

The background of the slide is a composite image. It shows a large satellite in the foreground, likely the Himawari-8 satellite, with its solar panels and various instruments visible. The satellite is positioned above the Earth's horizon, which is curved and shows a view of the planet's surface, including clouds and landmasses. In the upper right corner, a smaller satellite is also visible in orbit. The sky is filled with stars, suggesting a space environment.

# **MOTION TRACKING AND CLOUD HEIGHT ASSIGNMENT METHODS FOR HIMAWARI-8 AMV**

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Meteorological Satellite Center  
Japan Meteorological Agency**

# Contents

A satellite is shown in space, orbiting Earth. The satellite has a large solar panel array and a complex structure with various instruments. The Earth is visible in the lower half of the image, showing clouds and landmasses. The background is a dark space filled with stars.

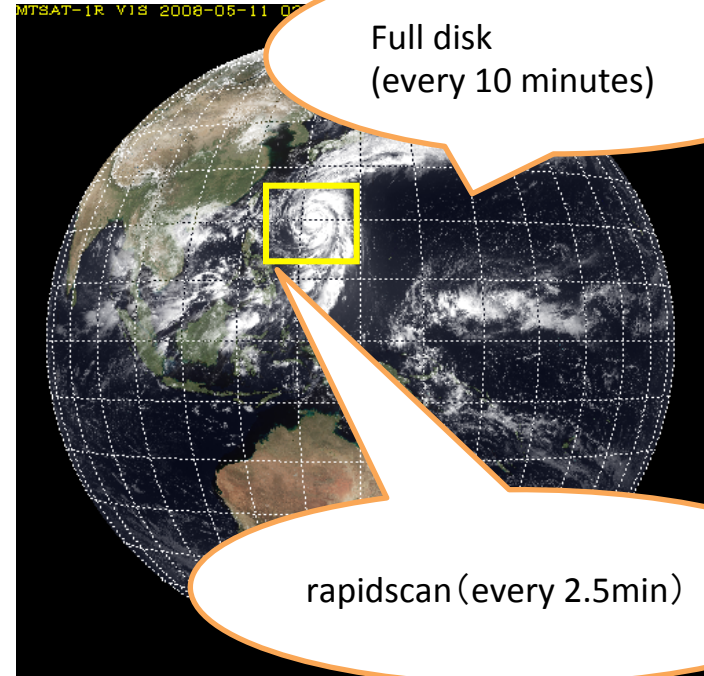
1. Introduction to Advanced Himawari Imager (AHI)
2. Tracking algorithm
3. Cloud height assignment algorithm
4. Result by new algorithm
5. Summary

# Specification of Advanced Himawari Imager (AHI)

## HIMAWARI-8/9

Band	Central Wavelength [ $\mu\text{m}$ ]	Spatial Resolution
1	0.43 - 0.48	1Km
2	0.50 - 0.52	1Km
3	0.63 - 0.66	0.5Km
4	0.85 - 0.87	1Km
5	1.60 - 1.62	2Km
6	2.25 - 2.27	2Km
7	3.74 - 3.96	2Km
8	6.06 - 6.43	2Km
9	6.89 - 7.01	2Km
10	7.26 - 7.43	2Km
11	8.44 - 8.76	2Km
12	9.54 - 9.72	2Km
13	10.3 - 10.6	2Km
14	11.1- 11.3	2Km
15	12.2 - 12.5	2Km
16	13.2 - 13.4	2Km

RGB →



Band	Central Wavelength [ $\mu\text{m}$ ]	Spatial Resolution
1	0.55 - 0.90	1Km
2	3.50 - 4.00	4Km
3	6.50- 7.00	4Km
4	10.3 - 11.3	4Km
5	11.5 - 12.5	4Km

## MTSAT-1R/2

# motivation to innovate new tracking and height assignment method

- Effective use of increased temporal and spatial information
  - = higher resolution AMV requested
  - = target box size should be minified for avoiding overlapping
  - = **tracking accuracy debased due to lack of target feature information**
  
- Effective use of increased bands information
  - = improvement to CTH estimation
  - = simultaneous use of multiple bands needed
  - = **JMA has no methods better than IR-WV intercept and EBBT for CTH estimation**

# Contents

2. Tracking algorithm

3. New algorithm

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# Cross-Correlation Tracking for MTSAT AMV

Searching Backward

Target Area

Searching forward

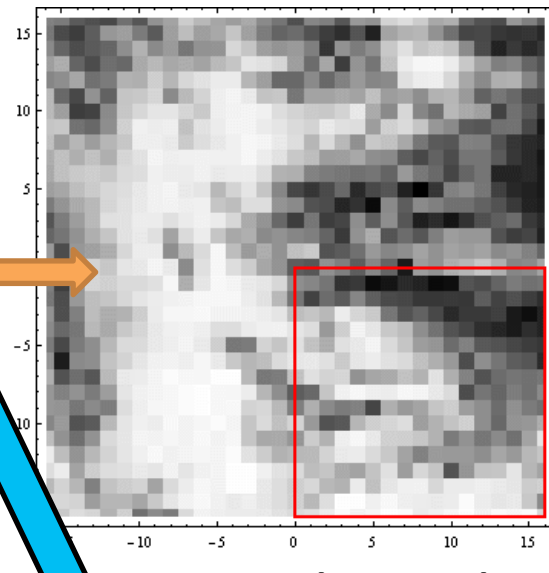
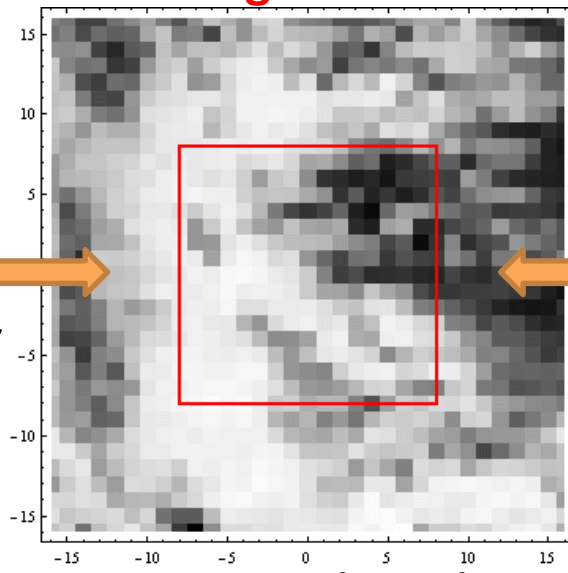
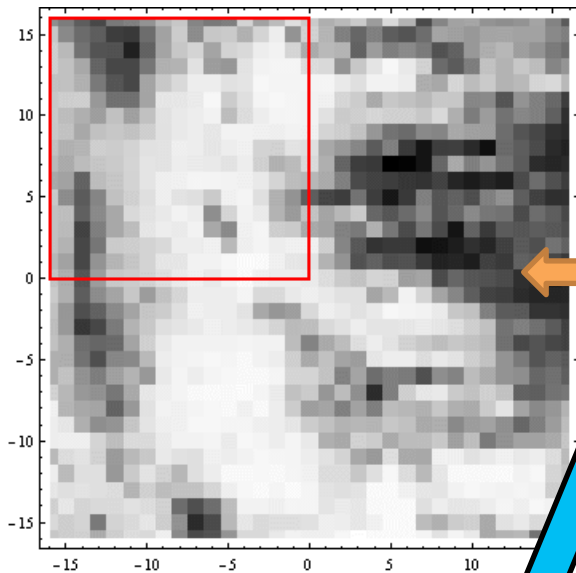


Image A ( $T = t_0 - 1$ )

Image B ( $T = t_0$ )

Image C ( $T = t_0 + 1$ )

Correlation surface  
of backward motion

Correlation surface  
of forward motion

backward motion vector  
used for consistency check

forward motion vector  
final output vector

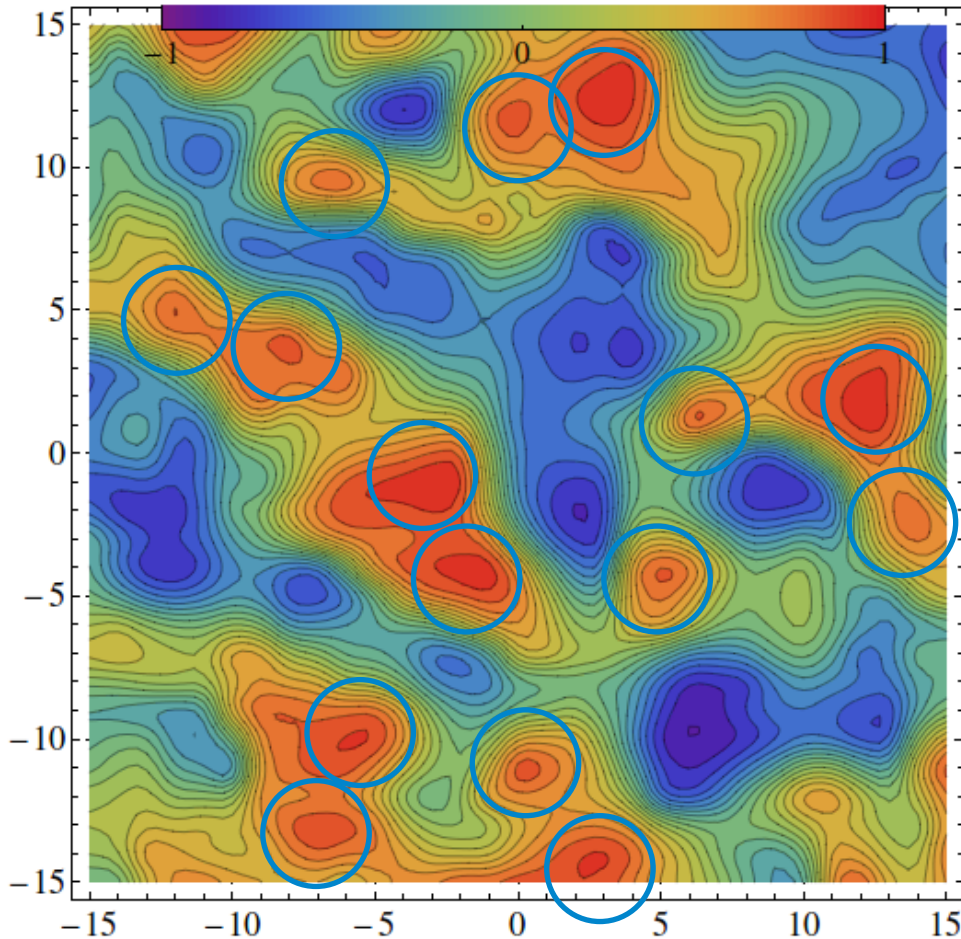
# Correlation Surface from small target

box

赤外画像追跡過程

Target Size(pixel):{ 5} lon:132.135 lat:26.7109

SPEED(backward):13.4017m/s SPEED(forward):13.7073m/s(BtoC)

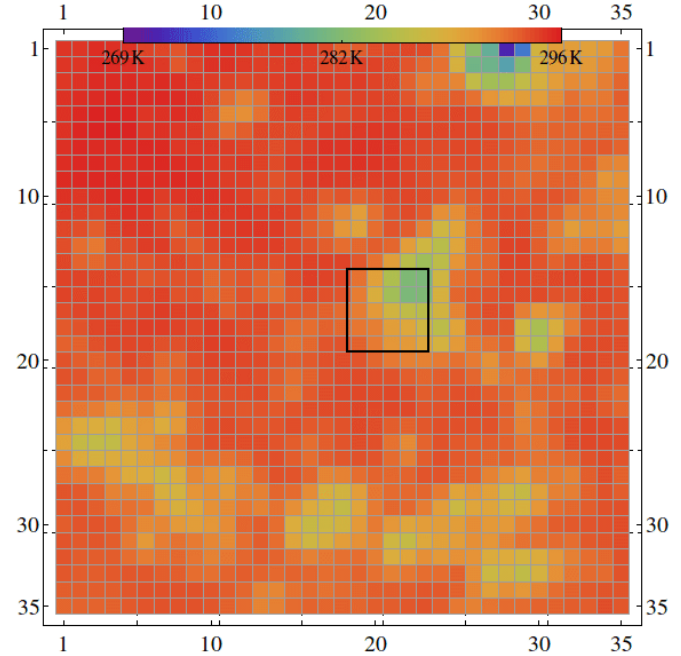


correlation surface with small target box  
(5x5 pixels)

赤外画像追跡過程

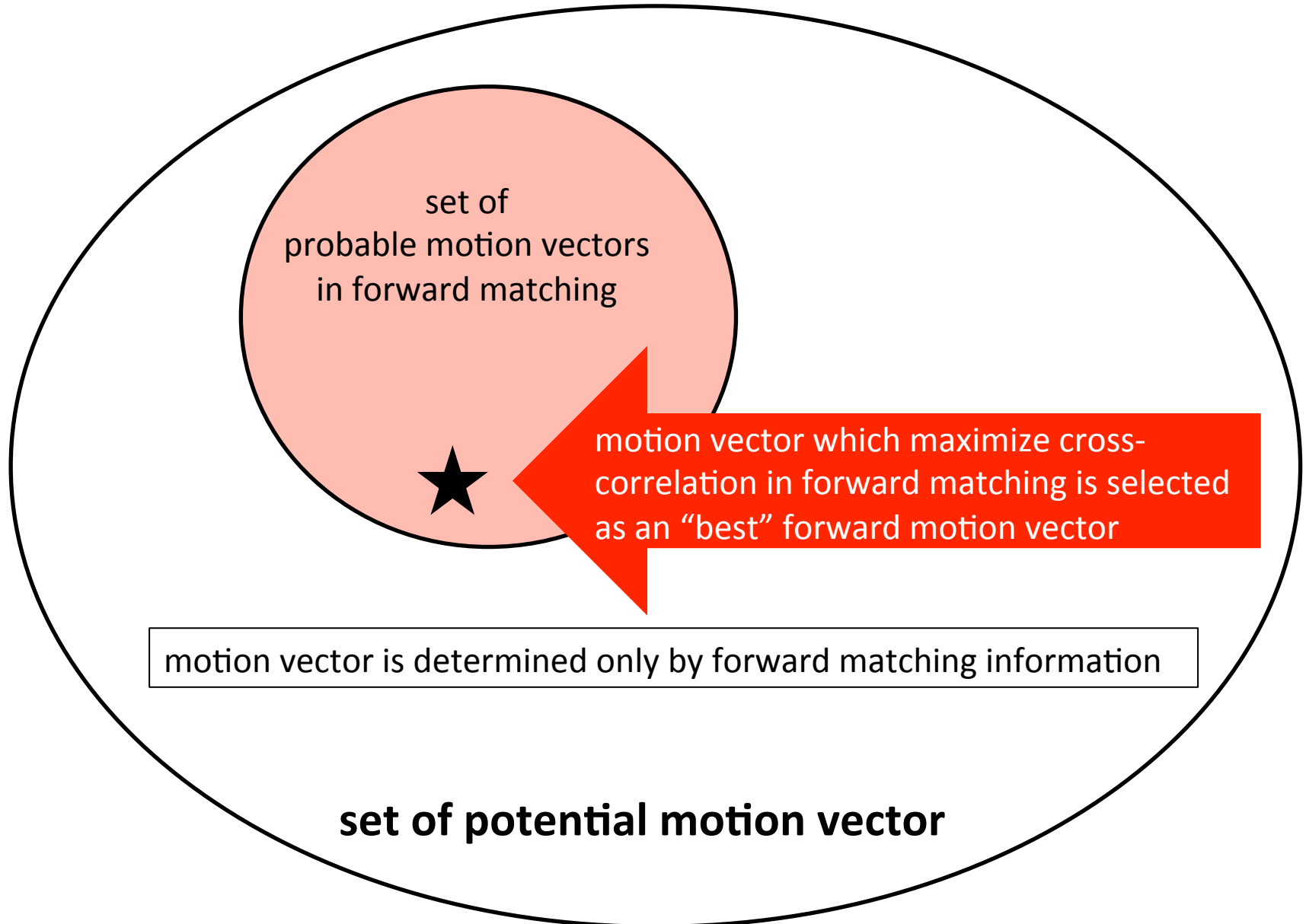
Target Size(pixel):5 lon:132.135 lat:26.7109

