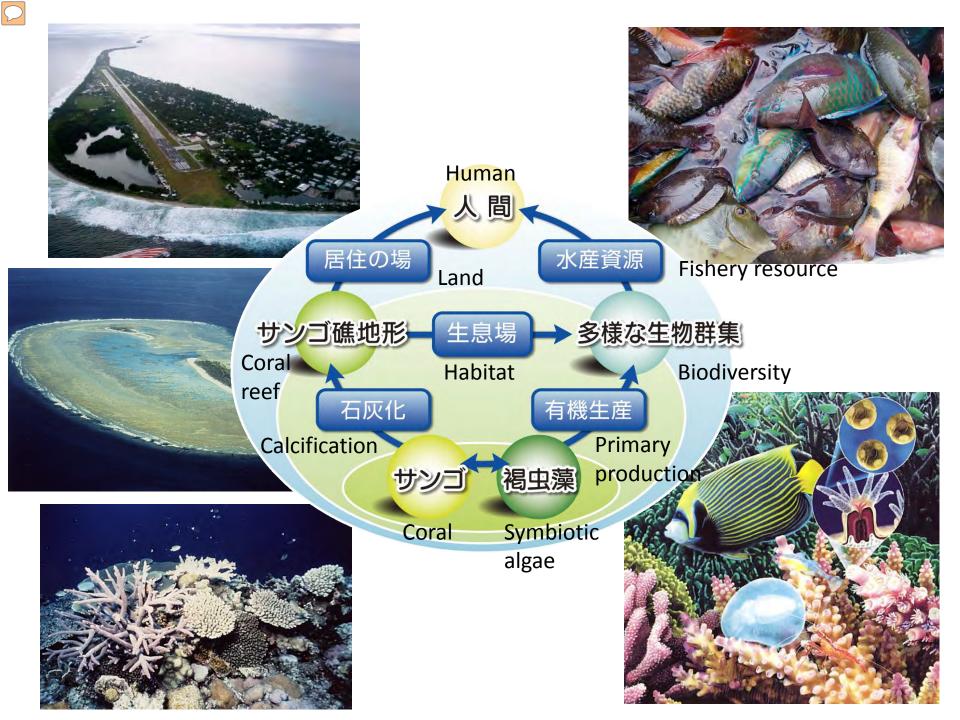


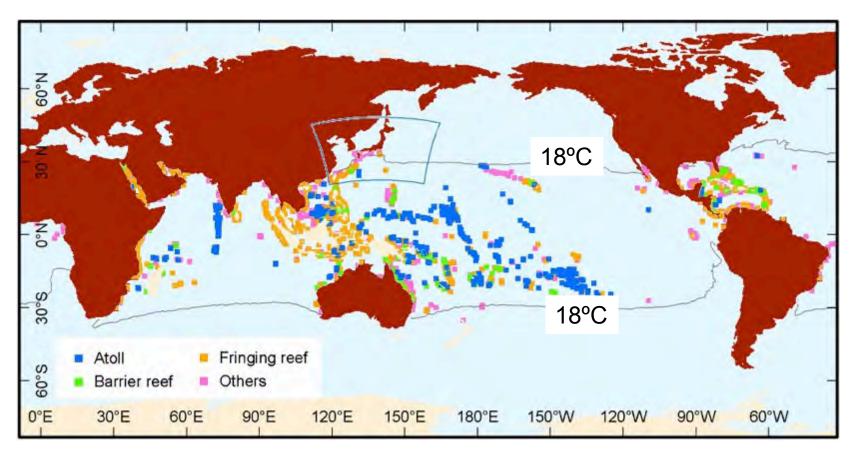
Hiroya Yamano and Naoki H. Kumagai (National Institute for Environmental Studies)

#### **Contents**

- Brief introduction of shallow-water corals and coral reefs
- Climate-related issues and corals: Global
- Climate-related issues and corals: Japan
- Conclusions



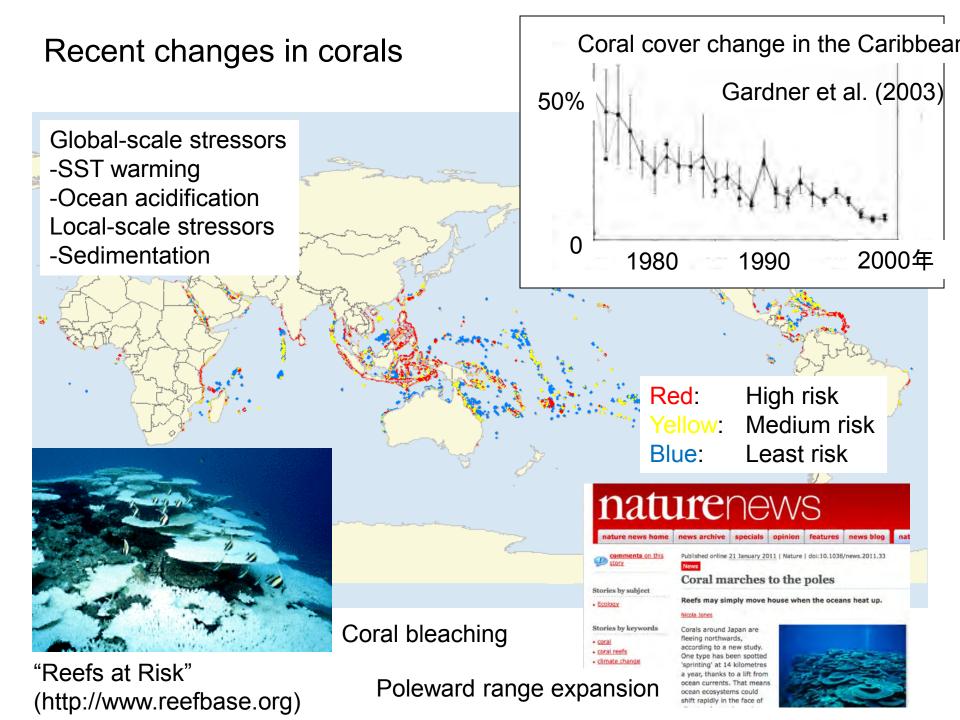
#### Coral reefs of the world



#### Japan:

ReefBase (http://www.reefbase.org)

- ➤ Transitional area (Subtropical Warm Temperate Temperate)
- ➤ Clear environmental gradient
- ➤ Less affected by continents
- ➤ Ideal setting to detect climate-induced effects



