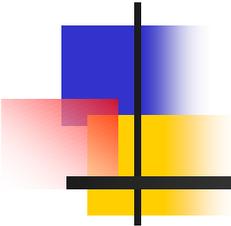


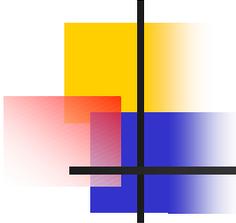
# Singularity-Spreading Phase Unwrapping



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A.Hirose and R.Yamaki

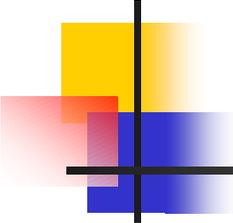
Dept. of Electronic Eng.,  
The University of Tokyo



# Outline

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1. Introduction
2. Singularity-Spreading Phase Unwrapping : SSPU
3. Weighted SSPU Utilizing Amplitude Data
4. Evaluation with Real Terrain Height Data
5. Reduction in Calculation Time
6. Conclusion



# Outline

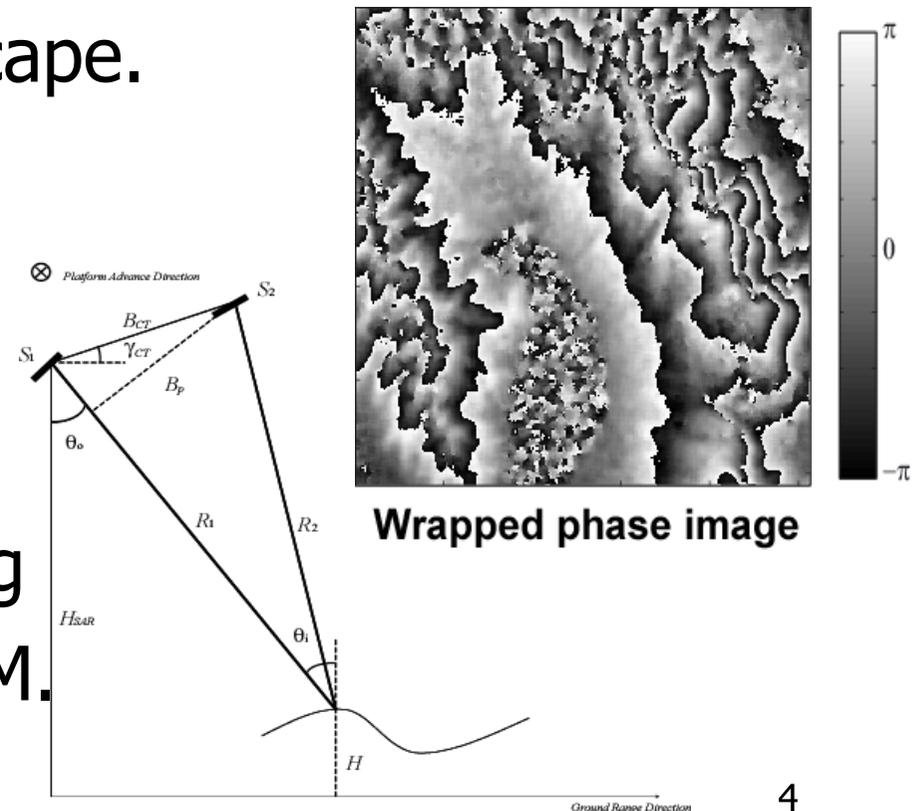
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- 1. Introduction**
2. Singularity-Spreading Phase Unwrapping : SSPU
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# Introduction

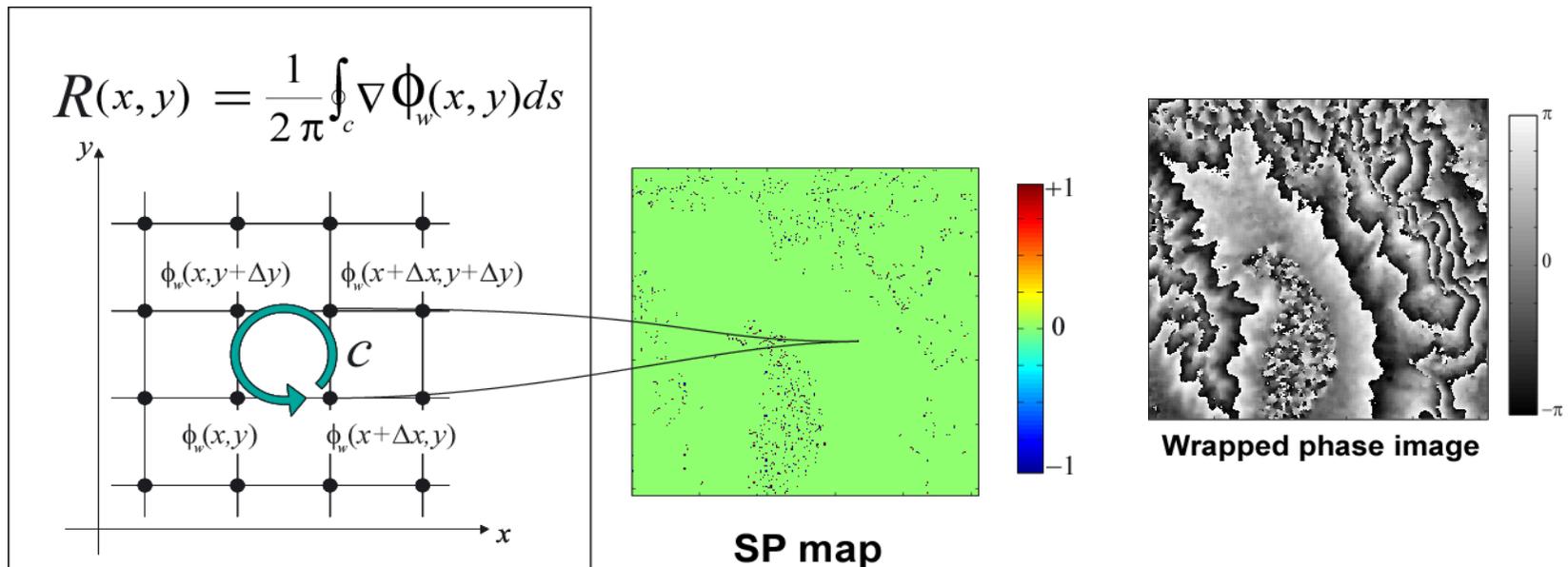
- Interferometric Synthetic Aperture Radar (InSAR) system generates interferograms which represent the landscape.

- Phase Unwrapping:  
Observed phase value is wrapped into  $(-\pi, \pi]$ .  
Need to unwrap for making Digital Elevation Map : DEM.



# Introduction

- Singular Point (SP):  
where phase rotation has a non-zero value  
(+1 or -1). SPs cause phase inconsistency.



# Introduction

- Minimum Cost Network Flow (MCMF) Method

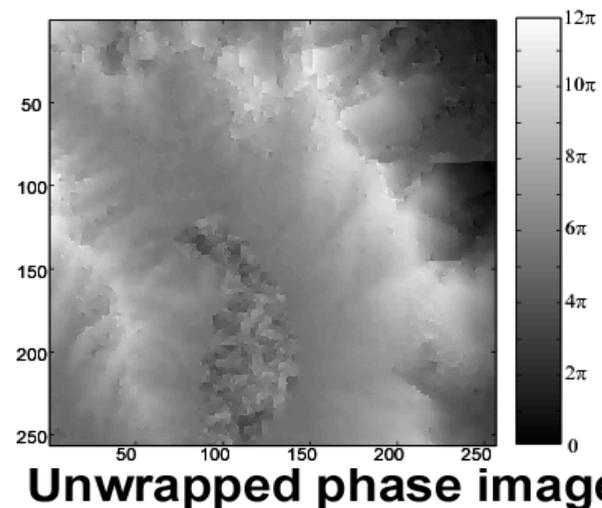
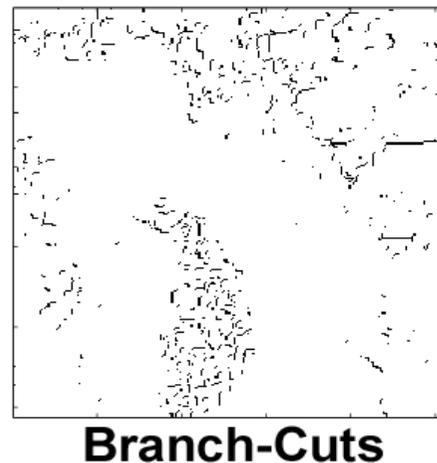
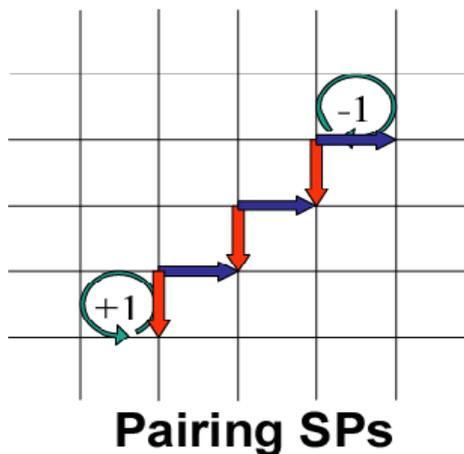
Mario Costantini, 1998

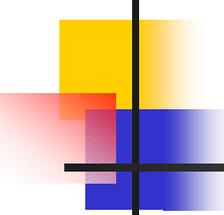
An efficient method for 2D-PU

Pairing +1 and -1 SPs with discrete  $2n\pi$ 's  
(Placing optimum branch-cuts)

Problems:

