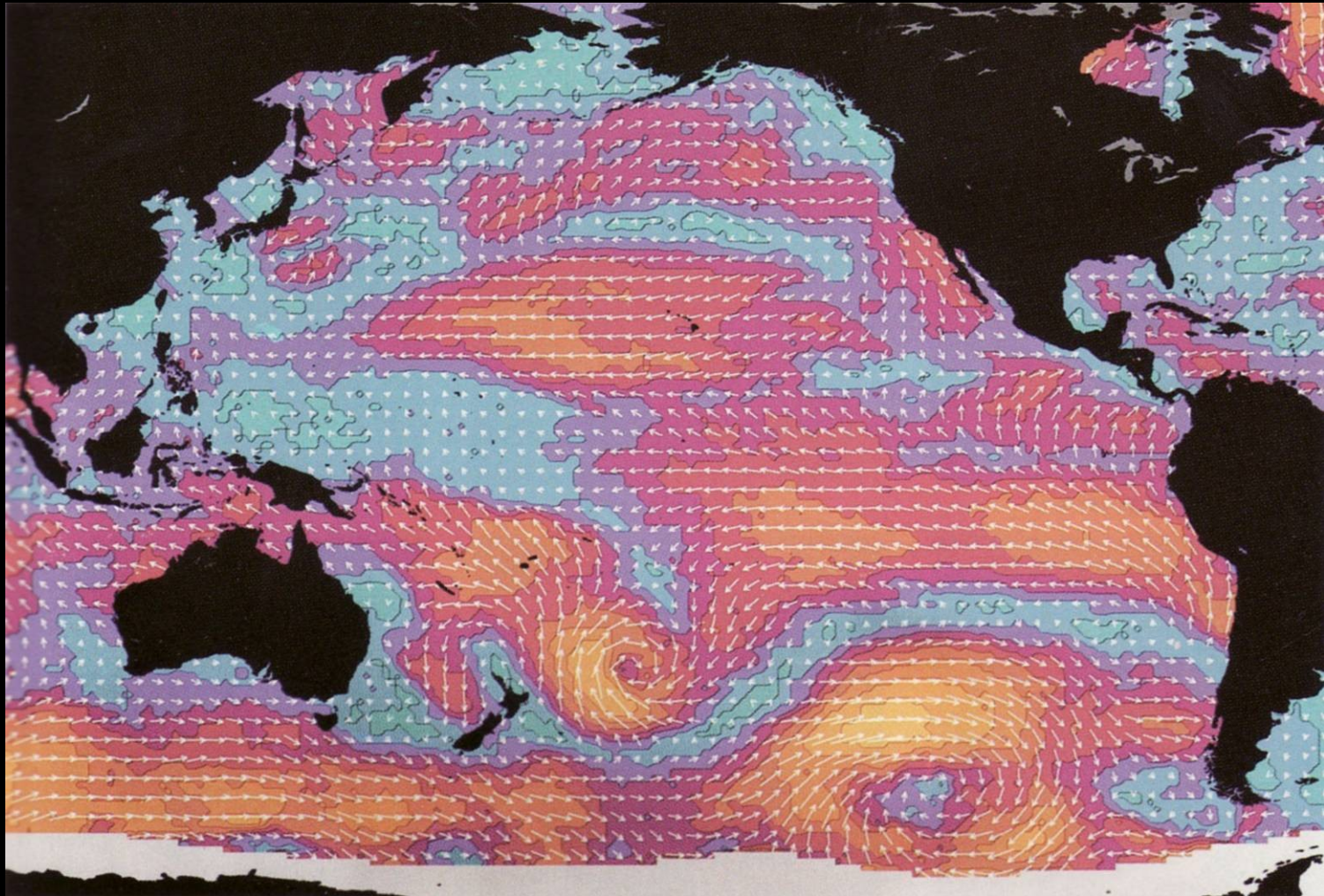
30 JOURS



# NSCAT CONFIGURATION

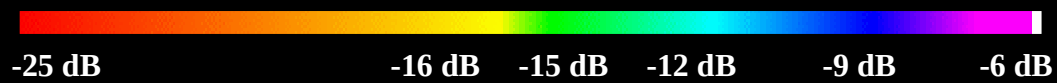
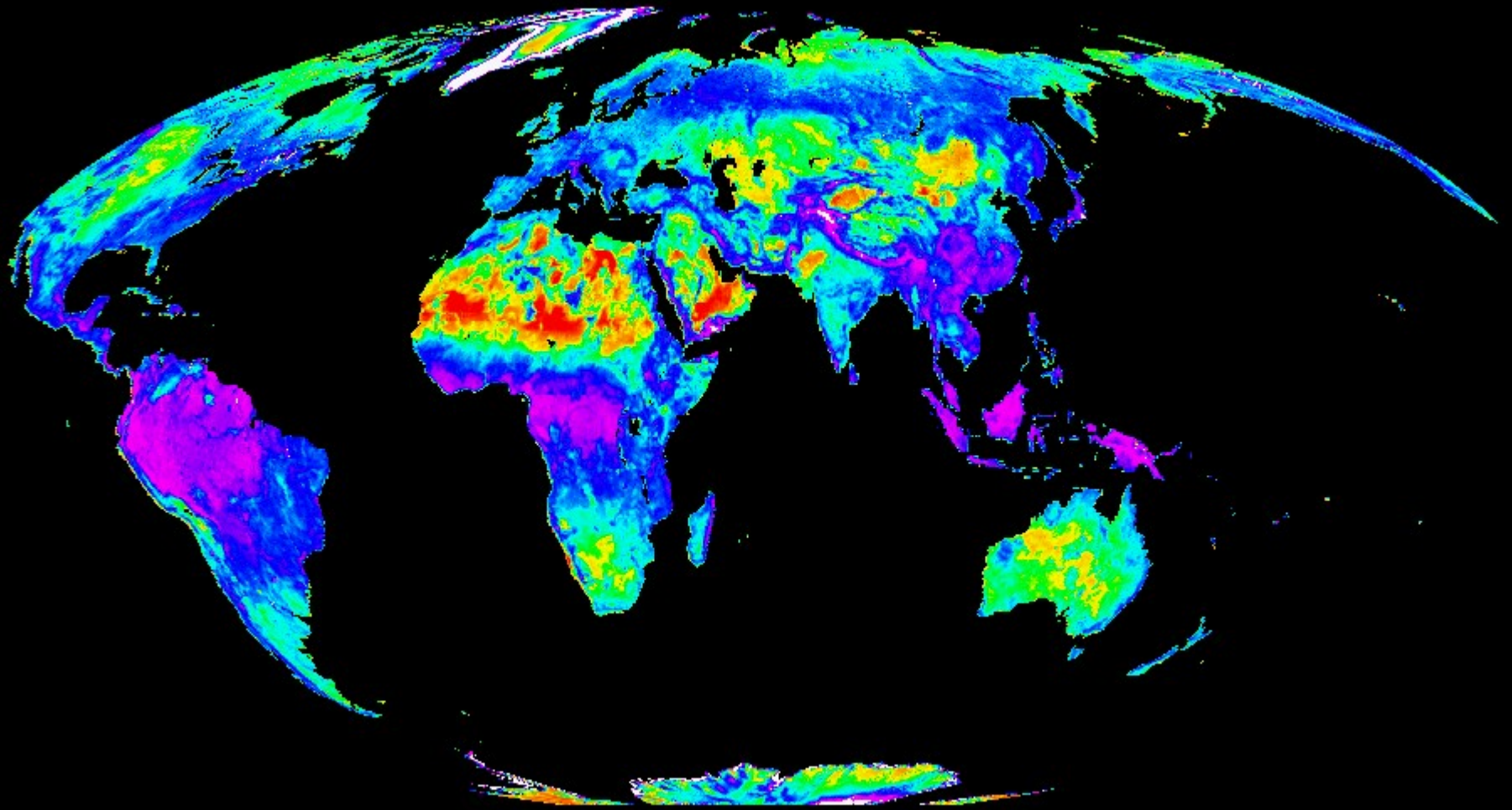


