



Drift simulation of Japan Tsunami Marine Debris (JTMD) as an application of data assimilation

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Plan of the presentation

1. Introduction
2. Data Assimilation System: MOVE and K7
3. Modelling of Drifting JTMD and
Examples of the Model Solution
4. Summary

I. INTRODUCTION

Tragic event of the March 11, 2011 tsunami in Japan has generated estimated **1.5 million tons** of debris floating off the eastern Honshu (Japan Ministry of Environment, 2014).

This is an amount comparable to the annual budget of plastic marine debris of the entire North Pacific (Jambeck et al., 2015).

This Japan Tsunami Marine Debris (**JTMD**) was seen on photographs in the coastal areas (see the figures).



The largest "island" of debris stretches 60 nautical miles (69 miles) in length and covers an expanse of more than 2.2 million square feet, according to the US Navy's 7th Fleet, which is closely monitoring the floating rubbish

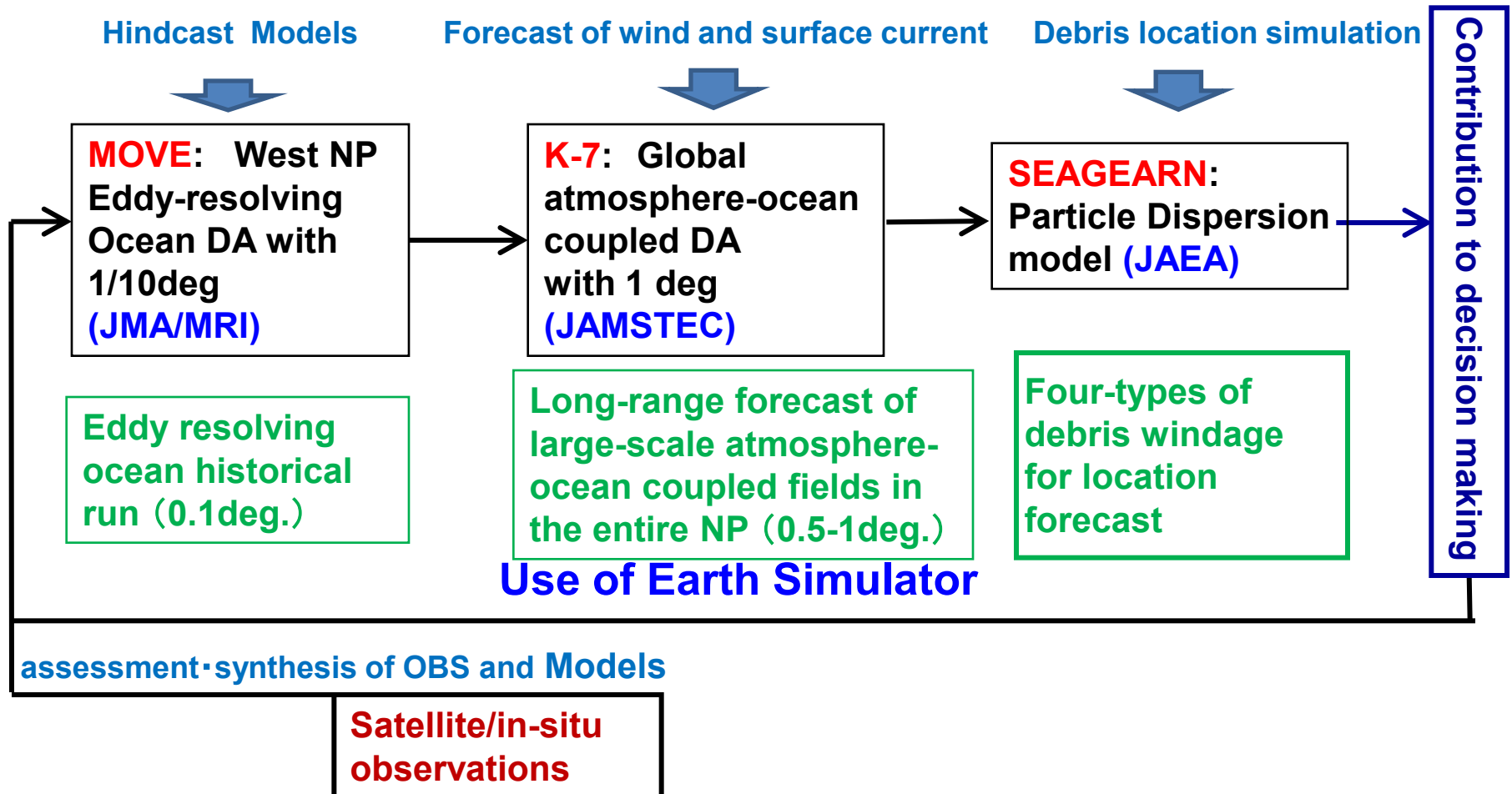
Picture: REUTERS



Several weeks later, after JTMD drifted off shore and dispersed, its monitoring became very difficult.

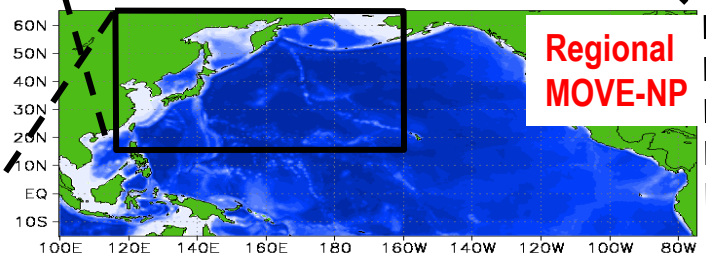
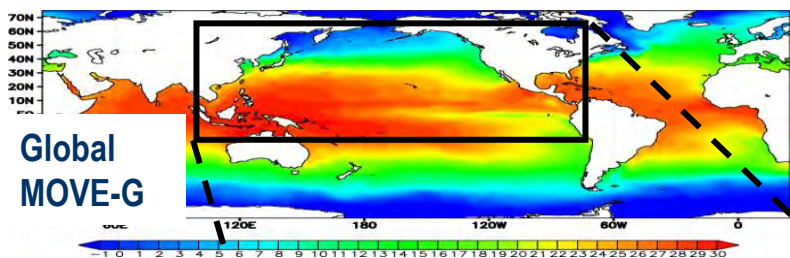
Sparse reports from the sea were not able to provide a coherent description of the pattern and drift motion of JTMD and this task was adopted by numerical models.