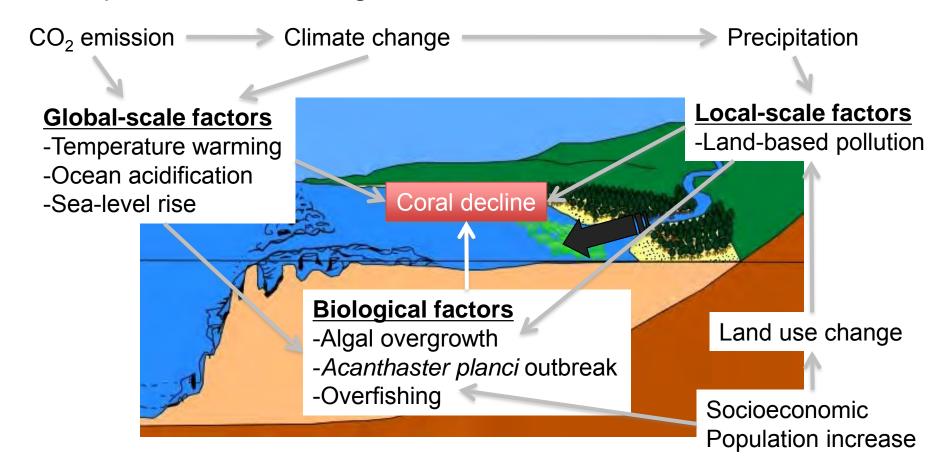
# Aichi Biodiversity Targets



## Target 10

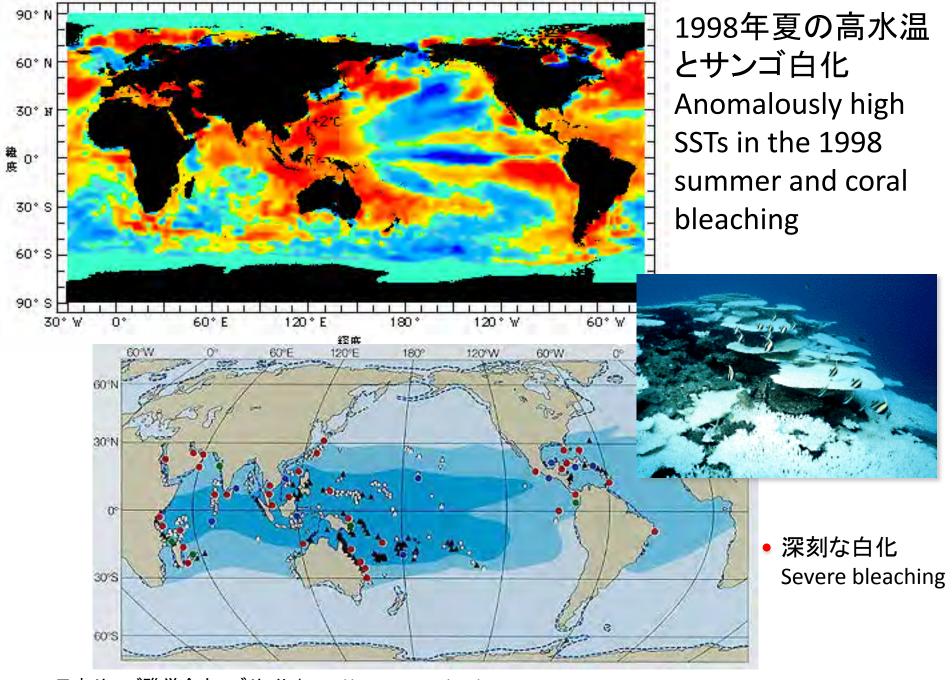
By 2015, the multiple anthropogenic pressures on coral reefs and other vulnerable ecosystems impacted by climate change or ocean acidification are minimized, so as to maintain their integrity and functioning.

## Multiple factors causing the distribution of corals



#### **Contents**

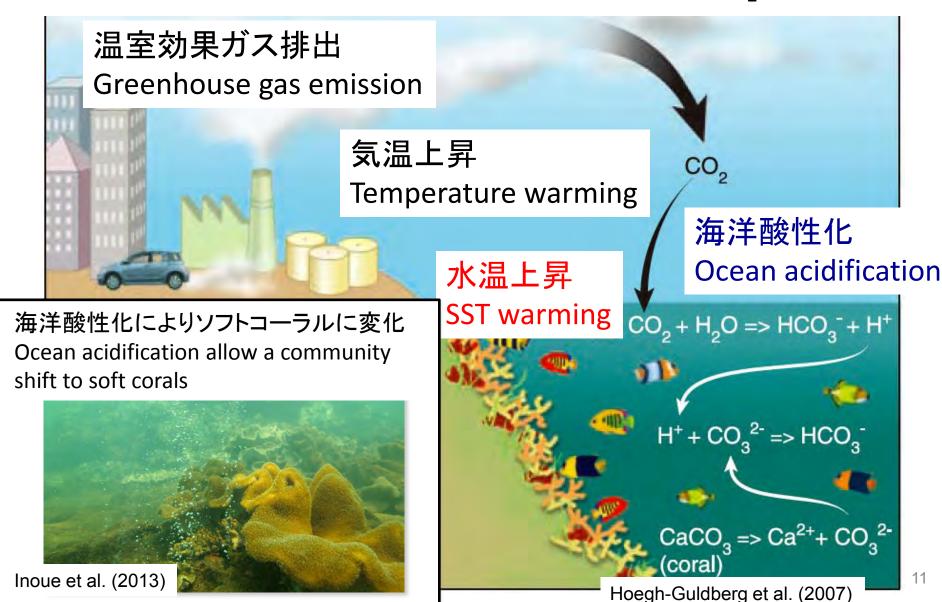
- Brief introduction of shallow-water corals and coral reefs
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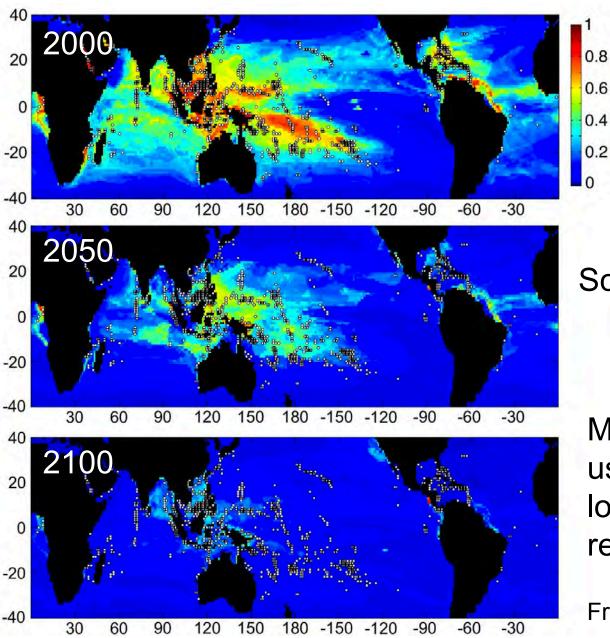
日本サンゴ礁学会ウェブサイト(http://www.jcrs.jp/wp/?page\_id=622)



