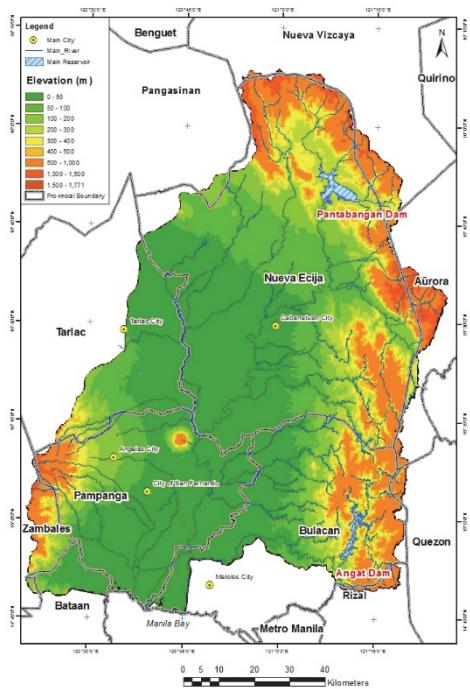


*“SOUSEI” is a Japanese word which means “generation” or “creation”.*



# Flood/Drought Risk Assessment under Climate Change in Asia



Pampanga River Version

International Centre for Water Hazard and Risk Management under the auspices of UNESCO (ICHARM),

Public Works Research Institute (PWRI), Japan



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2. Outline of SOUSEI Program
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  - 4.2 Flood risk assessment under climate change
  - 4.3 Drought risk assessment under climate change
5. Issue to be solved
6. Conclusion

# 1. Background

## Three Key Global Agendas in 2015

Understanding      Governance      Investment      EW/BBB



Concerted Action is Required

Reducing Current Risk

Preventing Future Risk

Adaptation & Recovery

Building Resilience



Sustainable Development

# 1. Background

## CMIP5 (Coupled Model Intercomparison Project Phase 5)



<http://cmip-pcmdi.llnl.gov/cmip5/>

- At a September 2008 meeting involving 20 climate modeling groups around the world agreed to promote a new set of coordinated climate model experiments.
- These experiments comprise the **fifth phase of the Coupled Model Intercomparison Project (CMIP5)**.
- **More than 50 General Circulation Model (GCM) datasets** for IPCC AR5 studies.



## Intergovernmental Panel on Climate Change (IPCC) 5<sup>th</sup> Assessment Report (AR5) (2013)

### ✓ RCP (Representative Concentration Pathway)

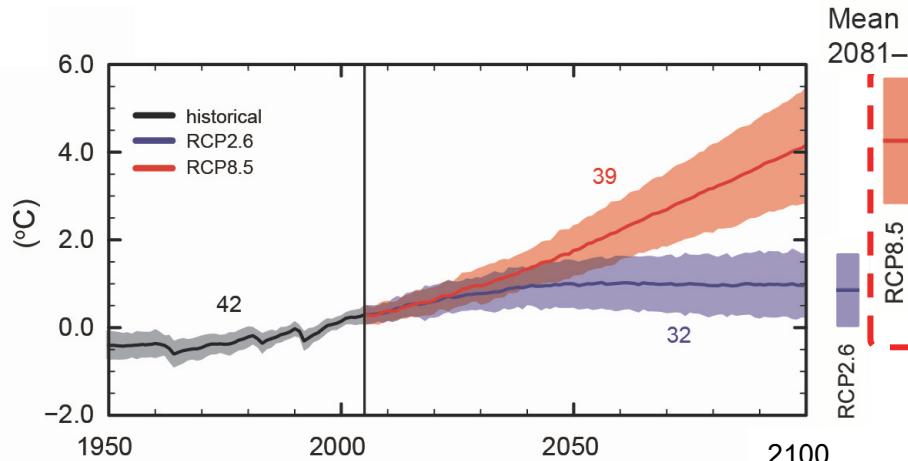


Fig. Global average surface temperature change (in AR5)

**RCP8.5: Business as usual scenario with highest GHG emission in RCPs.**

RCP 2.6: Global annual GHG emissions peak between 2010-2020, with emissions declining substantially thereafter.

RCP 4.5: GHG emissions peak around 2040, then decline

RCP 6 : GHG emissions peak around 2080, then decline

RCP 8.5, emissions continue to rise throughout the 21st century

## 2. Outline of SOUSEI Program (1/2)



### Objectives

To create new basic information required for **managing water-related disaster risks resulting from climate change in the river basin scale.**

### Outline

- The program is a five-year (2012-2016) research program **funded by MEXT** (Ministry of Education, Culture, Sports, Science and Technology, Japan).
- Co-workers are Kyoto Univ., Yamanashi Univ., etc., and the research collaborators in relative governments.