Wind speed and direction estimated  
by the SEASAT scatterometer  
september 6 – 8 1978



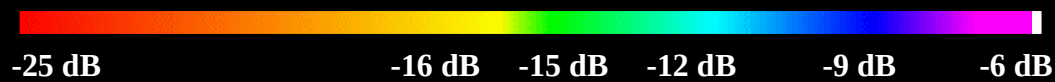
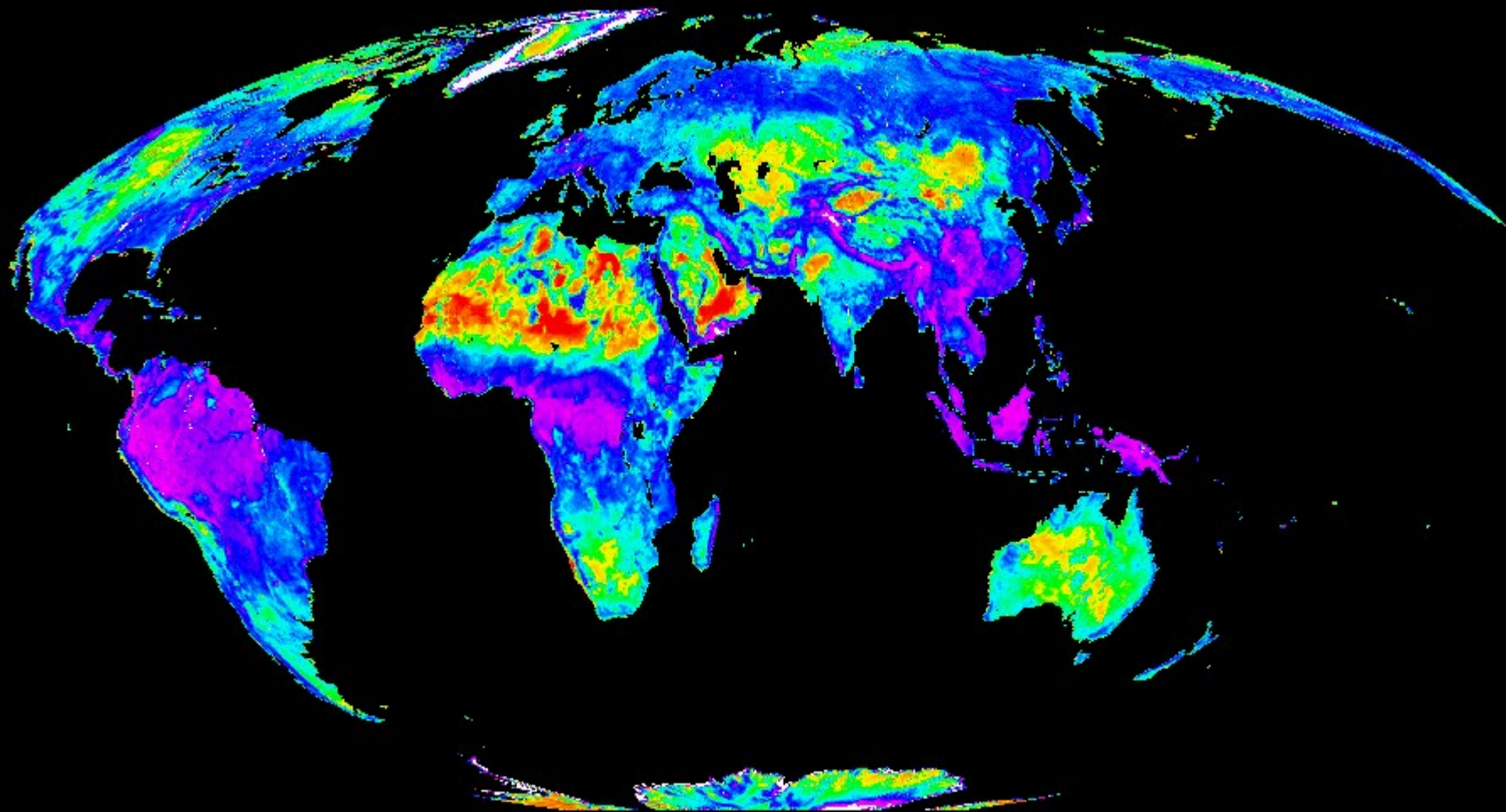
# ERS Scatterometer $\sigma^0(40^\circ)$

