# Promotion of International Database of Ocean Surface pCO<sub>2</sub> and Use for Basin Scale Estimation of Ocean CO<sub>2</sub> Sink and Sources (Abstract of the Final Report)

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|-----------------------------------|----------------|
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# 1. Introduction

The global ocean is the largest natural  $CO_2$  sink. There exists disequilibrium between ocean and atmosphere with lower p $CO_2$  of ocean surface than that of atmosphere. It is the driving force of the oceanic sink of atmospheric  $CO_2$  and it accounts about 2.4 Gt C/year of natural sequestration of atmospheric  $CO_2$ . The understandings of the temporal and spatial change of the oceanic sink and source of  $CO_2$  are important for model estimation of the future natural sink of  $CO_2$ , which could be significant for the necessary mitigation to ensure the safe stabilization level of atmospheric  $CO_2$ .

As the oceanic  $pCO_2$  can only be measured by at sea observation by ship or buoys, global observation has been maintained by the international collaboration and Japanese institutions have been continuing important roles in the North and West Pacific regions. NIES (National Institute for Environmental Studies) is operating North Pacific oceanic  $pCO_2$  observation by volunteer observation ships (VOSs) since 1995 as a part of global environmental monitoring project.

In 2007, an international database project was proposed by UNESCO/IOCCP (International Ocean Carbon Coordination Project) as SOCAT (Surface Ocean Carbon Atlas). It is the approach for effective global integration of ocean surface pCO<sub>2</sub> dataset and distribution to international scientists for analysis and modeling the ocean carbon cycles. The data centers have been established, settling core offices in Bergen University, Norway, and NOAA/PMEL (National Oceanic and Atmospheric Administration/Pacific Marine Environmental Laboratory), USA. On September 2011, the first version of SOCAT database was opened for public. The 2nd version of SOCAT has also been successfully opened for public in Sept. 2013. The current status of SOCAT is in the preparation phase of its 3rd version. NIES is taking important role in the data submission curator of the North Pacific region and has responsibility in the quality control and assurance of the data. This research program is contributing the NIES activity as a North Pacific hub in SOCAT program.

# 2. Research Objective

NIES ocean pCO<sub>2</sub> observation is one of major data contributors of SOCAT project.

This research program has been planned for supporting the NIES VOS observation of surface  $pCO_2$  in the Pacific. It supports establishment of accurate calculation of ocean  $pCO_2$  using  $CO_2$  measurement and various auxiliary measurements for necessary quality control, like temperature, salinity, pressure and so on. It promotes a timely data submission of NIES  $pCO_2$  observational dataset to SOCAT and also supports other Japanese institutes to submit  $pCO_2$  data set, as a Pacific hub institute for SOCAT project.

The ocean surface  $CO_2$  sink and sources are important components of ocean carbon cycle including physical and biological processes. This program also contributes data analysis using NIES dataset and also SOCAT database to estimate temporal and spatial variability of ocean surface pCO<sub>2</sub> in the Pacific using an up-to-date data analysis technique of neural network, which is suited for estimating non-linear relationship with ocean parameters and pCO<sub>2</sub>. The application of neural network technique is to be expanded from North and Equatorial Pacific, where data coverage is enough, to South Pacific, where sparse observation has been done. For global estimation of ocean surface pCO<sub>2</sub>, another scheme of neural network has also been tested. Mapping of dissolved inorganic carbon was established from the pCO<sub>2</sub> mapping as a direct indicator of biogeochemical cycling of  $CO_2$  in the ocean surface.

#### 3. Results and Discussion

(1) Pacific hub of international ocean pCO<sub>2</sub> database (SOCAT)

NIES has been continued the oceanic surface  $pCO_2$  observation for North and West Pacific using VOSs servicing one between Japan and US since 1995 and one between Japan and Australia/New Zealand since 2006. The data treatment scheme has been improved by this research program with the recent improvements of on board auxiliary measurements for quality control of  $pCO_2$  data. Installation of high precision temperature sensors to the water intake and equilibrators enabled to eliminate error from seawater temperature change during traveling in the pipe line and gave improvement of the  $pCO_2$ data quality.

In NIES ocean pCO<sub>2</sub> data site (<u>http://soop.jp</u>), we uploaded photo of on board system and detailed specification of measurement items to give better understanding of the observation. In this year, we open the recent dataset by March 2014 observation to the web site. The data publication is quickest in institutes involving ocean surface CO<sub>2</sub> observation. The site includes data from atmospheric observation cargo ship in the South East Asian area.

The on board system of the north Pacific  $pCO_2$  platform, M/S Pyxis, has already been very old and ship itself will stop operation in near future. We decided to change platform to other ship. The new ship is M/S New Century 2, operating between Japan and North America route. We finished the installation of ocean  $pCO_2$  system by March 2014 and the observation will be resumed very soon.

SOCAT is activity to establish global ocean surface pCO2 database, uniformly quality controlled. Responsibility of quality control of each ocean area has been allocated to leading institute of regional observation. NIES has responsibility in the quality control in the North Pacific. During the period of this project, there were several events for SOCAT. In September 2011, 1st version of SOCAT had been public. By the end of 2011, dataset for 2nd version had requested to be submitted to the data management office. After the quality control, 2nd version had been public on June 2013. The data submission for 3rd version has been requested by the end of 2013. NIES submitted up-to-date data for each submission request. In 1st version of SOCAT, only North Pacific data had been

included from NIES observation, however, NIES added Oceania route data for 2nd and 3rd versions. For 3rd version, NIES submitted data by August 2013 (Figure 1). NIES is sharing data quality control in the North Pacific, north of 30 degree, including all dataset submitted by world institutes to SOCAT.