SPEED(backward):14.0451m/s SPEED(forward):12.7604m/s



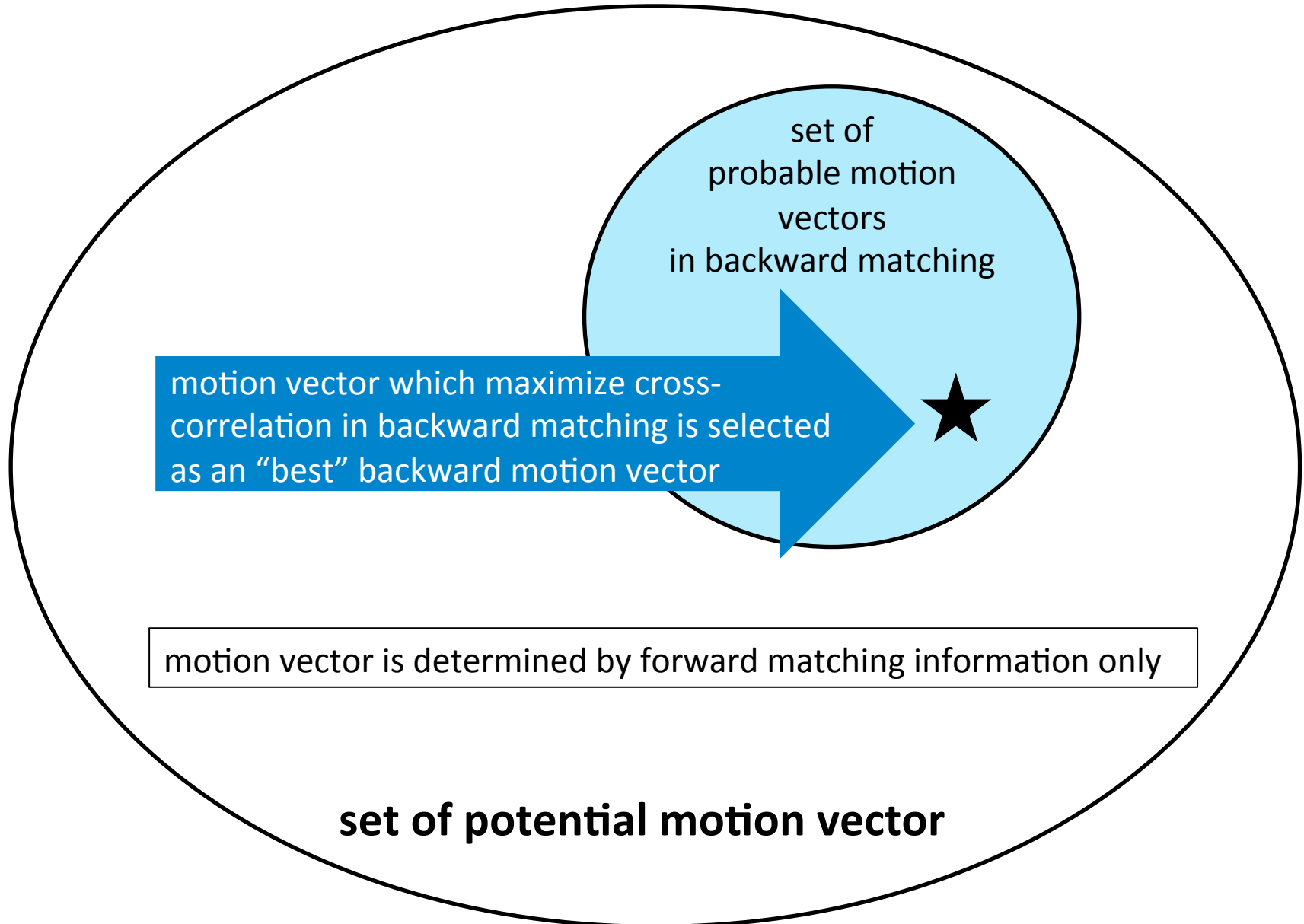
many peaks = many similar patterns ->  
Information included in target feature is  
not enough to determine wind vector  
accurately.

# motion vector estimation from forward matching

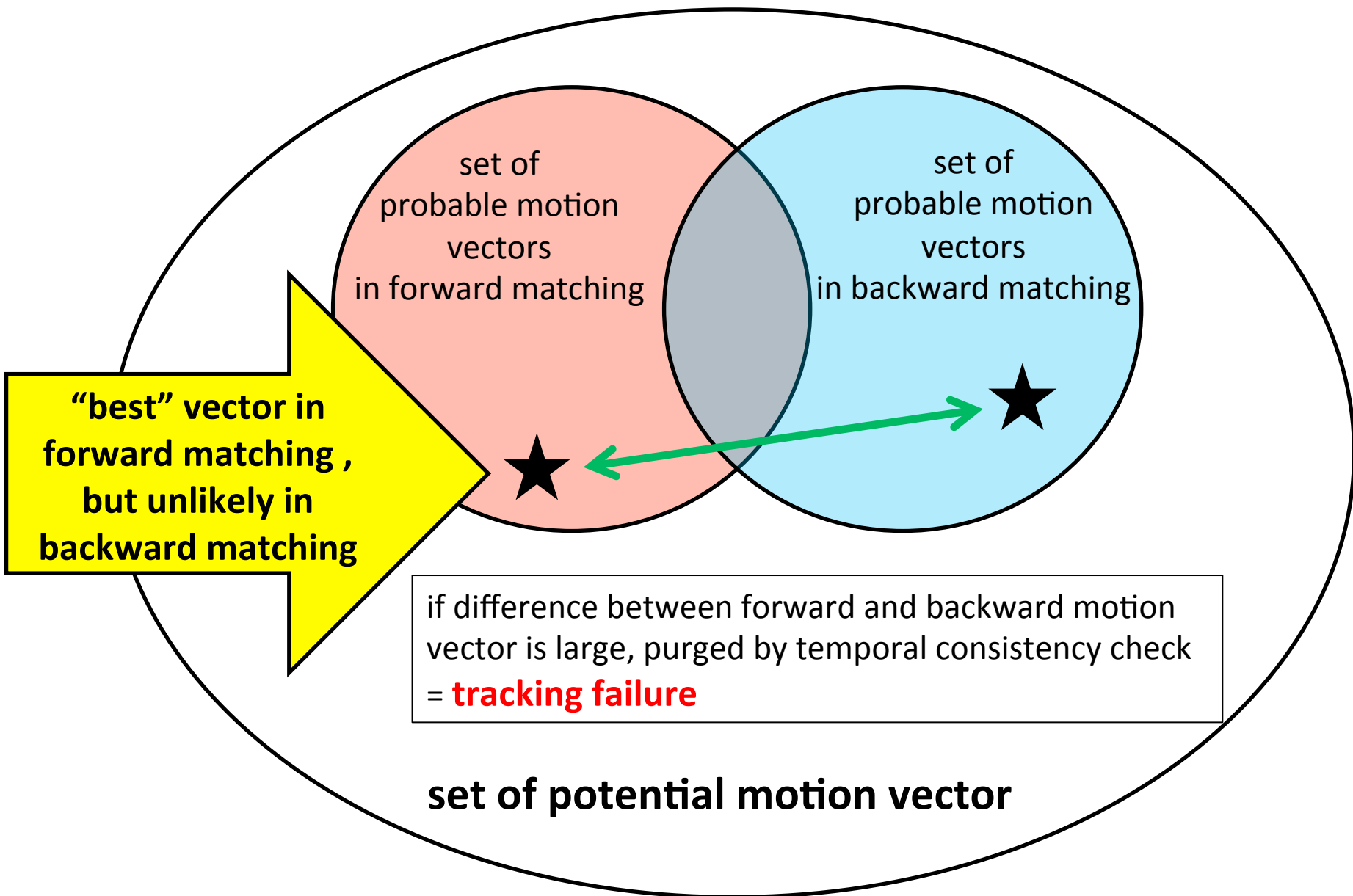




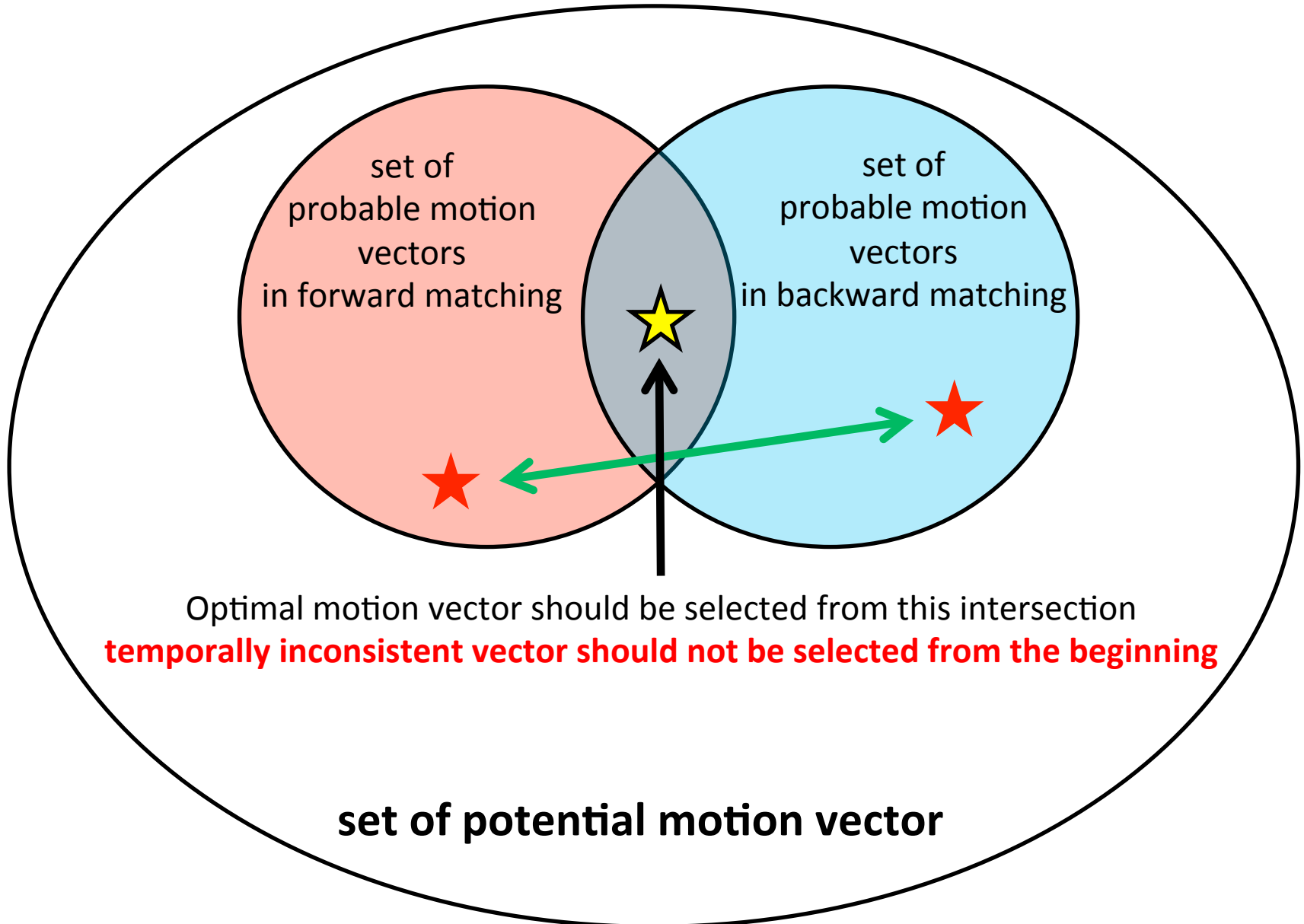
# motion vector estimation from backward matching



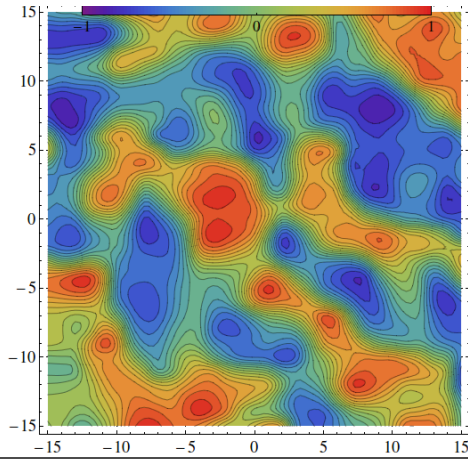
# Simultaneous use of matching information



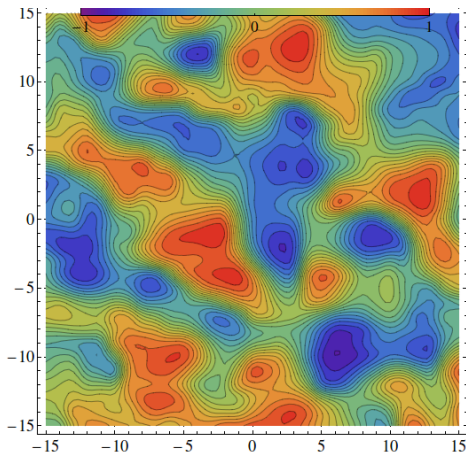
# Simultaneous use of matching information



# Maximum Likelihood Estimation Approach for small Scale AMV



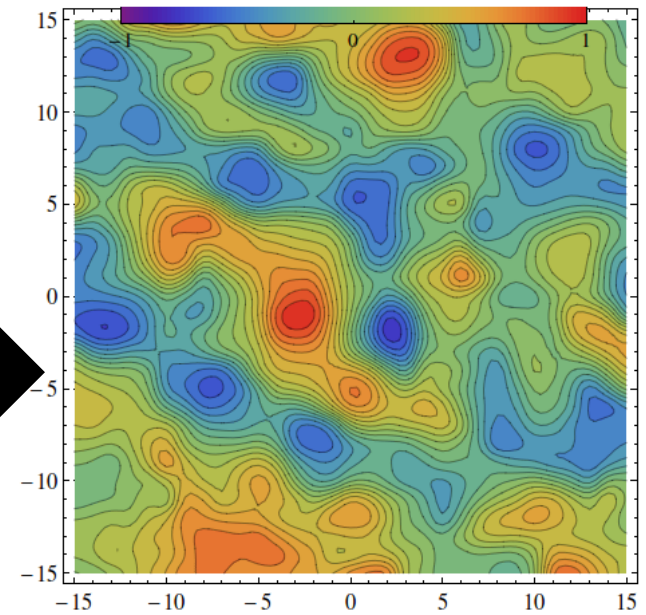
auxiliary information  
Correlation surface from backward motion



prior information  
Correlation surface from forward motion

1. To equate cross-correlation with **log likelihood function**
2. To compute average of two **log likelihood function surface** from forward and backward matching
3. To search vector which maximize the **averaged log likelihood function**