May 1992



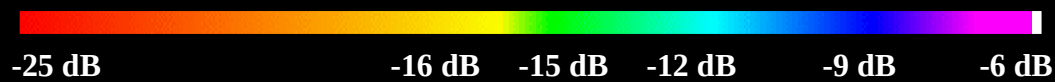
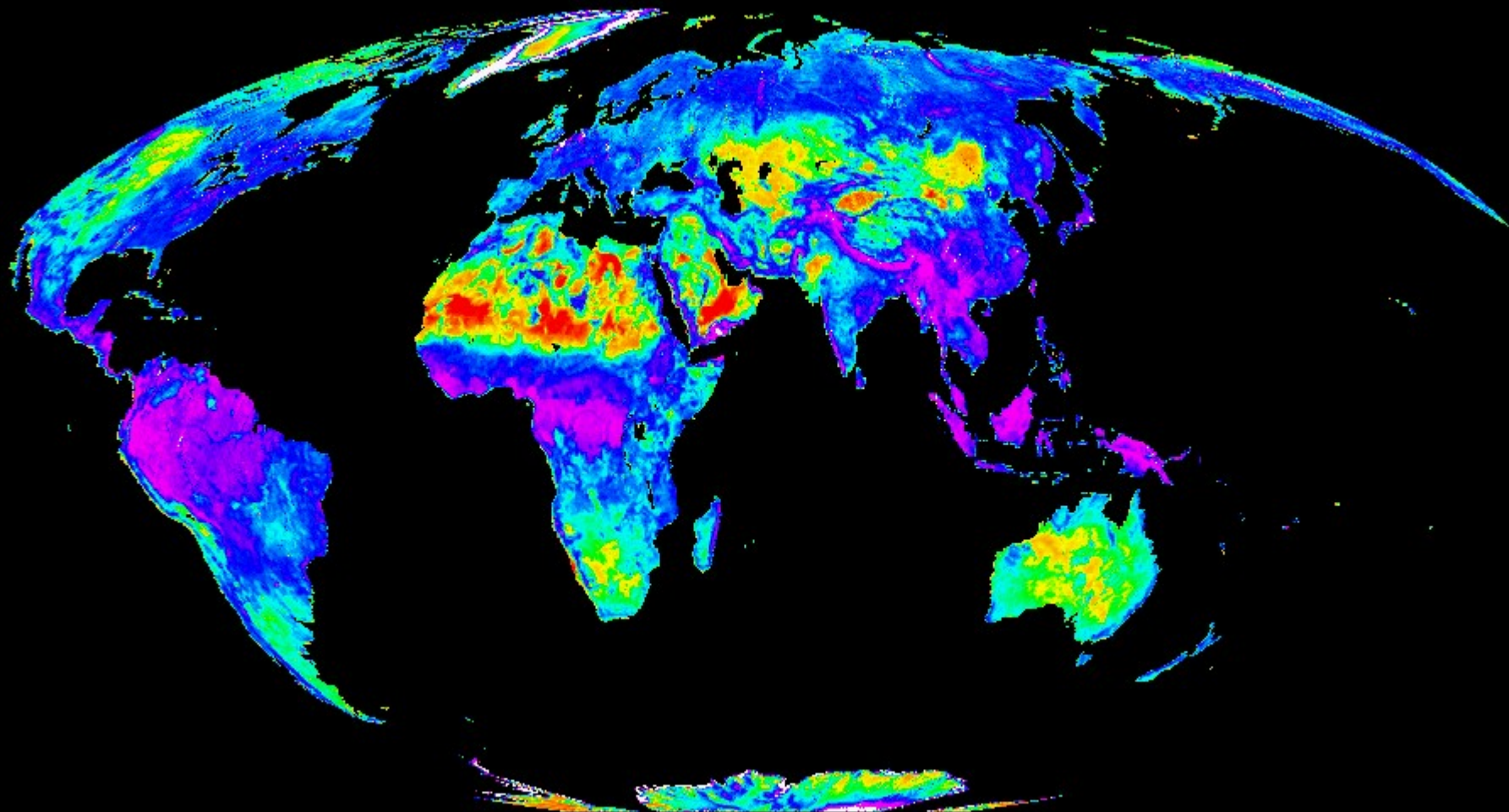
# ERS Scatterometer $^{\circ}(40^{\circ})$

June 1992



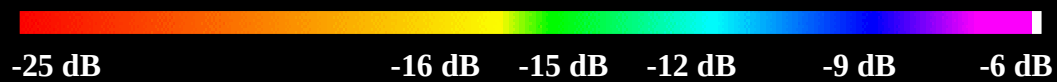
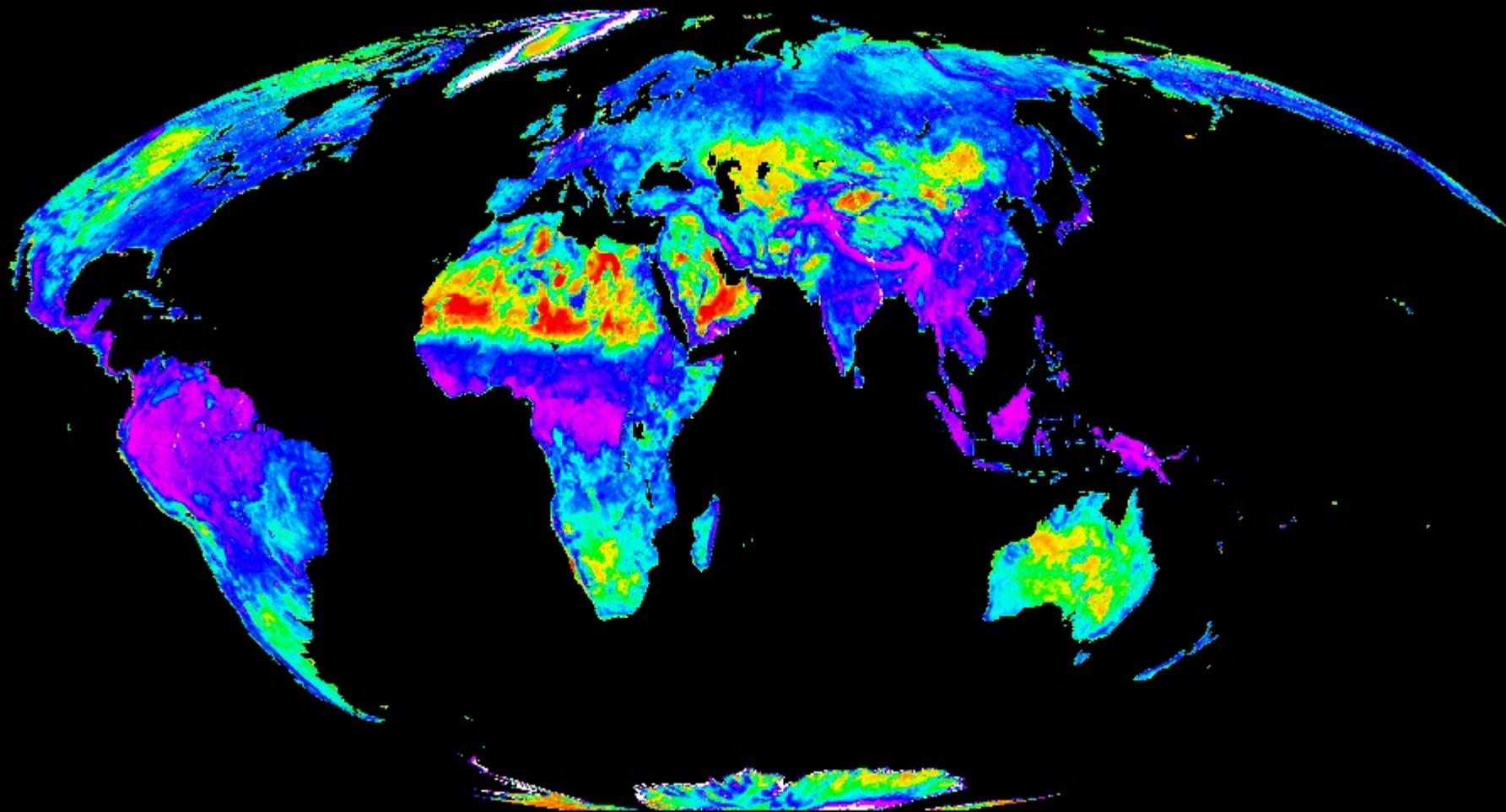
# ERS Scatterometer $\sigma^0(40^\circ)$