### Basic technologies to develop

1. Prediction of the **change of rainfall** under the climate change,
2. Development of **hydrological model**,
3. **Flood/Drought hazard analysis** for future condition using hydrological model,
4. **Flood/Drought risk assessment** on socio-economic activities for future condition,
5. Promotion of adaptation measures against the climate change

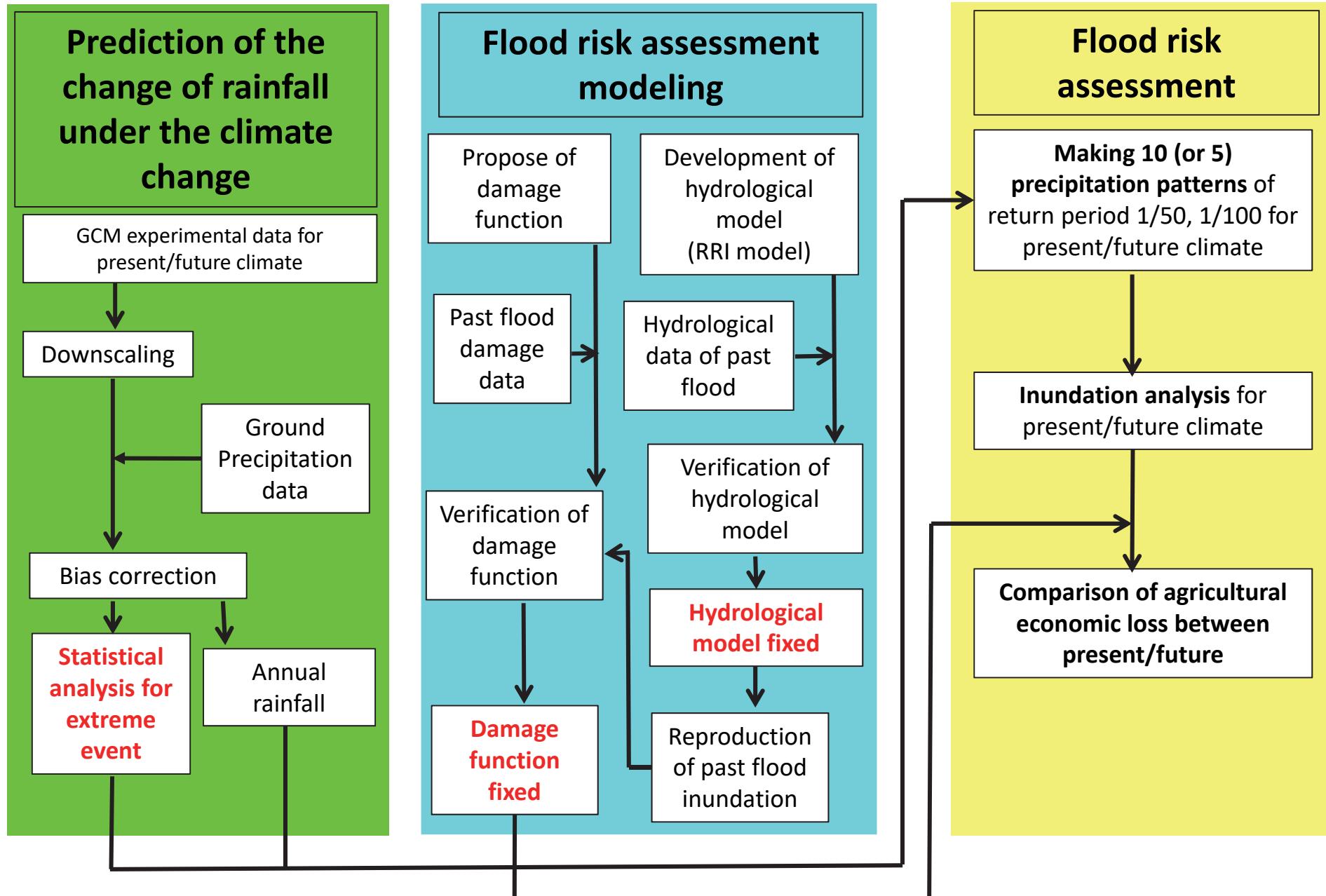
## 2. Outline of SOUSEI Program (2/2)