Tsunami Debris Nowcast and Forecast procedure

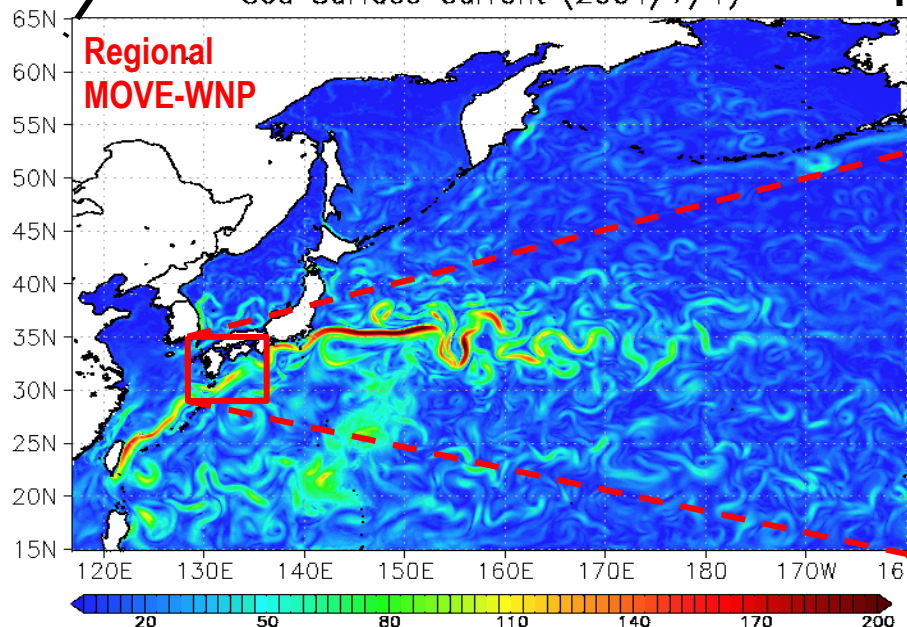


JMA/MRI systems

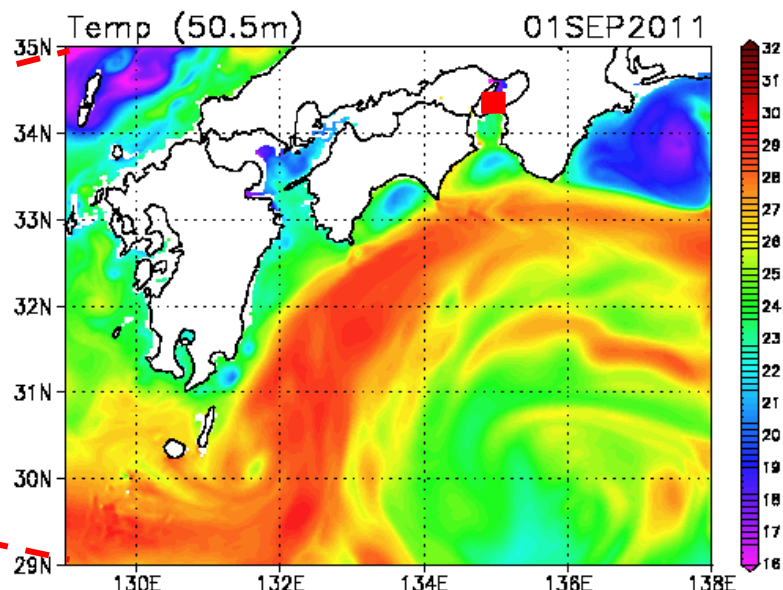
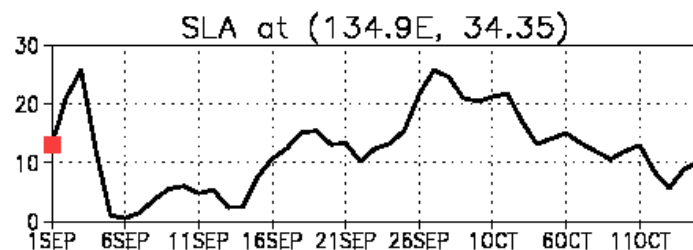
Global Warming, Seasonal-ElNino (Global, 1°)
 Ocean Weather (N. Pac, $1/2^\circ \sim 1/10^\circ$)
 Ocean Weather (W.N. Pac, $0.1^\circ \sim$)
 Coastal mdl (Seto, Jpn, Tohoku-SICAT02:2km)



Sea Surface Current (2004/7/1)



Coastal Application: Abnormal High Tide



JMA/MRI Ocean Data Assimilation System

MRI MOVE/MRI.COM (Multivariate Ocean Variational Estimation) system

OGCM: MRI.COM (MRI Community Ocean Model) (similar to MOM)

Method: Multivariate 3D-VAR, 4D-VAR

with vertical coupled T-S Empirical Orthogonal Function (EOF) modal decomposition with area partition (control variable: amp. of EOF mode)
horizontal Gaussian function (inhomogeneous decorrelation scales)
nonlinear constraints (dynamic QC, density inversion) bias correction

$$J(\mathbf{x}) = \frac{1}{2}(\mathbf{x} - \mathbf{x}^b)^T \mathbf{B}_v^{-1}(\mathbf{x} - \mathbf{x}^b) + \frac{1}{2} \left[\mathbf{H}\mathbf{x} - \mathbf{y}^{\text{TS}} \right]^T \mathbf{R}^{-1} \left[\mathbf{H}\mathbf{x} - \mathbf{y}^{\text{TS}} \right] + \frac{1}{2\sigma_h^2} \left[\mathcal{H}(\mathbf{x}) - \mathbf{y}^{\text{SSH}} \right]^T \left[\mathcal{H}(\mathbf{x}) - \mathbf{y}^{\text{SSH}} \right]$$

Source (observation) Data:

Satellite Altimetry (TOPEX/POSEIDON, ERS-1 &-2, ENIVISAT, Jason),

SST (COBESST or GHRSSST),

in situ T & S (GTSP, ARGO, Tao/Triton, drifter),

with QC in each data centers

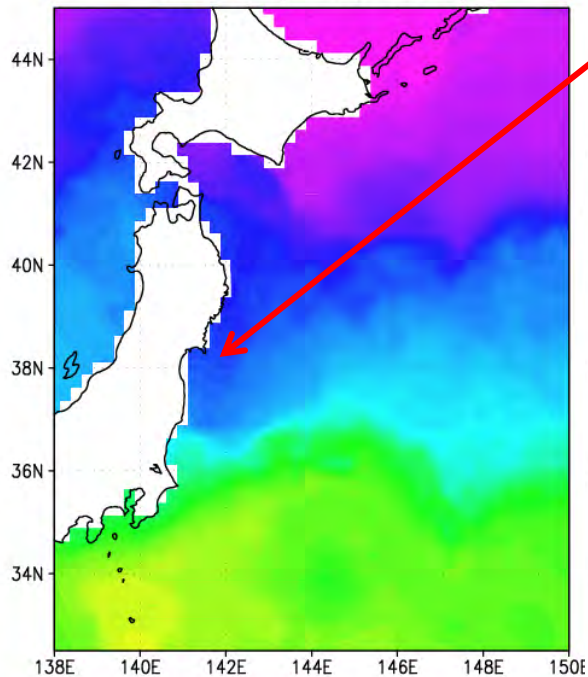
Atmospheric forcing (Output of Numerical Weather Prediction

or Atmospheric Reanalyses: JRA55)

Snapshot of SST (March 7, 2005) offshore of Target areas (Tohoku)

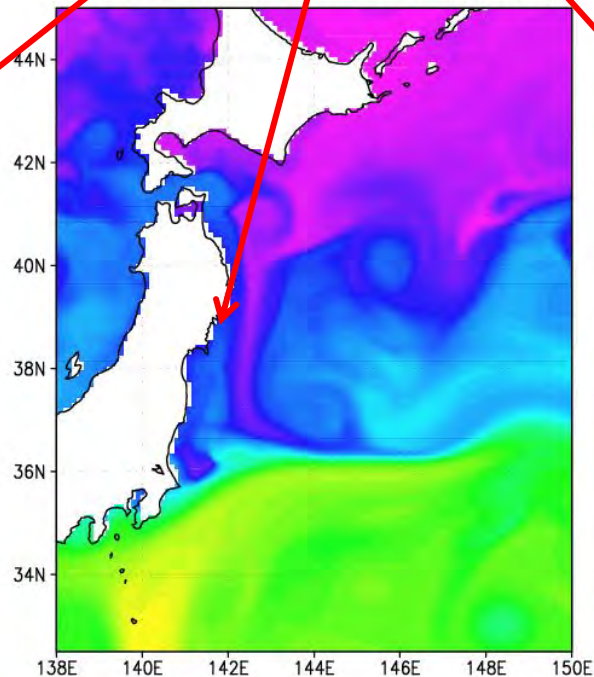
MGDSST
(statistical 1/4°)

MGDSST (7 Mar 2005)

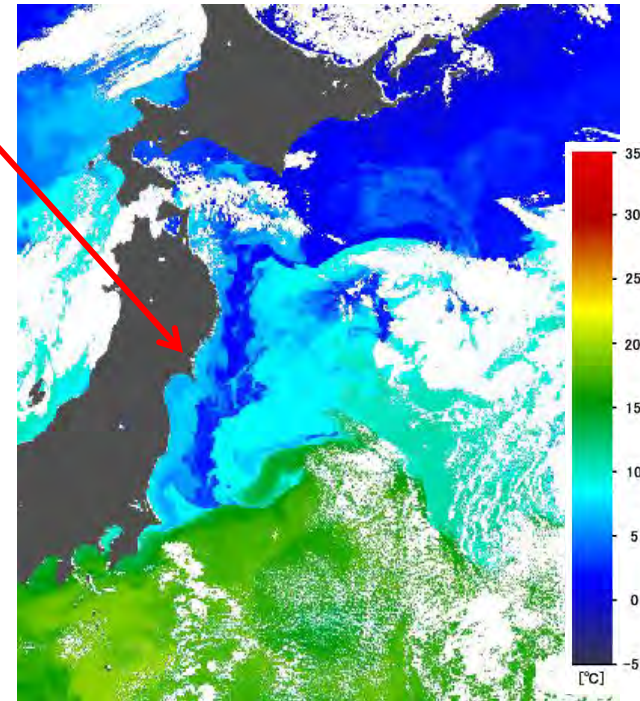


MOVE / MRI.COM
(data assimilation
with 0.1°)

assimilated SST (1-10 Mar 2005)



Terra/Aqua MODIS
(satellite OBS)