July 1992



# ERS Scatterometer $\sigma^0(40^\circ)$

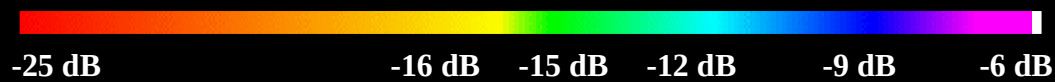
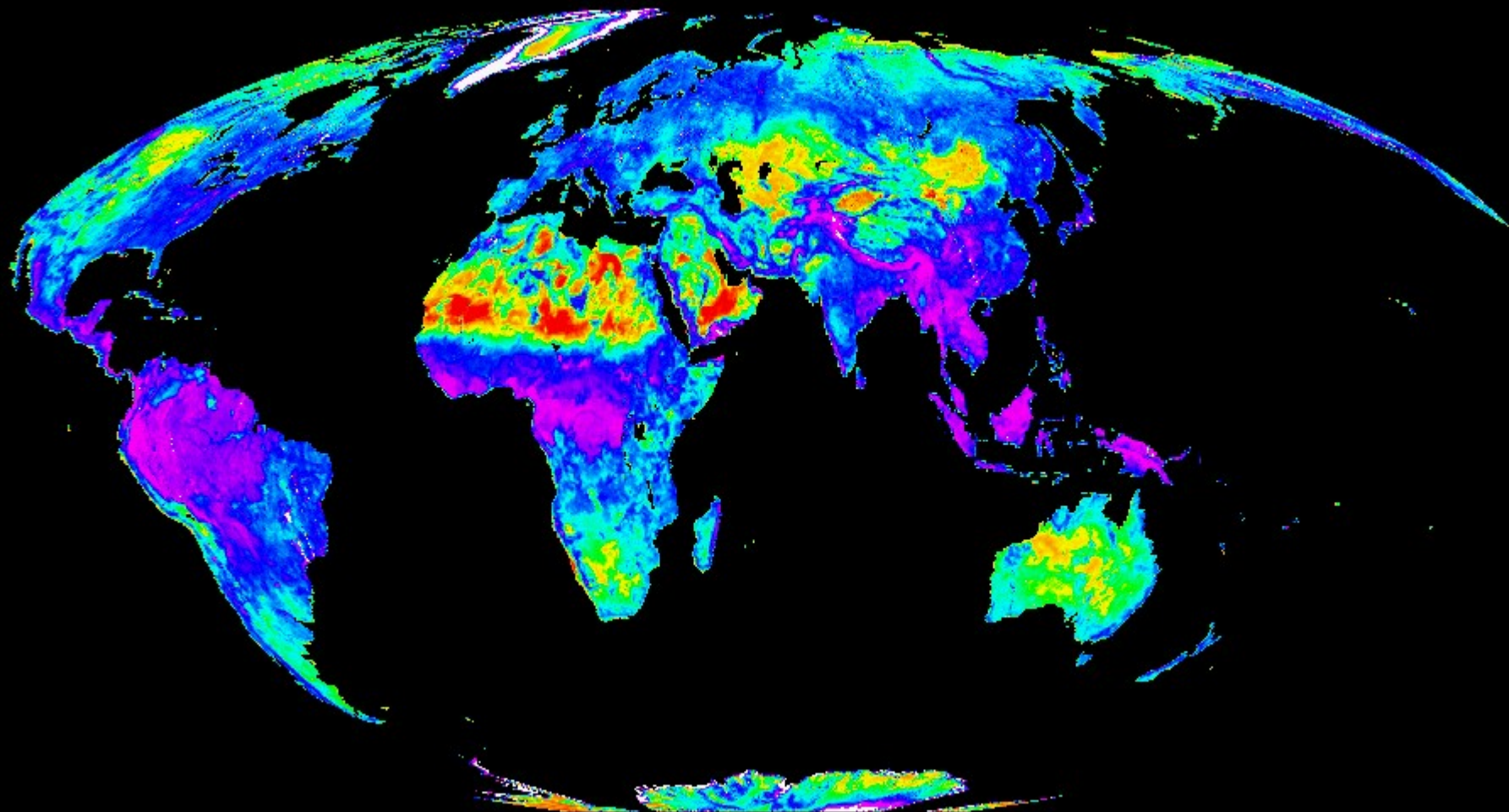
August 1992