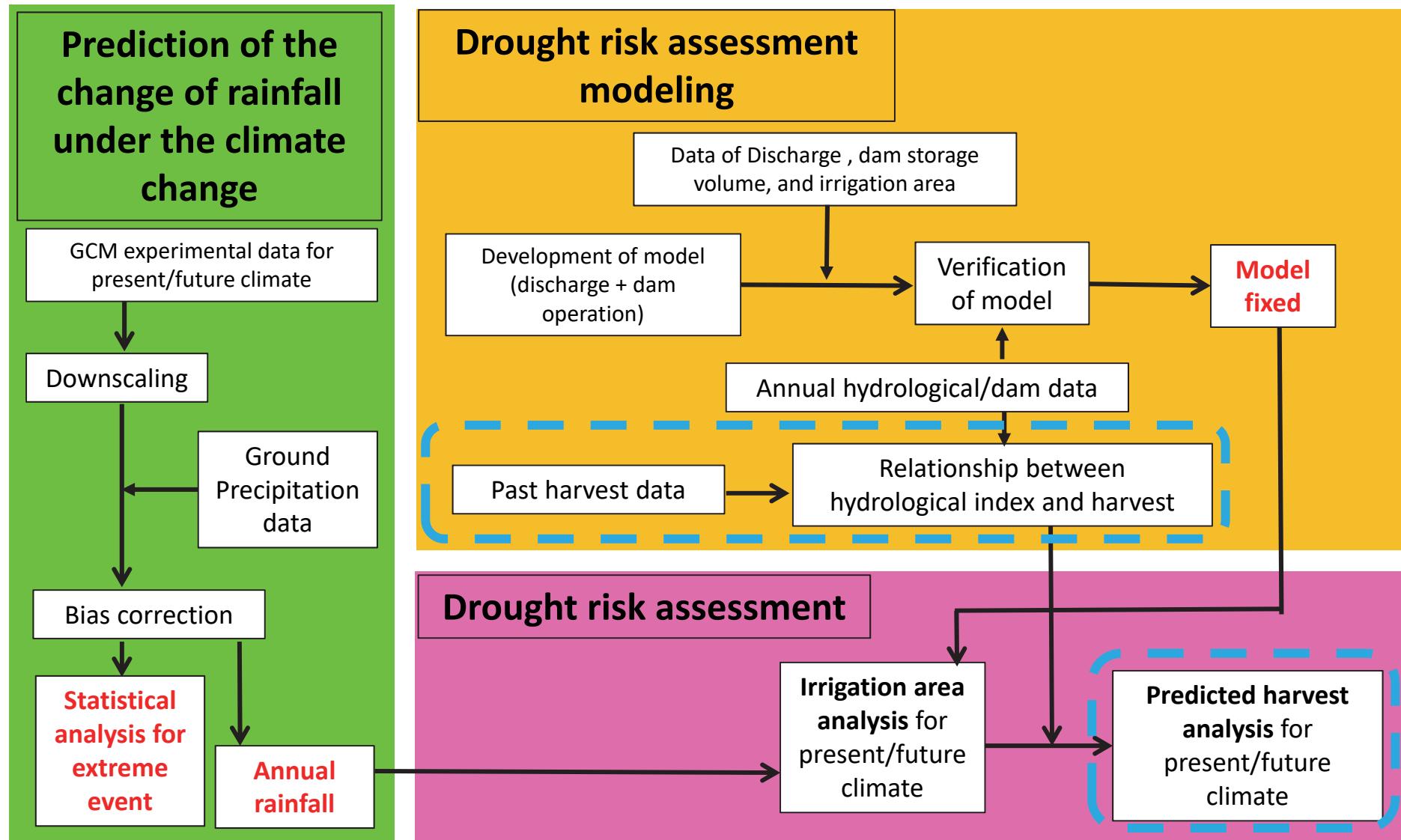
River basins with various characteristic

River	Attribute	Basin area (Thousand km <sup>2</sup> )	Population in basin (Thousand)
Indus	Continent, Semi-Arid, Snowmelt	1170	237,000
Mekong	Continent, Monsoon, Dam	800	60,000
Chao Phraya	Continent, Monsoon, Dam	160	28,000
Solo	Islands, Volcano, No Typhoon	16	17,000
Pampanga	Islands, Volcano, Typhoon	11	5,800

### 3. Research Methodology (1/2)



### 3. Research Methodology (2/2)



 Under researching

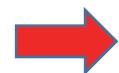
### 3. Research Methodology 3.1 Rainfall change assessment

#### GCM experimental data for present/future climate

**Input data:**  
CMIP5 dataset, etc.

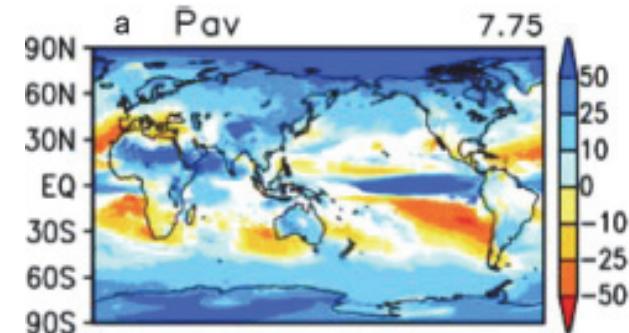


**Atmospheric General  
Circulation Model:**  
**MRI-AGCM 3.2S**



**Output:**  
Precipitation change

**Hydrological Effect of  
Global Warming**



(Kitoh & Endo, 2016 WCE)

**Present Climate Experimental  
Data (1979-2003)**  
1 pattern

Initial/Boundary Conditions:  
Green house gas (GHG), Sea surface  
temperature (SST), sea ice, etc.,  
based on the observation

**Future Climate Experimental  
Data (2075-2099)**

4 patterns (MME, C1, C2, C3)

Initial/Boundary Conditions:  
GHG (RCP8.5), etc.,  
4 types of SST & sea ice fields based

on 28 GCMs in CMIP5 RCP8.5  
experiment (MME, C1, C2, C3)

[Refer next slide]

#### Merits of MRI-AGCM:

- ✓ Horizontal resolution is higher (20km) than those of coupled GCMs (CGCMs) in CMIP5 (100+km)  
→ Better precipitation (topography, TCs, etc.)
- ✓ Uncertainty in CGCMs can be separated:
  - Uncertainty of model physics
  - Uncertainty of SST distribution

#### Reference:

- ✓ Kitoh, A. and H. Endo (2016) Changes in precipitation extremes projected by a 20-km mesh global atmospheric model, *Wea. and Clim. Extremes*, 11, 41-51, DOI:10.1016/j.wace.2015.09.001.
- ✓ Mizuta, R., H. Yoshimura, H. Murakami, M. Matsueda, H. Endo, T. Ose, K. Kamiguchi, M. Hosaka, M. Sugi, S. Yukimoto, S. Kusunoki and A. Kitoh (2012) Climate simulations using MRI-AGCM3.2 with 20-km grid, *J. of Meteor. Soc. of Japan*, 90A, 233-258, DOI:10.2151/jmsj.2012-A12.
- ✓ Mizuta, R., O. Arakawa, T. Ose, S. Kusunoki, H. Endo and A. Kitoh (2014) Classification of CMIP5 future climate responses by the tropical sea surface temperature changes, *SOLA*, 10, 167-171, DOI:10.2151.sola.2014-035.