# 海洋酸性化一地球温暖化と同時に進行するCO<sub>2</sub>問題 Ocean acidification – Another problem related to CO<sub>2</sub> emission



## Future habitat suitability based on SST and ocean acidification

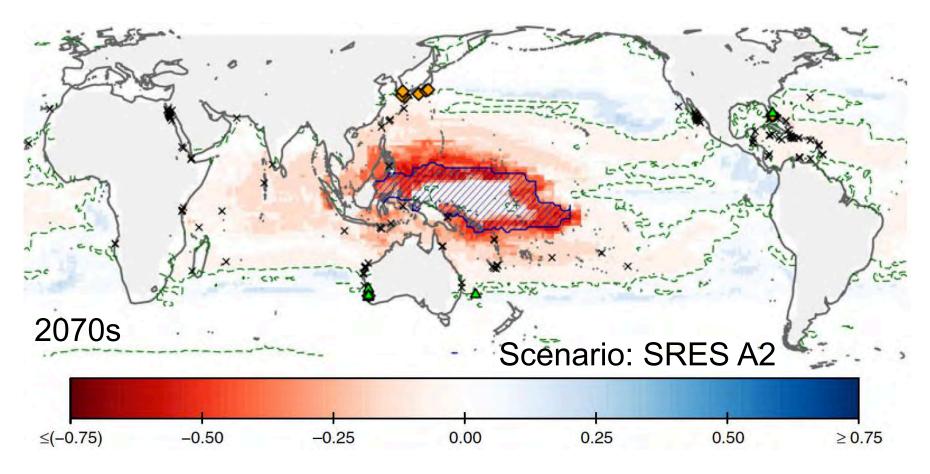


Scenario: RCP8.5

Maxent trained using the current location of coral reefs worldwide

Freeman et al. (2013) 12

#### Future habitat suitability based on SST and ocean acidification



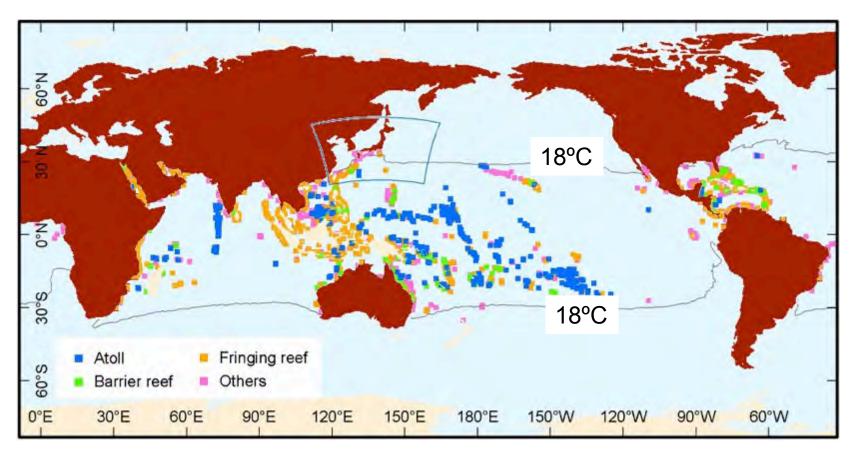
Maxent and other models trained using the current location of coral reefs worldwide

Couce et al. (2013)

#### **Contents**

- Brief introduction of shallow-water corals and coral reefs
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#### Coral reefs of the world

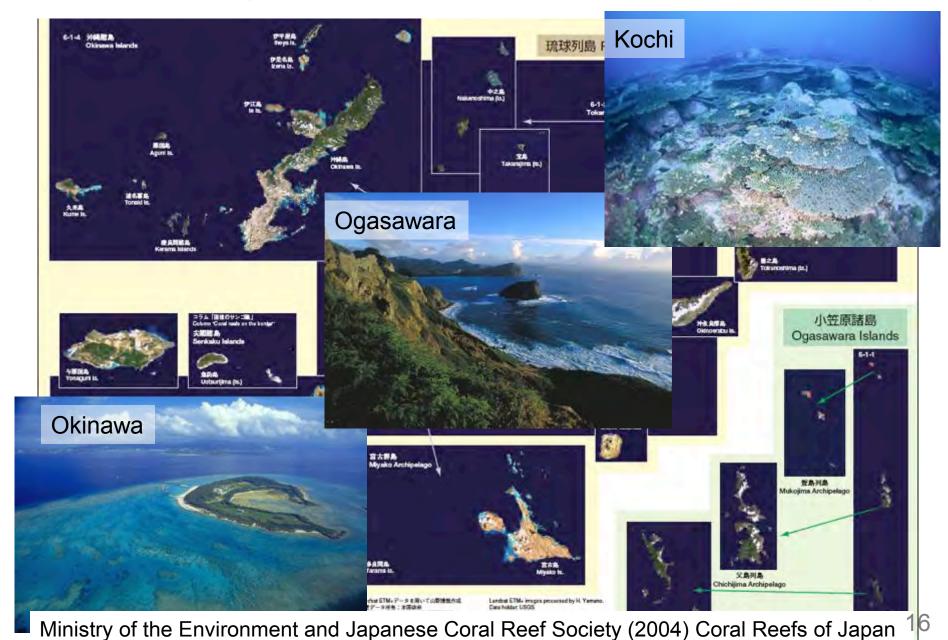


#### Japan:

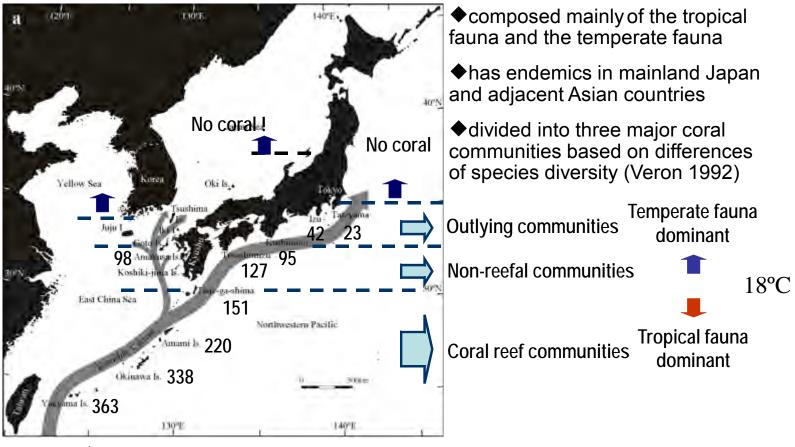
ReefBase (http://www.reefbase.org)

- ➤ Transitional area (Subtropical Warm Temperate Temperate)
- ➤ Clear environmental gradient
- ➤ Less affected by continents
- ➤ Ideal setting to detect climate-induced effects

# Latitudinal gradient of coral reef geomorphology



# Hermatypic coral fauna in Japan



◆coral species diversity in Japan decreases with increasing latitude

decrease in SST related to the Kuroshio Current (Veron and Minchin 1992)

# Latitudinal changes in coral communities

## Coral reef community



Coral reefs are found widely



- ♦high cover and higher diversity, clear coral zonation correlated with reef topography and water depth gradient
- ◆branching *Acropora, Montipora* and *Porites,* and massive *Porites* and faviids dominant in shallow lagoons (<3m deep)
- ◆tabular *Acropora*, Robust-branching *Pocillopora*, and massive-encrusting faviids characterize upper reef slopes (<10m deep)
- ◆foliaceous-encrusting *Montipora* and pectiniids, and massive-encrusting faviids common at the intermediate depths (10-20m deep) on reef slopes
- ◆foliaceous-encrusting agariciidsand *Porites*, and massive-encrusting faviids abundant on lower reef slopes (20-30m deep)





#### Non-reef community











- ♦ high cover and high diversity, unclear coral zonation
- ◆tabular *Acropora* dominant at the depths <10m (*A. hyacinthus* > *A. solitaryensis*)
- ◆associated with platy *Pavona decussata* and massive-encrusting faviids and *Porites* (mainly *P. heroensis*)
- ◆foliaceous-encrusting pectiniids dominant at the depths >10m associated with massive-encrusting faviids
- ◆blanching Acropora (A. pruinosa, A. striata?) also common in sheltered environments



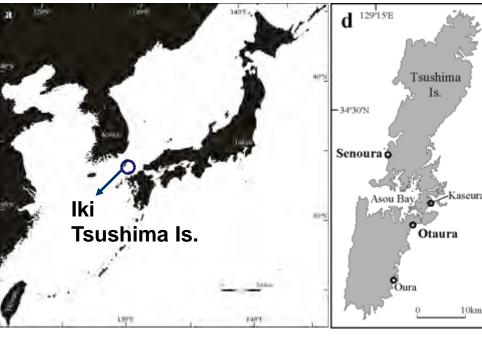
# Outlying community











- ◆high cover but low diversity, clear coral zonation
- ◆no tabular Acropora
- ◆massive Dipsastraea speciosa and Caulastrea tumida dominant at the depths <2m</p>
- ◆foliaceous-encrusting corals (*Echinophyllia* and *Lithophyllon*) dominant at the depths >2m
- ◆Massive Oulastrea crispataand Alveopora japonicainhabit the shallowest (<2m) and turbid areas
- ◆blanching *Acropora* ( *A. pruinosa*) also common

# Extreme marginal corals

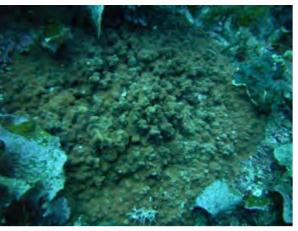


- Corals are distributed sparsely and do not form large communities
- Oulastrea crispata are distributed up to Sadogashima (37.5°N), where monthly mean low SST is 10°C