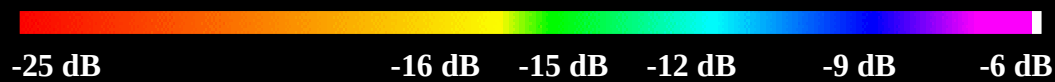
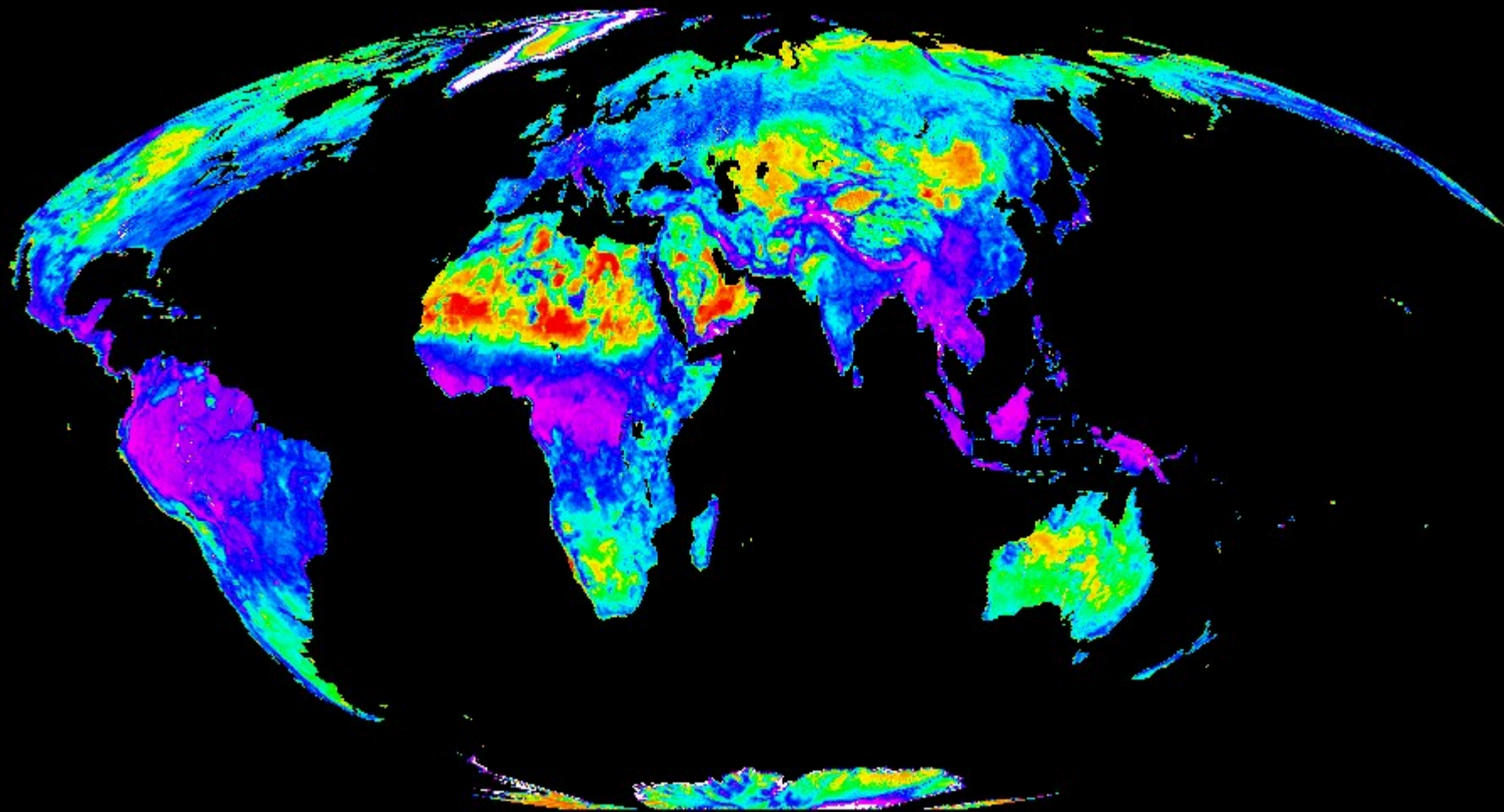
# ERS Scatterometer $^{\circ}(40^{\circ})$

September 1992



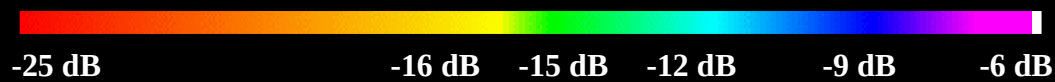
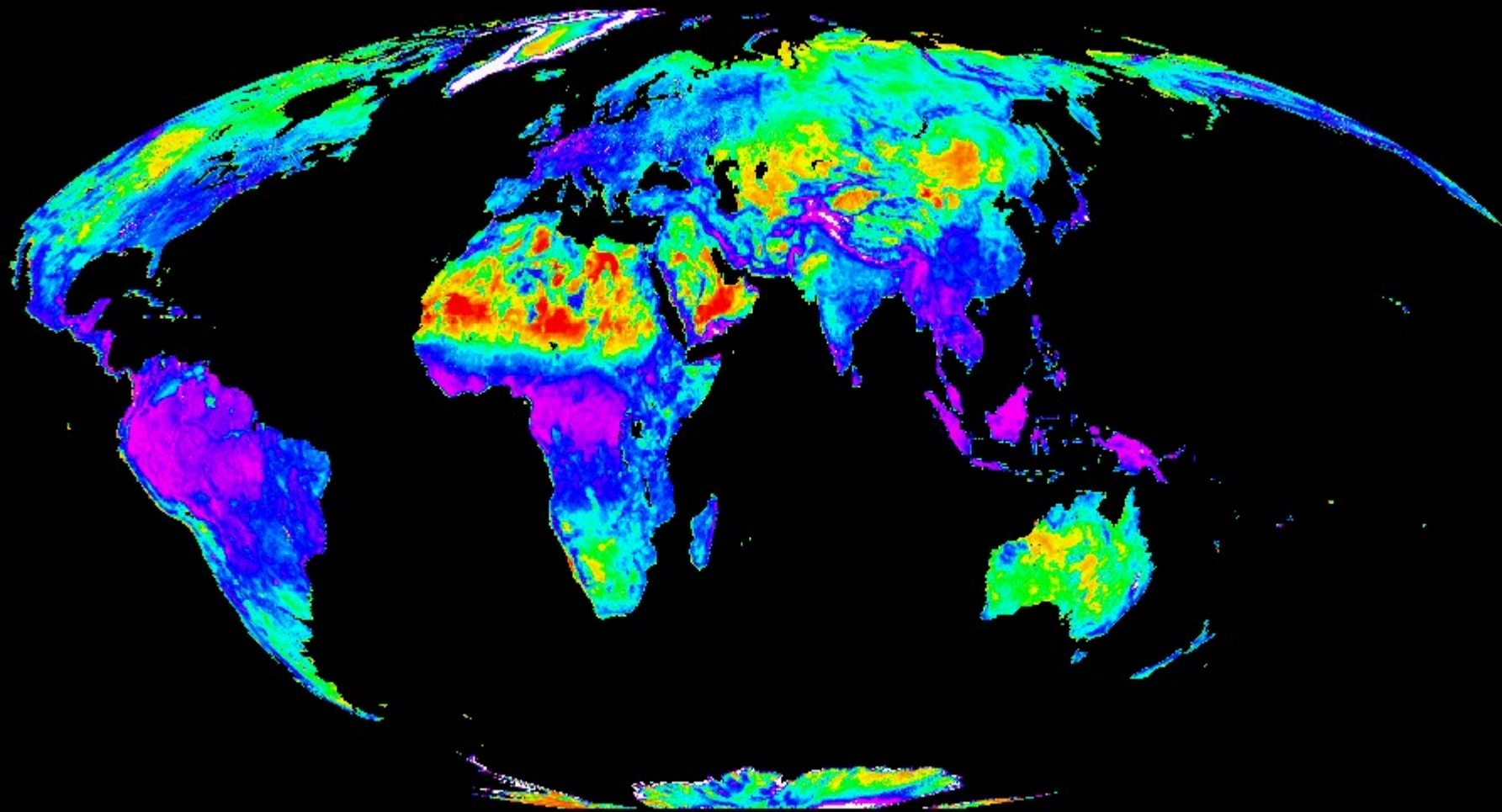
# ERS Scatterometer $^{\circ}(40^{\circ})$