### 3. Research Methodology 3.1 Rainfall change assessment



## 4 types of Sea Surface Temperature (SST) & sea ice fields based on 28 GCMs in CMIP5 RCP8.5 experiment (MME, C1, C2, C3)

Cluster 1 (C1):

8 MRI-AGCM3.2S models with nearly uniform warming in the both hemispheres

Cluster 2 (C2):

14 models with a larger warming over the central equatorial Pacific (so-called El Niño-like pattern)

Cluster 3 (C3):

6 models with a larger warming in the Northern Hemisphere than in the Southern Hemisphere.

The mean of these 28 CMIP5 models (MME):

a baseline future precipitation while C1, C2 and C3 cases represent climate change uncertainty.

Reference:

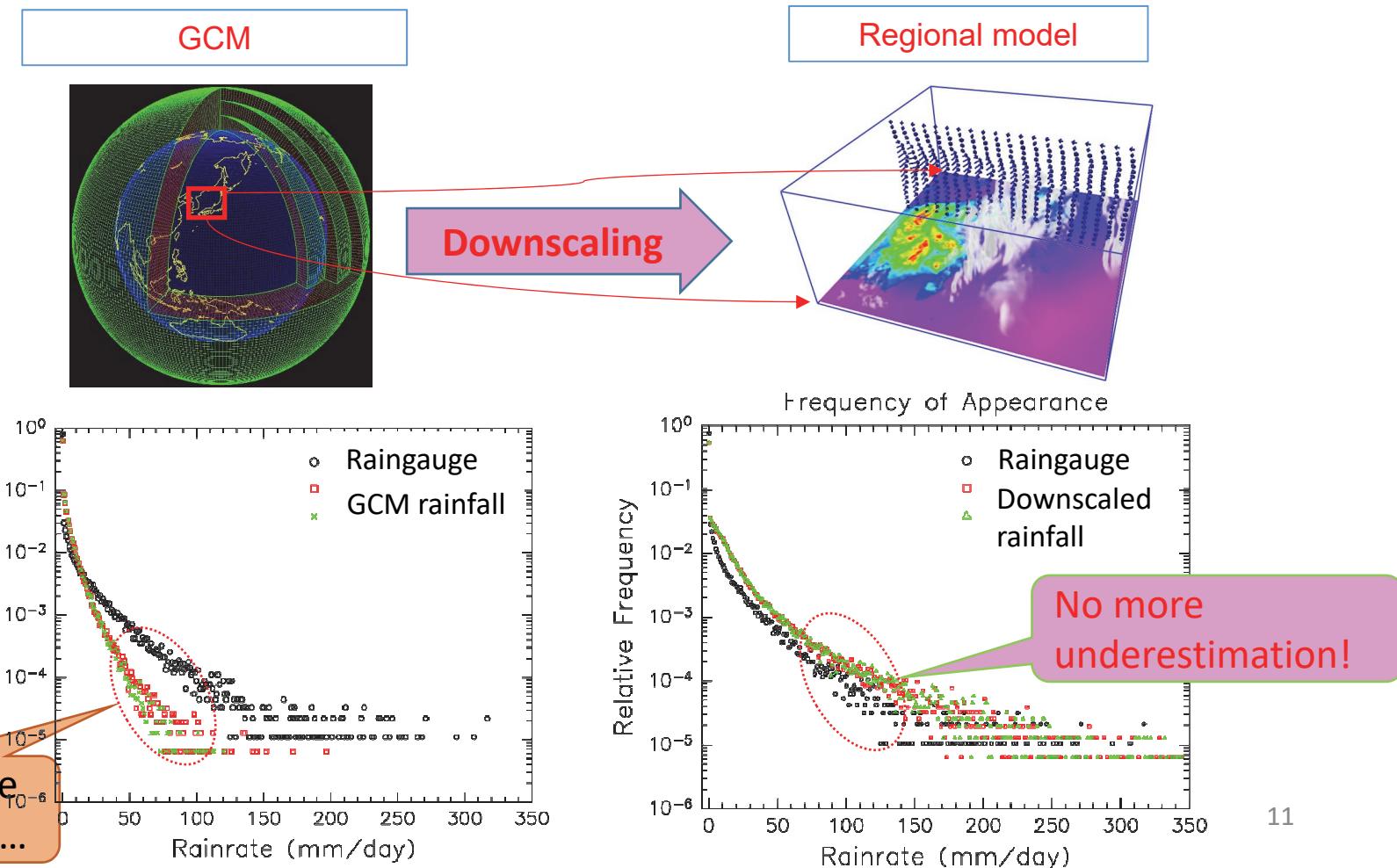
✓ Mizuta, R., O. Arakawa, T. Ose, S. Kusunoki, H. Endo and A. Kitoh (2014) Classification of CMIP5 future climate responses by the tropical sea surface temperature changes, SOLA, 10, 167-171, DOI:10.2151.sola.2014-035.

### 3. Research Methodology

#### 3.1 Rainfall change assessment

##### Dynamic downscaling

- General Circulation Model (GCM) is **too coarse** to compute precipitation processes in typically 20-30 km size clouds with the effect of complex terrains.
- Dynamic downscaling by a regional model reproduces **more accurate** rainfall via realistic representation with high resolution model in a limited area.