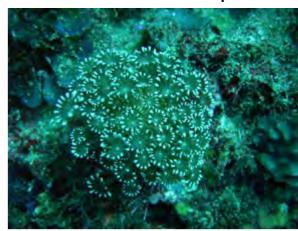
#### Endemic species



Oulastrea crispata

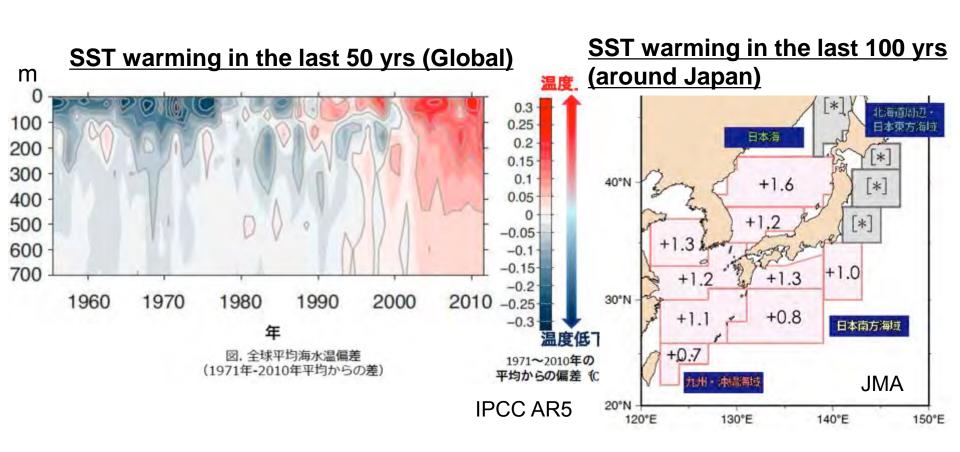


Psammocora profundacella



Alveopora japonica

# Rising sea surface temperatures (SSTs)

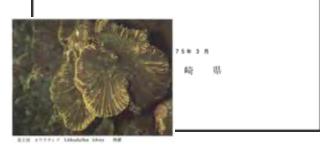


# Collecting past coral occurrence records

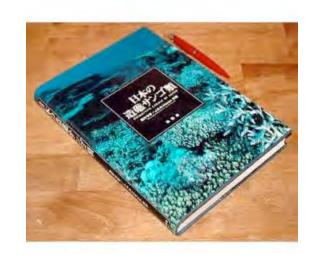




表崎県海中公園学術調査報告書 (上五島、平戸、九十九島地区)



~30,000 records



1930s Specimen stored in Tohoku Univ. Museum 1960s-1970s
Survey reports to designate marine parks

1980s Monograph (Nishihira and Veron, 1995)

#### Citizen science enhances data abundance

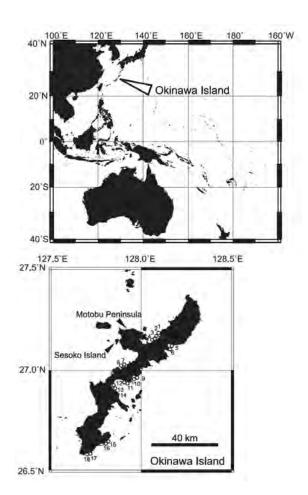


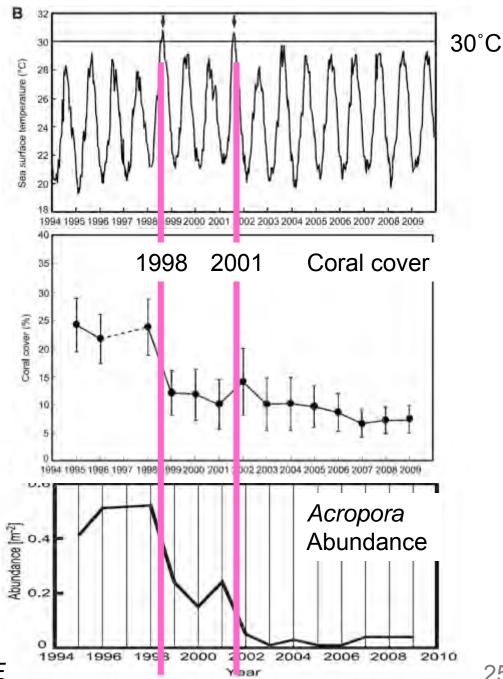
http://www.sangomap.jp 2008~



サンゴの 9割近くが白化 環境省調查35ヵ所沖縄「石西礁湖」 50m A

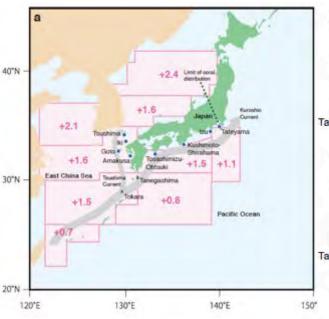
# Recent coral decline due to bleaching at subtropical area





Hongo and Yamano (2013) PLoS ONE

# Recent range expansion of corals at temperate area



Three subtropical species

and one warm-temperate

species showed range

Speed: up to 14km/year

expansions

Acropora hyacinthus

Tsushima
Iki
Goto
Amakusa
Tanegashima

Acropora muricata

Tsushima
Izu
Kushimoto-Shirahama
Tosashimizu-Ohtsuki
Tokara-Tanegashima

Tanegashima

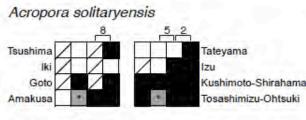
Acropora muricata

Tsushima
Iki
Goto
Amakusa
Tanegashima

Tanegashima

Tokara-Tanegashima

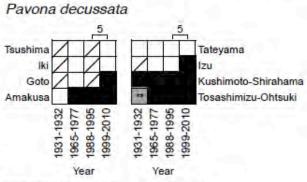
Tateyama
Izu
Kushimoto-Shirahama
Tosashimizu-Ohtsuki
Tokara-Tanegashima



A. hyacinthus@Goto



A. muricata@Goto



Pacific regions

East China Sea regions



A. solitaryensis@Tsushima

# Consequences of the coral range expansion

Obligate coral-dwelling crabs were found on *A. solitaryensis* colonies that settled recently in temperate areas

#### Reef sites

#### Ranges of obligate coral-dwelling crabs extend northward as their hosts move north



Fig. 1 One of the northernmost Acropova aslitaryenst colonies at Tateyama, Japan







Fig. 2 Orligate coral-dwelling codes associated with the northermune Acropson solitary-ensis colonies. a Cymomelomolacytise, b Trapecia symmetore, and e Tetralidae sp.

Recent sea-surface temperature warming may allow poleward range expansions of warm-water coral species into temperate areas. In Japan, Acropora solitaryensis Veron and Wallace, 1984 showed a poleward range expansion to Tateyama, on the southern tip of the Boso Peninsula (34°59′N and 139°47′E), based on the historical occurrence records and recent surveys (Yamano et al. 2011). The Boso Peninsula is located downstream of the Kuroshio warm current and is the northermost known coral community in the Pacific, although it is located beyond the limit of the coral reef distribution (Shimoike 2004).

In July 2011, we observed five A. solitaryensis colonies on sedimentary rock substrate at water depths of ~12 m in Tateyama (Fig. 1). Four of the colonies served as hosts for obligate coral-dwelling crabs, Cymo melanodactylus Dana, 1852 (on one A. solitaryensis colony) (Fig. 2a), Trapezia cymodoce (Herbst, 1801) (on two colonies) (Fig. 2b), and Tetraliidae sp. (on one colony) (Fig. 2c). These were the northernmost records for A. solitaryensis and its associates C. melanodactylus and T. cymodoce in their distribution ranges (Minemizu 2000). The radius of A. solitaryensis colonies ranged from 6 to 15 cm, suggesting that settlement occurred several years between 1994 and 2004, according to the published radius expansion rate (0.9 cm/year; Yamano et al. 2011). Our observations suggest rapid establishment by crab symbionts after warm-water coral settlement, which may lead to changes in biodiversity in temperate areas during global warming.