October 1992



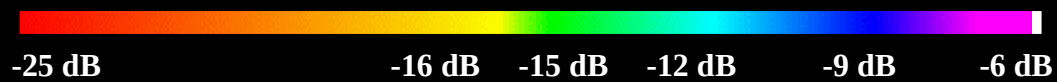
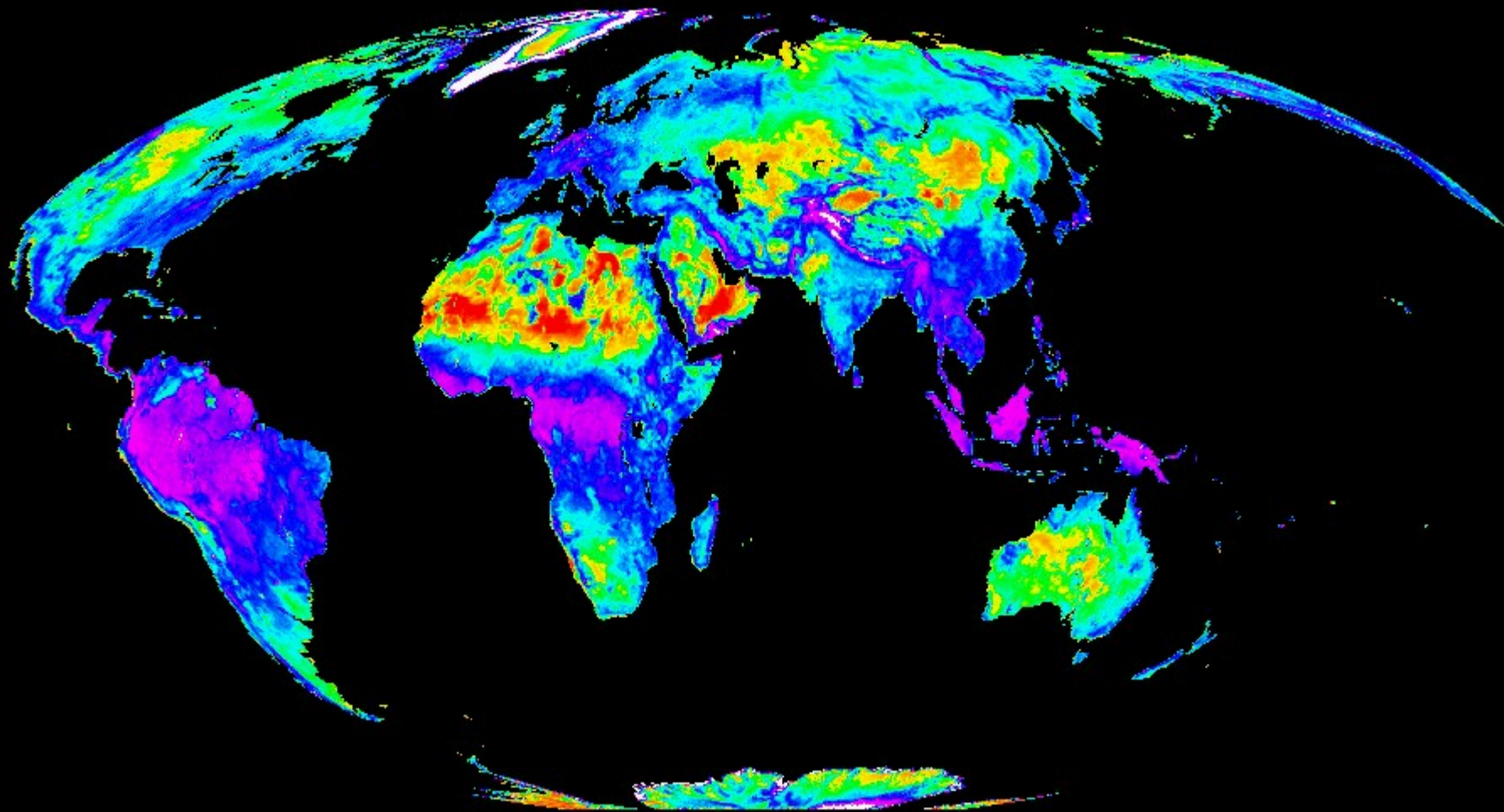
# ERS Scatterometer $^{\circ}(40^{\circ})$