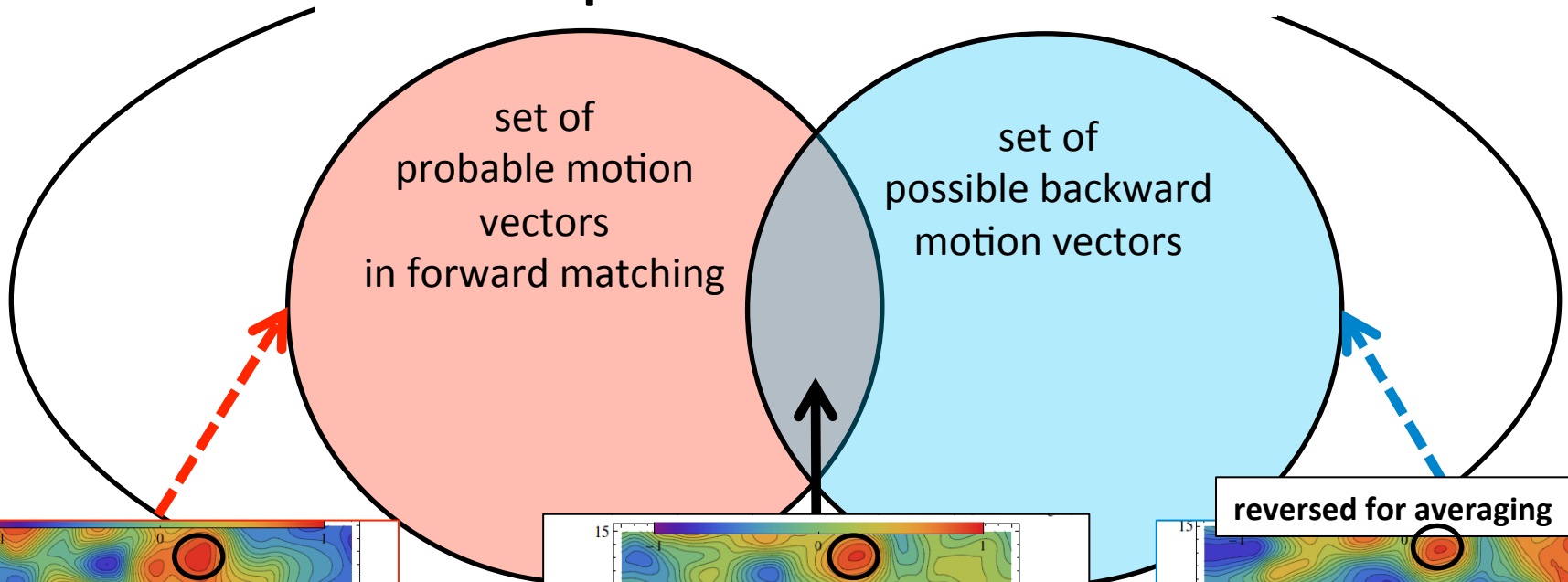
**probabilistic inference**  
to regard correlation  
surface as log likelihood  
function



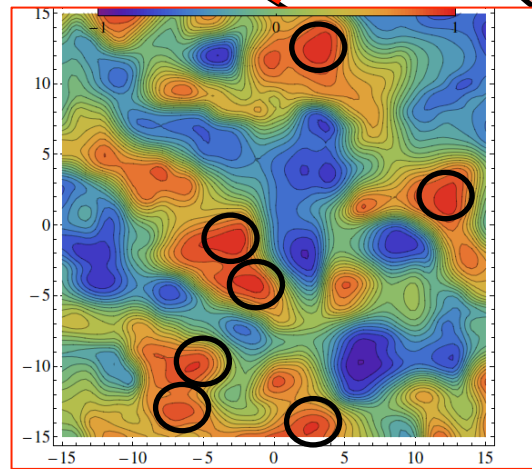
posterior information  
averaged correlation surfaces

# how to find temporally consistent vector

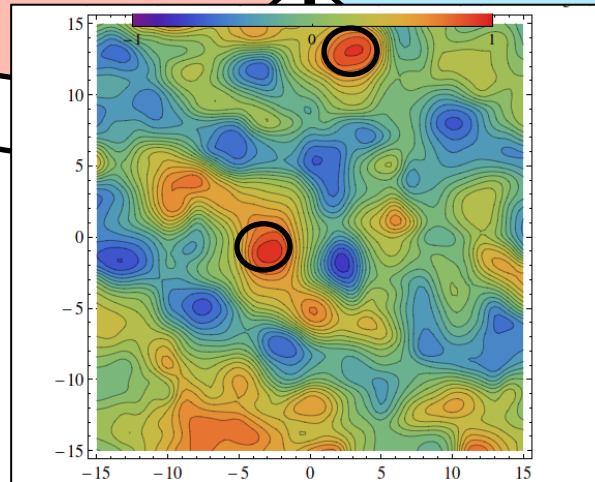
## set of potential motion vector



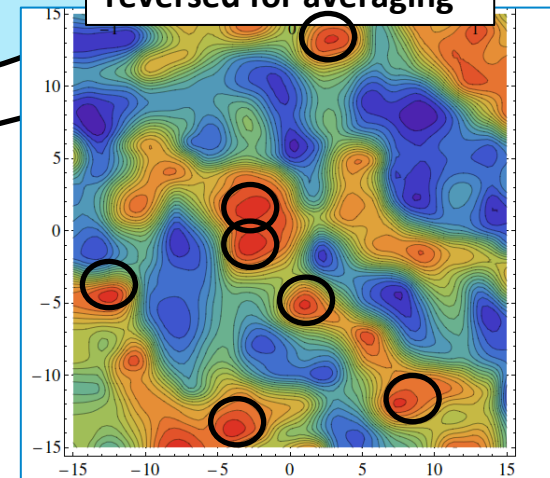
reversed for averaging



**prior information**  
correlation surface from  
forward matching



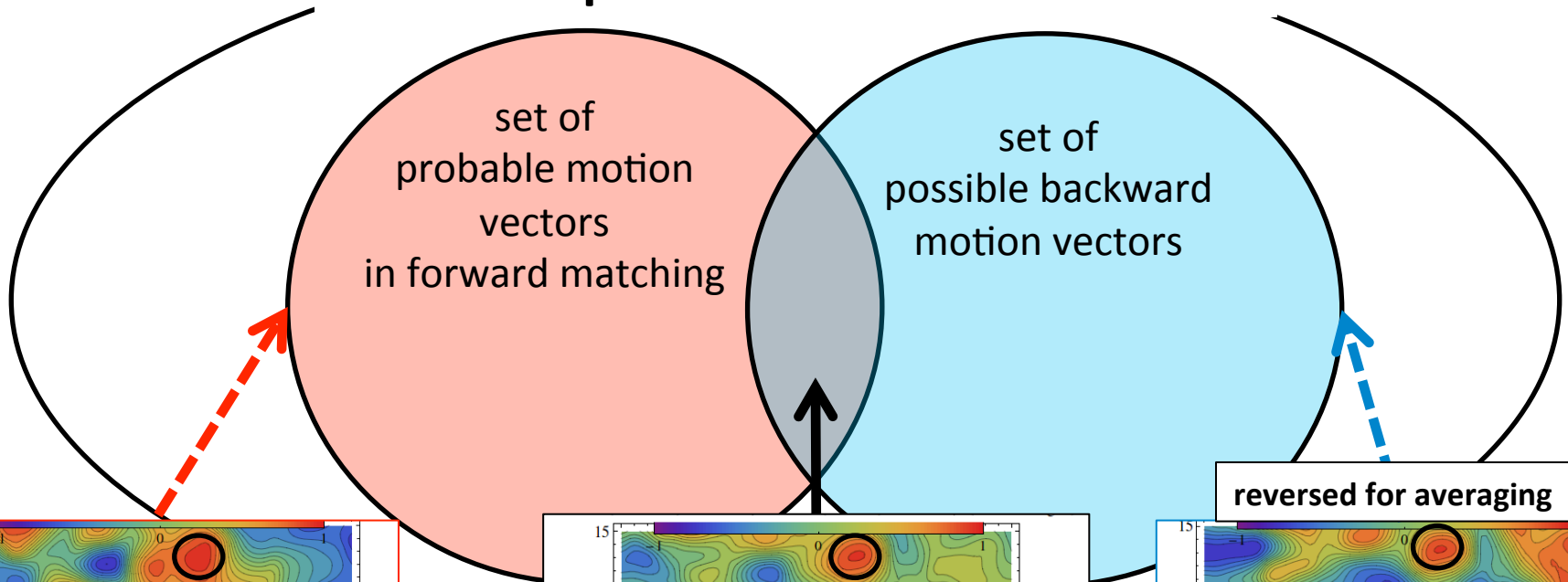
**posterior information**  
averaged correlation surfaces



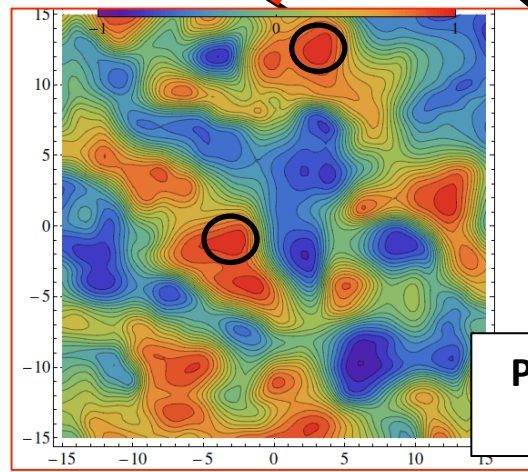
**auxiliary information**  
correlation surface from  
backward matching

# how to search temporally consistent vector

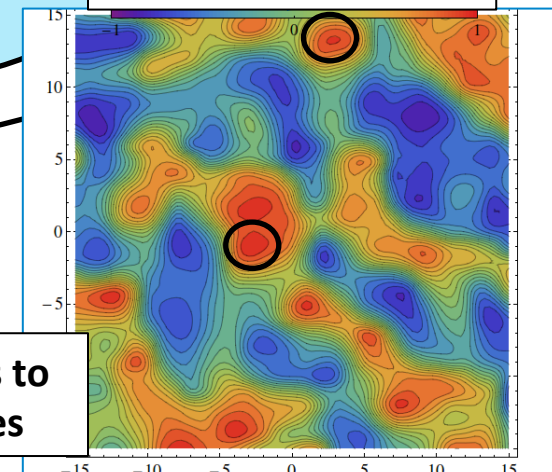
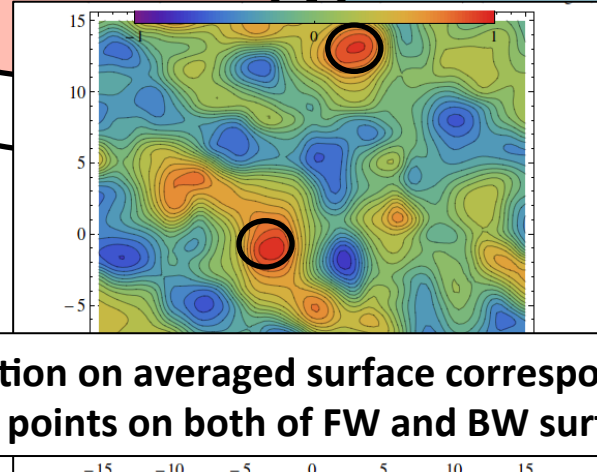
## set of potential motion vector



reversed for averaging



Peak position on averaged surface corresponds to large CC points on both of FW and BW surfaces



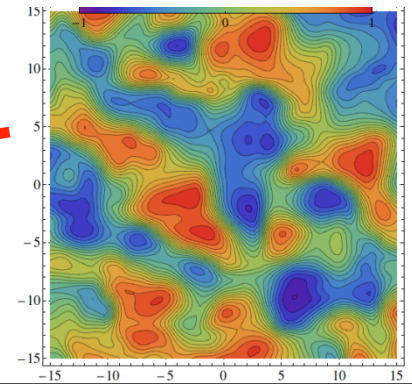
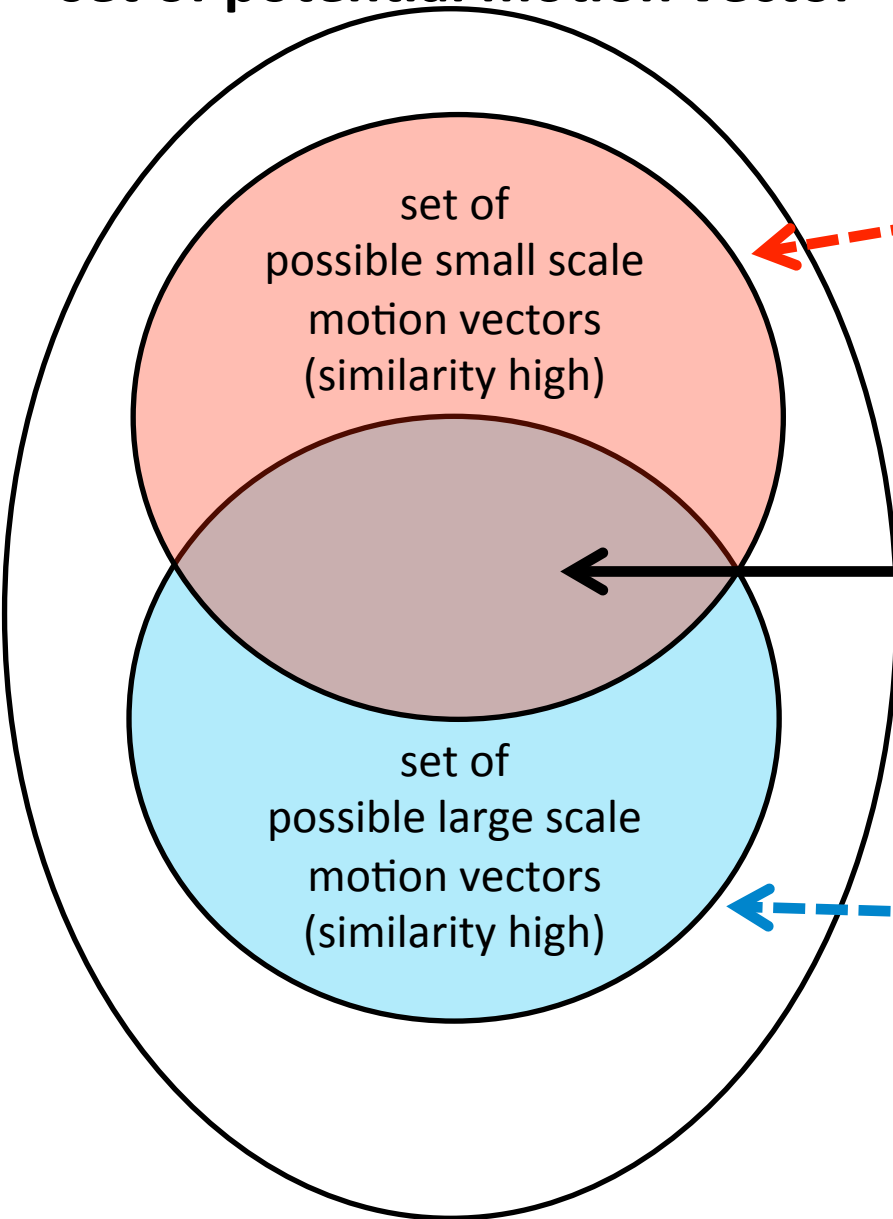
**prior information**  
correlation surface from  
forward matching

**posterior information**  
averaged correlation surfaces

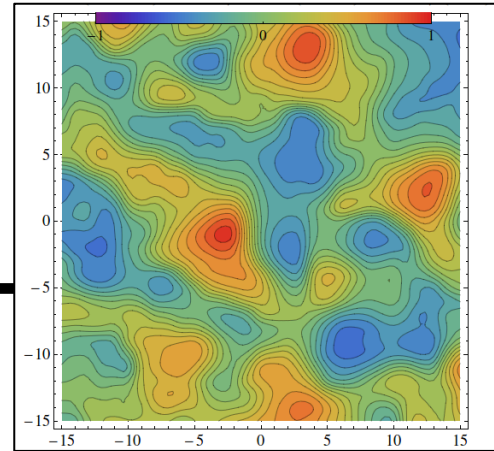
**auxiliary information**  
correlation surface from  
backward matching