Acknowledgments We thank Hitoshi Narita for field support. This research was supported by the Ministry of the Environmens, Japan (Project No. S-9), and the Monitoring Project for Global Warming Effects on Marine Environments in the National Institute for Environmental Studies, Japan, and The Oceanic Wildfife Society.

#### References

Minemizu R (2000) Marine decaped and atomaped crustaceam mainly from Japan. Bun-ichi Sogo Shappan, Tokyo

Shimoke K (2004) Boso Penimula. In: Ministry of the Environment and Japanese Coral Reef Society (ed) Coral reefs of Japan. Ministry of the Environment, Tokyo, pp 232–233 Yamano H, Sughara K, Nomura K (2011) Rapid poleward range expansion of tropical reef corals in response to rising sea surface temperatures. Geophys Res Lett 38:L04601, doi:10.1029/2010GL046474

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#### I. Okuno

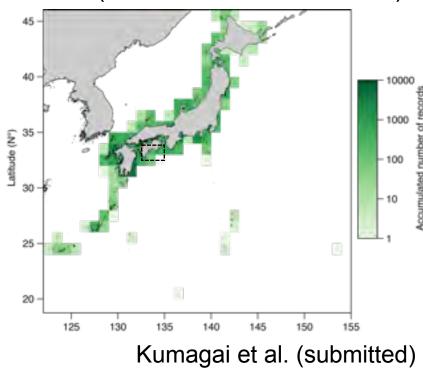
Coastal Branch of Natural History Museum and Institute, Chiba, 123 Yoshio, Katsuum, Chiba 299-5342, Japan

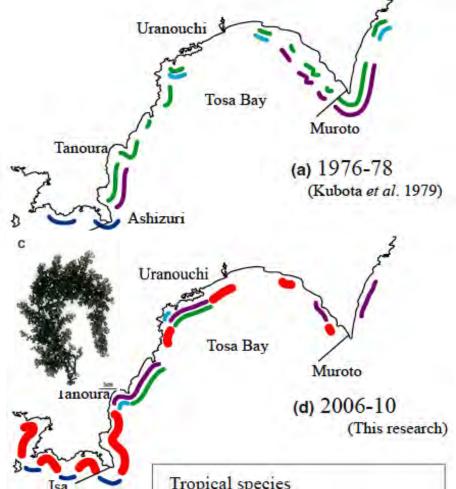
Received: 9 December 2011 / Accepted: 20 February 2012 / Published online: 3 March 2012 © Springer-Verlag 2012 Cornl Reefs (2012) 31:663 DOI 10.1007/s00338-012-0893-0

Yamano et al. (2012) Coral Reefs

# Range expansion of subtropical seaweeds

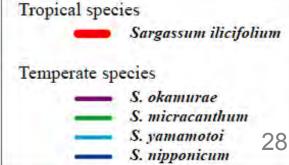
Collection of seaweed occurrence records (1970s-; ~41,500 records)



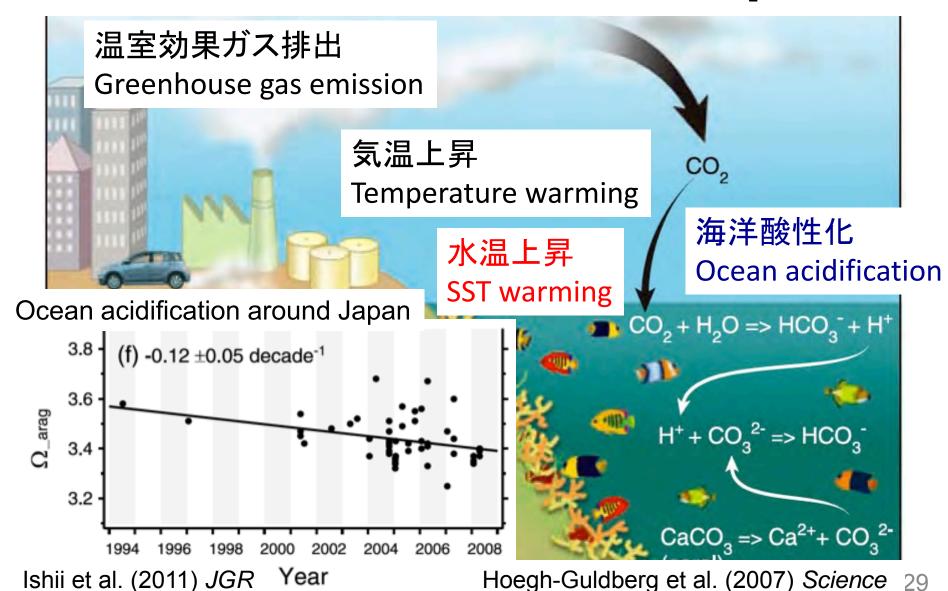


Range expansion of subtropical *Sargassum* (*S. ilicifolium* [formerly *S. duplicatum*])

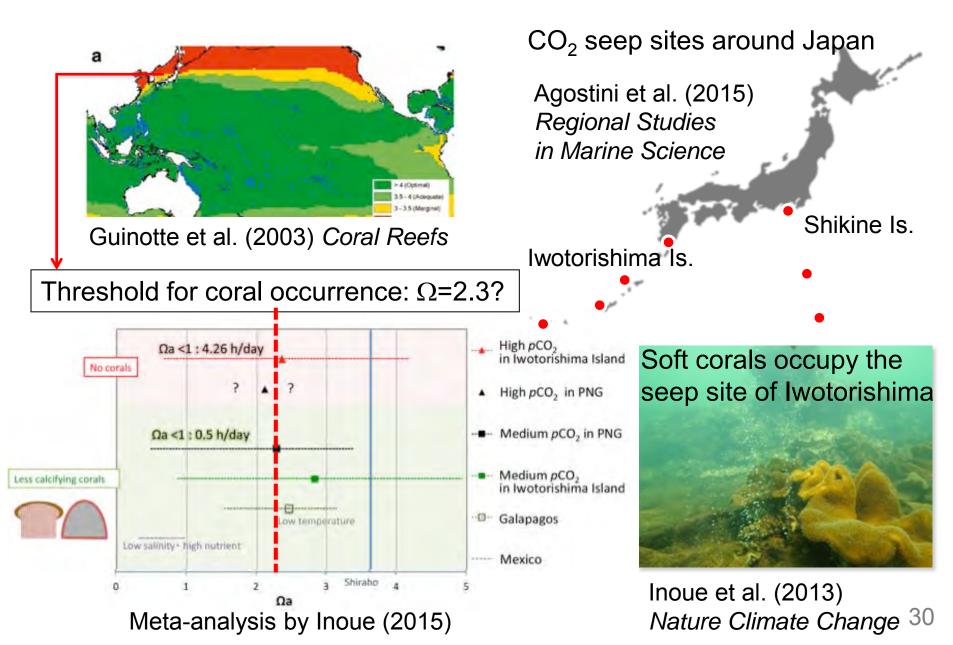
Tanaka et al. (2012)