November 1992



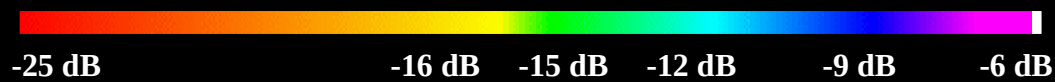
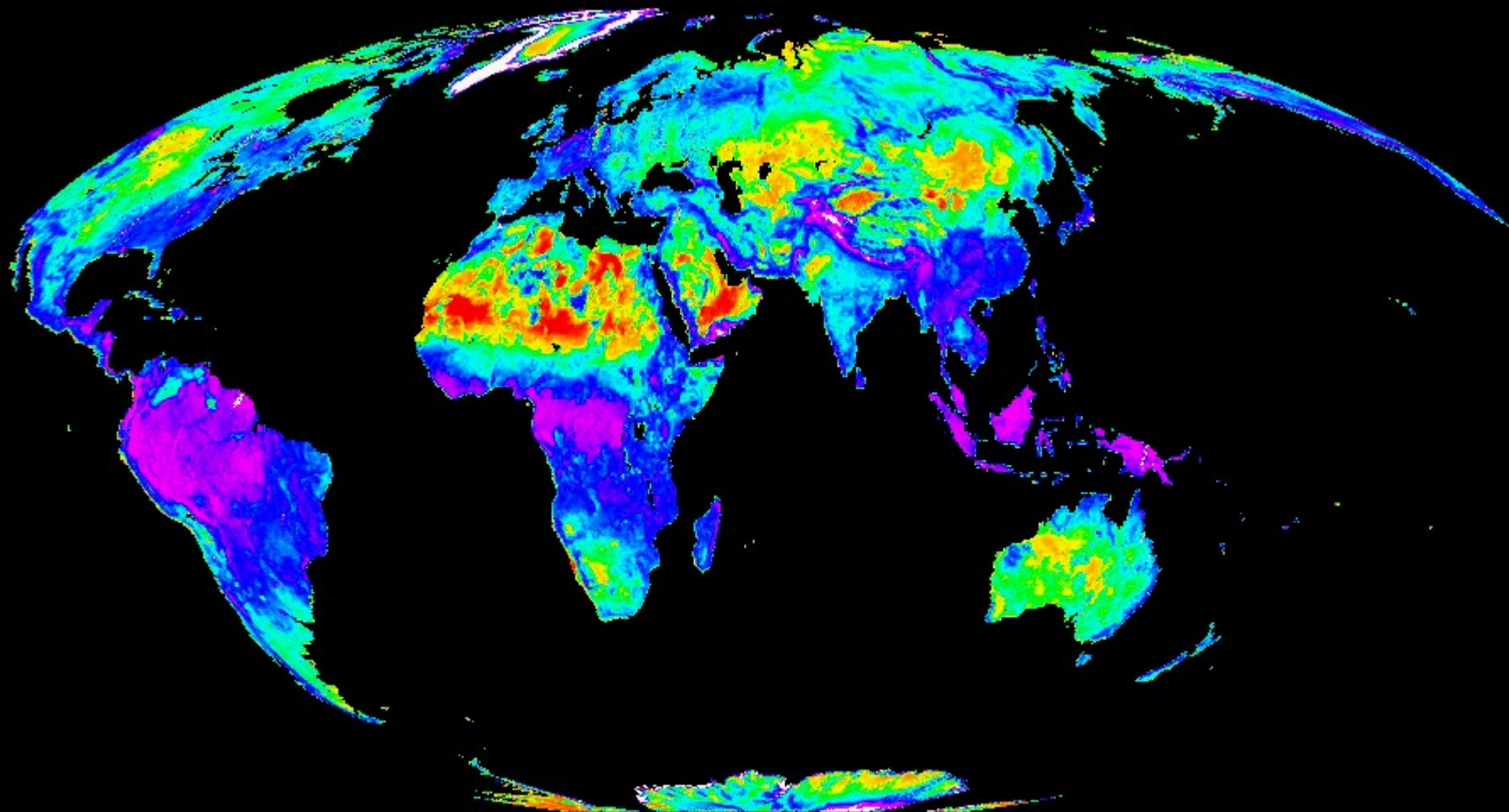
# ERS Scatterometer $^{\circ}(40^{\circ})$

December 1992



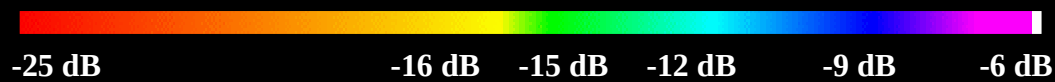
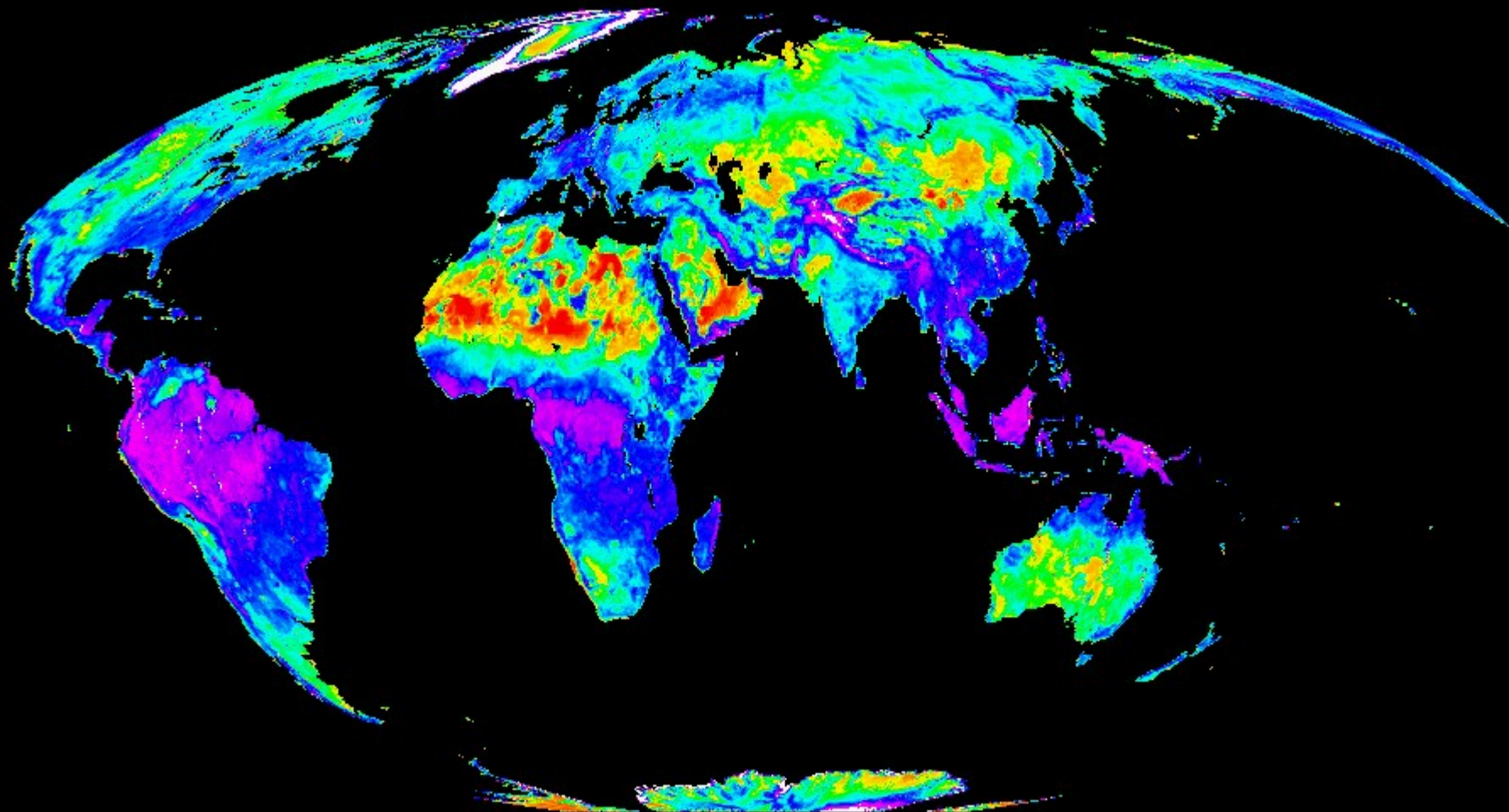
# ERS Scatterometer $^{\circ}(40^{\circ})$