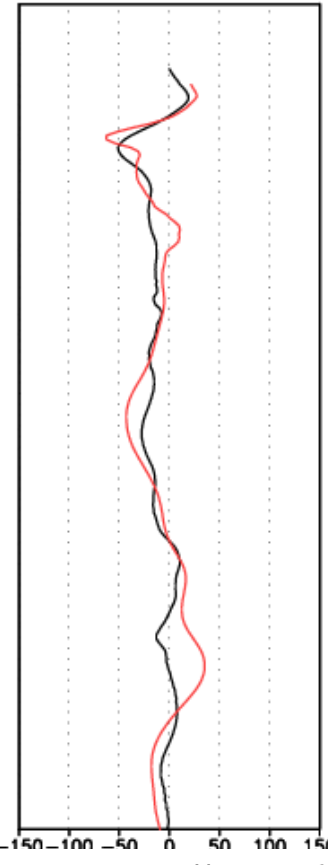
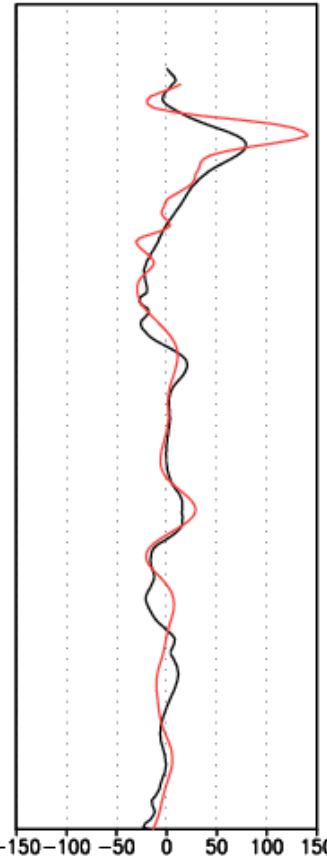
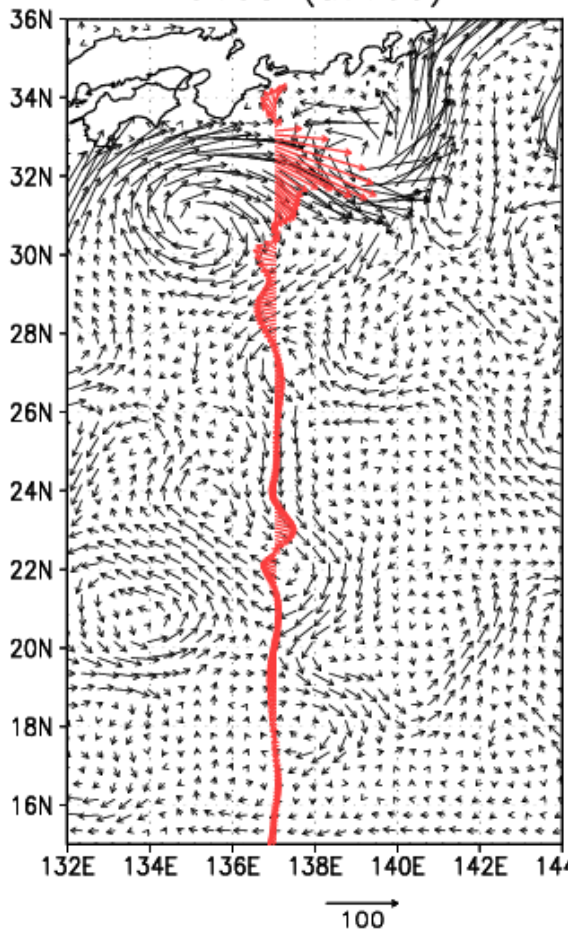


Validation

0105 (uv100)

u (cm/s)

v (cm/s)



Horizontal Velocity

2005/1

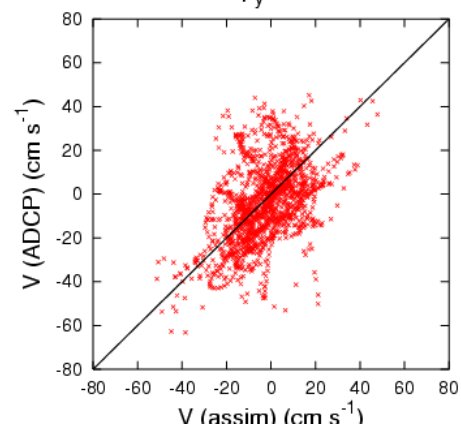
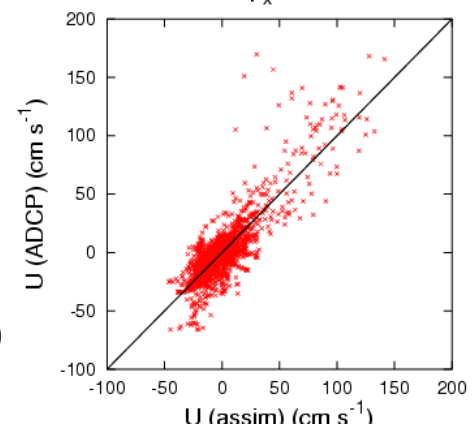
Black: Assim (MOVE)

Red: Independent Obs. (ADCP)

U : $\rho_x = 0.84$

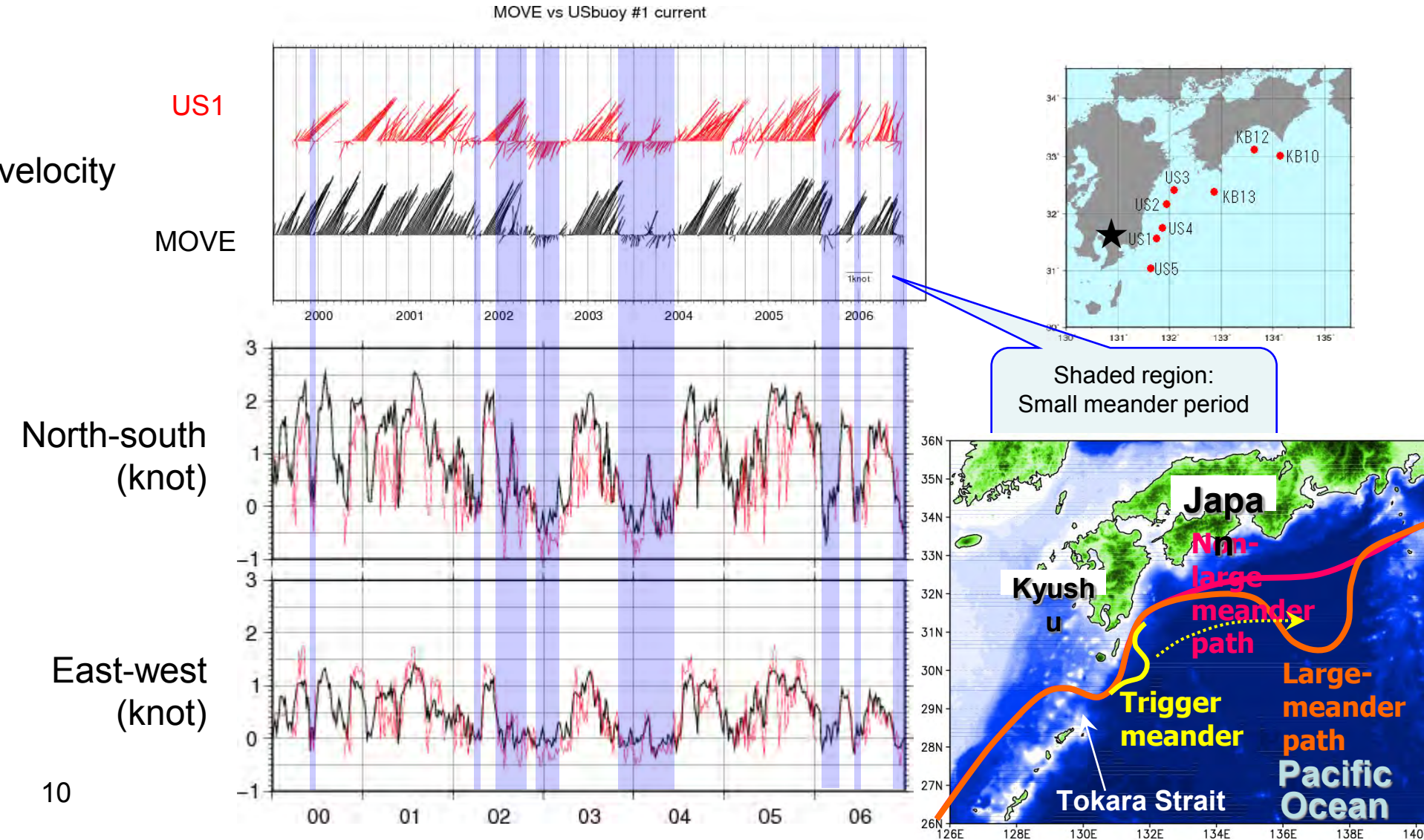
V : $\rho_y = 0.47$

Correlation Coefficient
V variability is smaller -> difficult



Validation

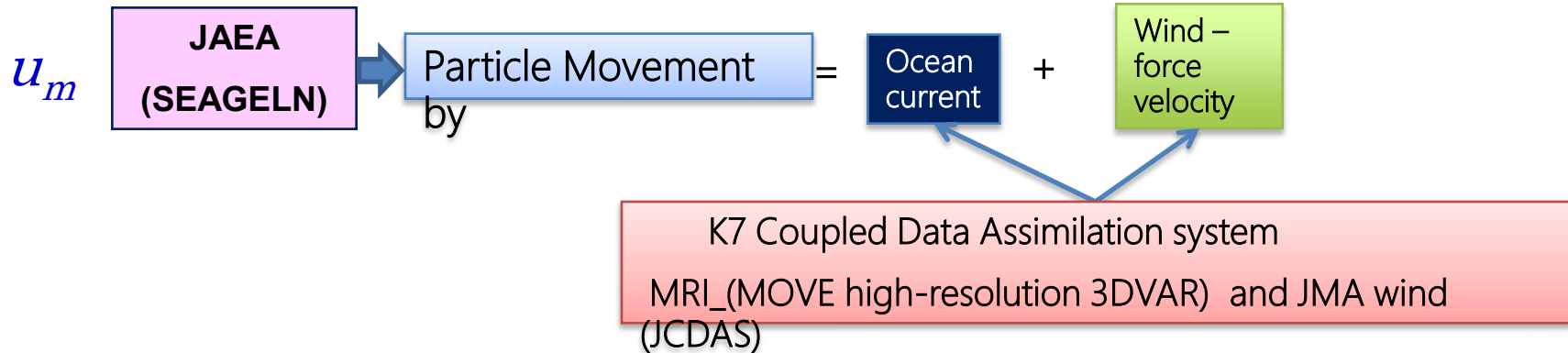
Comparison with Umisachi buoy #1 (2000-2006)