# Application to spatially consistent vector

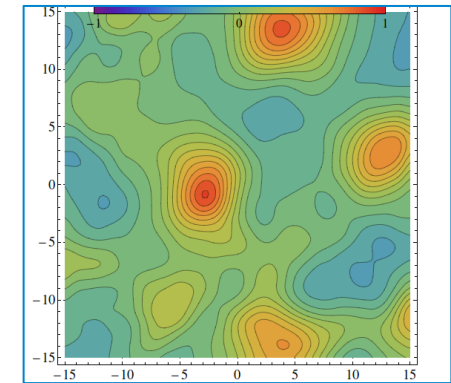
set of potential motion vector



**prior information**  
correlation surface  
from small target box



**posterior information**  
averaged correlation surfaces



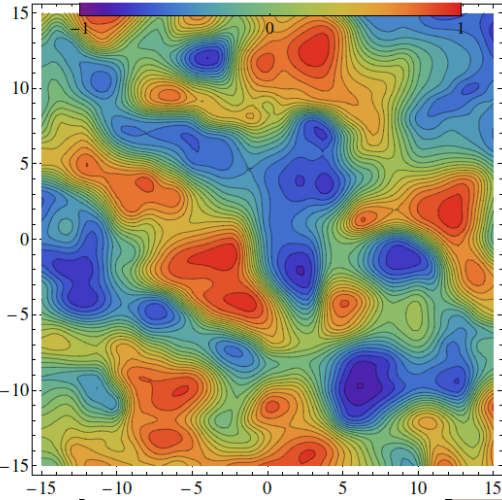
**auxiliary information**  
correlation surface  
from large target box

# Likelihood estimation by temporal and spatial information

赤外面像追跡過程

Target Size(pixel):{5} lon:132.135 lat:26.7109

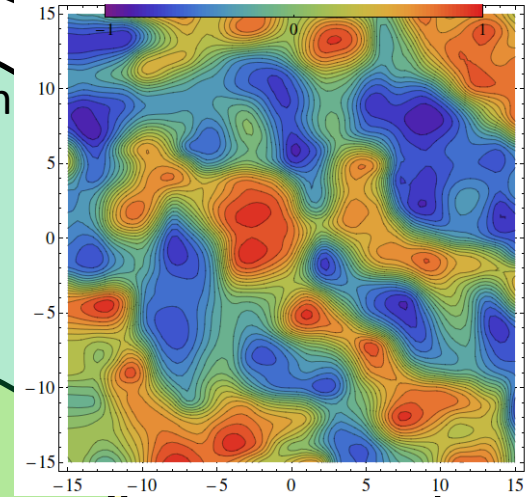
SPEED(backward):13.4017m/s SPEED(forward):13.7073m/s(BtoC)



赤外面像追跡過程

Target Size(pixel):{5} lon:132.135 lat:26.7109

SPEED(backward):13.4017m/s SPEED(forward):13.7073m/s(BtoA)



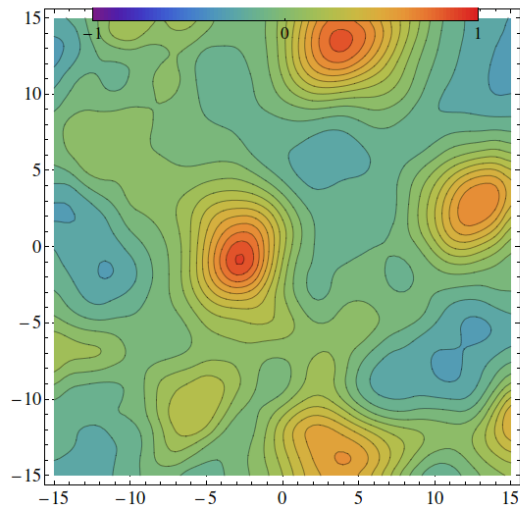
forward motion  
small scale

backward motion  
small scale

赤外面像追跡過程

Target Size(pixel):{15} lon:132.135 lat:26.7109

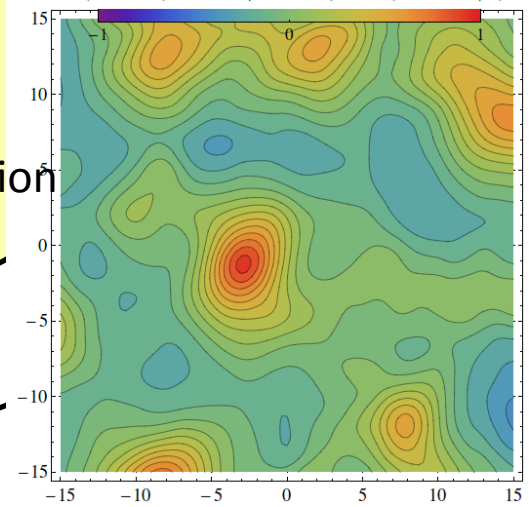
SPEED(backward):14.8074m/s SPEED(forward):12.1142m/s(BtoC)



赤外面像追跡過程

Target Size(pixel):{15} lon:132.135 lat:26.7109

SPEED(backward):14.8074m/s SPEED(forward):12.1142m/s(BtoA)

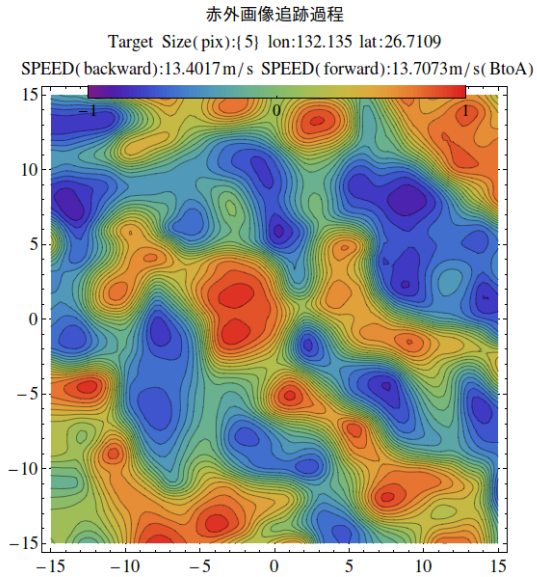
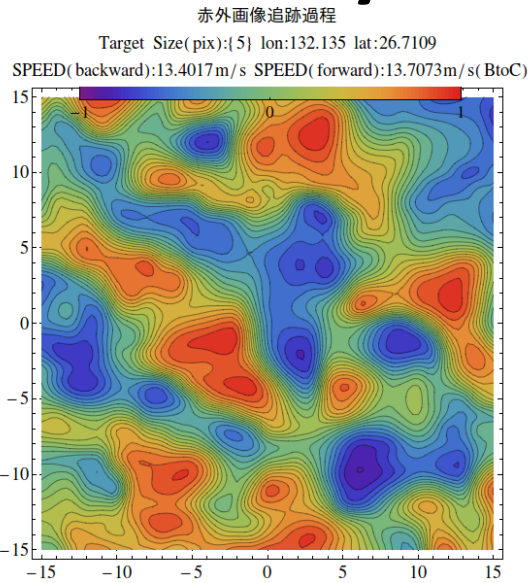


forward motion  
large scale

backward motion  
large scale

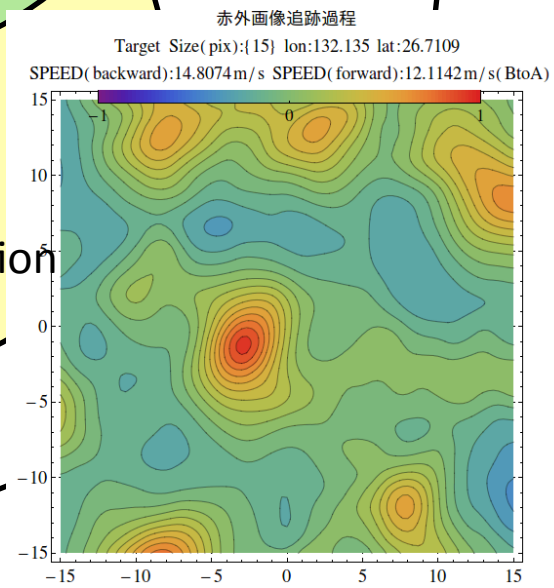
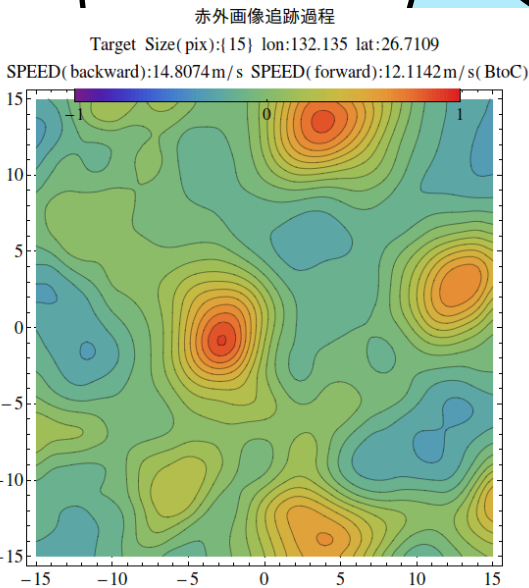
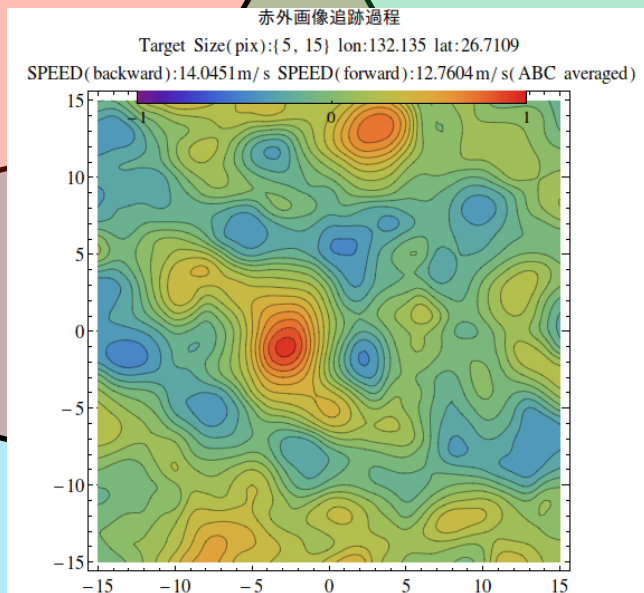