1. Dense SPs generate spikes.
2. Isolated SPs cause unnatural cliffs.
3. Optimization requires a high calculation cost.



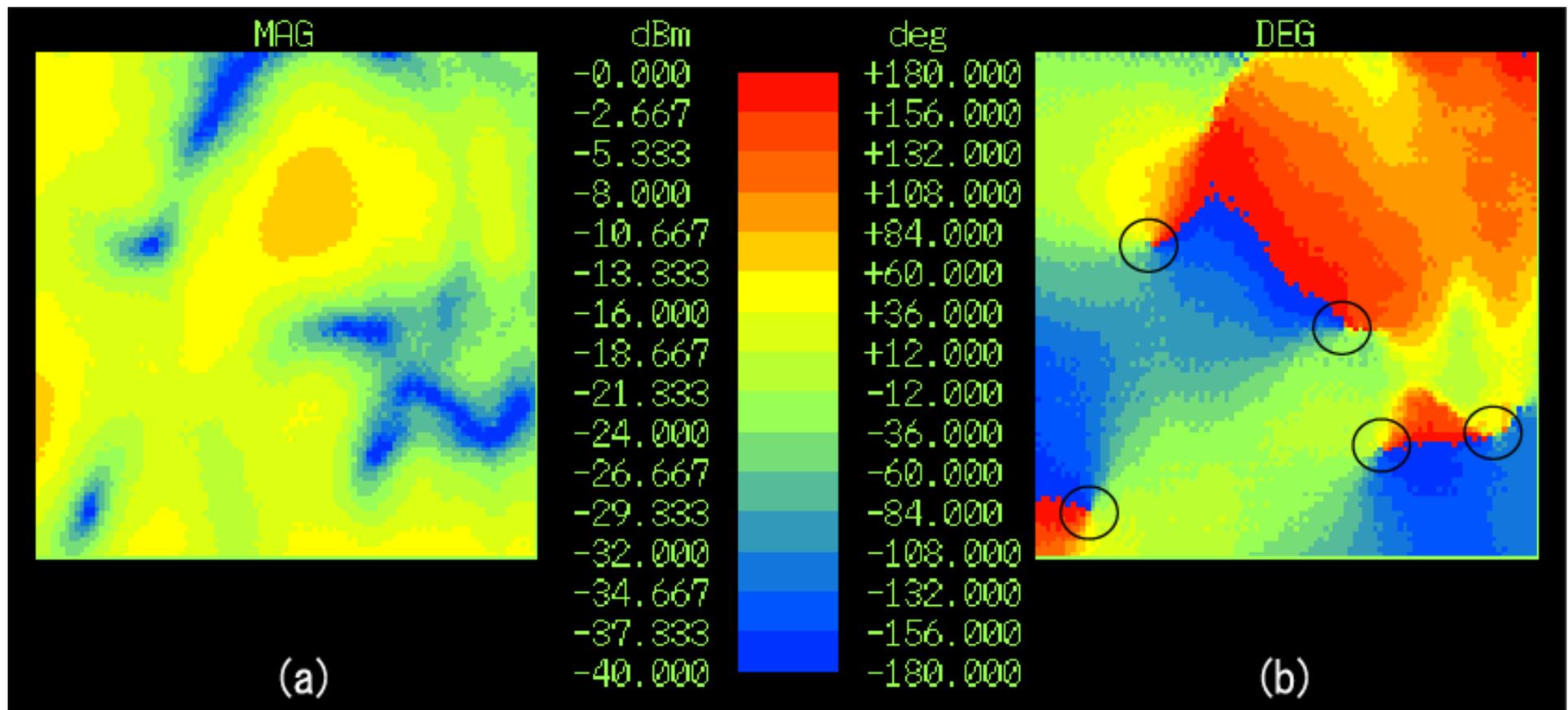


# Outline

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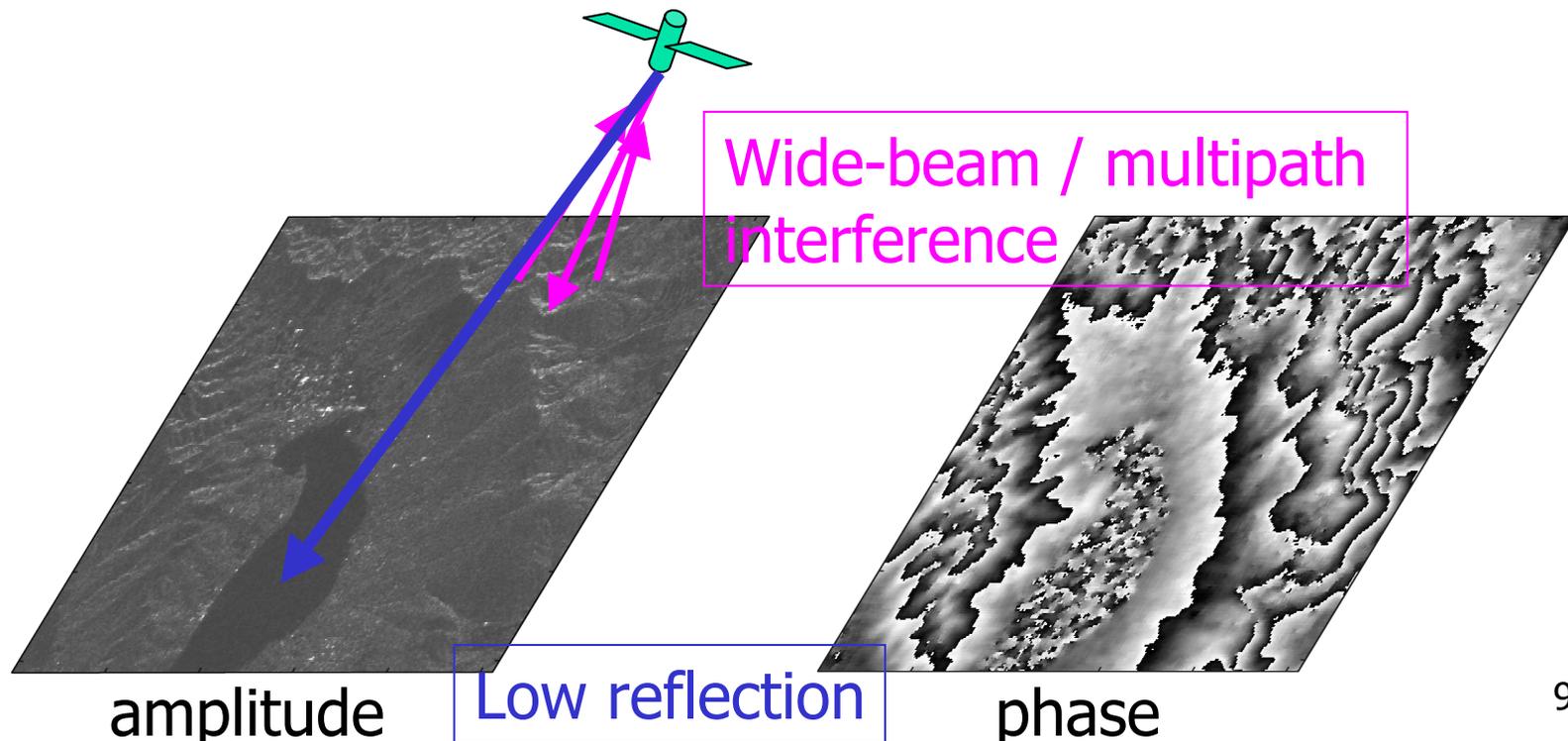
1. Introduction
2. **Singularity-Spreading Phase  
Unwrapping : SSPU**
3. Weighted SSPU Utilizing Amplitude Data
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# Introduction



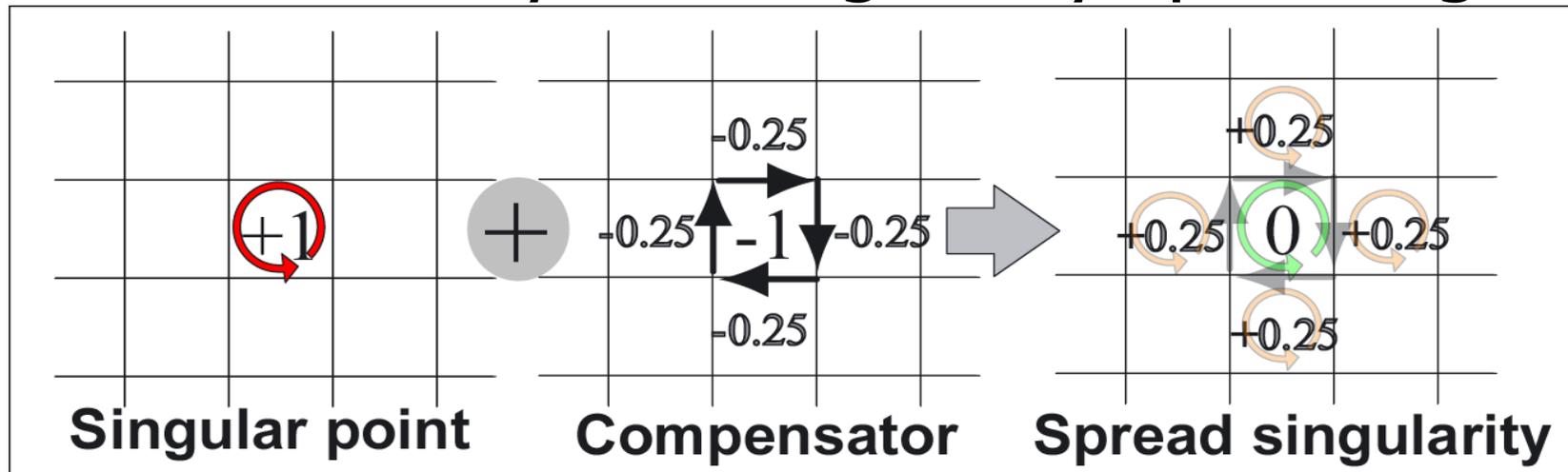
# Singularity-Spreading Phase Unwrapping

- Phase values are distorted in EM-wave propagation causes SPs.