January 1993



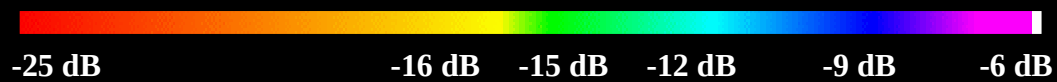
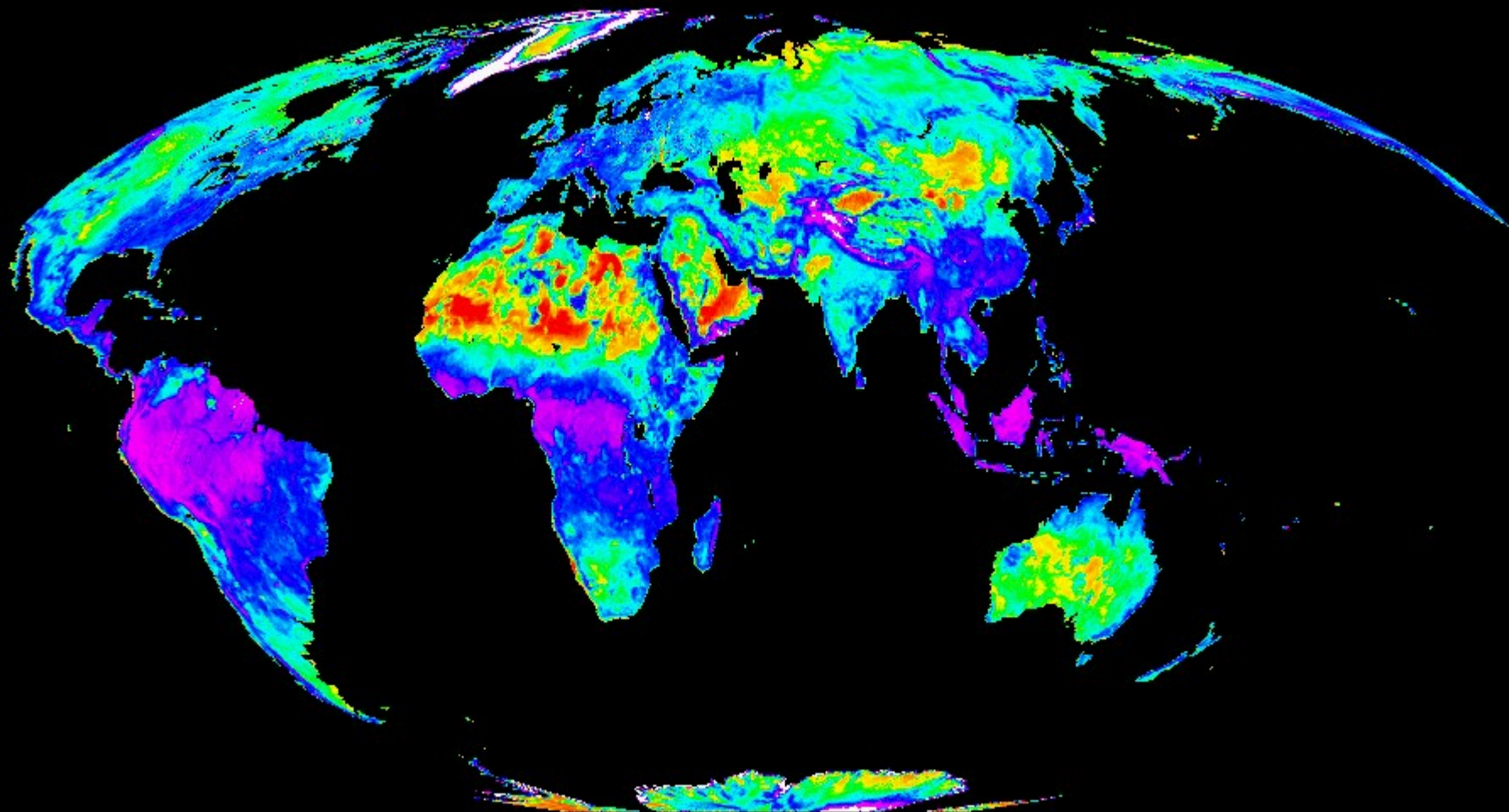
# ERS Scatterometer $^{\circ}(40^{\circ})$

February 1993



# ERS Scatterometer $^{\circ}(40^{\circ})$

March 1993



# ERS Scatterometer $^{\circ}(40^{\circ})$

April 1993