### 3. Research Methodology

#### 3.1 Rainfall change assessment

##### Bias correction

✓ **Climate models exhibit systematic errors (biases) in their output.**

These errors can be due, among others, to:

- Limited spatial resolution (horizontal and vertical)
- Simplified physics and thermodynamic processes
- Numerical schemes
- Incomplete knowledge of climate system processes



- **Initial GCM result should be tuned to the observation data by bias correction.**
- **The ratio can be used to get bias corrected GCM future value.**

The main assumptions of bias correction methods are:

- Quality of the observations database limits the quality of the correction.
- It is assumed that the bias behaviour of the model does not change with time.
- Limitation: Temporal errors of major circulation systems can not be corrected.

### 3. Research Methodology

#### 3.1 Rainfall change assessment

##### Concept of bias correction method for GCM -Hybrid Method- (1/2)

###### A) Extreme Value

⇒ The samples in top 0.5% of prob. of non exceedance are considered.

###### B) Other value

⇒ They are divided into each month.

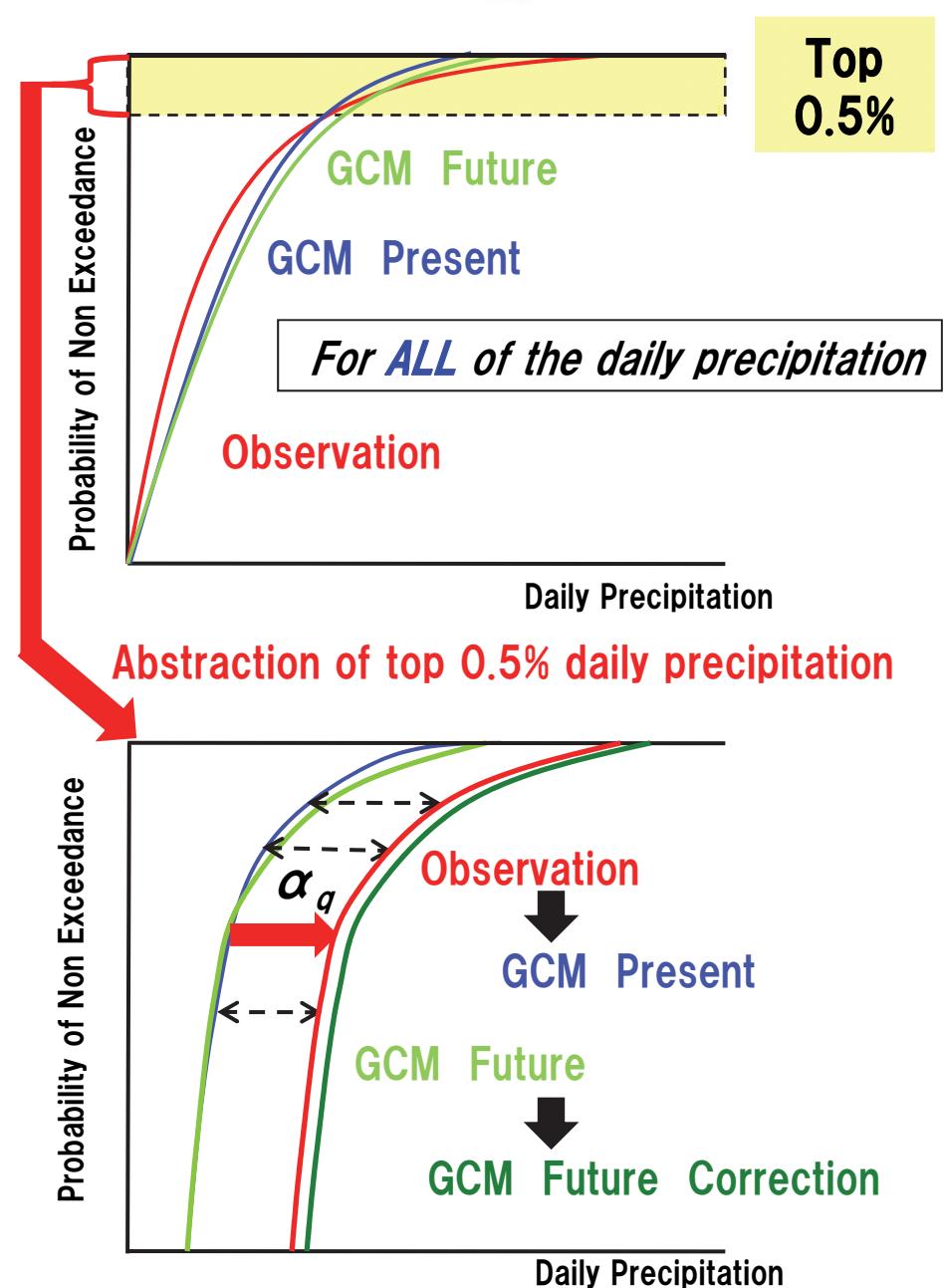
① The samples in top 0.5% on probability of non exceedance for observation, GCM Present and GCM Future are abstracted.

② The ratio for each quantile ( $\alpha_q$ ) between observation (Red line) and GCM Present (Blue line) is estimated.

$\alpha_q$  is regarded as a correction coefficient for each quantile and multiplied to the value of GCM Future (Light Green line) of same quantile and corrected value (Dark green line) is obtained.