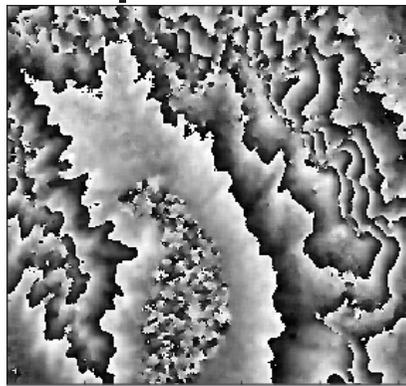
# Singularity-Spreading Phase Unwrapping

- SPs should be compensated in a **continuous manner** together with their vicinity. --> Singularity spreading

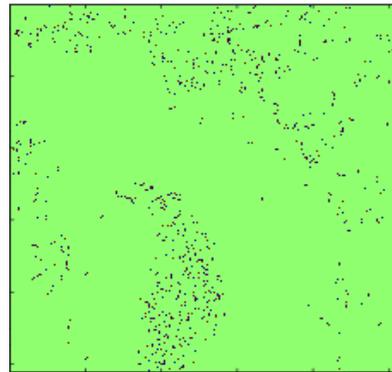


Iteration over the whole image

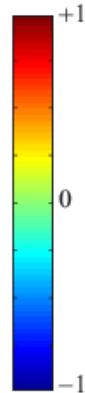
# Singularity-Spreading Phase Unwrapping



Wrapped phase image

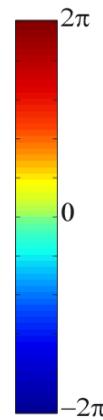
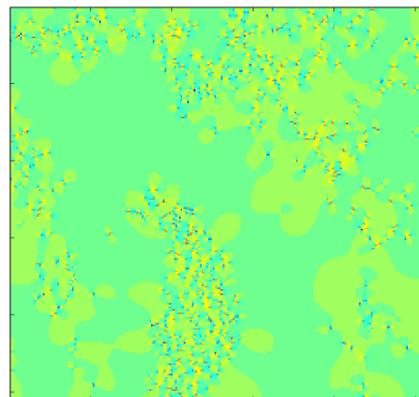
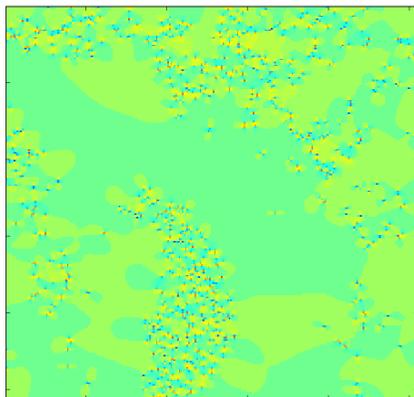


SP map

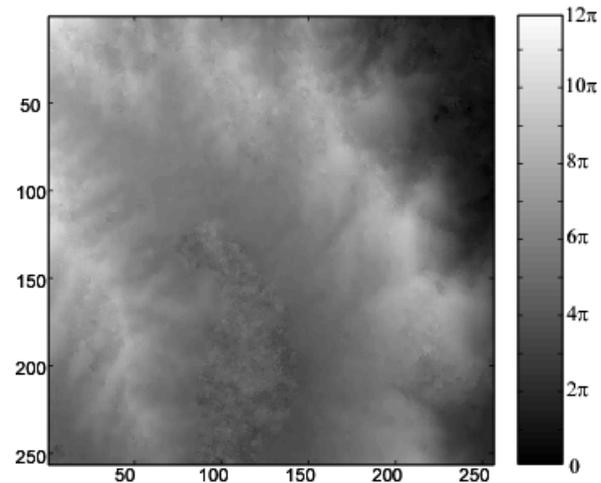


In the SSPU, compensators combine +1 and -1 SPs gently, and diffuse isolated ones.

--> SPs are removed.