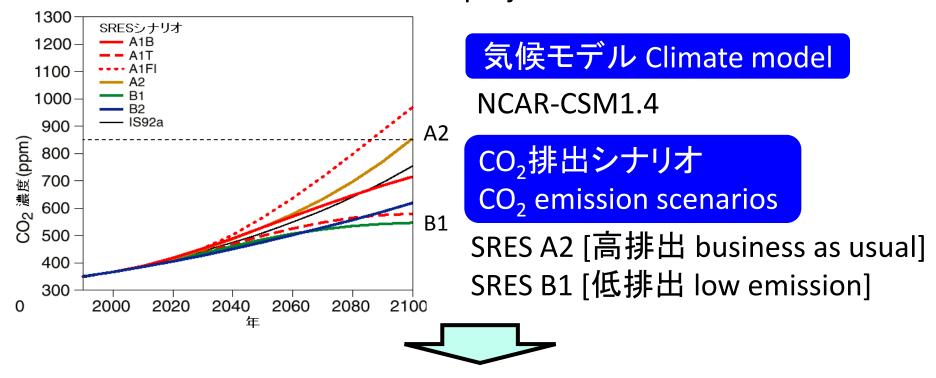
# 海洋酸性化一地球温暖化と同時に進行するCO<sub>2</sub>問題 Ocean acidification – Another problem related to CO<sub>2</sub> emission



# Another marginal feature: Aragonite saturation states



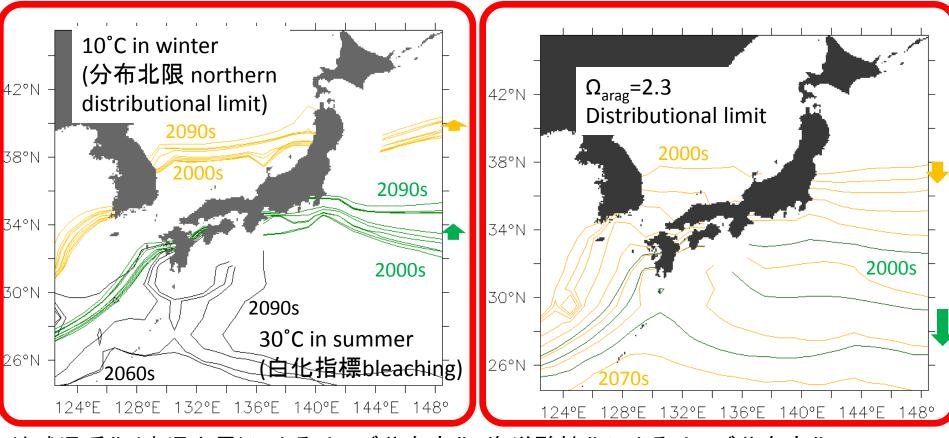
# 気候モデルを用いた予測 Future projection based on a climate model



地球温暖化(水温上昇)と海洋酸性化(アラゴナイト飽和度)予測 Projection of global warming (SST warming) and ocean acidification (aragonite saturation state; Ω<sub>arag</sub>)



# CO<sub>2</sub>高排出(SRES A2) シナリオによる予測 Projection based on the business as usual scenario

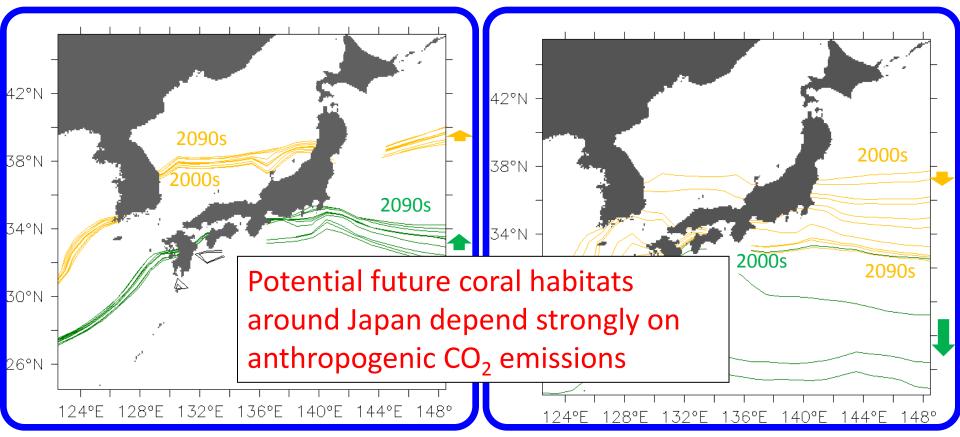


<u>地球温暖化(水温上昇)</u>によるサンゴ分布変化 Coral habitat change due to SST warming

<u>海洋酸性化</u>によるサンゴ分布変化 Coral habitat change due to ocean acidification

高水温(夏の水温>30°C)と海洋酸性化により、2070年代には日本近海からサンゴ消滅 Coral will disappear in the 2070s due to high SST and ocean acidification

# CO<sub>2</sub>低排出(SRES B1) シナリオによる予測 Projection based on the lowered emission scenario

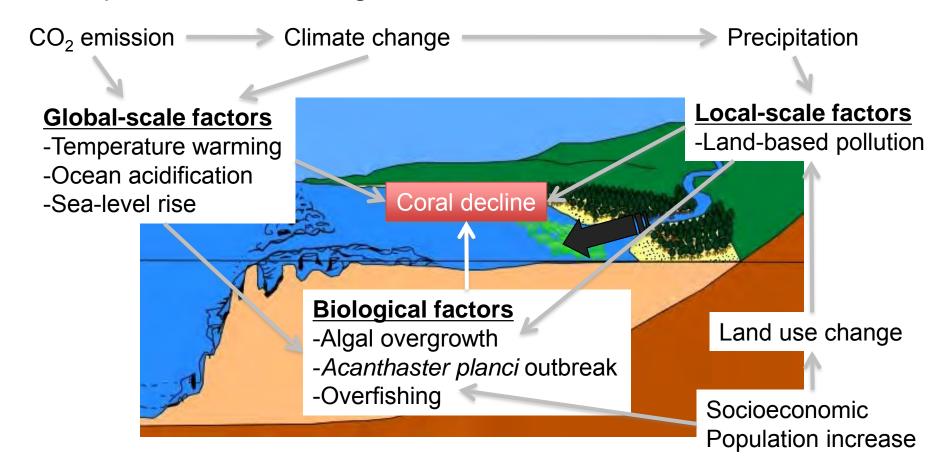


地球温暖化(水温上昇)によるサンゴ分布変化 海洋酸性化によるサンゴ分布変化 Coral habitat change due to SST warming

Coral habitat change due to ocean acidification

高水温は無く、海洋酸性化の影響は九州~四国まで No bleaching, and the effect of ocean acidification would be limited to higher latitudes Yara et al. (2016) In: Aquatic Biodiversity Conservation and Ecosystem Services

## Multiple factors causing the distribution of corals



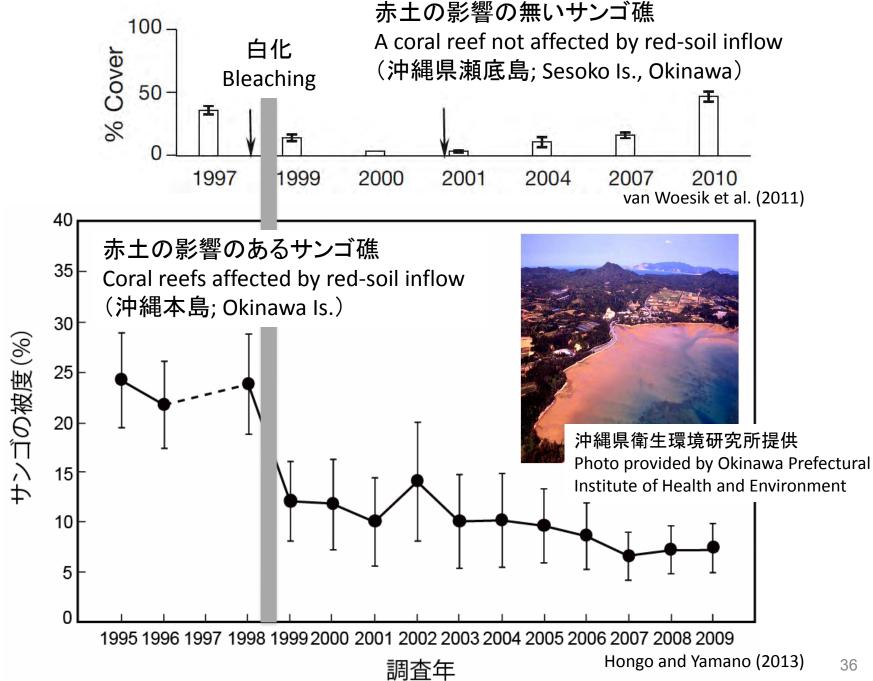
# Sediment discharge from farmland











## **Conclusions**

- Shallow-water corals are subject to multiple stressors at both global (SST warming and ocean acidification) and local (sediment discharge) scales
- Japan provides a unique opportunity (geographical setting and data abundance) to examine the relationship between environmental factors and corals
- Species Distribution Modeling may contribute to understanding the current/future coral distributions and set up conservation strategies to conserve corals