# Likelihood estimation by temporal and spatial information



forward motion  
small scale

backward motion  
small scale

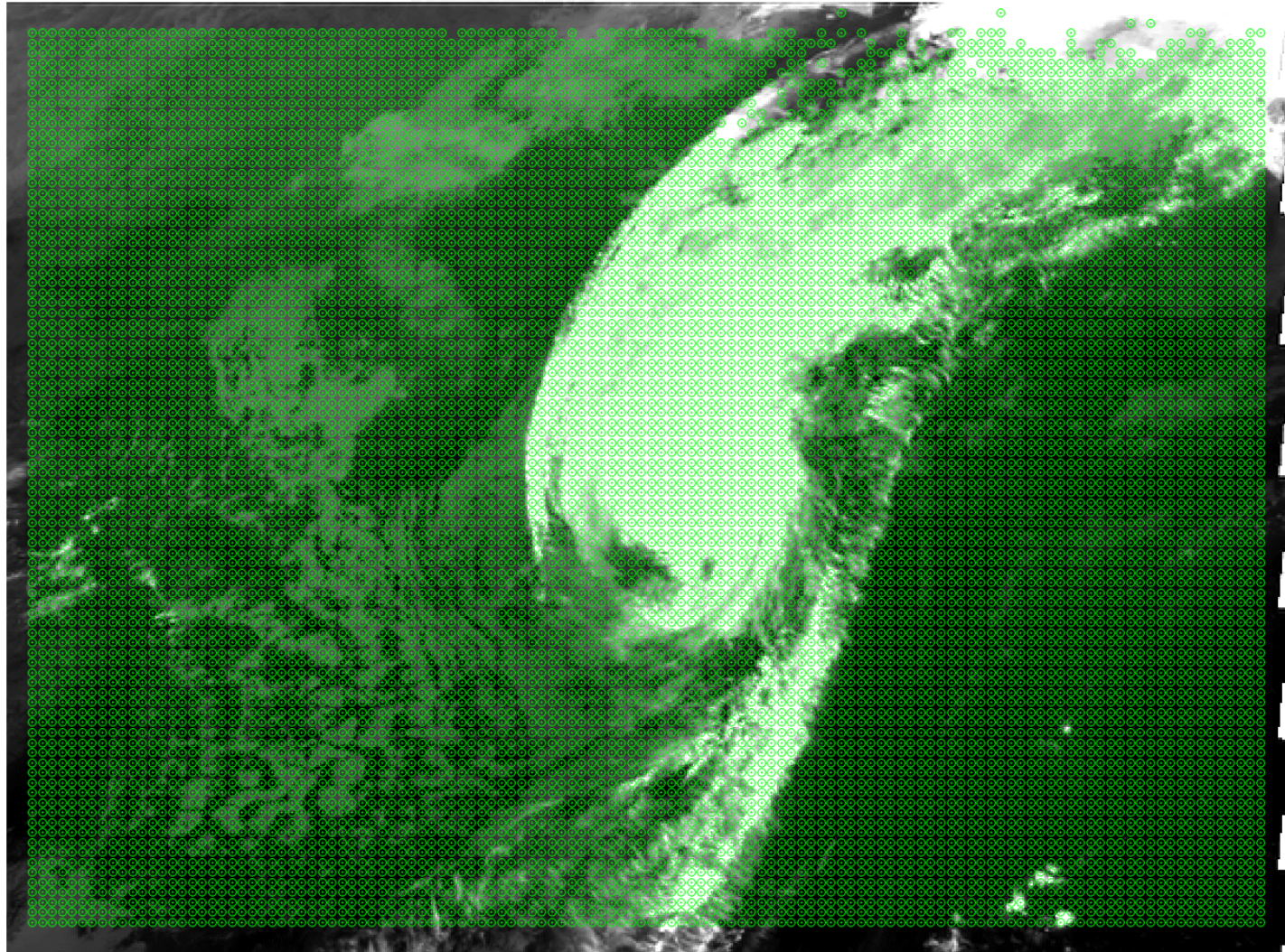


forward motion  
large scale

backward motion  
large scale

# Target motion trajectories with small target box

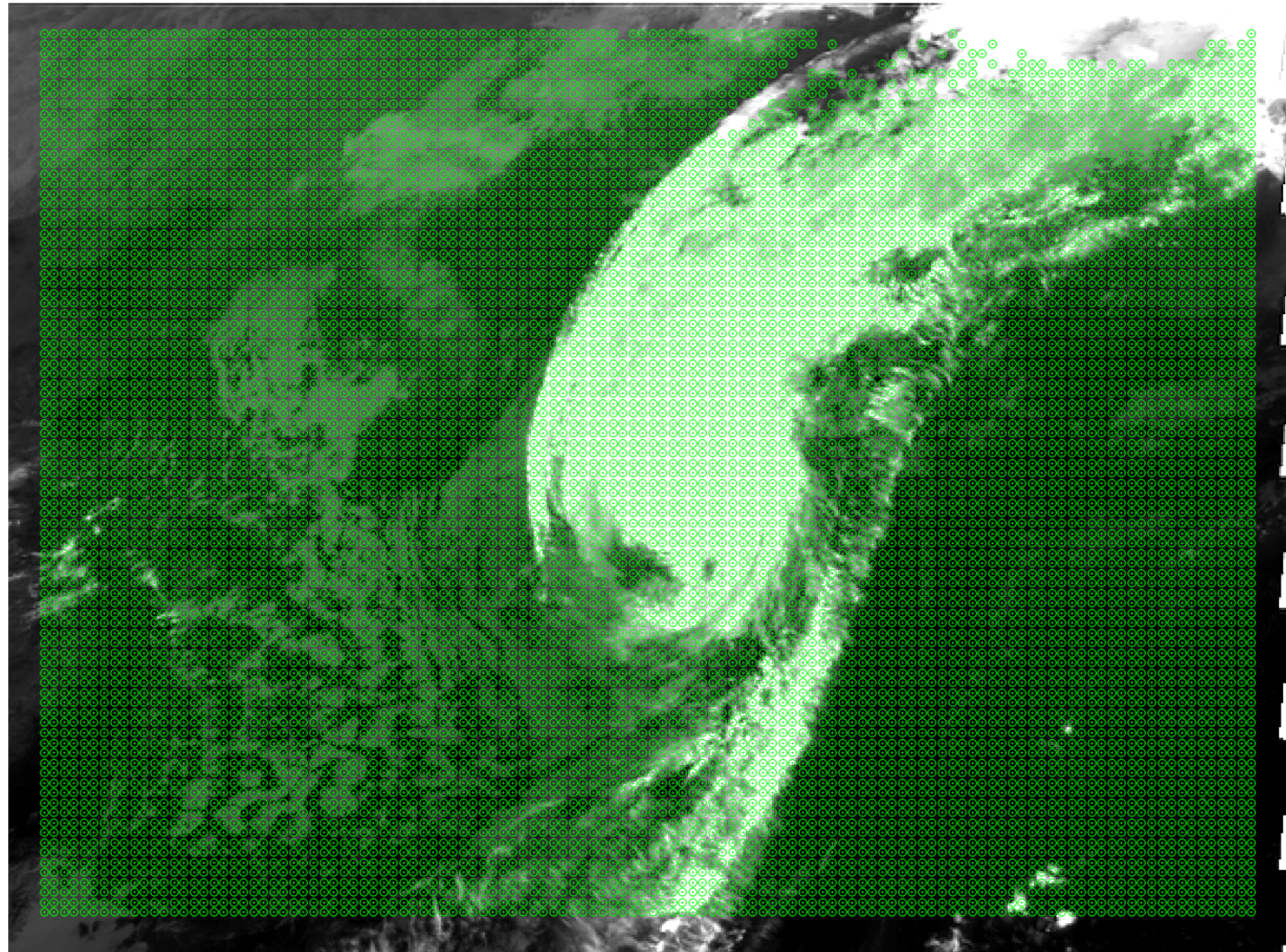
sat:MTSAT-1R  
Channel:IR10.8  
time interval:5min  
target size:5x5pix  
tracking: normal



Green: natural  
Red: noisy track

# comparison to rapid scan tracking methods by checking cloud trajectory

sat: MTSAT-1R  
Channel: IR10.8  
time interval:  
5min  
target size:  
5x5pix, 15x15pix  
tracking: time  
and space MLE



Green: natural  
Red: noisy track

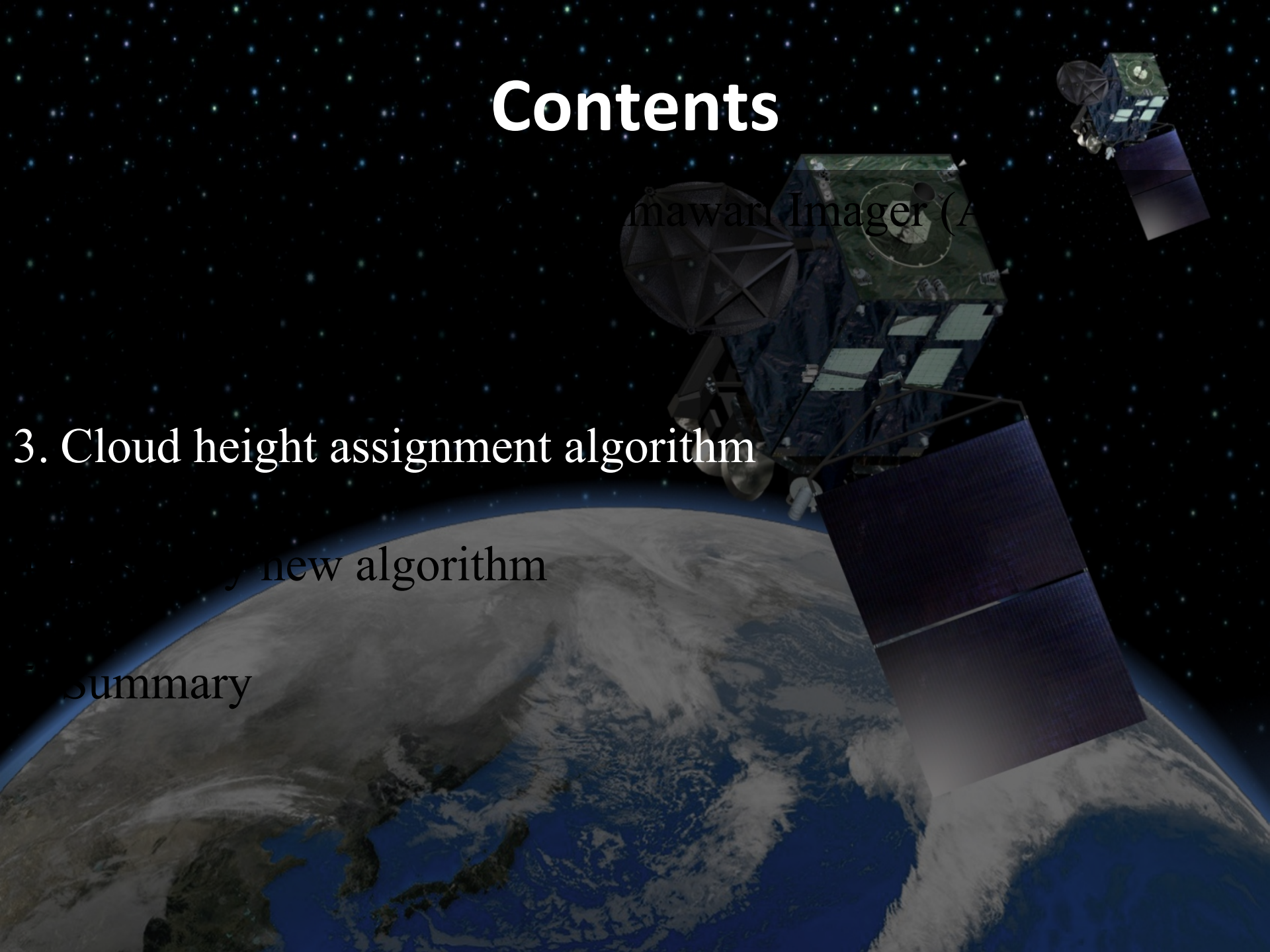
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Advanced Imager (A

## 3. Cloud height assignment algorithm

new algorithm

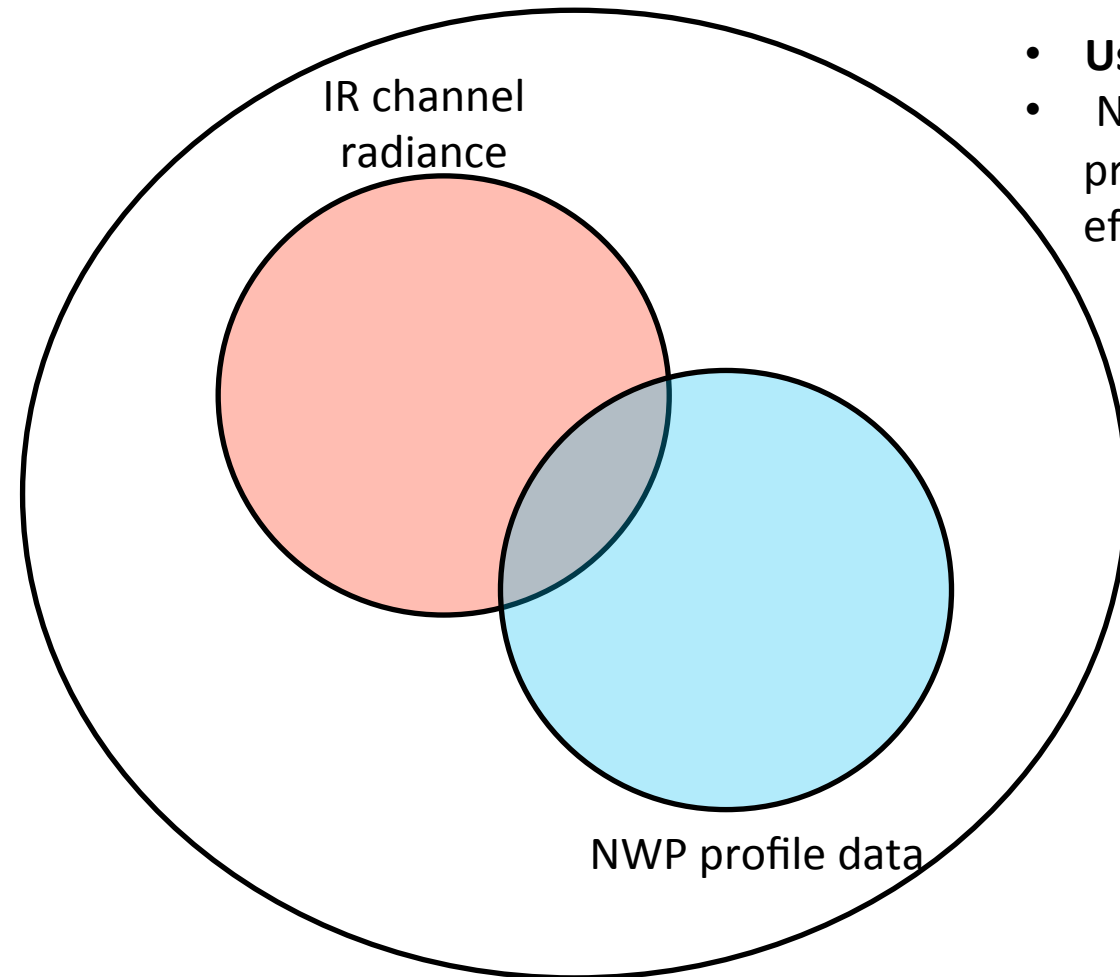
summary



# simultaneous use of radiance and motion vector for cloud height estimation

## EBBT method

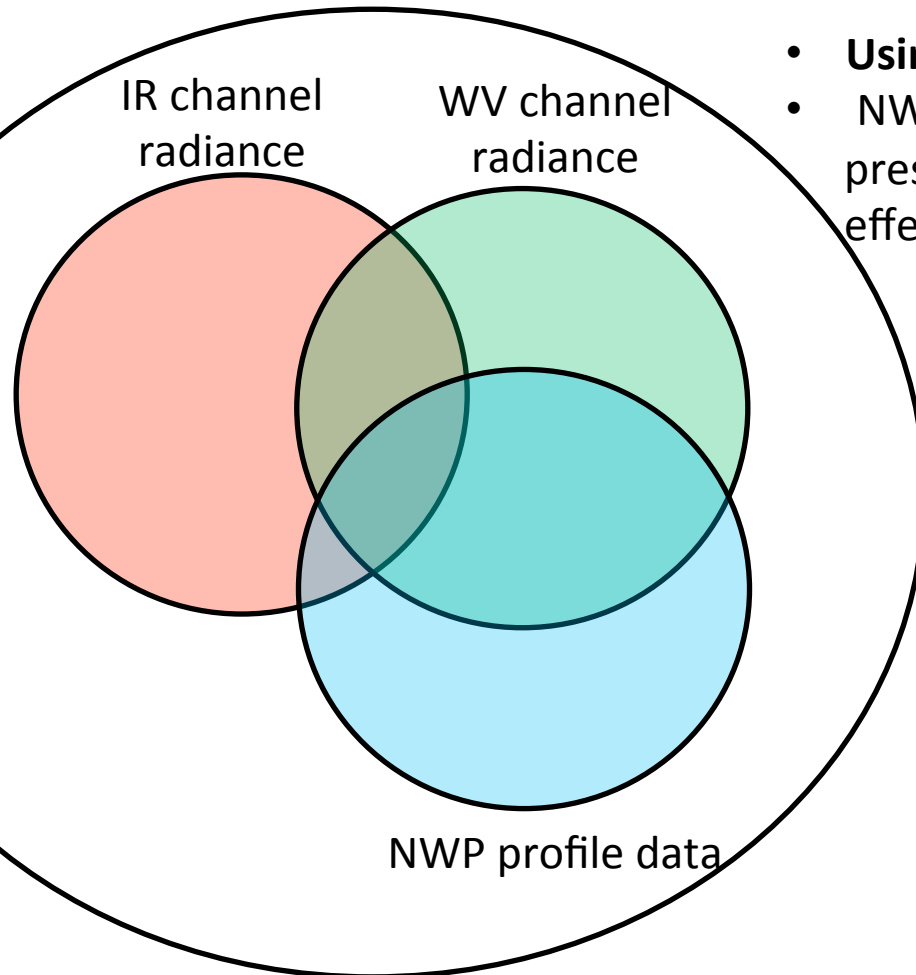
- **Using single band radiance information**
- NWP profile is needed for conversion to pressure and considering atmospheric effects to observed radiance



# simultaneous use of radiance and motion vector for cloud height estimation

## IR-WV intercept method

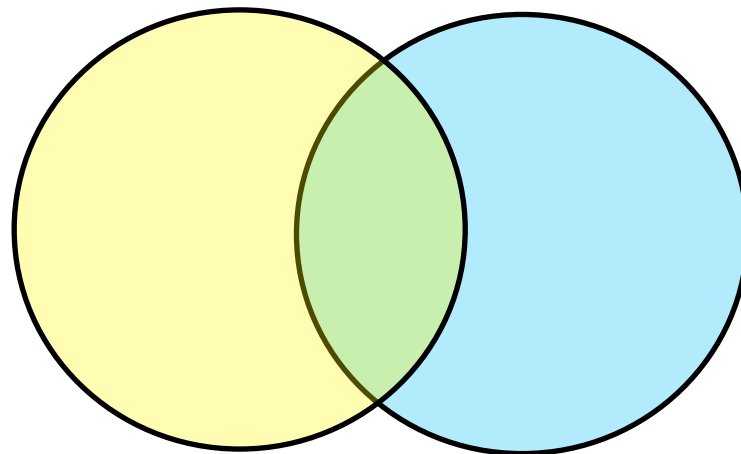
- **Using IR-WV bands radiance information**
- NWP profile is needed for conversion to pressure and considering atmospheric effects to observed radiance