###### Reference:

Inomata, H., K. Takeuchi and K. Fukami (2011) Development of a statistical bias correction method for daily precipitation data of GCM20, J. of Japan Soc. of Civil Engineers, Ser. B1 (Hydraulic Engineering), 67, I\_247-I\_252, DOI:10.2208/jscejhe.67.I\_247.



### 3. Research Methodology

#### 3.1 Rainfall change assessment

##### Concept of bias correction method for GCM -Hybrid Method- (2/2)

③ Samples except top 0.5% on observation, GCM Present and Future are divided into each month.

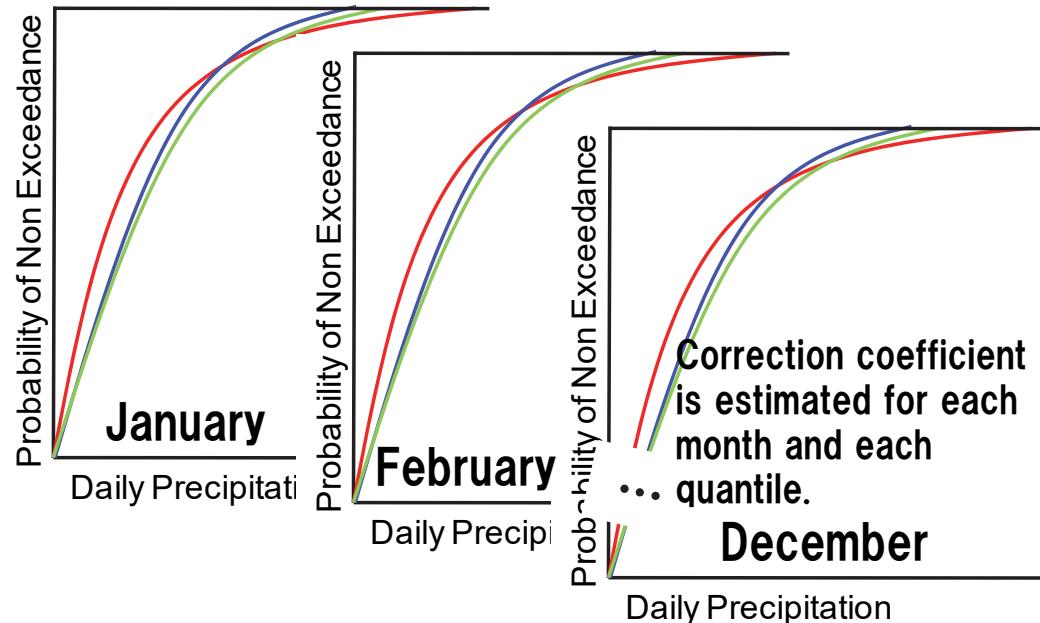
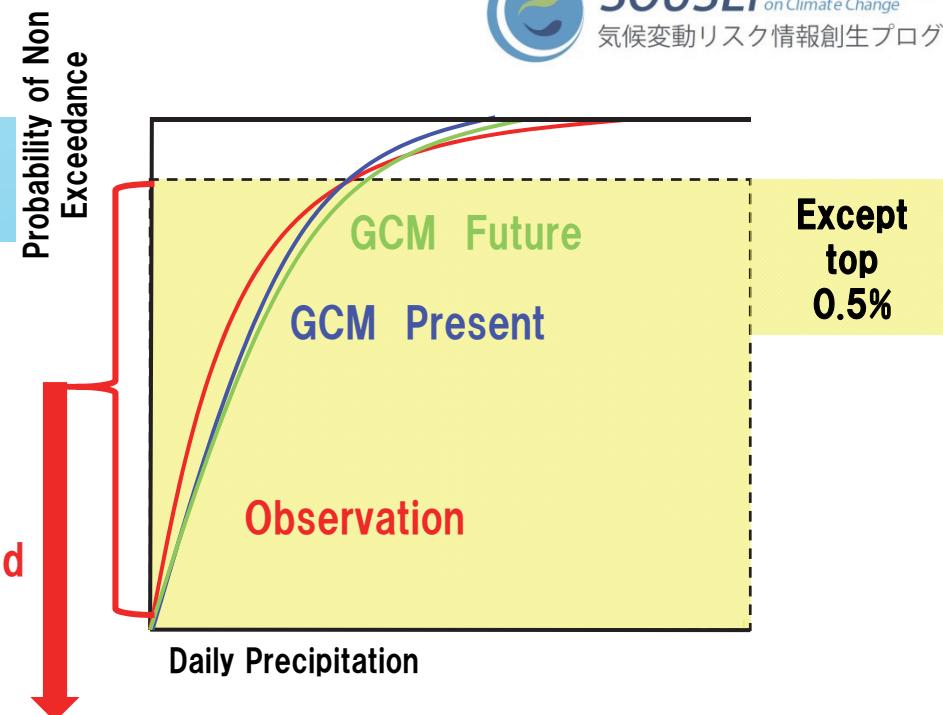
Samples except top 0.5% is divided into each month.

④ The ratio between observation (Red line) and GCM Present (Blue line) is estimated for each month and each quantile ( $\alpha_{m,q}$ ).

$\alpha_{m,q}$  is regarded as correction coefficient and multiplied to GCM Future of same month and same quantile (Light Green line) and corrected value is obtained.