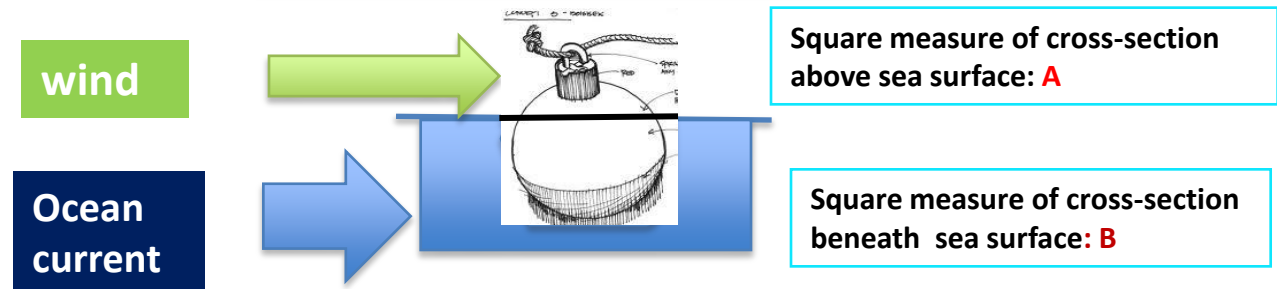
Dynamic framework of Particle tracking

$$x_{t+\Delta t} = x_t + u_m \Delta t + \delta x$$

(time evolution) (advection) (random diffusion)



Wind-driven effect for particle movement



$$\text{Wind force velocity} = \text{windage} \times \sqrt{\frac{A}{B}} \times W_{10}$$