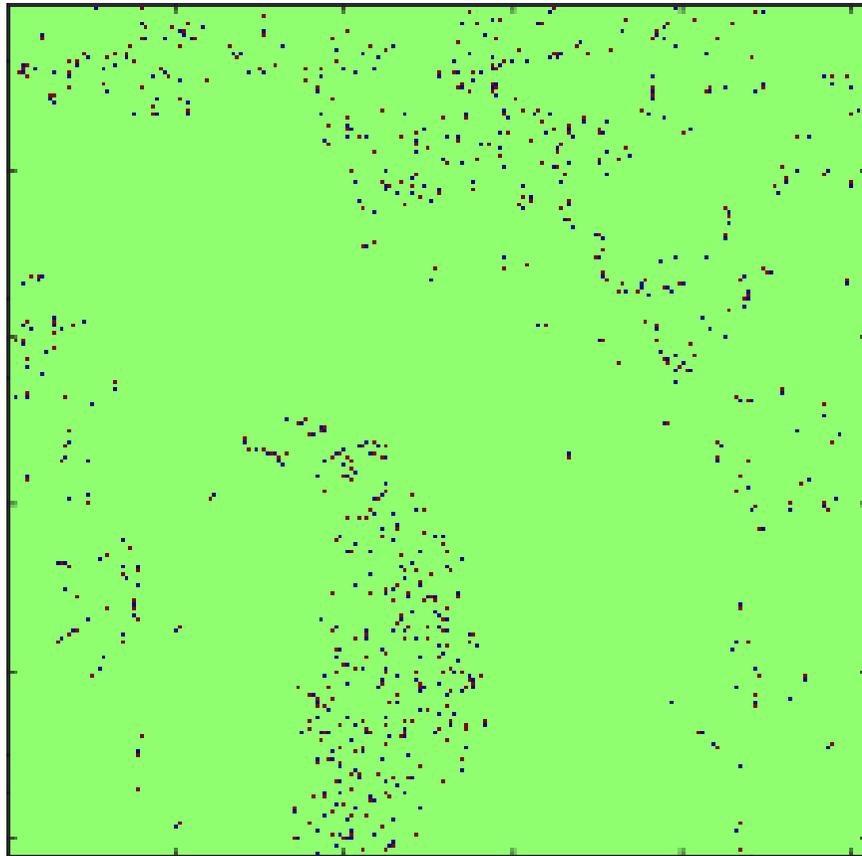


x and y directional compensators

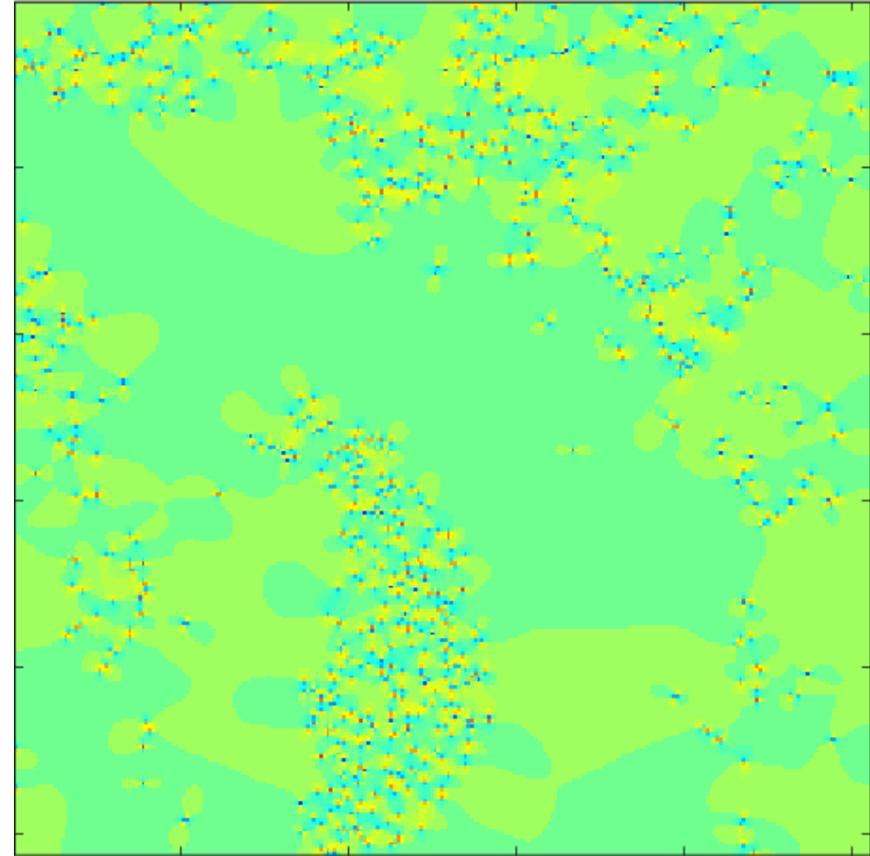


Unwrapped phase image

# Singularity-Spreading Phase Unwrapping

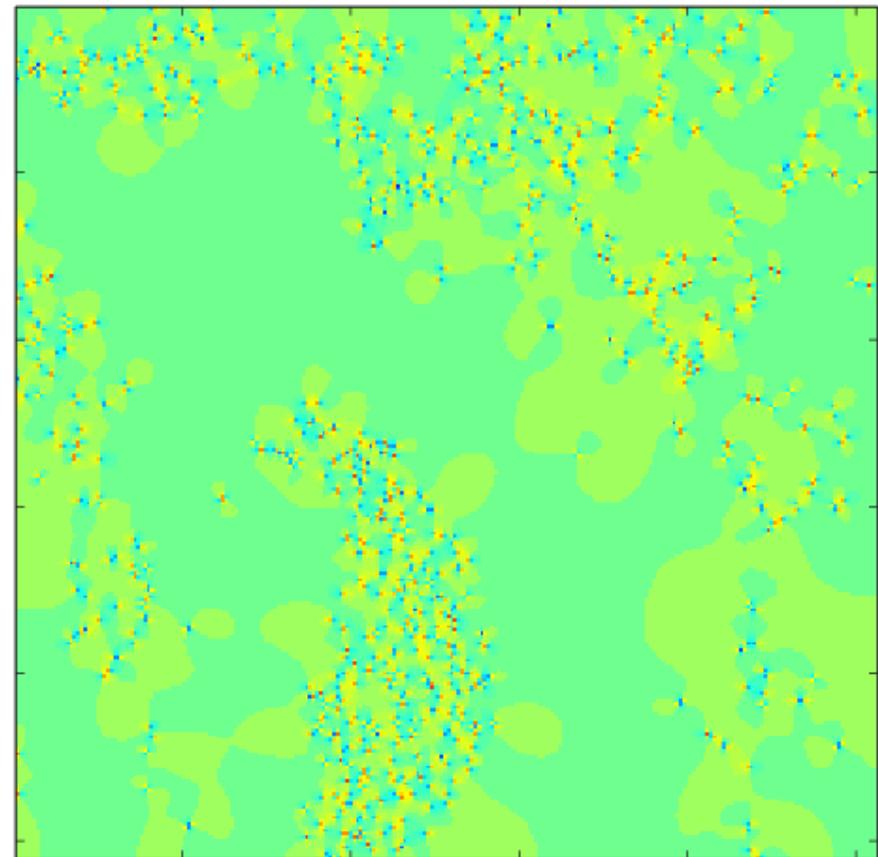
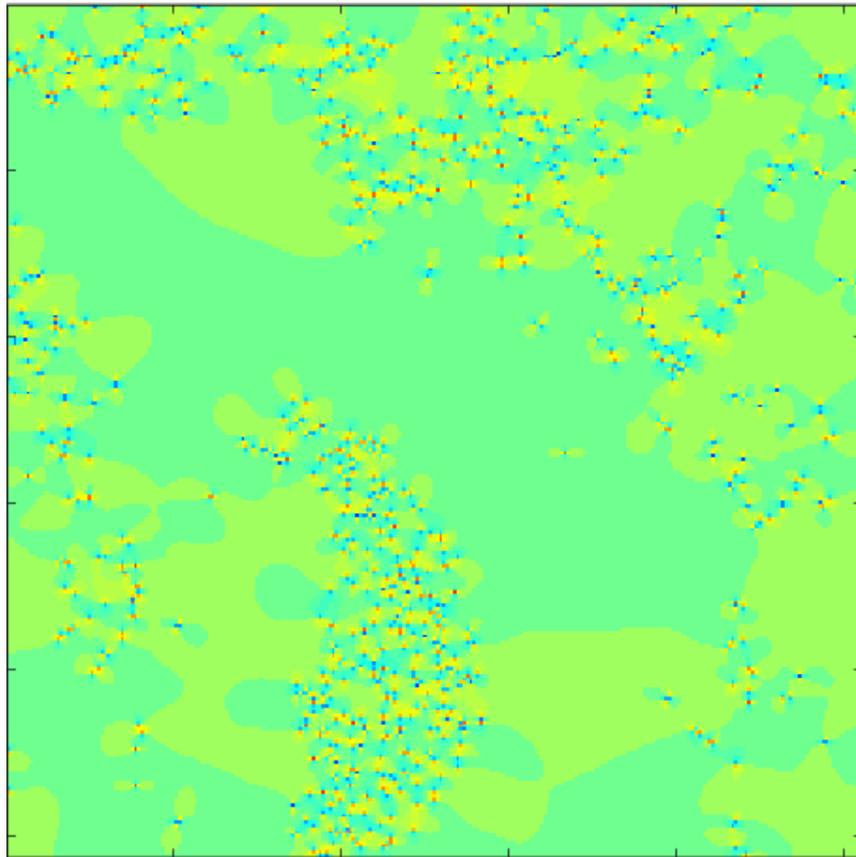


SP map



x directional compensators

# Singularity-Spreading Phase Unwrapping

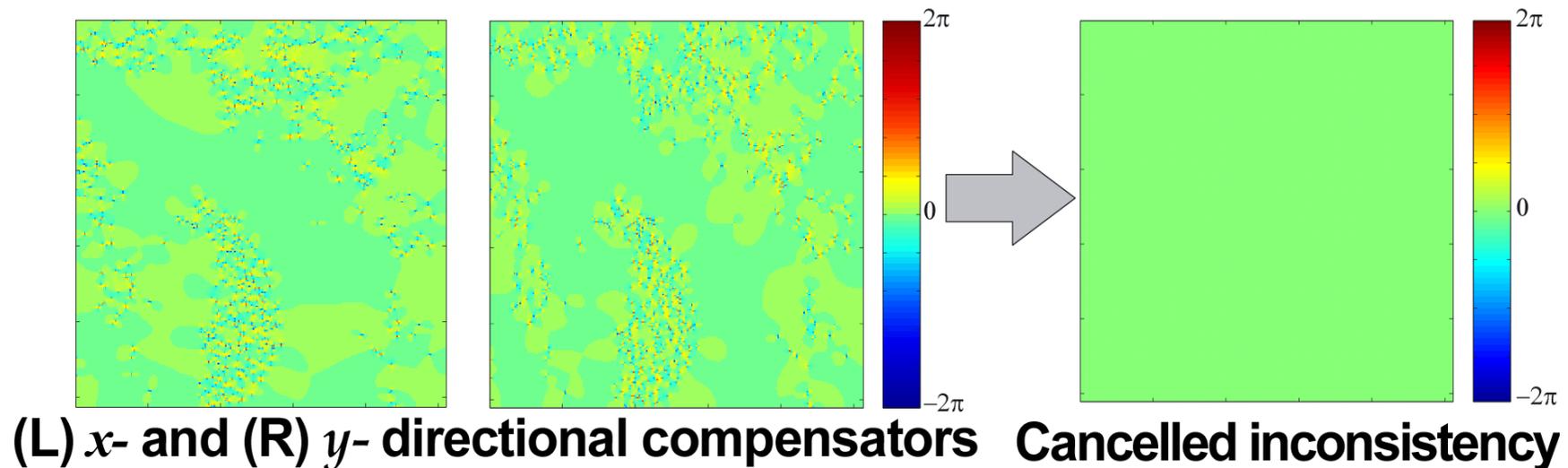


x and y directional compensators

# Singularity-Spreading Phase Unwrapping

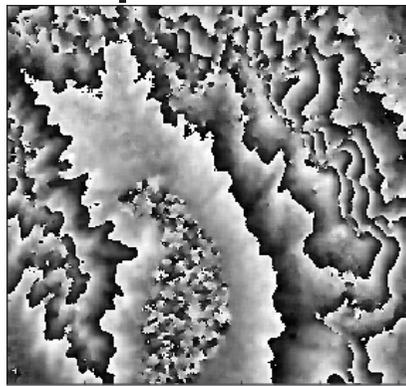
In the SSPU, compensators combine +1 and  $-1$  SPs gently. Then, the inconsistency cancels out.

Isolated SPs are also erased without yielding unnatural cliffs.

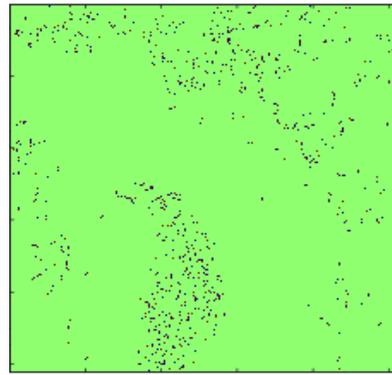


**(L)  $x$ - and (R)  $y$ - directional compensators** **Cancelled inconsistency**

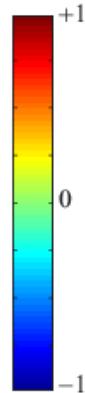
# Singularity-Spreading Phase Unwrapping



Wrapped phase image

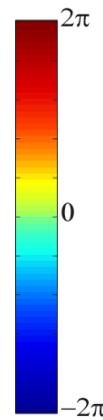
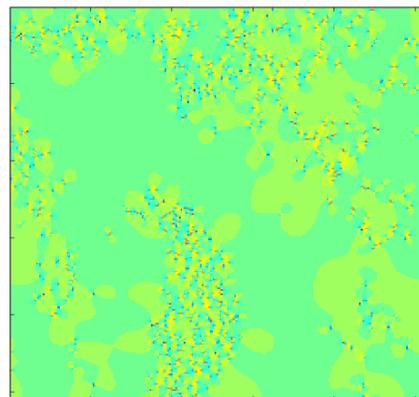
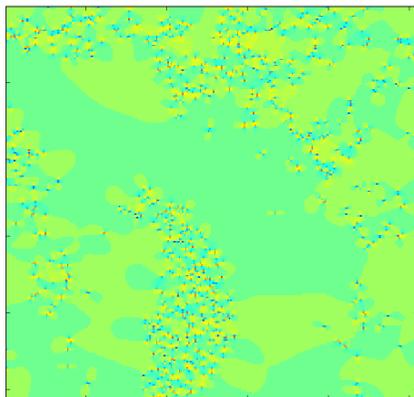


SP map

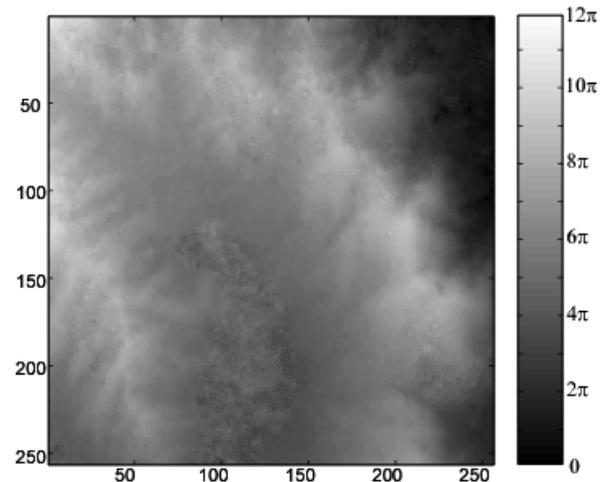


In the SSPU, compensators combine +1 and -1 SPs gently, and diffuse isolated ones.