# simultaneous use of radiance and motion vector for cloud height estimation

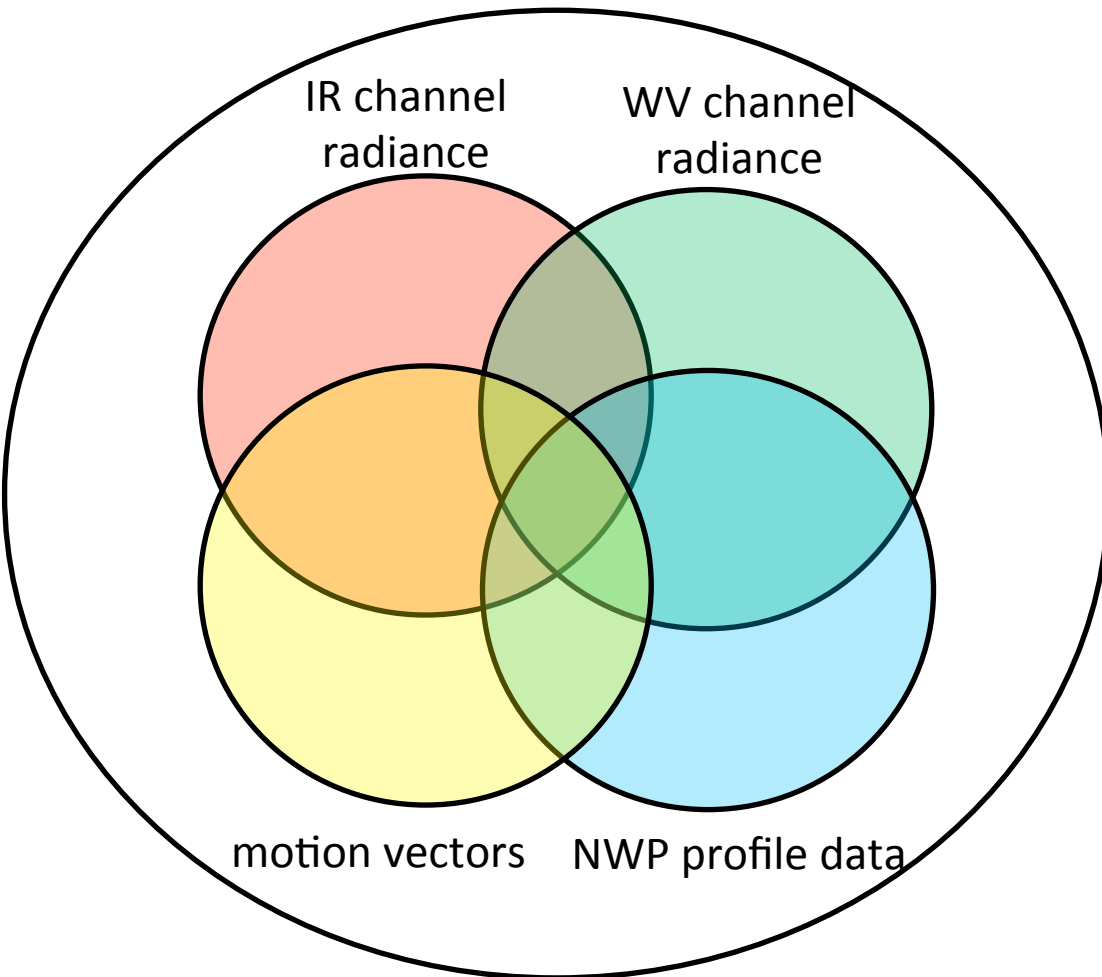
## Best fit level method

- Using motion vector information
- NWP profile is needed for minimizing difference between AMV and NWP wind



motion vectors    NWP profile data

# simultaneous use of radiance and motion vector for cloud height estimation



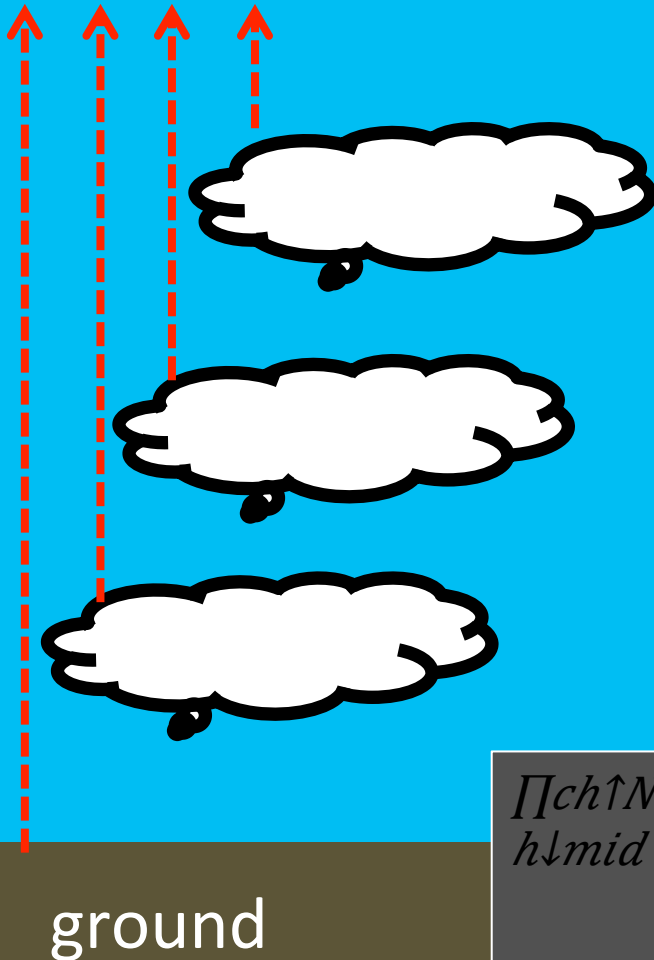
## Maximum Likelihood Estimation for cloud height assignment

- Usable information for height assignment are radiance, motion vector and NWP profile data
- Likelihood function to be maximized must be defined (no convenient information such as correlation surface)
- Optimization algorithm required for searching optimal cloud height



# Forward model

- Radiance rationing of from high, middle, low and ground layer
- 10.5, 12.0 and 6.7 micro meter imagery are used
- Averaged radiance in target box (5x5) is used



$$R(\rho_{\downarrow high}, \rho_{\downarrow mid}, \rho_{\downarrow low}, h_{\downarrow high}, h_{\downarrow mid}, h_{\downarrow low}) =$$

$$\rho_{\downarrow high} \varepsilon_{\downarrow high} (ch) Rad(h_{\downarrow high}) +$$

$$\rho_{\downarrow mid} \varepsilon_{\downarrow mid} (ch) Rad(h_{\downarrow mid})$$

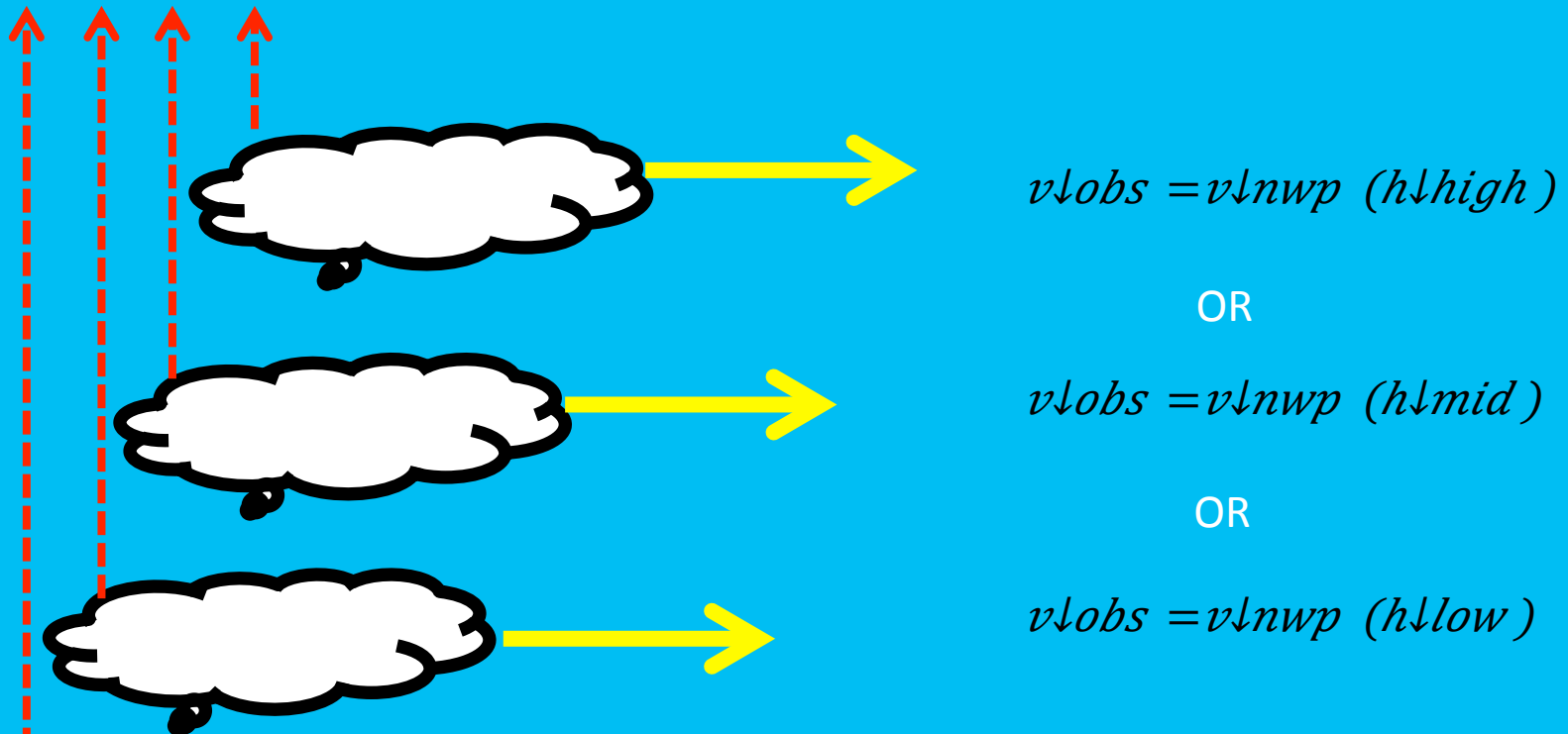
$$+ \rho_{\downarrow low} \varepsilon_{\downarrow low} (ch) Rad(h_{\downarrow low})$$

$$+ (1 - (\rho_{\downarrow high} + \rho_{\downarrow mid} + \rho_{\downarrow low})) \varepsilon_{\downarrow ground} (ch) Rad(\text{ground})$$

$$\prod_{ch \uparrow N} e^{\uparrow - (R_{\downarrow obs} - R(\rho_{\downarrow high}, \rho_{\downarrow mid}, \rho_{\downarrow low}, h_{\downarrow high}, h_{\downarrow mid}, h_{\downarrow low}))^2 / 2 \sigma^2}$$

# usability of motion vectors for cloud height estimation

- wind vectors derived from VIS, IR and WV imagery are available
- Information of visible imagery is also available for height assignment by using VIS wind vector



$$v_{\text{obs}} = v_{\text{nwp}} (h_{\text{high}})$$

OR

$$v_{\text{obs}} = v_{\text{nwp}} (h_{\text{mid}})$$

OR

$$v_{\text{obs}} = v_{\text{nwp}} (h_{\text{low}})$$

$$\prod_{ch \uparrow N \downarrow ch} (1 - \prod_{\text{layer} \uparrow N \downarrow \text{layer}} (1 - e^{-\frac{(v_{\text{obs}} - v_{\text{nwp}}(h_{\text{layer}}))^2}{2 \sigma^2}}))$$

ground

# Optimization Strategy

- Not to minimize cost function but to maximize likelihood function which is set to 0-1 for handling not only “equation” but also “inequality” and fuzzy inference theory.

**Likelihood function maximization**

**(available for simultaneous equation and inequality system and propositional logic)**

**Limit of cost function minimization (available for only simultaneous equation system)**

.EQ.	$f(x)=y+\sigma$	$\rightarrow$	$L(f(x)=y+\sigma) = \text{Exp}(-(f(x)-y)^2 / 2 \sigma^2)$
------	-----------------	---------------	---

.AND.	$P \text{ and } Q$	$\rightarrow$	$L(P) \times L(Q)$
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.GT.	$f(x) > y + \sigma$	$\rightarrow$	$L(f(x) > y + \sigma) = 1/2 (1 + \text{Erf}((f(x) - y) / \sqrt{2} \sigma))$
------	---------------------	---------------	---

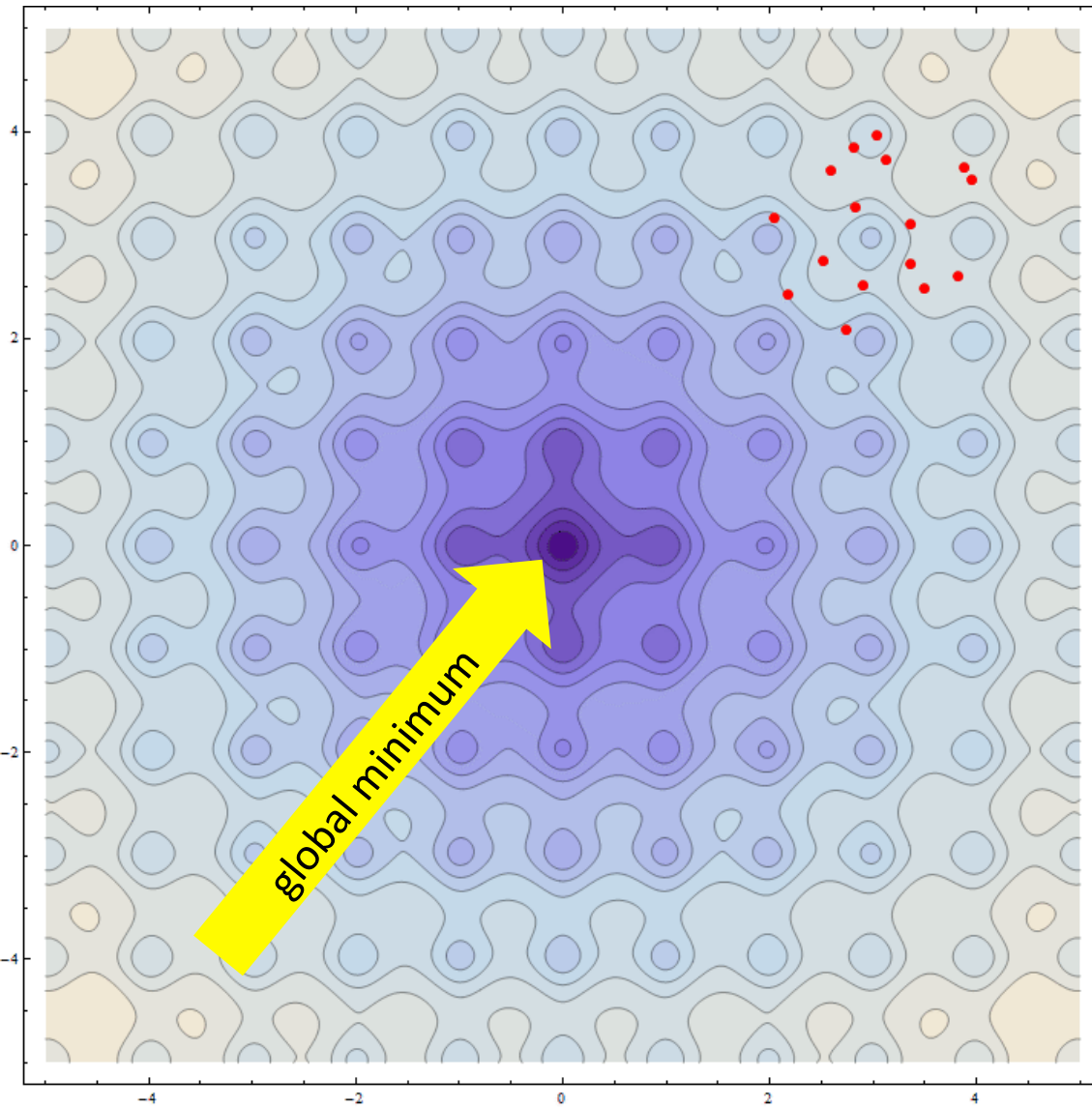
.NOT.	$\text{not } P$	$\rightarrow$	$1 - L(P)$
-------	-----------------	---------------	------------

.OR.	$P \text{ or } Q = \text{not}(\text{not}(P) \text{ and } \text{not}(Q))$	$\rightarrow$	$1 - (1 - L(P))(1 - L(Q))$
------	--	---------------	----------------------------

IF THEN	$\text{if } P \text{ then } Q = \text{not}(P \text{ and } \text{not}(Q))$	$\rightarrow$	$1 - L(P)(1 - L(Q))$
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**In real computation, Cauchy distribution (and its CDF) used instead of normal distribution for searching optimal latent variables**

# Optimization method - Differential Evolution method



Test function : Ackley's function

$$f(x, y) = -20 \exp \left( -0.2 \sqrt{0.5 (x^2 + y^2)} \right) - \exp (0.5 (\cos (2\pi x) + \cos (2\pi y))) + 20 + e.$$

Too many local minima  
⇒ difficult to find optimal  
parameter by methods using  
derivative function

initial points are changed by  
iteration of

- 1. mutation evolution**
  - 2. crossover**
  - 3. survival of the fit**
- operations .