##### Reference:

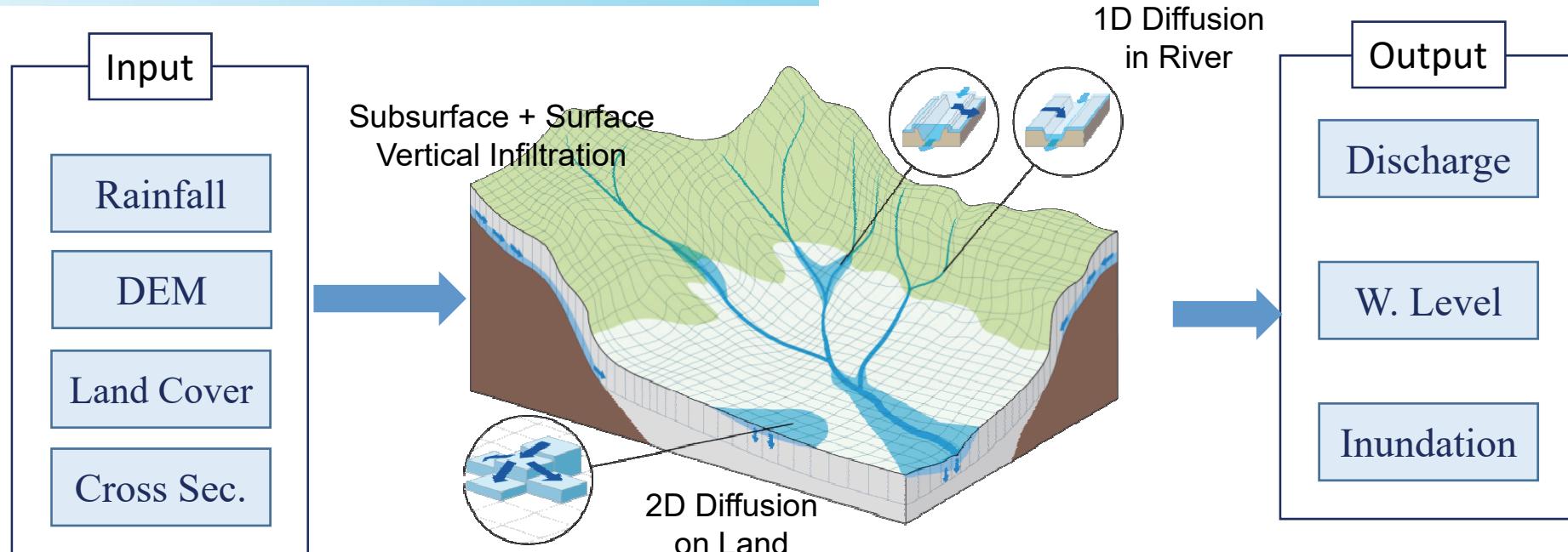
Inomata, H., K. Takeuchi and K. Fukami (2011) Development of a statistical bias correction method for daily precipitation data of GCM20, J. of Japan Soc. of Civil Engineers, Ser. B1 (Hydraulic Engineering), 67, I\_247-I\_252, DOI:10.2208/jscejhe.67.I\_247.



### 3. Research Methodology

#### 3.2 Flood risk assessment

#### Rainfall-Runoff-Inundation Model (RRI model)



- Two-dimensional model capable of simulating rainfall-runoff and flood inundation simultaneously
- The model deals with slopes and river channels separately
- At a grid cell in which a river channel is located, the model assumes that both slope and river are positioned within the same grid cell

#### Reference:

Takahiro Sayama, Go Ozawa, Takahiro Kawakami, Seishi Nabesaka & Kazuhiko Fukami et al.: Rainfall-Runoff-Inundation Analysis of Pakistan Flood 2010 at the Kabul River Basin, Hydrological Sciences Journal, 57(2), pp. 298-312, 2012.

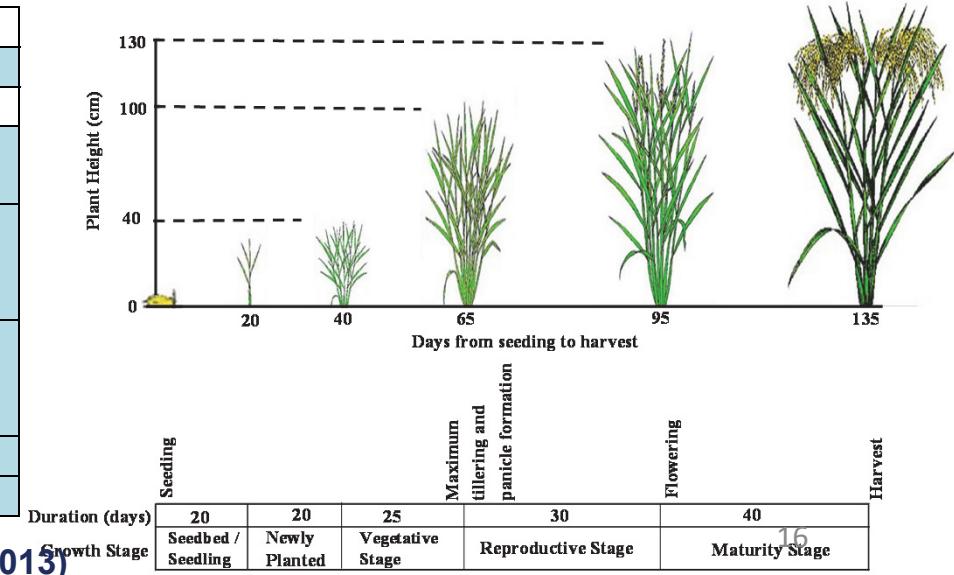
### 3. Research Methodology 3.2 Flood risk assessment