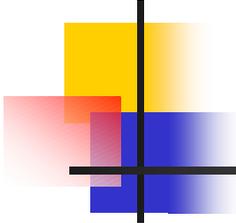
--> SPs are removed.



x and y directional compensators



Unwrapped phase image



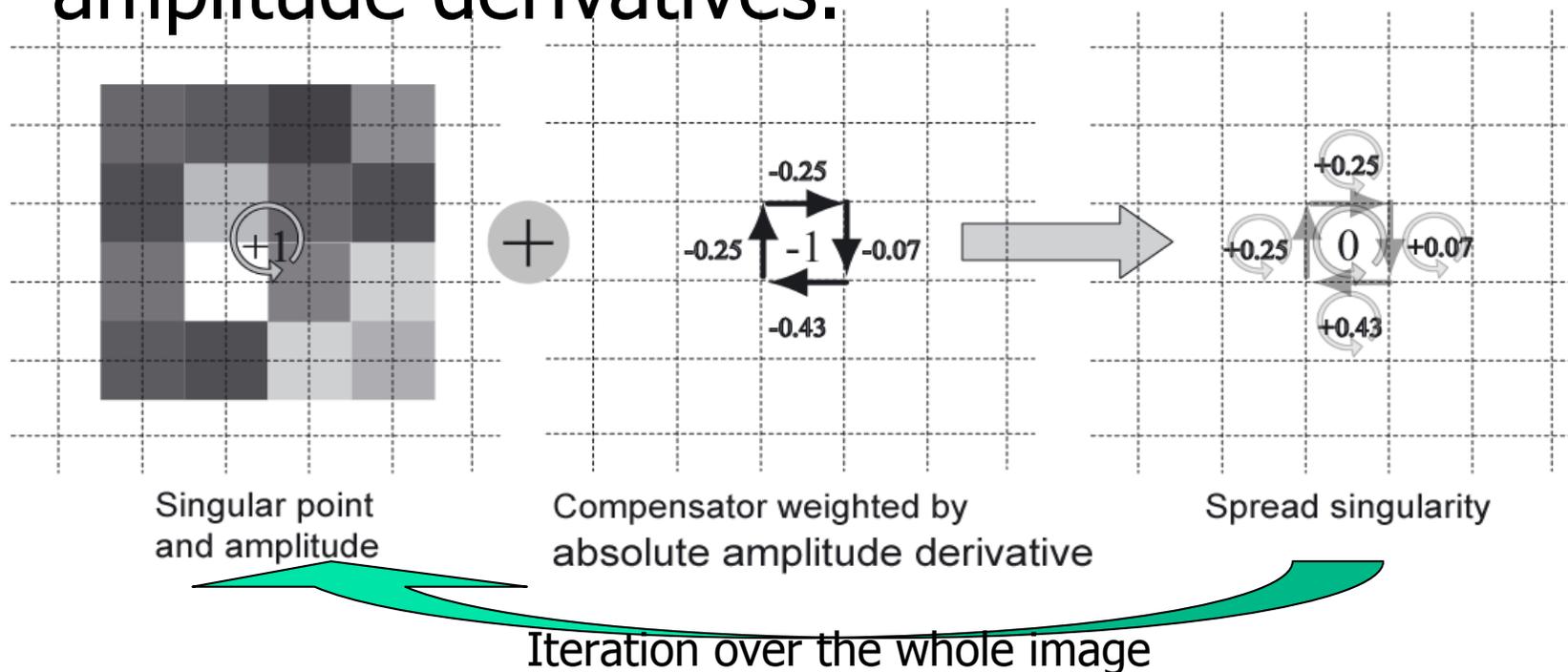
# Outline

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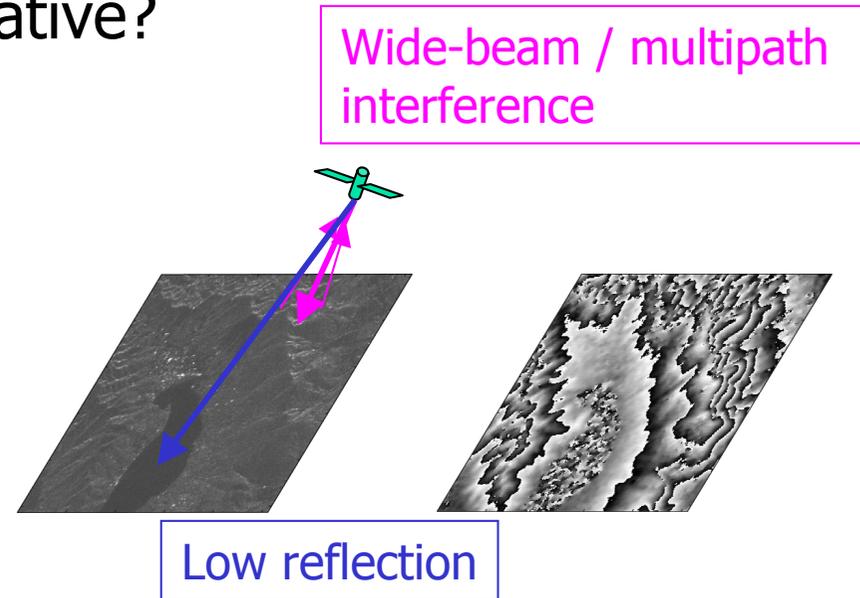
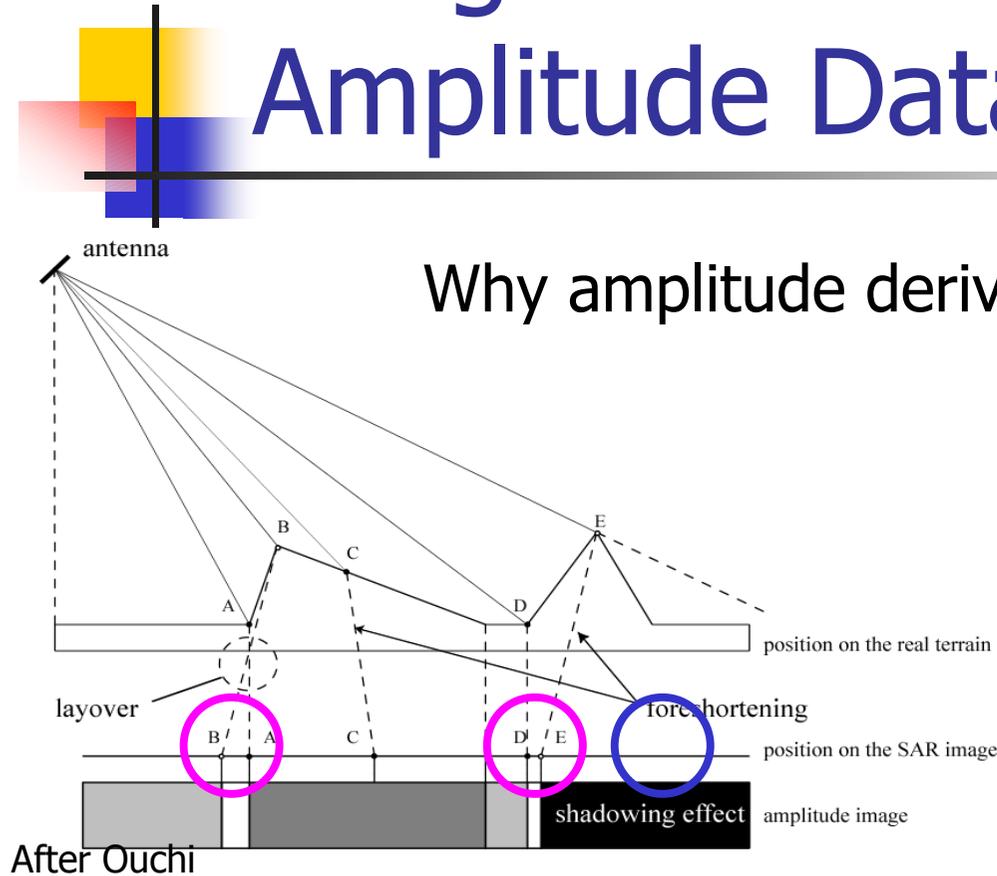
1. Introduction
2. Singularity-Spreading Phase Unwrapping : SSPU
- 3. Weighted SSPU Utilizing Amplitude Data**
4. Evaluation with Real Terrain Height Data
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# Weighted SSPU Utilizing Amplitude Data

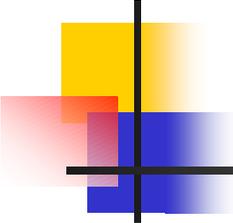
Weight the fractions of the inverse rotation depending on the absolute values of the amplitude derivatives.