Figure 1. Cruise line map of pCO<sub>2</sub> data submitted from NIES in 2nd version of SOCAT (upper panel) and 3rd version of SOCAT (lower panel).

(2) Basin scale estimation of  $pCO_2$  distribution with the neural network technique

It was found that Multiple Linear Regression (MLR) method, which is commonly applied for spatial interpolation of ocean surface  $pCO_2$ , is not necessarily suitable for basin-wide  $pCO_2$  estimation, and suggested that recent artificial Neural Network (NN) technique, which is applicable for non-linear field such as  $pCO_2$  variability, could be successful way to do it. We tried to evaluate temporal and spatial variability of  $pCO_2$  using Self Organizing Map (SOM) type of NN in the basin-scale North Pacific  $pCO_2$  estimation in this study. Estimation of North Pacific area using NIES VOSs dataset was the first step and then it was expanded to Equatorial and South Pacific, using SOCAT dataset. Finally the estimation includes Pacific sector of Southern Ocean, giving whole Pacific data analysis of ocean surface  $pCO_2$ .

The NN estimation uses basin wide mapping data of sea surface temperature (SST), sea surface salinity (SSS), mixed layer depth (MLD) and sea surface chlorophyll-a concentration (CHL). These mapping data sets are available from satellite observation and/or objective analyses. Equation includes location information as polar coordinates. Surface  $pCO_2$  has impact of anthropogenic increase of atmospheric  $CO_2$  concentration and it is added as a linear increasing term. Mapping process of the NN uses equation as follows;

$$pCO_2 = f_{som} (x, y, z, SST, SSS, MLD, CHL) + \alpha^*(t-t_{ref})$$
(1)

where, x, y, z are  $\cos(\text{Lat})^* \cos(\text{Lon})$ ,  $\cos(\text{Lat})^*\sin(\text{Lon})$ ,  $\sin(\text{Lon})$ ,  $\alpha$  is atmospheric increasing rate and  $t_{\text{ref}}$  is reference year of 2005. Estimation was made for January 1998 to December 2008.

In Figure 2, distribution of data for the NN estimation process from the 2nd version of SOCAT database is shown. The data density in the North Pacific, north of 15 degree N is enough dense, however, Western South Pacific is the area of few observation. This lack of data could be the major cause of  $pCO_2$ estimation.

The results (Figure 3) indicate general agreement with climatology given by Takahashi et al. (2009). In boreal



Figure 2. Distribution of data density for 1998-2008 (data number/month) used for neural network estimation of Pacific Ocean  $pCO_2$  from the 2nd version of SOCAT.

winter, high  $pCO_2$  is observed in the Northern North and low in mid latitude North Pacific of 20-40 degree N. In the eastern Equatorial Pacific has high  $pCO_2$  more than 400 µatm.



Figure 3. Estimated distribution of pCO<sub>2</sub> in the Pacific with Pacific sector of Southern Ocean, left panels: February, right panels: August, upper panels: results of this study as 1998-2008 climatology by neural network technique, lower panels: published climatology by Takahashi et al. (2009).

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These are well recognized phenomenon by shipboard observation. Western South Pacific of 15-45 degree S has lower  $pCO_2$  less than 350 µatm, however less observational data exists. The calculated difference of the two climatological maps is about 0.6 µatm. It has very small impact for the  $CO_2$  flux calculation, however, the NN estimate has advantage in the information of inter-annual variation and also in high spatial resolution.

We investigated another NN scheme to expand the technique for global estimation of  $pCO_2$ . Back-Propagation method is the candidate of applicable NN technique to ocean  $pCO_2$  estimation with global coverage, because of the less needs of computational power. As first trial, it was applied for estimating global ocean  $pCO_2$  climatology. The results showed good agreement with the SOM estimated  $pCO_2$  in the whole Pacific Ocean, shown above. The Back-Propagation method application including inter-annual variation is the next necessary step.



Figure 4. Estimation of dissolved inorganic carbon concentration (µmol kg<sup>-1</sup>) in the surface water of North Pacific from pCO<sub>2</sub> map and empirical formula for surface water alkalinity, left panel: February, right panel: August.

Using the  $pCO_2$  maps, mapping of DIC (dissolved inorganic carbon) in surface seawater was successfully done. DIC is a  $CO_2$  parameter more directly interacts to biological uptake of carbon in the surface ocean than  $pCO_2$ . The summer month's DIC decrease in the surface water column is useful for estimating the net community productivity. Estimation of summer draw down of DIC indicates distribution of biological productivity in the North Pacific, which has good similarity with that estimated from ocean color satellite. The mapping scheme is very new and unique results suggesting the difference of these productivities or f-ratio in the surface water with high spatial resolution.

## 4. Conclusion

Owing to the activity of this program, ocean surface  $pCO_2$  data from NIES VOS observation achieved very prompt manner in the release of the data set from web page. NIES contributed SOCAT activity for the 1st to 3rd versions in the quality control of submitted data set for North Pacific. Mapping of  $pCO_2$  using NN technique was applied for whole area in the Pacific and global application is in trial. The DIC mapping using the NN results well demonstrated the distribution of biological productivity in the North Pacific, having relationship with the CO<sub>2</sub> uptake of the ocean.

## Reference

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