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# AMV derivation experiment using new tracking and HA technique

**Satellite : MTSAT-2**

**Period : January 2013 (winter)**

**RTN**

**Target selection : MTSAT operational method**

**Tracking : Cross-Correlation**

**Height assign : operational method**

## **TEST1**

**Target selection : MTSAT operational method**

**Tracking : Cross-Correlation, MLE using 5x5 and 15x15 pixels**

**Height assign : MLE height estimation using only radiance information**

## **TEST2**

**Target selection : MTSAT operational method**

**Tracking : Cross-Correlation, MLE using 5x5 and 15x15 pixels**

**Height assign : MLE height estimation using radiance and tracked motion**

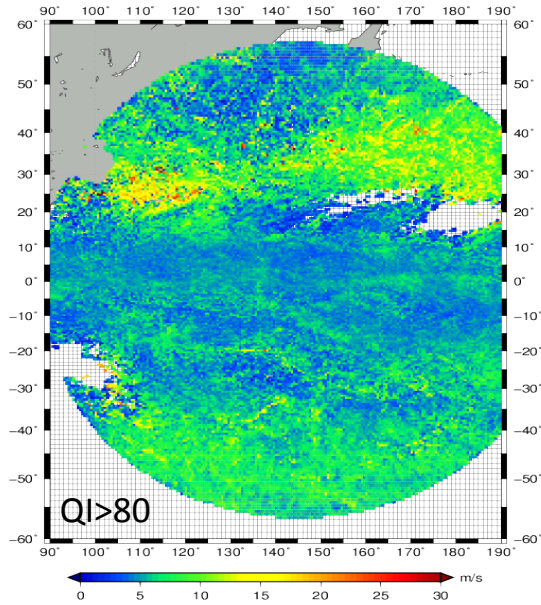
**Temporal information for tracking is not used in this experiment**

- for simplifying comparison using QI (consistent vector shows high quality even case that temporal QI is low)**

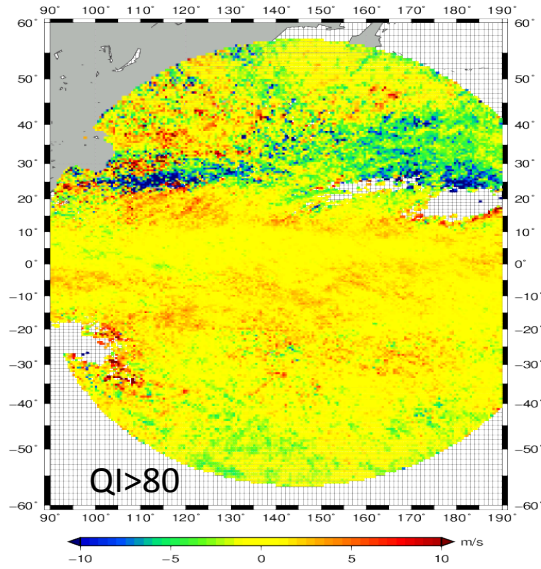
# IR upper level AMV O-B statistic for January 2013

operation

Map RMSVD

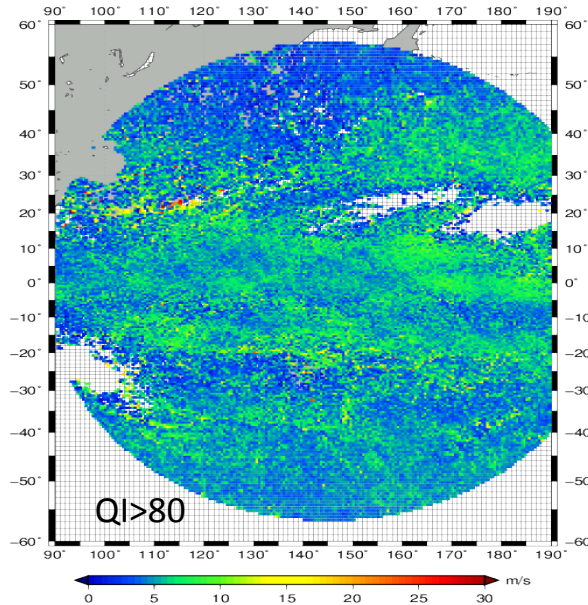


Map Bias HI

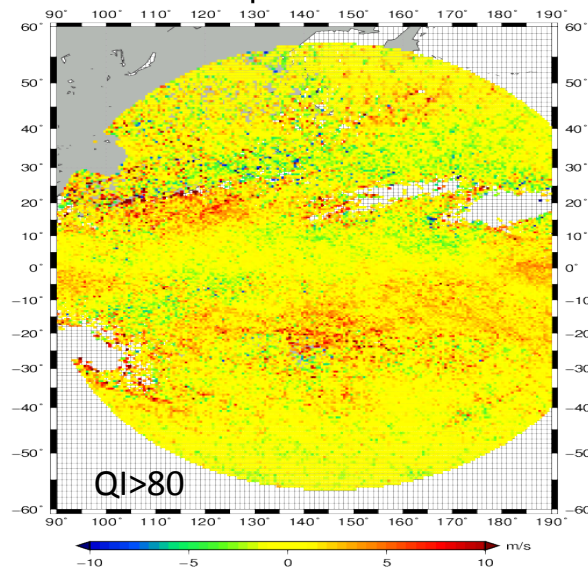


TEST1 : radiance only

Map RMSVD

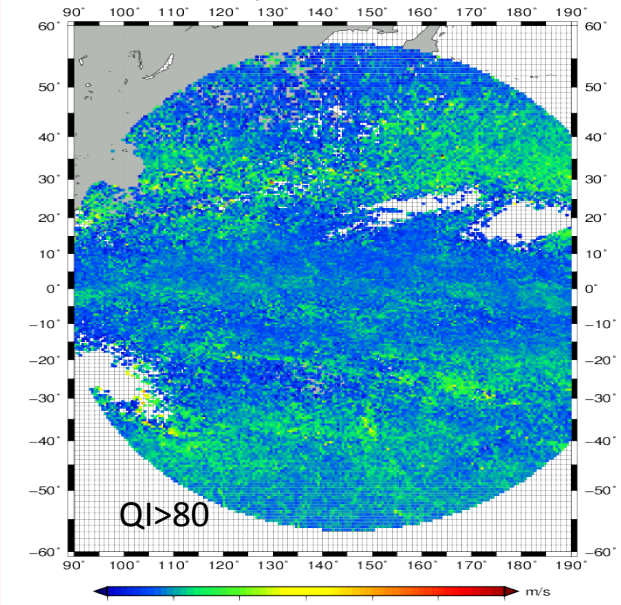


Map Bias HI

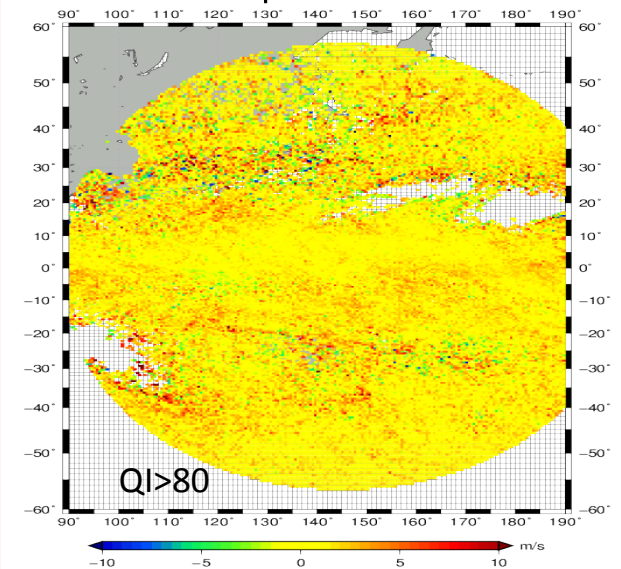


TEST2 : radiance and motion

Map RMSVD



Map Bias HI

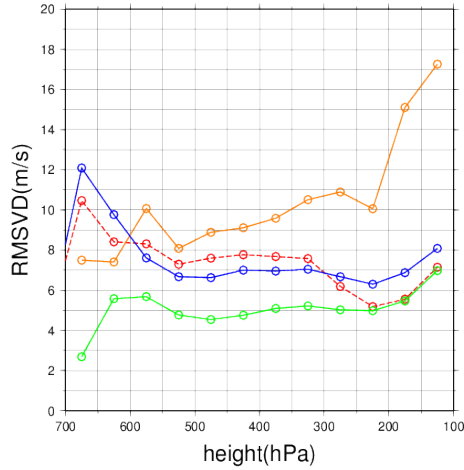


# IR upper level AMV O-B statistic for January 2013

TEST1 : radiance only

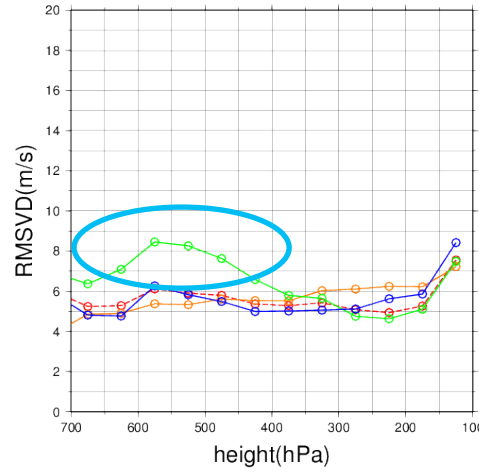
TEST2 : radiance and motion

RMSVD Histogram HI



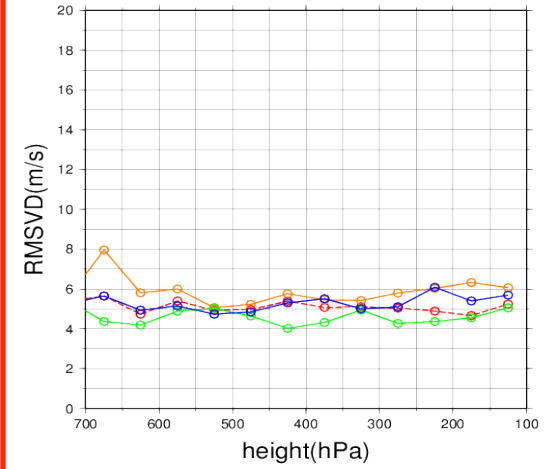
QI>80

RMSVD Histogram HI



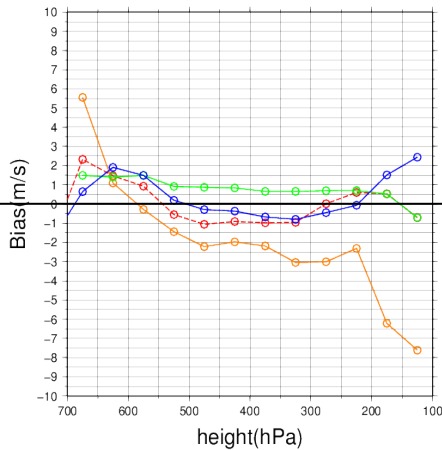
QI>80

RMSVD Histogram HI



QI>80

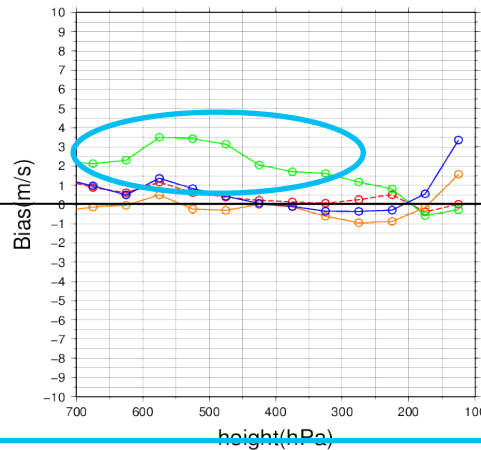
Bias Histogram HI



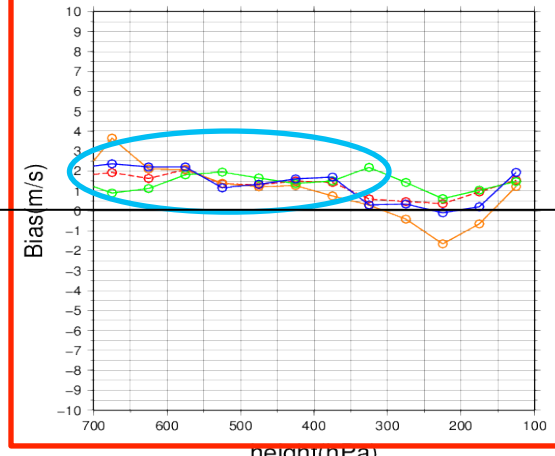
Full Disk  
NH  
TROP  
SH

0 m/s

Bias Histogram HI



Bias Histogram HI





# IR upper level AMV sonde statistics for January 2013

**Only radiance information used**

## RTN

### HIGH LEVEL

	FULL DISK	NH	TROP	SH
MVD	4.81	7.22	4.45	5.48
RMSVD	5.79	8.65	5.23	6.63
BIAS	-0.7	0.31	-0.94	0.71
SPD	15.09	35.40	11.78	23.73

## TEST1

	FULL DISK	NH	TROP	SH
MVD	5.88	6.34	5.77	5.91
RMSVD	7.15	7.57	7.06	6.99
BIAS	-1.34	-1.20	-1.53	0.31
SPD	18.31	36.90	13.27	25.84

### MEDIUM LEVEL

	FULL DISK	NH	TROP	SH
MVD	6.17	6.57	3.93	5.28
RMSVD	7.74	8.23	4.54	6.04
BIAS	-1.67	-2.08	0.01	-0.01
SPD	21.38	23.14	9.43	19.65

	FULL DISK	NH	TROP	SH
MVD	5.28	5.50	3.76	5.27
RMSVD	6.4	6.67	4.21	6.20
BIAS	-0.69	-0.85	-0.17	0.29
SPD	22.02	23.94	9.74	19.84

Method : Comparison of rawinsonde winds with AMV winds within 150 km radius of a RAOB site

Filters : VERT. DIST. ( $\geq 700$ hPa)  $< 50$  (hPa)  
VERT. DIST. ( $< 700$ hPa)  $< 35$  (hPa)  
QUALITY  $\geq 85$   
0.5\*0.5 deg. latitude/longitude grid point data  
SPEED DIFF.  $< 30$  (m/s) - DIRECTION DIFF.  $< 90$  (deg)