# Weighted SSPU Utilizing Amplitude Data



	Amplitude	Phase	Compensator
Layover area	higher than its vicinity	distorted by interference	locally distributed
Shadowed area	almost zero	random noise	uniform (statistically)



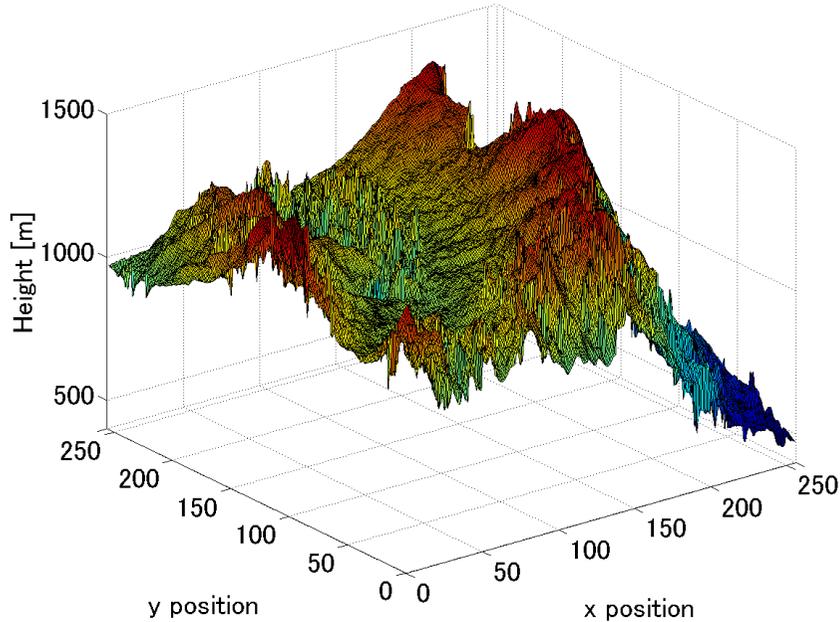
# Outline

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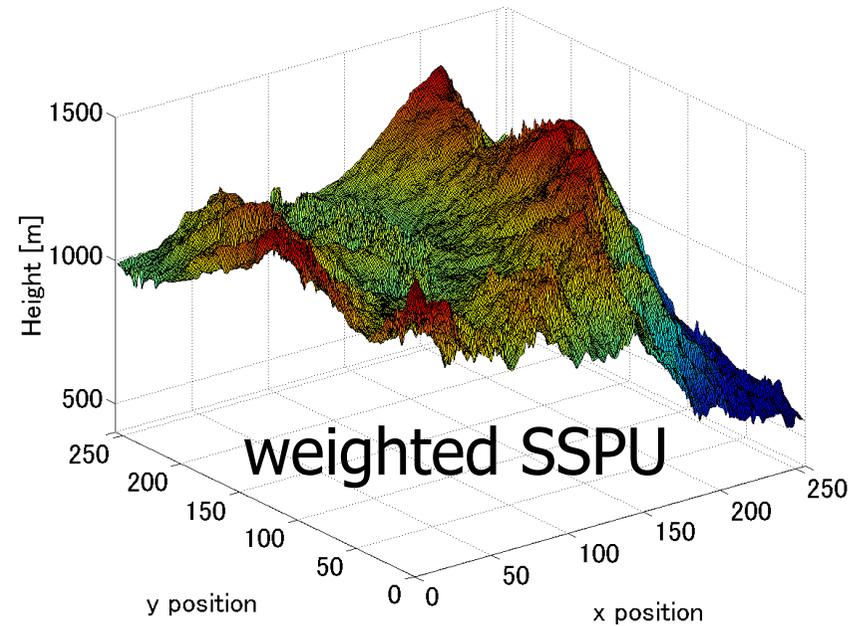
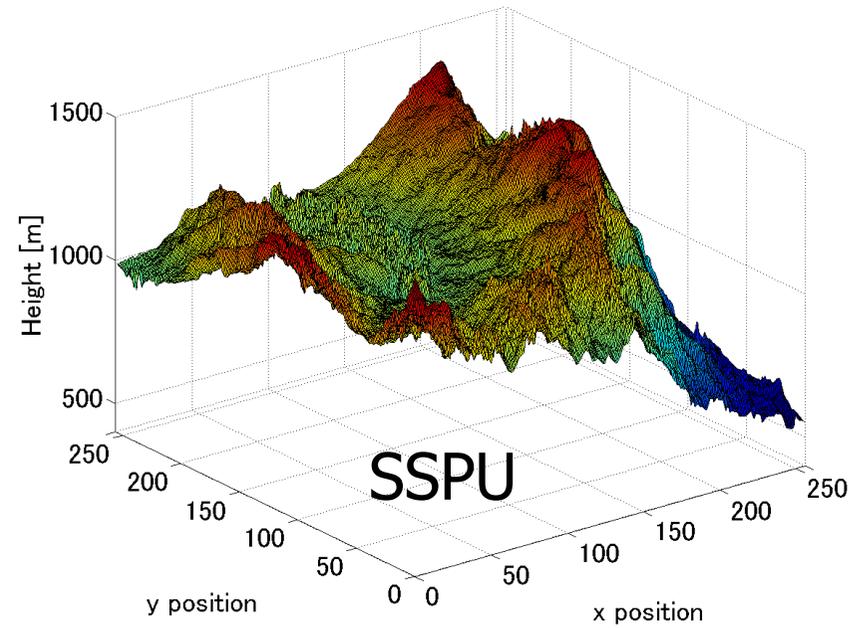
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# Evaluation with Height Data

## Generated DEMs

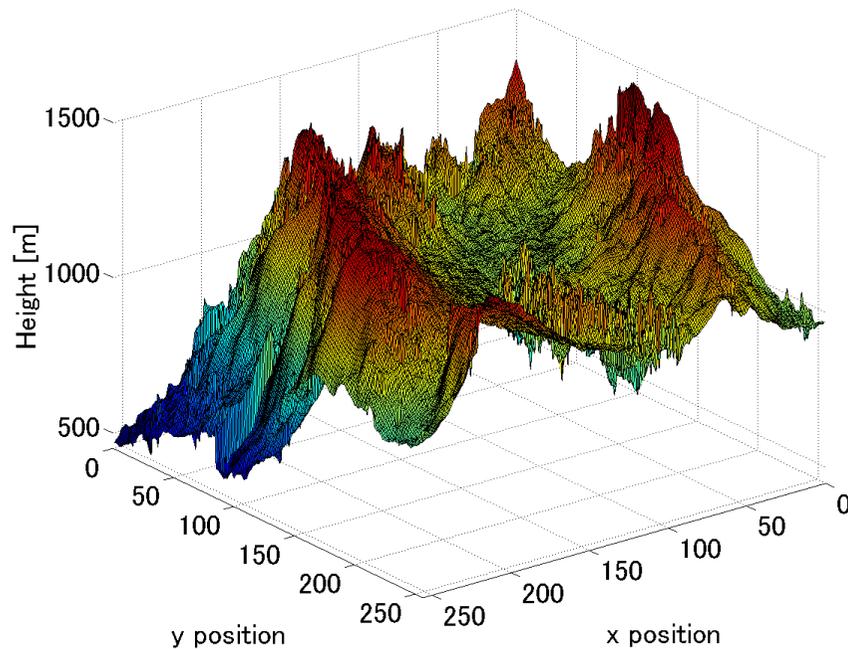


Min.Cost NF method

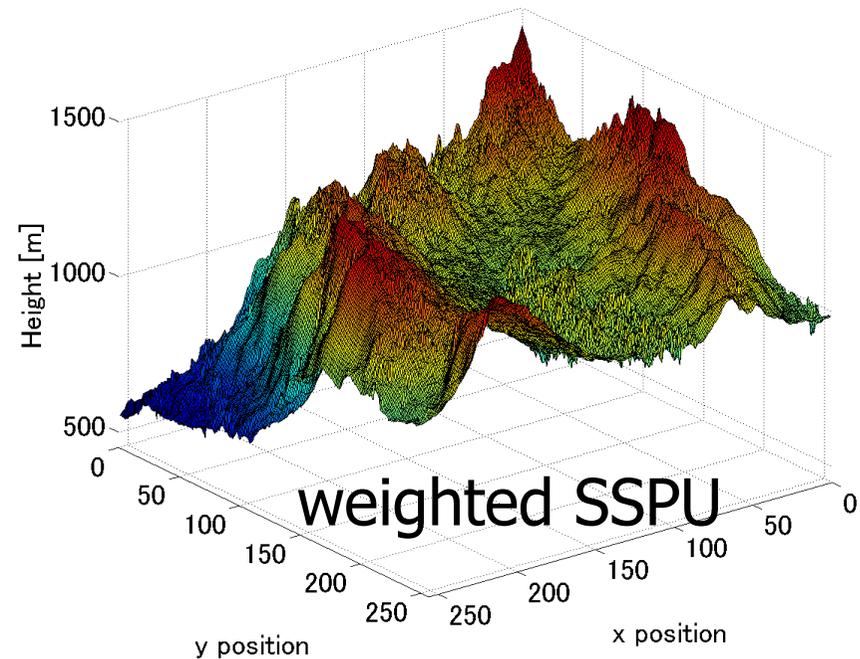
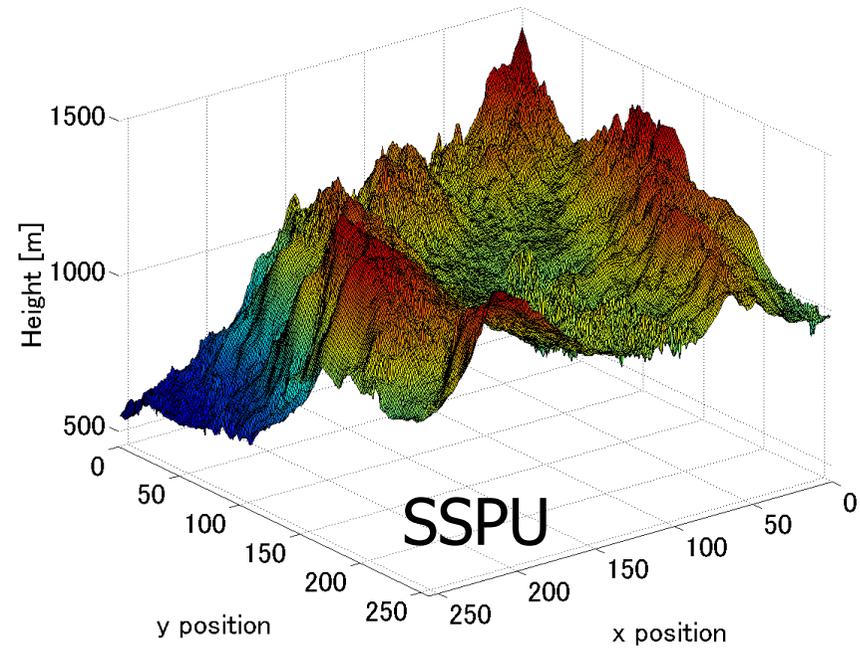