More on Species Distribution Modeling will be presented by Dr Kumagai



Predicting near-future changes in the distribution of temperate and tropical coral species in Japan

Naoki H. KUMAGAI (Nat. Inst. Envir. Stud., JP)

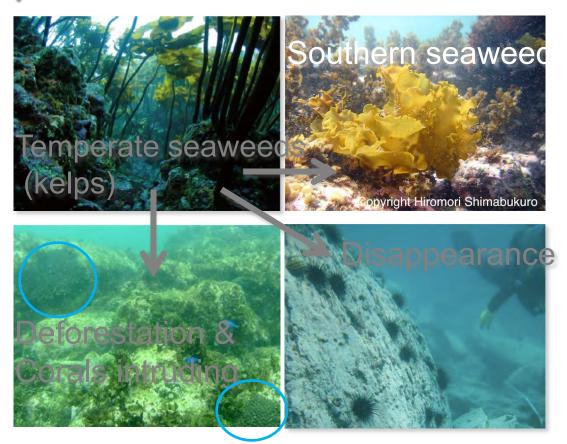


## Check points in Species Distribution Modelings:

- Dataset with less biases: sufficient range, balanced,
   presence/absence (e.g. "spatial sorting bias": Hijmans 2012 Ecology 93: 679–688)
- -> Dataset across Japan over 50 years
- Relative importance of temperature and other environmental factors (water and coastal characteristics) -> Multi-model
- Multi-collineality: correlated patterns among explanatory variables (Dorman et al. 2013 Ecography 36: 27–46) -> Use of PCA score
- 4. Biases by specific statistical model -> Model ensembling of 7 statistical methods

# Degradation of temperate seaweeds Expansion of tropical corals

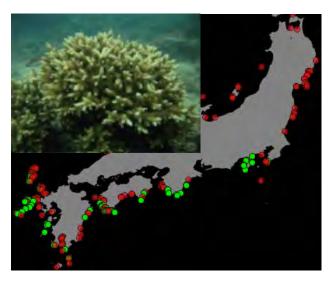




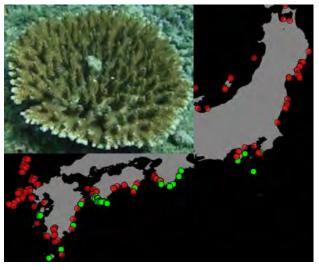
- Rising sea temperature -> physiology, herbivorous impact
- Overuse (terrestrial runoff, coastal development etc)



## Study species: 2 groups of reef-building corals



- 1. Temperate species (Acropora pruinosa)
- Sedentary species, not abundant
- -> Less susceptible to thermal stress?
- -> Range unchanged under temperature warming



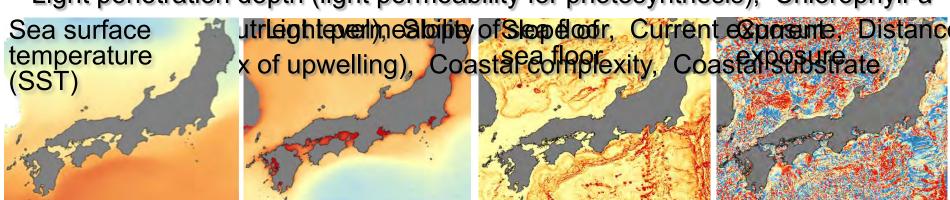
- 2. Tropical species (Acropora solitaryensis)
- Expanding species into temperate zone
- -> Responsive to thermal condition?
- -> Range expansion under temperature warming

## Materials & methods

- Collecting literature on historical records of occurrence
- Summarize into GIS dataset
   Compiling 9 environmental factors as explanatory variables
- Species distribution modelings
   (statistical models + machine learnings)
- -> Comparison: (1) sea temperature only model,
  - (2) temperature and water characteristics model,
  - (3) Full variables model (1, 2 and coastal characteristics)
- -> Predictions for each decade period (1990s, 2010s, 2030s)

## Environmental factors

- Spatial resolution: adjusted to 0.01°
- Sea surface temperature (SST):
- Miroc4h model (0.28125°×0.1875°): 1950–2005 (historical) / 2006–2035 (only RCP4.5 provided)
- Bias-correction with Optimum Interpolation Sea Surface Temperature (1986– 2005)
- Statistical interpolation with Multi-scale Ultra-high Resolution SST (0.01°, 2003–2012)
- Other 7 variables (used as constant)
- Light penetration depth (light permeability for photosynthesis), Chlorophyll-a





# Species distribution modelings (SDMs)

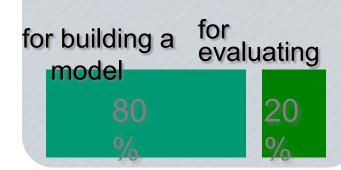
- 1. 7 methods of SDMs using 9 explanatory variables
- 2. Prediction performances were evaluated with cross-validation
- 3. Predictions were ensembled to reduce model biases ("biomod2" in R)

## 7 SDMs:

- Statistical models: GLM, GAM, MARS Multivariate additive regression splines
- Machine learnings: BRT Boosted regression tree, RF Random forest, ANN Neural network,

### Maxent

At each model running, data was split randomly —> repeat 10 times (cross-validation)

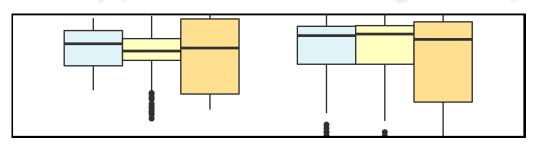


7 model methods x 10 cross-validations = 70 models

- Low performance models with AUC < 0.7 were avoided
  - (AUC score was adjusted by the method of maximizing sensitivity + specificity)
- Ensemble selected models with weighting by their AUC scores

# Comparing performances of SST indices

Accuracy (correction rate including chance predictions)



(coldest month) max(warmest month)

AUC (model performance against chance predictions)

······ Random

Outliers

3rd quantile

Median

1st quantile

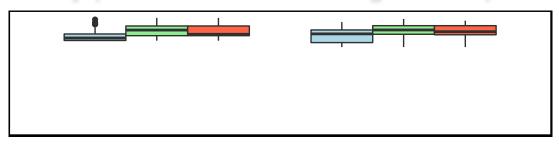
Outliers

- Mean SST was better predictor than min and max SST for both species
- Max/Min SST: principal components score of PCA, substitute for max and min SST to avoid multicollinearity (correlations among variables)