↑
sea surface wind velocity

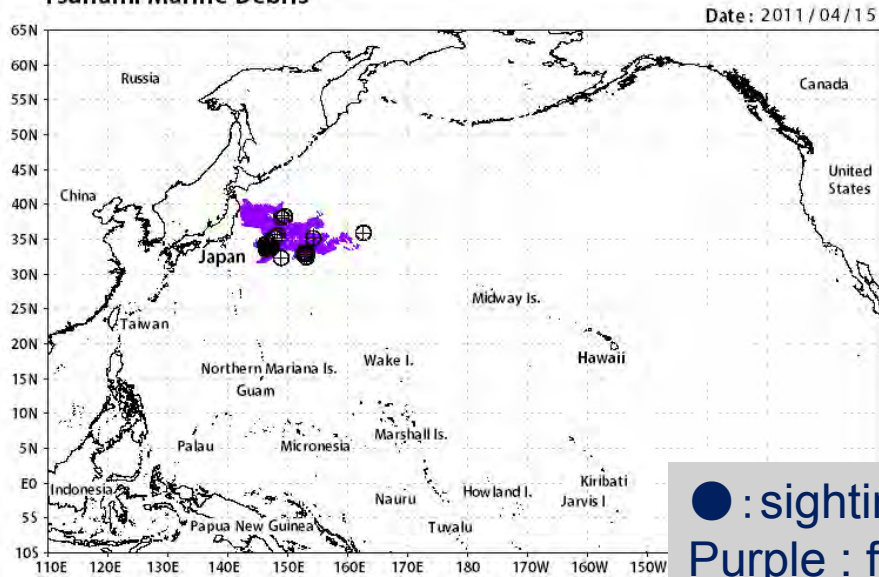
Forecast runs for 4 windage cases

k=0.025

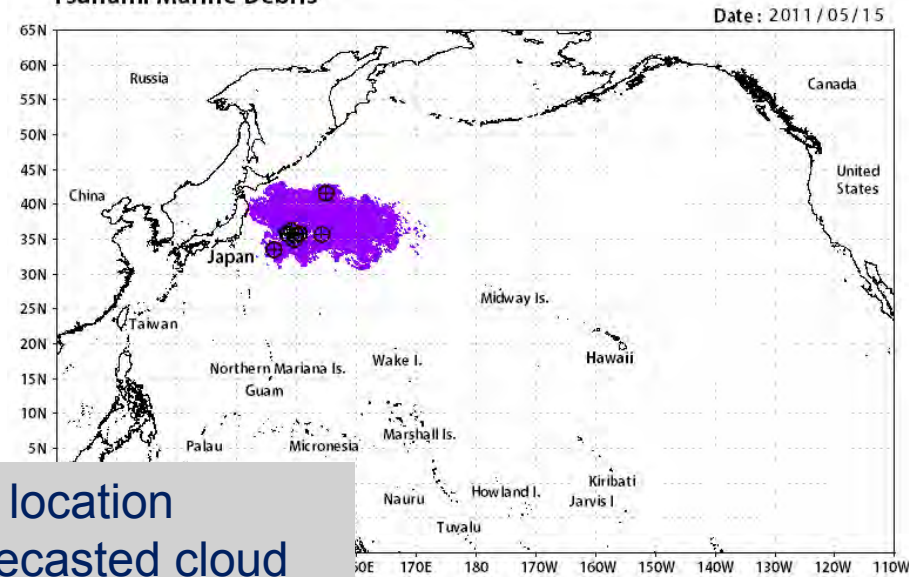
A:B=windage%

0:1=0%	Low windage
1:1=2.5%	
2:1=3.5%	
4:1=5.0%	High windage

Model Hindcast Tsunami Marine Debris

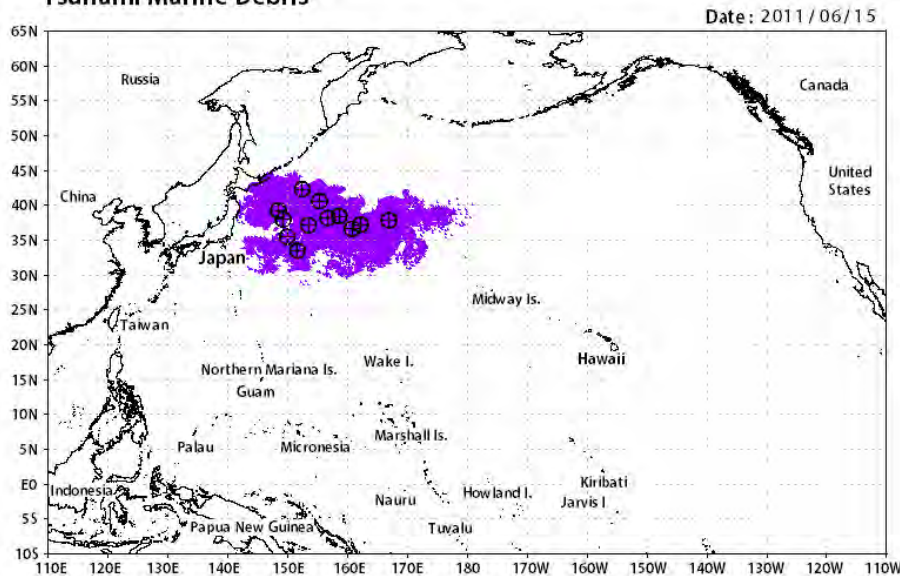


Model Hindcast Tsunami Marine Debris

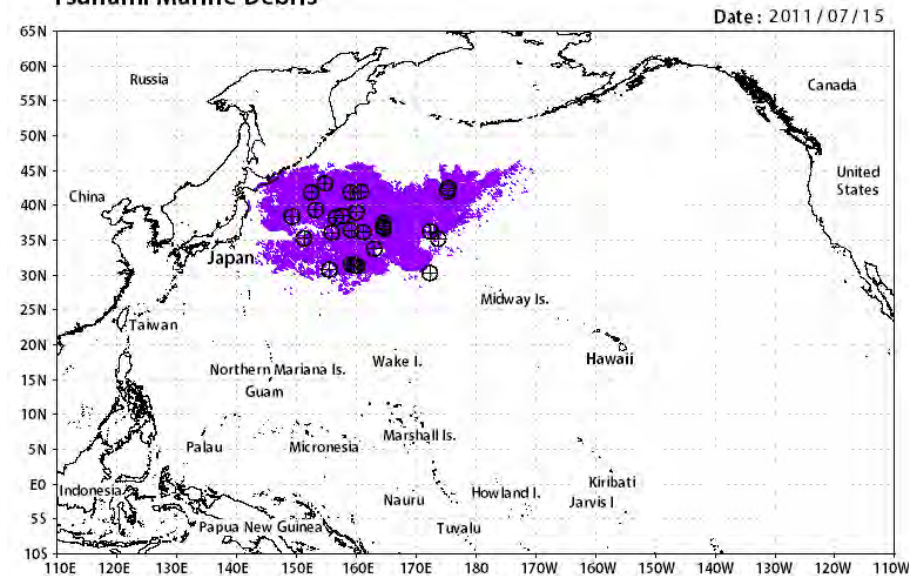


● : sighting location
Purple : forecasted cloud

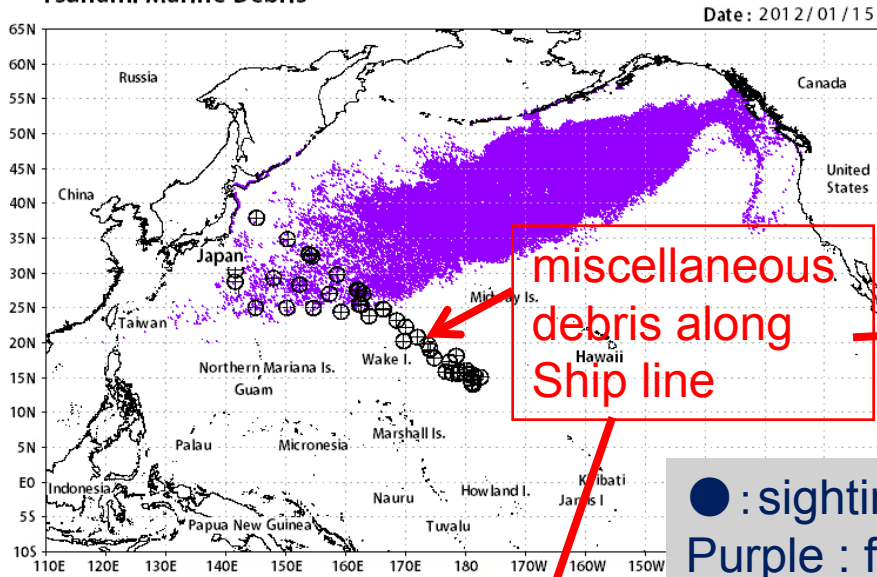
Model Hindcast Tsunami Marine Debris



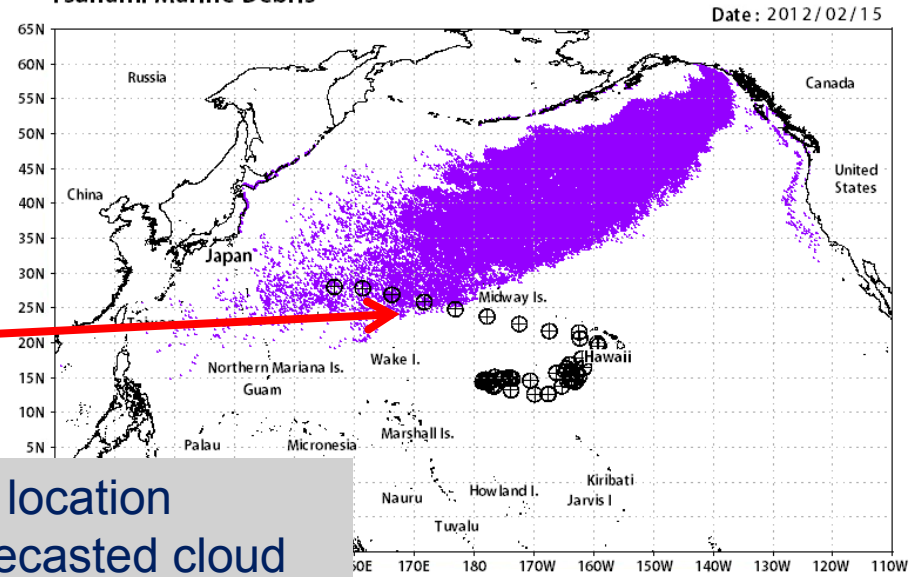
Model Hindcast Tsunami Marine Debris



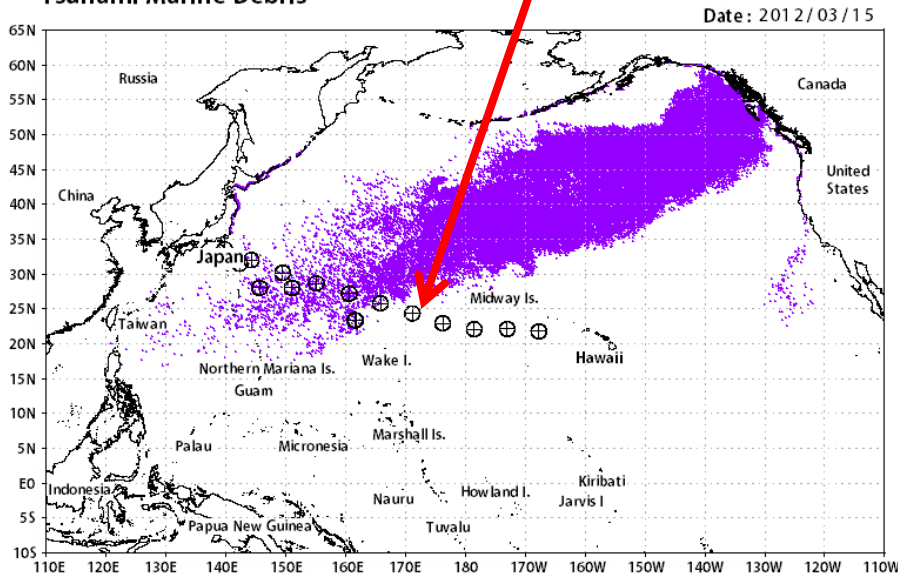
Model Hindcast Tsunami Marine Debris



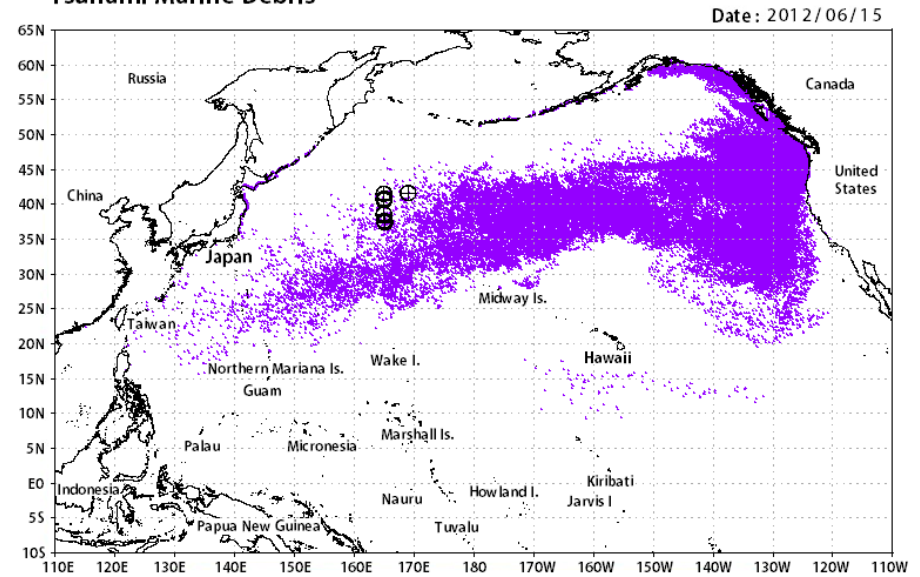
Model Hindcast Tsunami Marine Debris



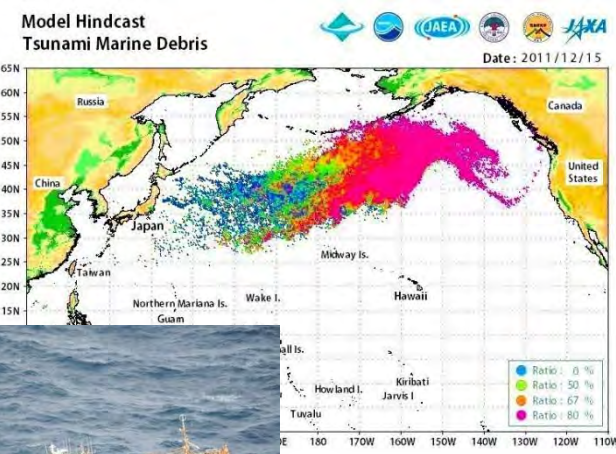
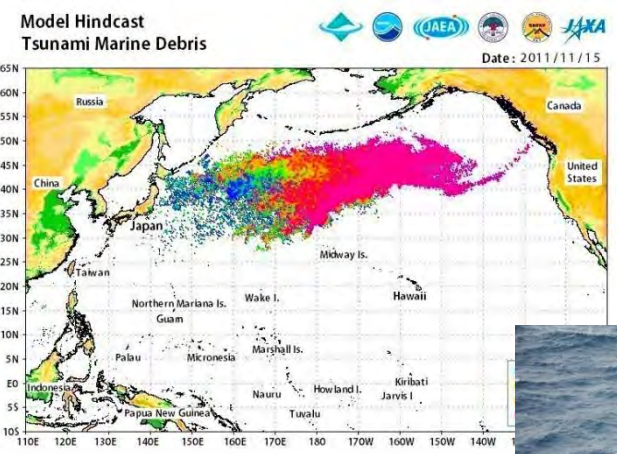
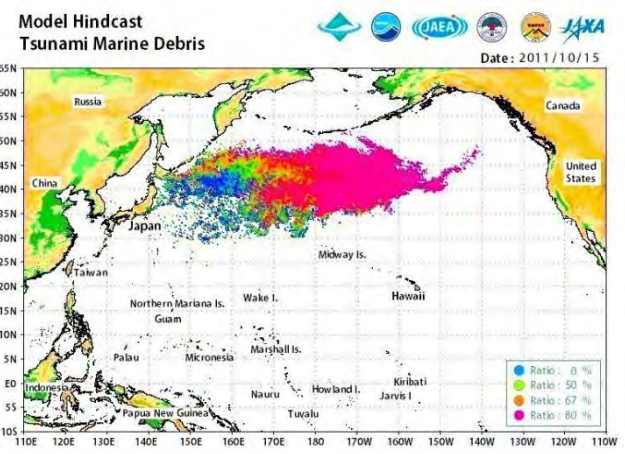
Model Hindcast Tsunami Marine Debris