# Evaluation with Height Data

## Generated DEMs



Min.Cost NF method



# Evaluation with Real Terrain Height Data

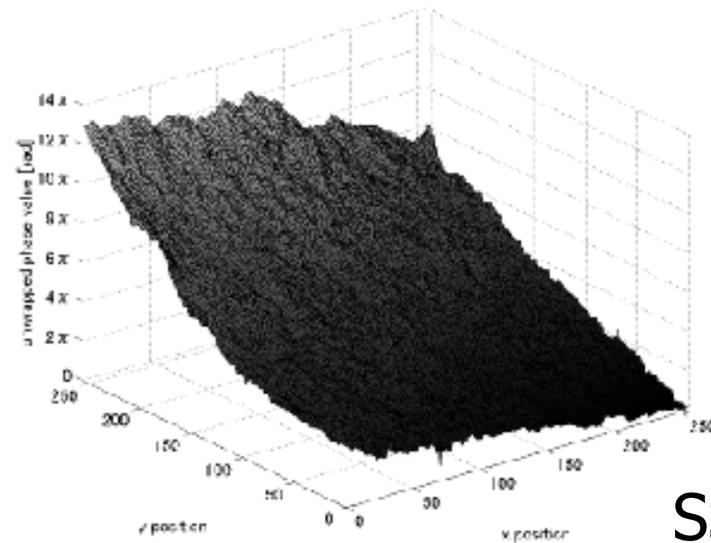
Method	MSE	MSNR	PSE	PNSNR
	$MSE$	$10 \log_{10} \frac{SHR}{MSE}$	$PSE$	$10 \log_{10} \frac{SHR}{PSE}$
	$\times 10^3 [m^2]$	[dB]	$\times 10^3 [m^2]$	[dB]
MCNF	3.32	24.3	121.2	8.63
Simple SSPU	2.93	24.8	83.4	10.26
Weighted SSPU	2.59	25.3	95.4	9.67

$$MSE = \frac{1}{S} \sum_x \sum_y \{\hat{H}(x, y) - H(x, y)\}^2 \quad [m^2]$$

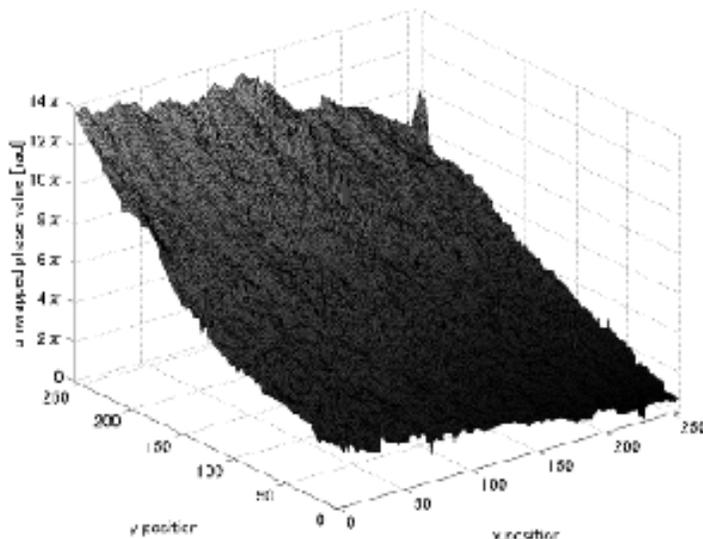
$$PSE = \max[\{\hat{H}(x, y) - H(x, y)\}^2] \quad [m^2]$$

# Evaluation with Real Terrain Height Data

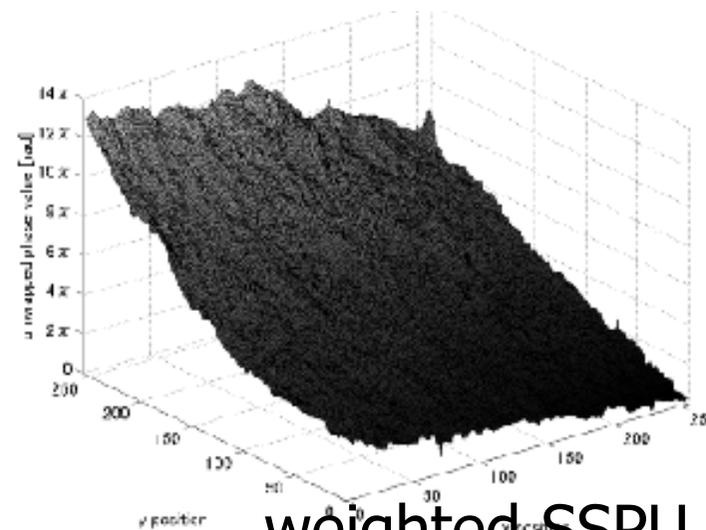
Generated DEMs



SSPU



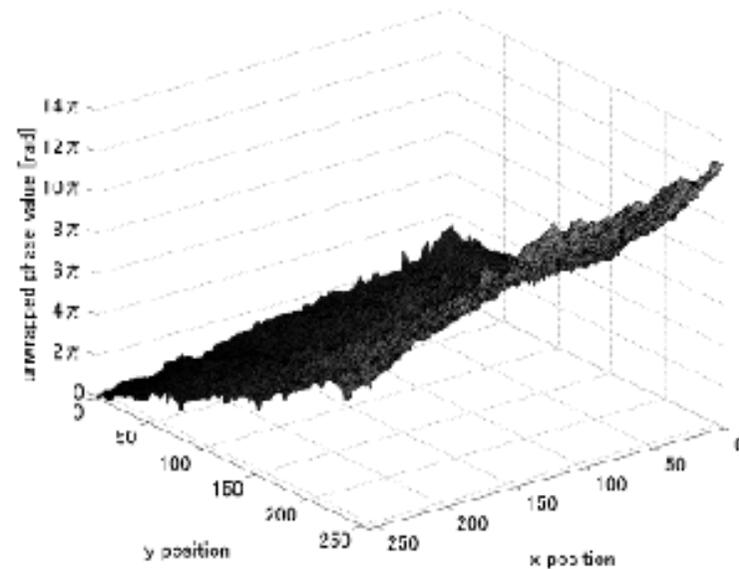
Min.Cost NF method



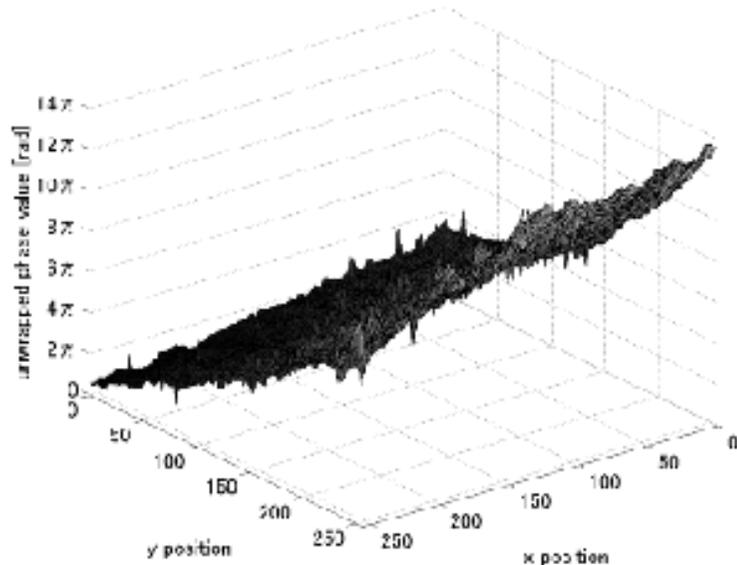
weighted SSPU

# Evaluation with Real Terrain Height Data

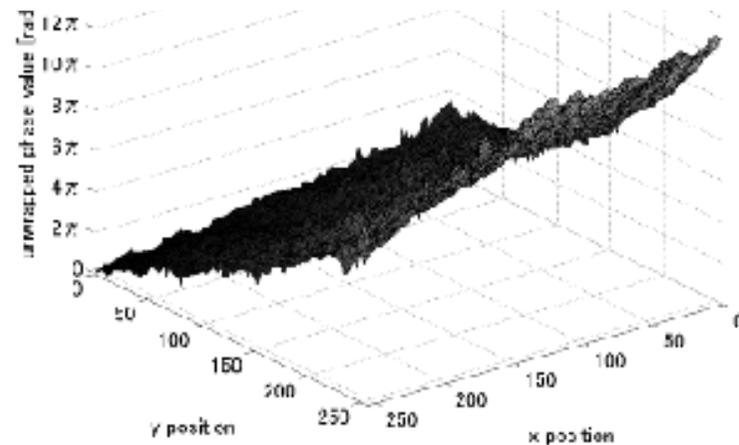
Generated DEMs



SSPU

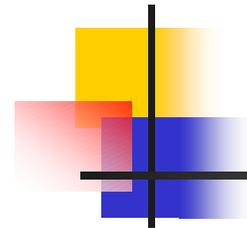


Min.Cost NF method



weighted SSPU

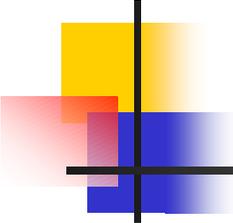
# Evaluation with Real Terrain Height Data