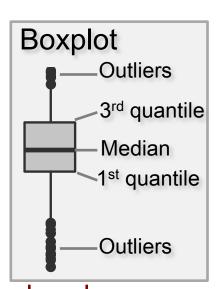
## $\bigcirc$

## Comparing performances among 3 models

- 1. SST model: Mean SST, Max/Min SST (warmest/coldest month: score of PCA)
- 2. SST & Water model: SST indices and water characteristics (Light permeability, chl-a)
- 3. Full variables model: SSTs, Water characteristics, and coastal characteristics (Slope of sea floor, Current exposure, Distance to deep sea, Coastal complexity, Accuracy (Correction rate including chance predictions)



AUC (model performance against chance predictions)

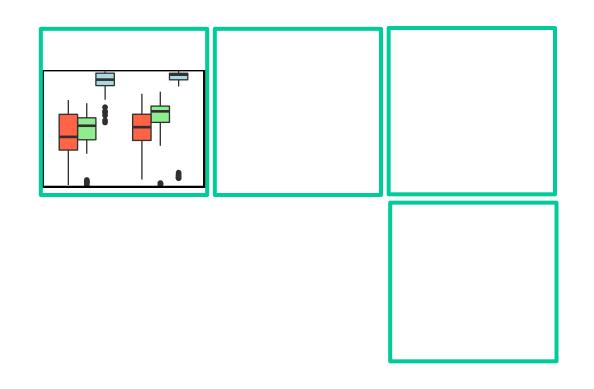


Temperate

Tropical

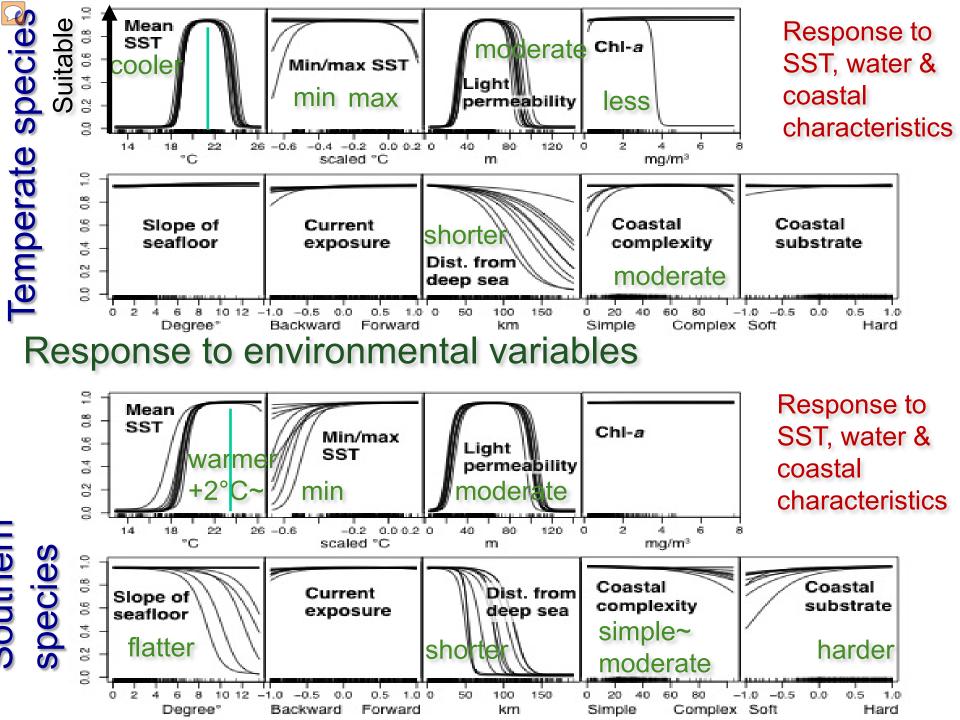
 With adding variables, model performance improved and prediction errors reduced (Full variables model was the best)

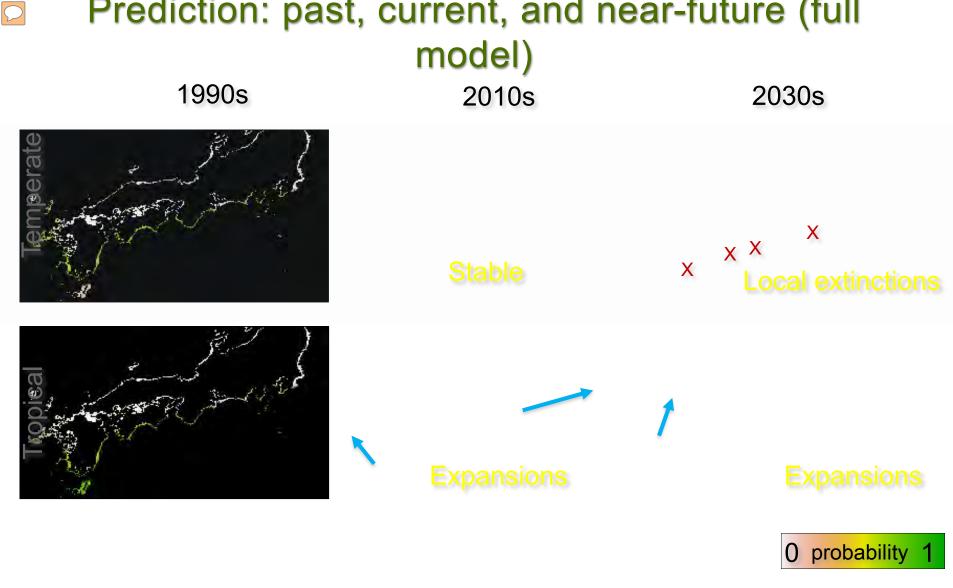
## Importance for environmental variables



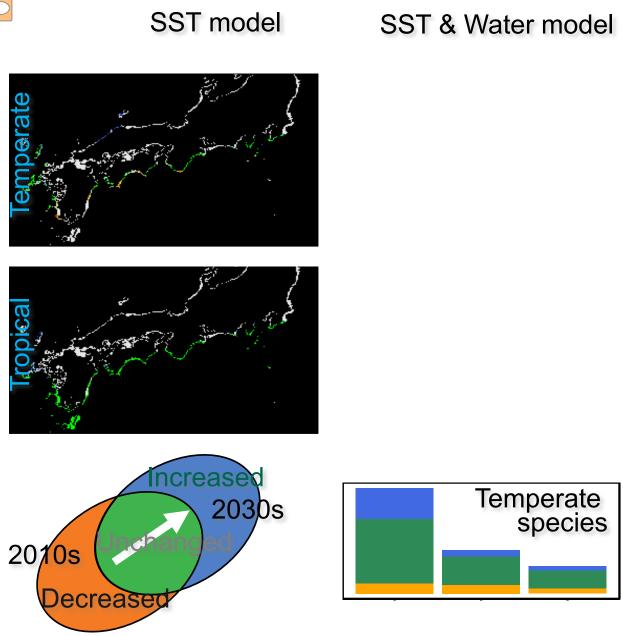
- Patterns of variable importances were similar between the species
- ●1<sup>st</sup>: Mean SST; 2<sup>nd</sup>: Light permeability; 3<sup>rd</sup>: Dist. Deep sea

les





- Temperate species: habitat contractions around southern edges
- Tropical species: habiat range expanded north-easternward



 SST model, SST & Water model overestimated habitable area and habitat changes

●Temperate sp · Decrease ≈ Increase · Tropical sp · Decrease << Increase

Full variable model

Tropical

species

## Summary

- What is the relative importance of temperature and other environmental factors in predicting seaweed distributions?
- —> Mean temperature was the main factor, but light permeability and coastal characteristics were also important factors
- -> Considering local managements of coastal land uses and terrestrial runoff could improve habitat suitability of seaweeds
- How do the distributions change from current to near-future climates?
- -> Temperate species shifted northward with contracting habitable area
- –> Southern species shifted northward almost in parallel

The results provide basis for adaptive management of coastal ecosystems to climate change