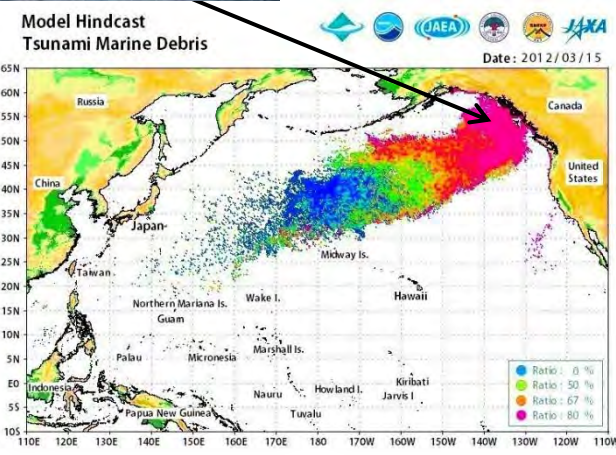
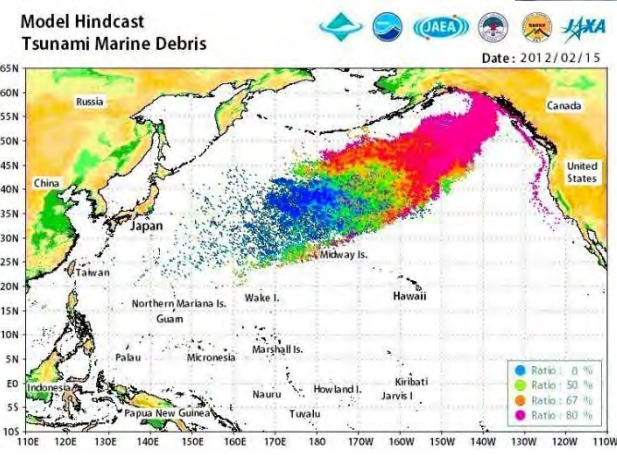
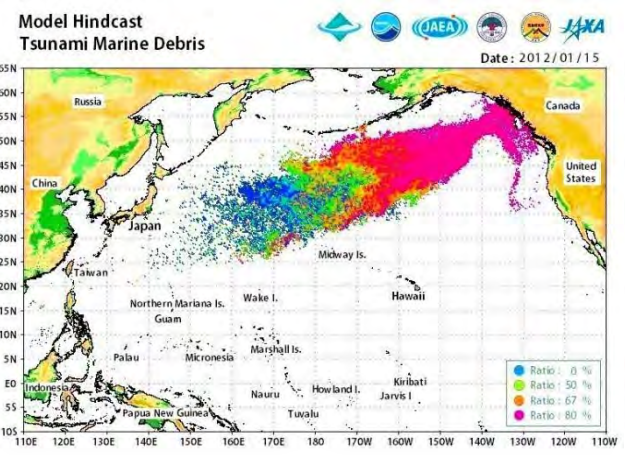
Model Hindcast Tsunami Marine Debris



forecast (Oct. 2011 ~ March 2012) : time-series of all forecast cases: overlapped



robust agreement



Ratio	beneath	above (the sea surface)	windage
Ratio : 0%	→	1 : 0	→ 0.0 %
Ratio : 50%	→	1 : 1	→ 2.5
Ratio : 67%	→	1 : 2	→ 3.5
Ratio : 80%	→	1 : 4	→ 5.0

forecast (Apr. 2012 ~ July 2012): time-series of all forecast cases: overlapped

Model Hindcast
Tsunami Marine Debris



Date: 2012/04/15

Model Hindcast
Tsunami Marine Debris

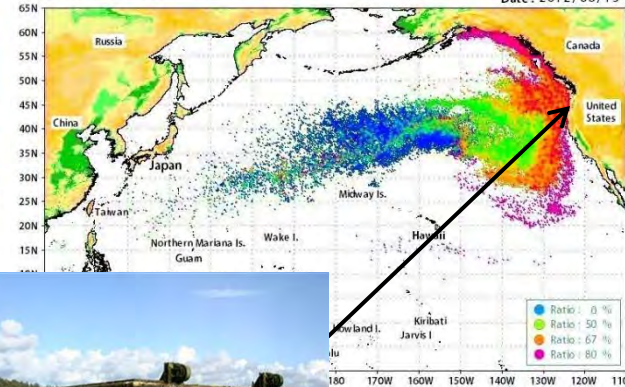
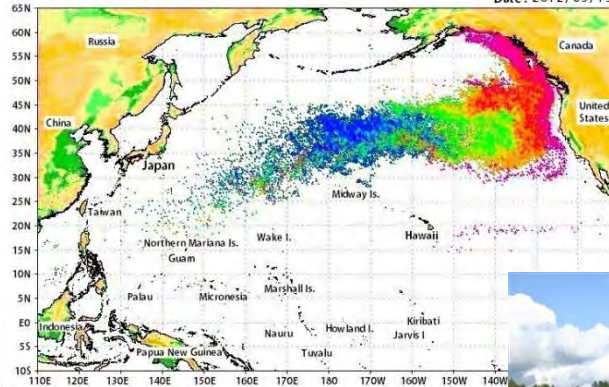
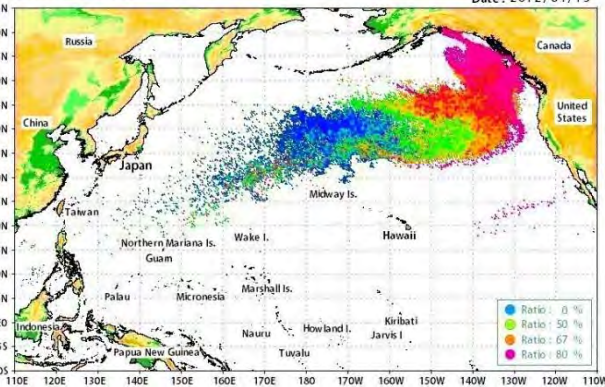