Method	MSE	MSNR	PSE	PNSNR
	$MSE$	$10 \log_{10} \frac{SHR}{MSE}$	$PSE$	$10 \log_{10} \frac{SHR}{PSE}$
	$\times 10 [m^2]$	[dB]	$\times 10^3 [m^2]$	[dB]
MCNF	17.2	37.5	26.0	15.7
Simple SSPU	15.2	38.0	6.0	22.1
Weighted SSPU	15.5	38.0	6.0	22.1

$$MSE = \frac{1}{S} \sum_x \sum_y \{\hat{H}(x, y) - H(x, y)\}^2 \quad [m^2]$$

$$PSE = \max[\{\hat{H}(x, y) - H(x, y)\}^2] \quad [m^2]$$

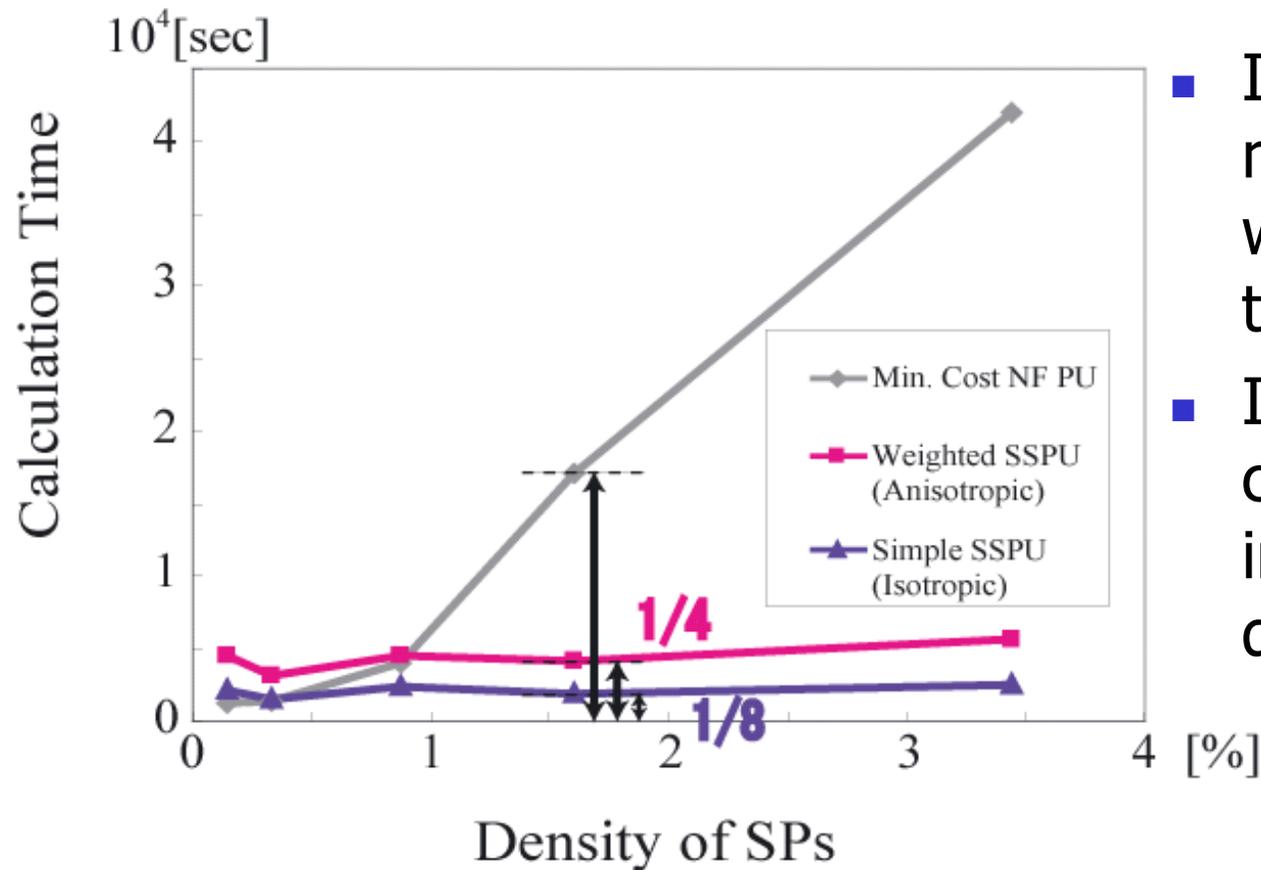


# Outline

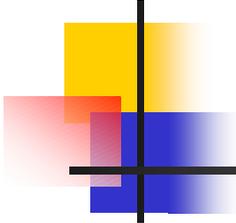
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# Reduction in Calculation Time



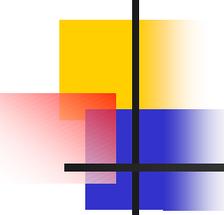
- In the conventional method, the more SPs we have, the more time is required.
- In SSPU, calculation costs are very low and independent of the density of SPs.



# Outline

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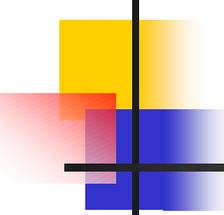
1. Introduction
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# Conclusion

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- We have proposed the simple SSPU method / weighted SSPU method by utilizing amplitude information.
- More precise DEMs can be generated in the weighted SSPU method as compared to the conventional method.
- Calculation times are reduced.



# Acknowledgment

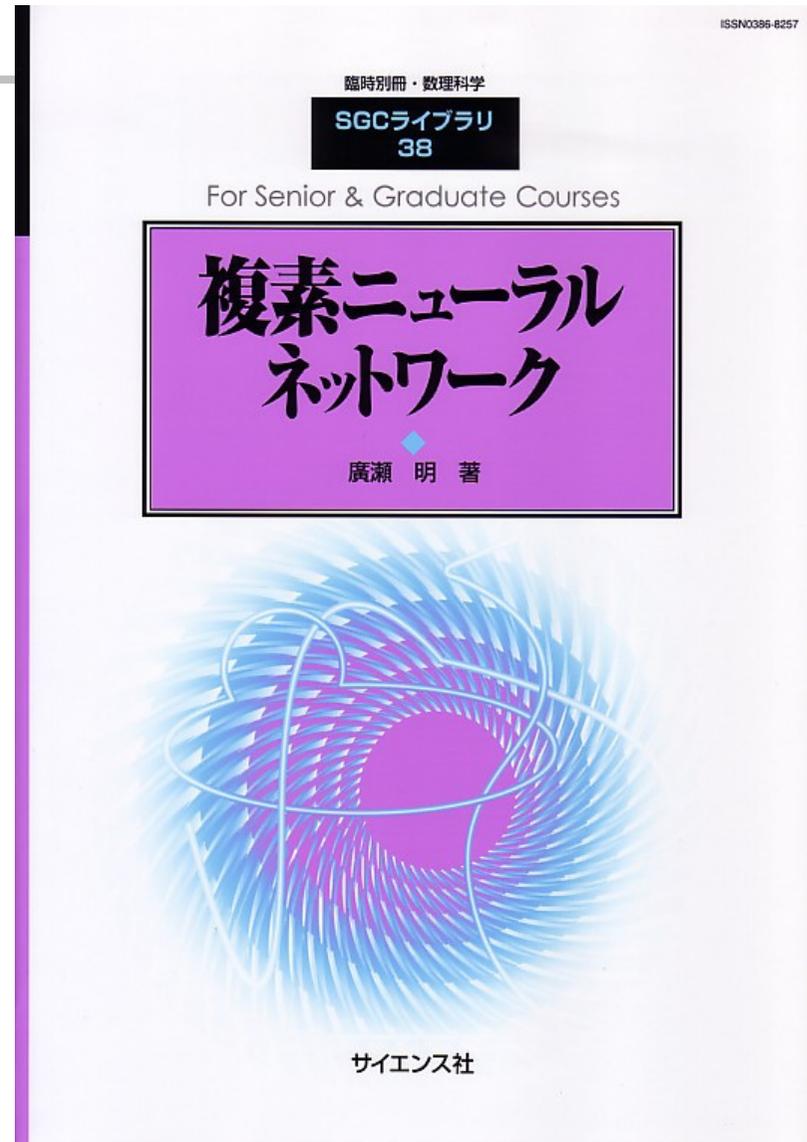
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- We thank Dr. M. Shimada of EROC/JAXA for supplying the data.

# 「複素ニューラル ネットワーク」

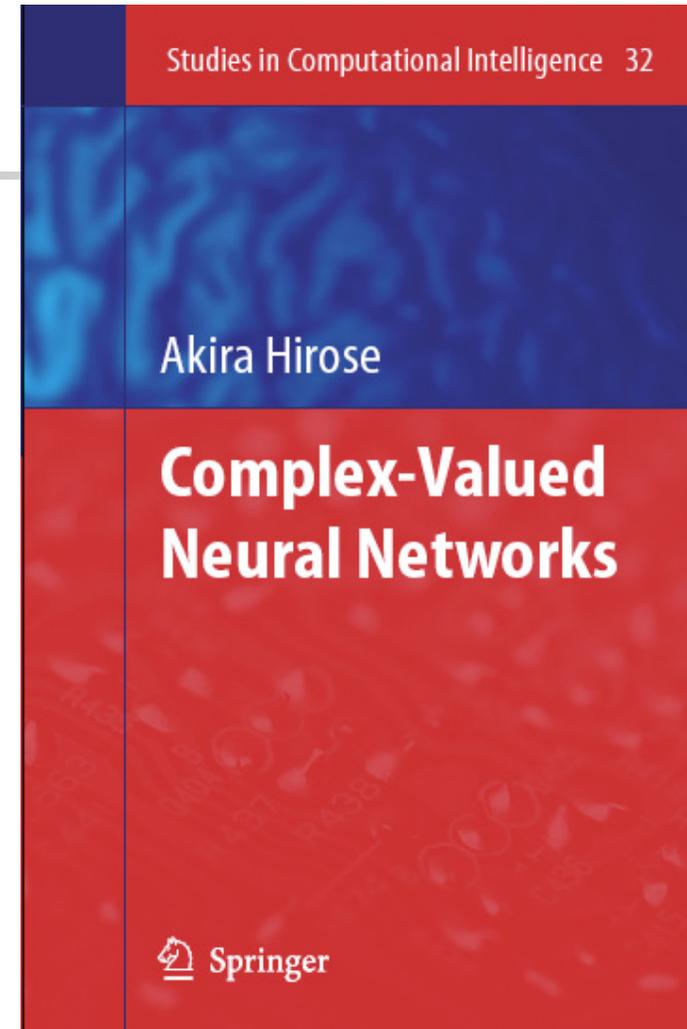
サイエンス社、  
SGCライブラリ  
(2005年3月刊)

InSARデータなどの  
位相を含む信号の  
適応的処理について  
解説しています。



# Complex-valued neural networks

Phase-sensitive  
neural networks  
= *a Super Brain*  
that could be  
brought up  
if we had  
phase-sensitive eyes



Springer-Verlag  
(2006)<sub>32</sub>