# IR upper level AMV sonde statistics for January 2013

**Both of radiance and motion vector information used**

## RTN

### HIGH LEVEL

	FULL DISK	NH	TROP	SH
MVD	4.81	7.22	4.45	5.48
RMSVD	5.79	8.65	5.23	6.63
BIAS	-0.7	0.31	-0.94	0.71
SPD	15.09	35.40	11.78	23.73

### MEDIUM LEVEL

	FULL DISK	NH	TROP	SH
MVD	6.17	6.57	3.93	5.28
RMSVD	7.74	8.23	4.54	6.04
BIAS	-1.67	-2.08	0.01	-0.01
SPD	21.38	23.14	9.43	19.65

## TEST2

	FULL DISK	NH	TROP	SH
MVD	5.04	6.51	4.63	5.96
RMSVD	6.03	7.79	5.45	6.98
BIAS	-0.34	-1.04	-0.21	0.04
SPD	19.26	37.21	14.42	27.57

	FULL DISK	NH	TROP	SH
MVD	5.06	5.29	3.89	6.14
RMSVD	6.05	6.30	4.53	7.13
BIAS	0.85	1.06	-0.59	2.88
SPD	21.16	23.82	10.11	25.78

Method : Comparison of rawinsonde winds with AMV winds within 150 km radius of a RAOB site

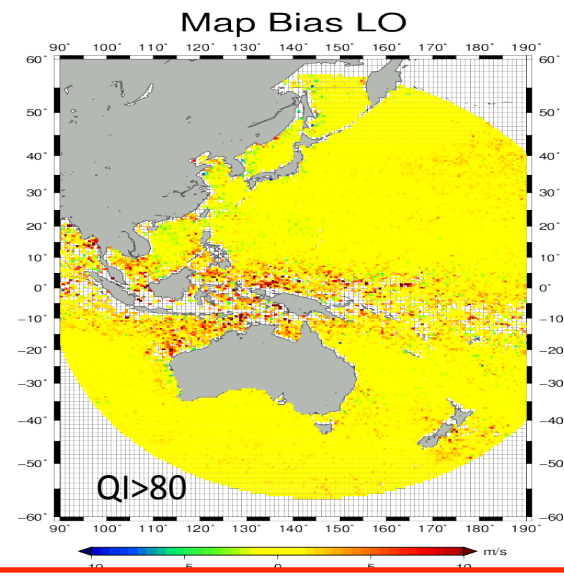
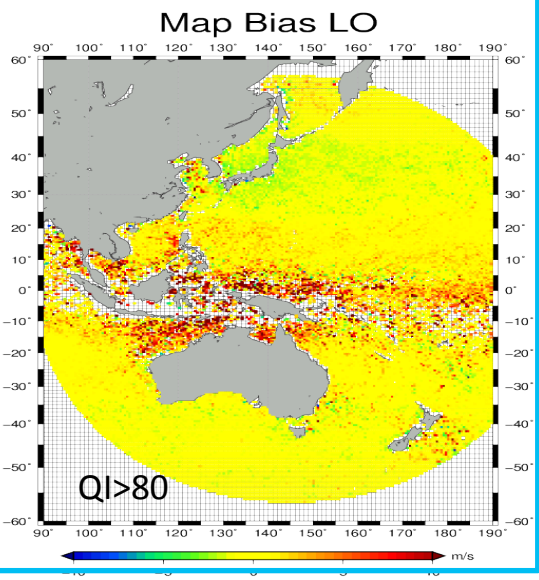
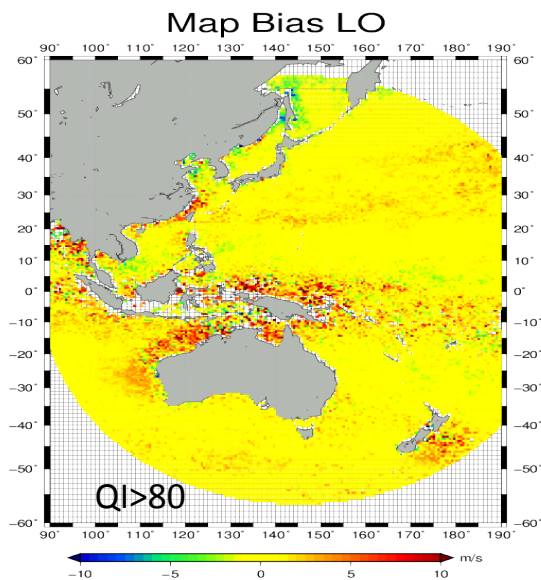
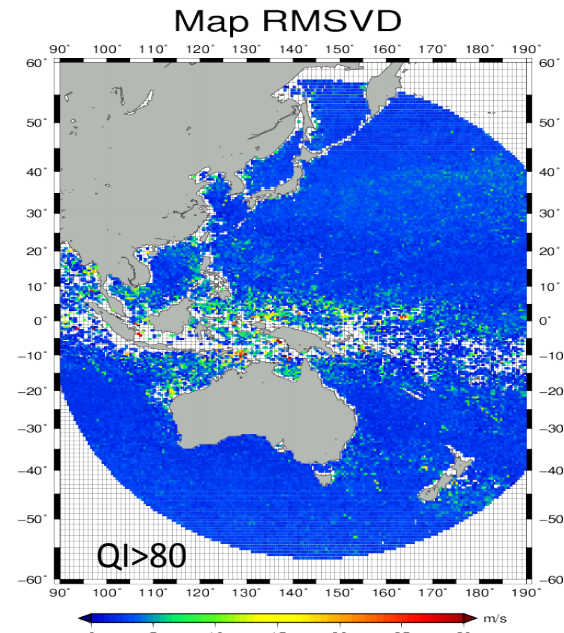
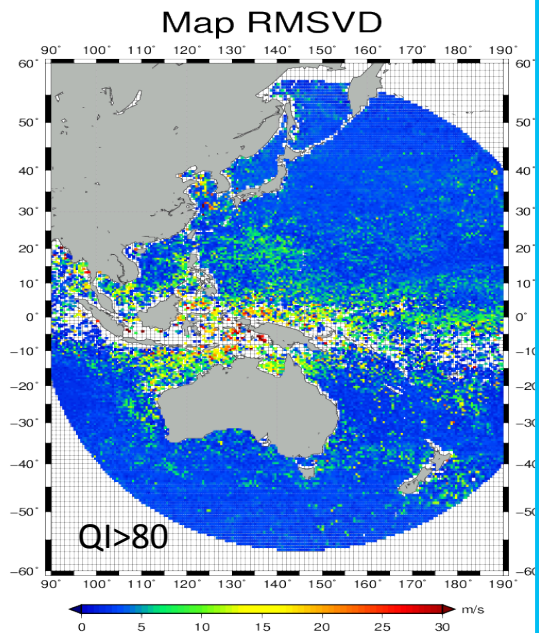
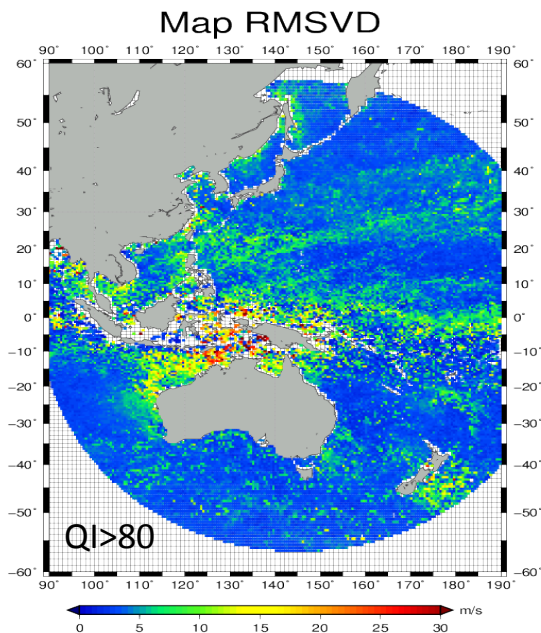
Filters : VERT. DIST. ( $\geq 700$ hPa) < 50 (hPa)  
VERT. DIST. ( $< 700$ hPa) < 35 (hPa)  
QUALITY  $\geq 85$   
0.5\*0.5 deg. latitude/longitude grid point data  
SPEED DIFF. < 30 (m/s) - DIRECTION DIFF. < 90 (deg)

# IR lower level AMV O-B statistic for January 2013

operation

TEST1 : radiance only

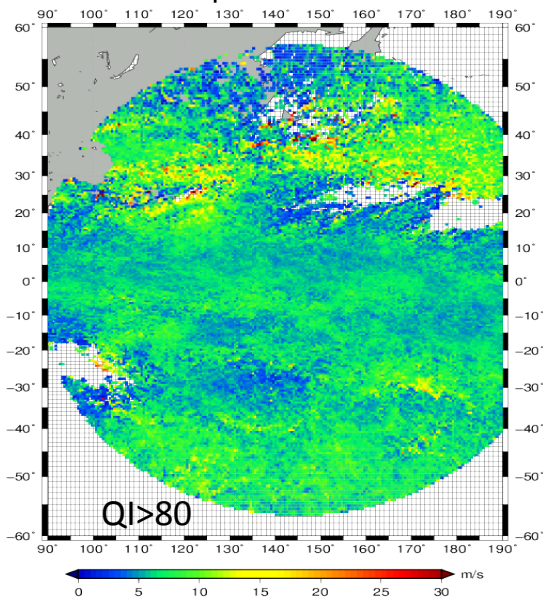
TEST2 : radiance and motion



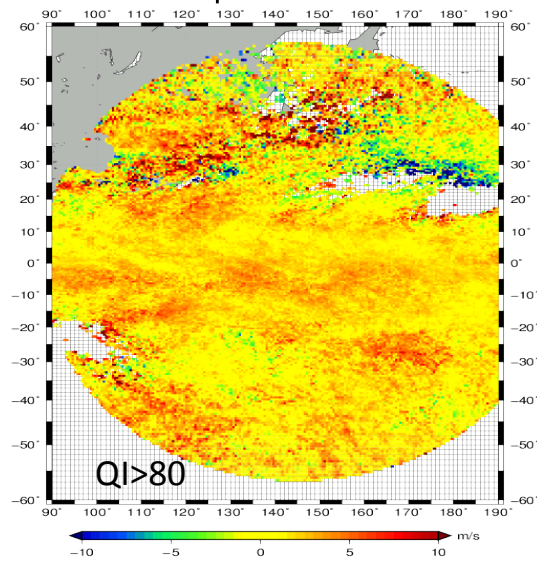
# WV cloudy AMV O-B statistic for January 2013

operation

Map RMSVD

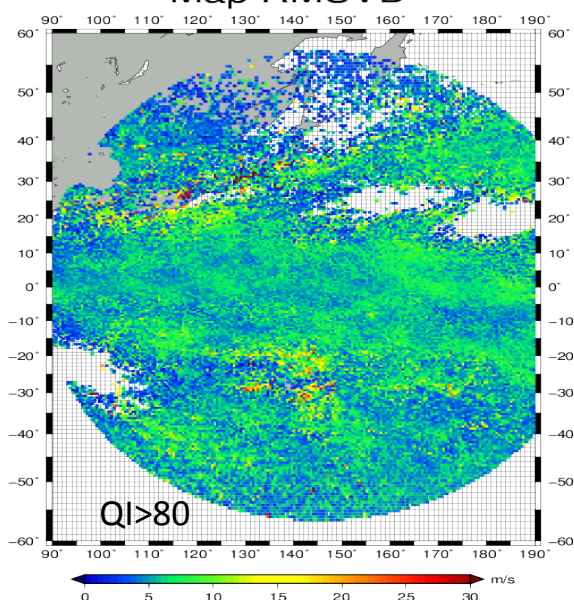


Map Bias WV

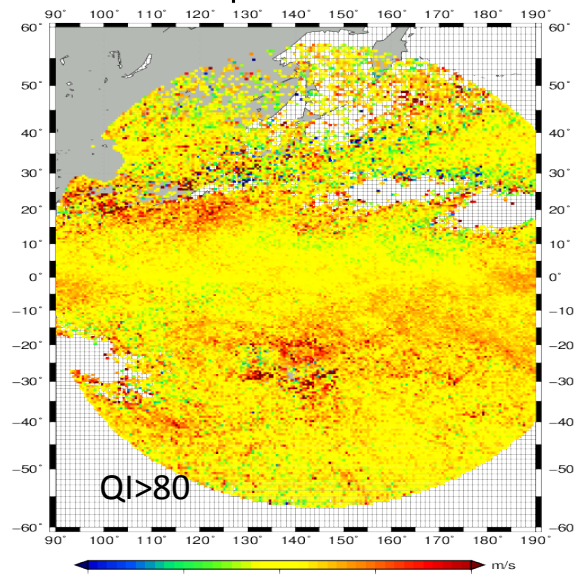


TEST1 : radiance only

Map RMSVD

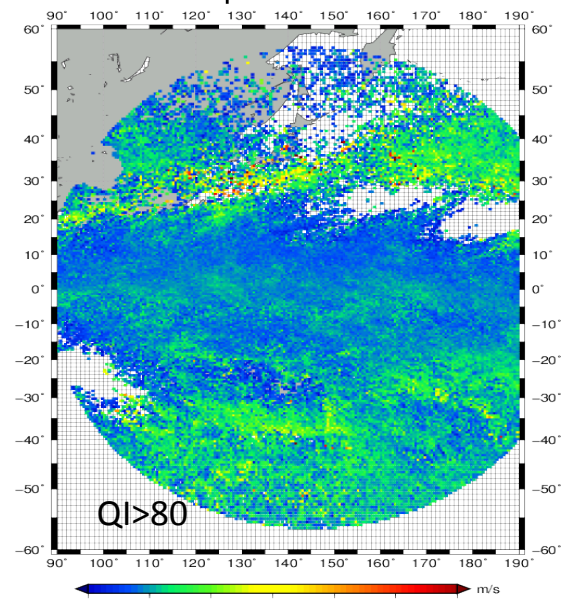


Map Bias WV

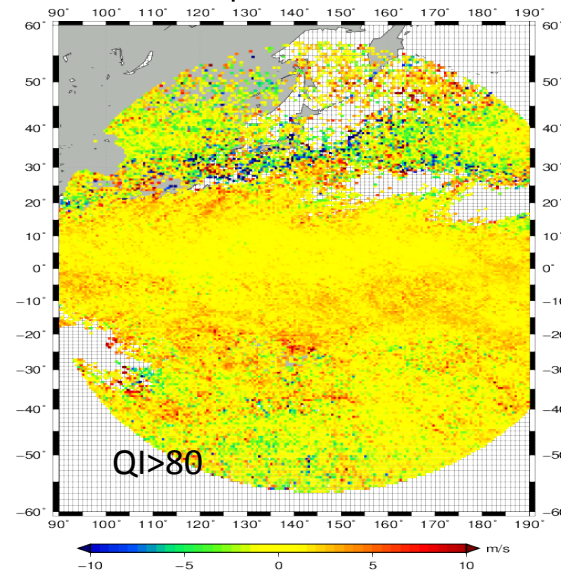


TEST2 : radiance and motion

Map RMSVD



Map Bias WV



# Summary

A satellite is shown in space, with the Earth's surface visible in the background. The satellite has a complex structure with various instruments and antennas. The background is a dark field of stars.

- By deriving motion vectors from sum of four correlation surfaces derived from small, large target boxes, and from forward and backward matching, Tracking accuracy was improved.
- BIAS and RMSVD of MTSAT IR AMV are totally improved by proposal height assignment method in case to use only radiance information. But as for BIAS, quality debased over tropical region.
- As a result to use motion vector as auxiliary information for height assignment, error and its homogeneity are improved, but positive BIAS can be seen in southern hemisphere.