Date: 2012/05/15

Model Hindcast
Tsunami Marine Debris



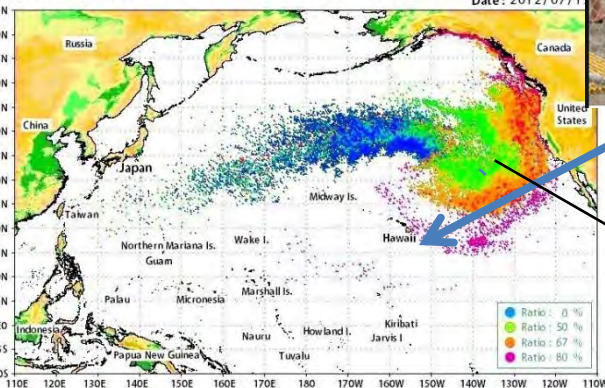
Date: 2012/06/15



Model Hindcast
Tsunami Marine Debris



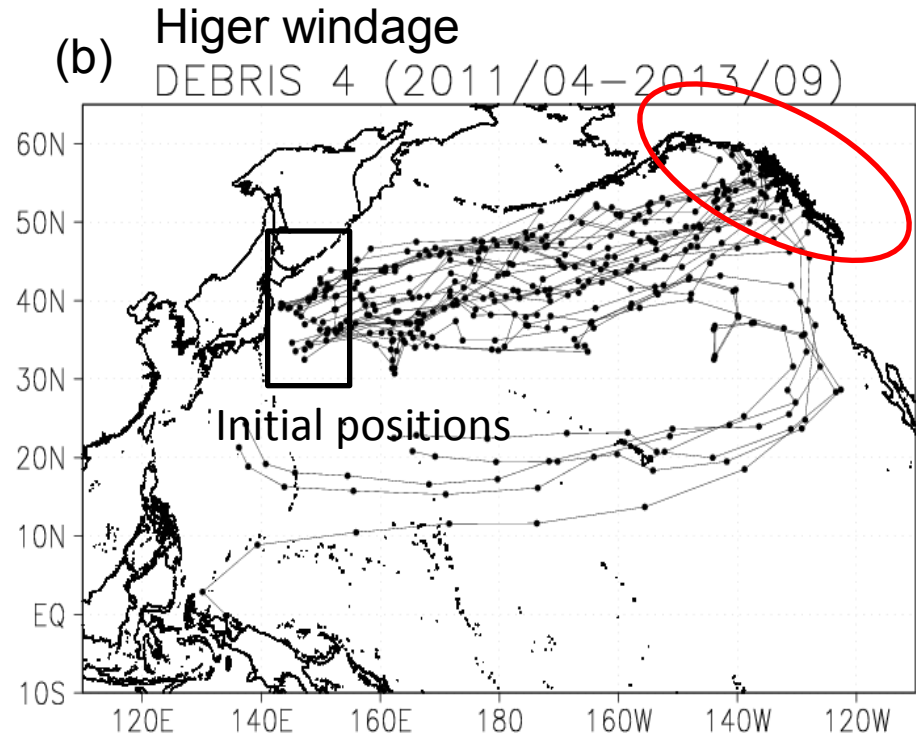
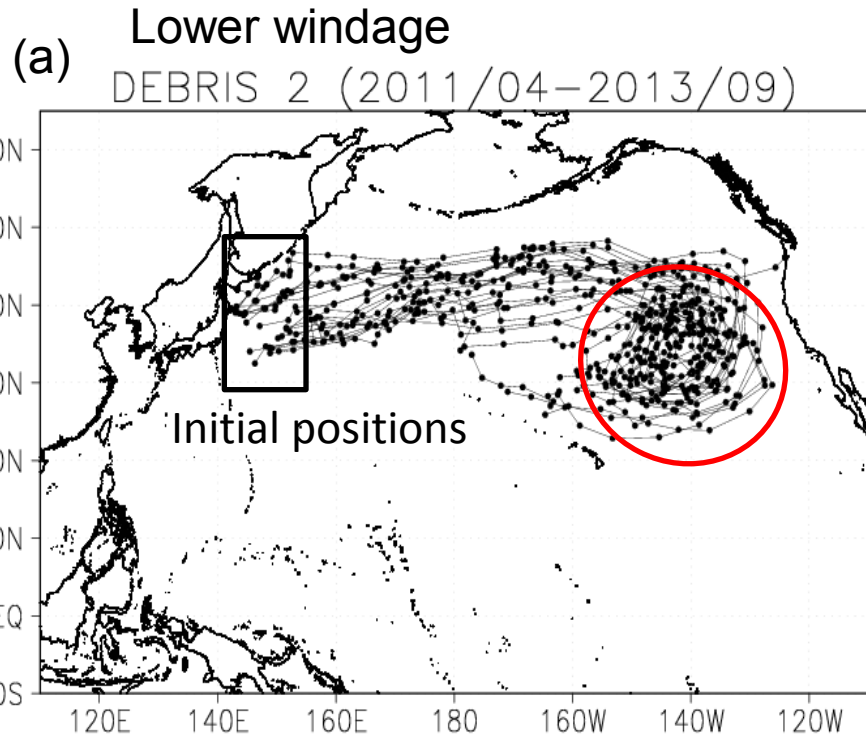
Date: 2012/07/1



Convergence area
"Garbage Patch"

Ratio		beneath : above (the sea surface)		windage
Ratio : 0%	→	1 : 0	→	0.0 %
Ratio : 50%	→	1 : 1	→	2.5
Ratio : 67%	→	1 : 2	→	3.5
Ratio : 80%	→	1 : 4	→	5.0

Typical debris trajectories with windages (a) 2.5% and (b) 5.0% from April 2011 to September, 2013.



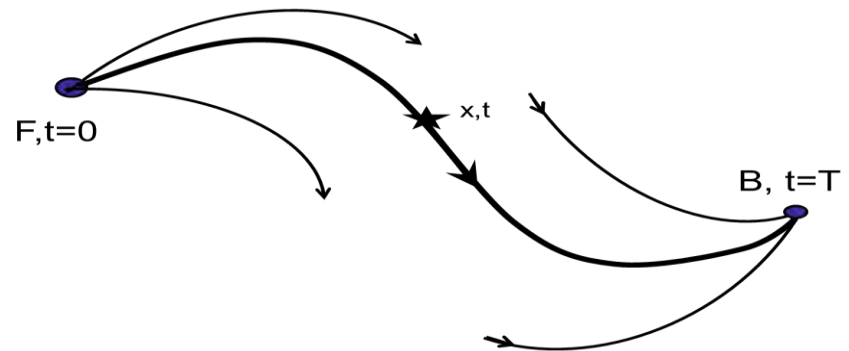
Deterministic Trajectory

Probabilistic Trajectory

The trajectories as well as distributions of debris have uncertainties, which can be expressed in a probabilistic way. For **selected start and destination (or target) points**, the uncertainties can be estimated from **a combination of trajectories from the starting point forward in time and trajectories from the destination point backward in time** in a manner of Fujii et al. (2013).

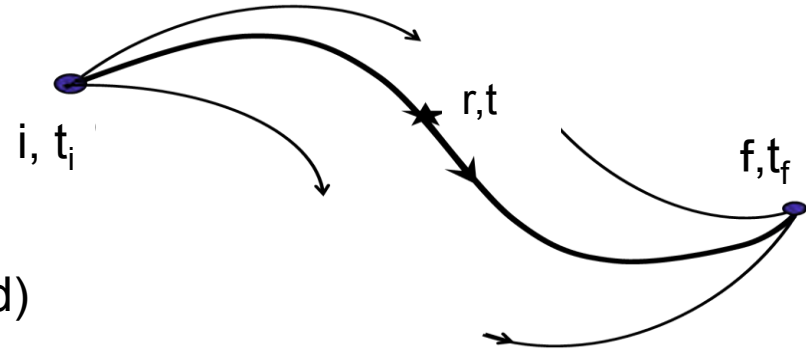
Chapman-Kolmogorov eqn.

$$p(B|F) = \int p(B|x, F)p(x|F)dx$$



Theoretical justification of the method was given in the forward (prediction) and backward (adjoint) models systems which are common in the data assimilation community. Holzer and Primeau (2008) and Fujii et al. (2013) used them to calculate the “**path density**” in different applications (e.g., **water mass movements**). In these studies the basic method is according to a balance that the time derivative of **forward variable multiplied by its adjoint variable** equals with the divergence of terms derived from advection and diffusion. Then the **combined (multiplied) variable is conserved, and its distribution gives the probability density**. Maximenko et al. (2015b) based their estimates on the interpretation of tracer concentration as a probability density of a single particle motions.

Probabilistic Trajectory: Theoretical Background



Method 1 (forward pdf by ensemble method)

Method 2 (Joint pdf) (Holzer & Primeau, 2008; Fujii et al., 2013)
(forward)x(backward full adjoint)

$$\rho(\mathbf{r}, \tau, \Omega_i, \Omega_f; t) = \frac{\rho(\mathbf{r}, t)}{M} \int_{t-\tau}^t dt_i \tilde{\mathcal{G}}(\mathbf{r}, t | \Omega_f, t_i + \tau) \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i)$$

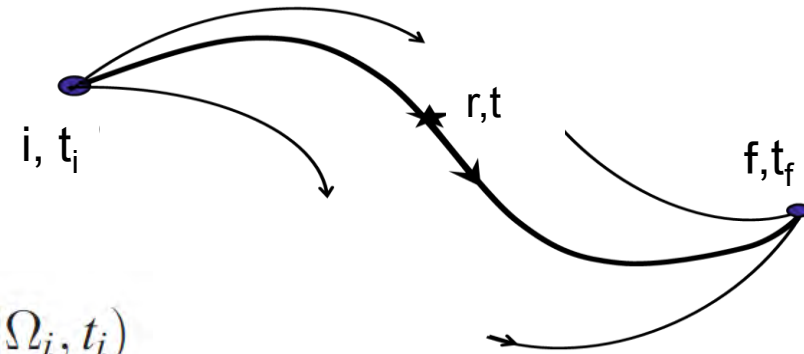
Method 2' (forward version: simplified Jpdf) (Holzer, 2009a,b)

$$\begin{aligned} \rho(\mathbf{r}, \Omega_f, t_f | \Omega_i, t_i) \\ = \frac{1}{NM} \mathcal{J}_f \int_{t_i}^{t_f} dt G(\mathbf{r}_f, t_f | \mathbf{r}, t) \rho(\mathbf{r}, t) \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i) \end{aligned}$$

$$\mathbf{J}(\mathbf{r}, t | \Omega_i, t_i) \equiv [\rho \mathbf{u} - \rho \mathbf{K} \nabla] \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i)$$

Probabilistic Trajectory: Theoretical Background

Method 2'' (simplified joint pdf) (Maximenko and Hafner, 2015)
 time-reverse, $u \rightarrow -u$, $K \rightarrow K^T$



$$\frac{\partial}{\partial t} [\rho \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i)] + \nabla \cdot \mathbf{J}(\mathbf{r}, t | \Omega_i, t_i) = 0$$

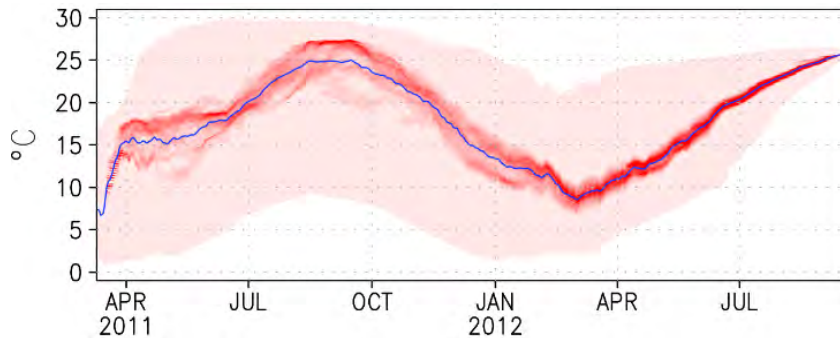
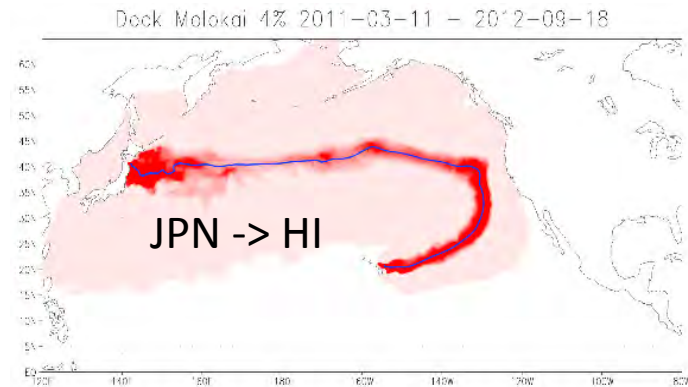
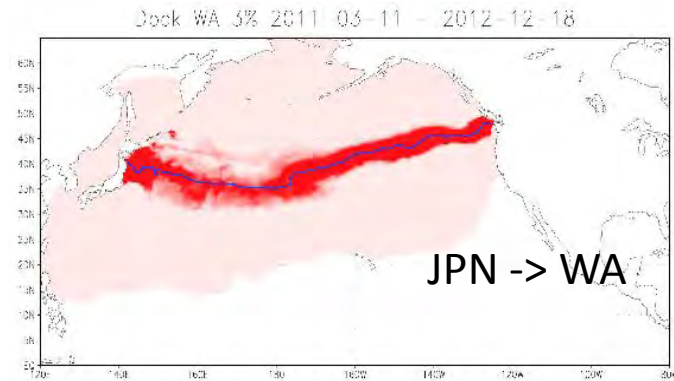
$$\mathbf{J}(\mathbf{r}, t | \Omega_i, t_i) \equiv [\rho \mathbf{u} - \rho \mathbf{K} \nabla] \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i)$$

$$\mathcal{G}(\mathbf{r}, t | \Omega_i, t_i) = \begin{cases} \delta(t - t_i) & \text{if } \mathbf{r} \in \Omega_i \\ 0 & \text{otherwise,} \end{cases}$$

$$\rho(\mathbf{r}, \tau, \Omega_i, \Omega_f; t) = \frac{\rho(\mathbf{r}, t)}{M} \int_{t-\tau}^t dt_i \tilde{\mathcal{G}}(\mathbf{r}, t | \Omega_f, t_i + \tau) \mathcal{G}(\mathbf{r}, t | \Omega_i, t_i)$$

$$\tilde{\mathbf{J}}(\mathbf{r}, t | \Omega_f, t_f) \equiv [-\rho \mathbf{u} - \rho \mathbf{K}^T \nabla] \tilde{\mathcal{G}}(\mathbf{r}, t | \Omega_f, t_f)$$

Probabilistic Trajectory



Probability density function of near-seasurface temperature, measured by the Argo network, along the probable path of Molokai dock

As shown in the figure (Maximenko et al., 2015b, and also Maximenko and Hafner, 2010), such approach gives not only the uncertainty of the trajectory of debris but also probabilistic information of the sea environment (e.g., temperature) along the trajectory and time. This information is critical for detecting probable path of invasive species colonizing debris items.

Next Presentation!

Example (Request)

Research Vessel (Kaisyou, 1.1ton) of Kesenuma Local Fisheries Laboratory (Miyagi prefectural Government) was found at about 6km offshore area from Miyako-city, Okinawa prefecture in May 12, 2016.

The prefectural government group would like to know the route.



(Lat=38.8, Lon=141.6)

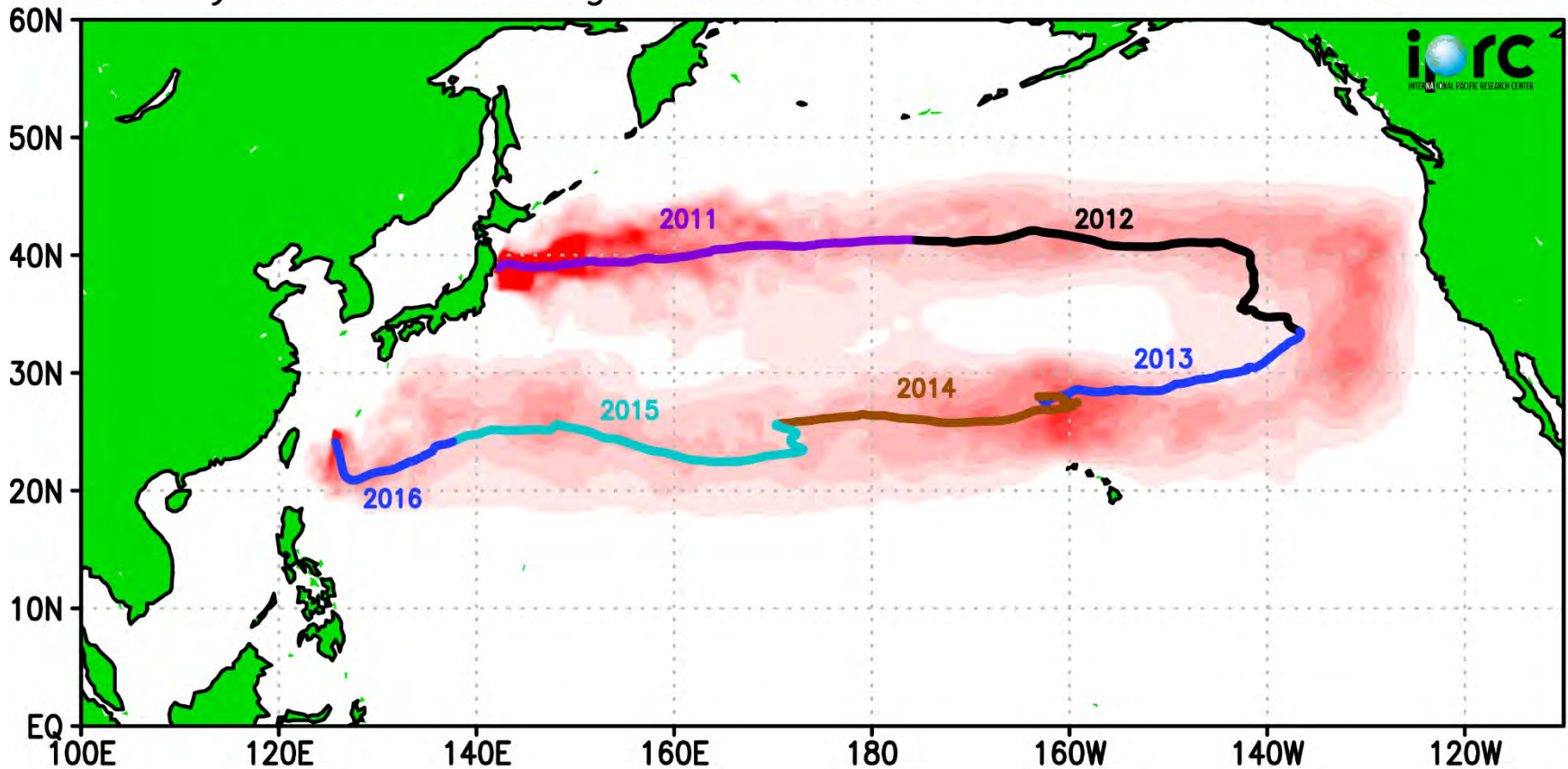


After found in 2016/5/12



Example (Answer)
Probabilistic route

Kaisyou Boat windage=1.6% 2011-03-11 – 2016-05-12



Summary (some figures are not shown)

1. High computing simulation and data assimilation are useful for the calculation of marine debris distribution. The model solution depends on the windage.
2. On-shore observation and model solution estimated seasonal change: e.g., summer 2012, winter-spring 2013, spring-summer 2014, due to seasonal wind and ocean current fields.
3. Model solution estimates that less than 10% of the tracer washes ashore annually and suggests that more than 50% of JTMD with boat type windage was still floating in the end of 2016. This means that boats from the 2011 tsunami, built to withstand rough ocean conditions, will likely continue coming to the US/Canada coastline in several future years. At the same time, JTMD wandering in the gyre gradually mixes with marine debris from other sources and loses its identity.
4. Future progress in marine debris modeling requires radically improved at-sea and on-shore observing systems as well as better model descriptions of coastal process and processes on the sea surface (such as Stokes drift by wind waves) and their effects on floating objects.

Thank you for your attention