#### Process of Damage Assessment (Damage to Rice-Crops)

Growth Stage of Rice	Calculation Method
Seedbed / Seedling 20 days from palay germination	$\text{Value of production losses} = \text{Area affected} \times \text{Cost of input} / \text{hectare} \times \text{yield loss}$
Newly Planted Stage 1-20 days after sowing	
Vegetative Stage (21-45 days)	
Reproductive Stage (46-75 days)	$\text{Value of Production Losses} = \text{Volume of losses} \times \text{most recent farm gate price}$
Maturing Stage (76-115 days)	$\text{Volume of losses} = \text{Most recent yield/hectare} \times \text{area damaged} \times \text{Yield loss}$

Flood damage matrix: Rice-crops Damage	Days and plant height of rice crops at its each stage
--	---

Growth stage	Days of submerge			
	1-2	3-4	5-6	7
Estimated yield loss (%)				
Vegetative stage: Minimum Tillering /Maximum Tillering	10-20	20-30	30-50	50-100
Reproductive Stage: Panicle Initiation/Booting Stage (Partially Inundated)	10-20	30-50	40-85	50-100
Reproductive Stage: Panicle Initiation/Booting Stage (Completely Inundated)	15-30	40-70	40-85	50-100
Maturity Stage: Flowering stage	15-30	40-70	50-90	60-100
Ripening Stage	5	10-20	15-30	15-30

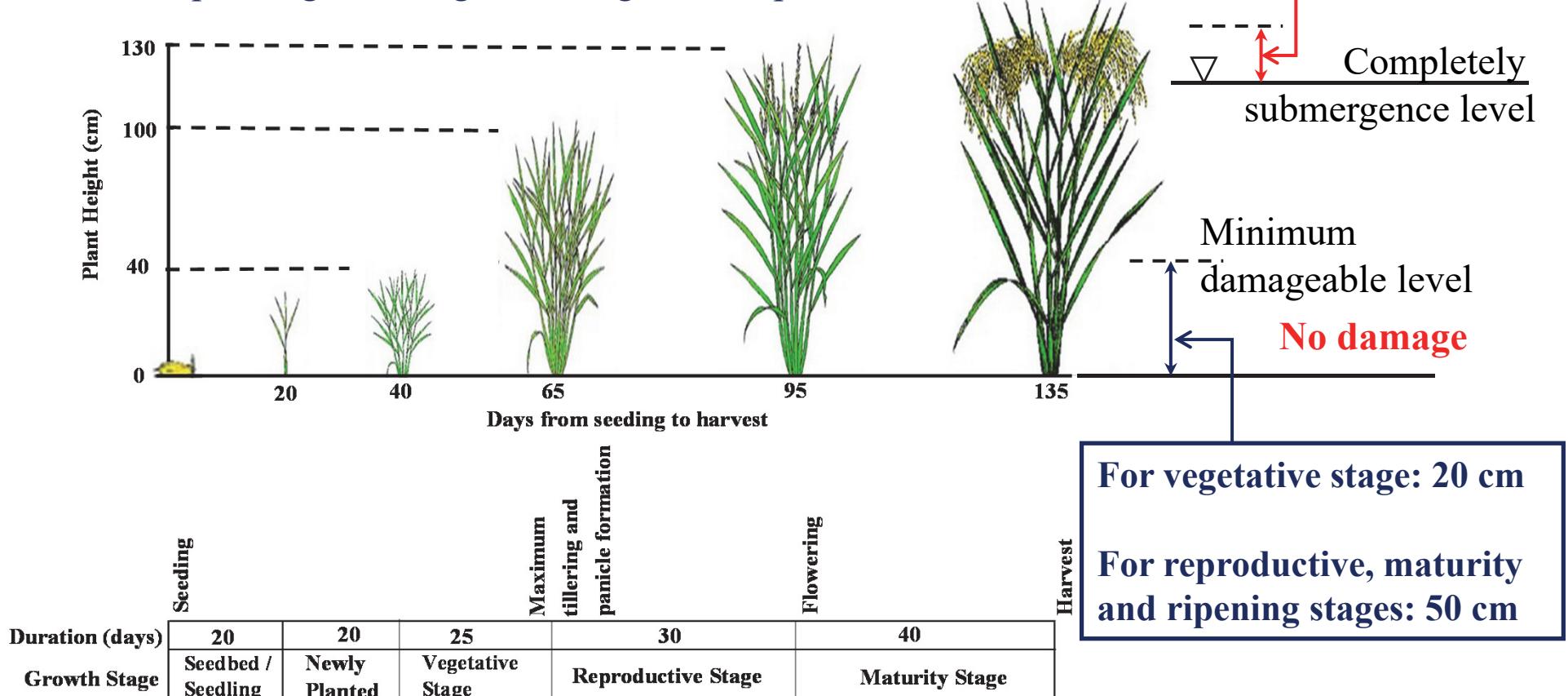


Source: Bureau of Agricultural Statistics, Philippines (2013)

### 3. Research Methodology 3.2 Flood risk assessment

#### Development of Flood Damage Curves (Rice-Crops)

- Flood damage curves as a function of flood depth and duration are proposed based on linear interpolation of flood damage matrix data by introducing minimum damageable flood depth and by considering partial or complete submergence water surface levels corresponding to each growth stage of rice plants.

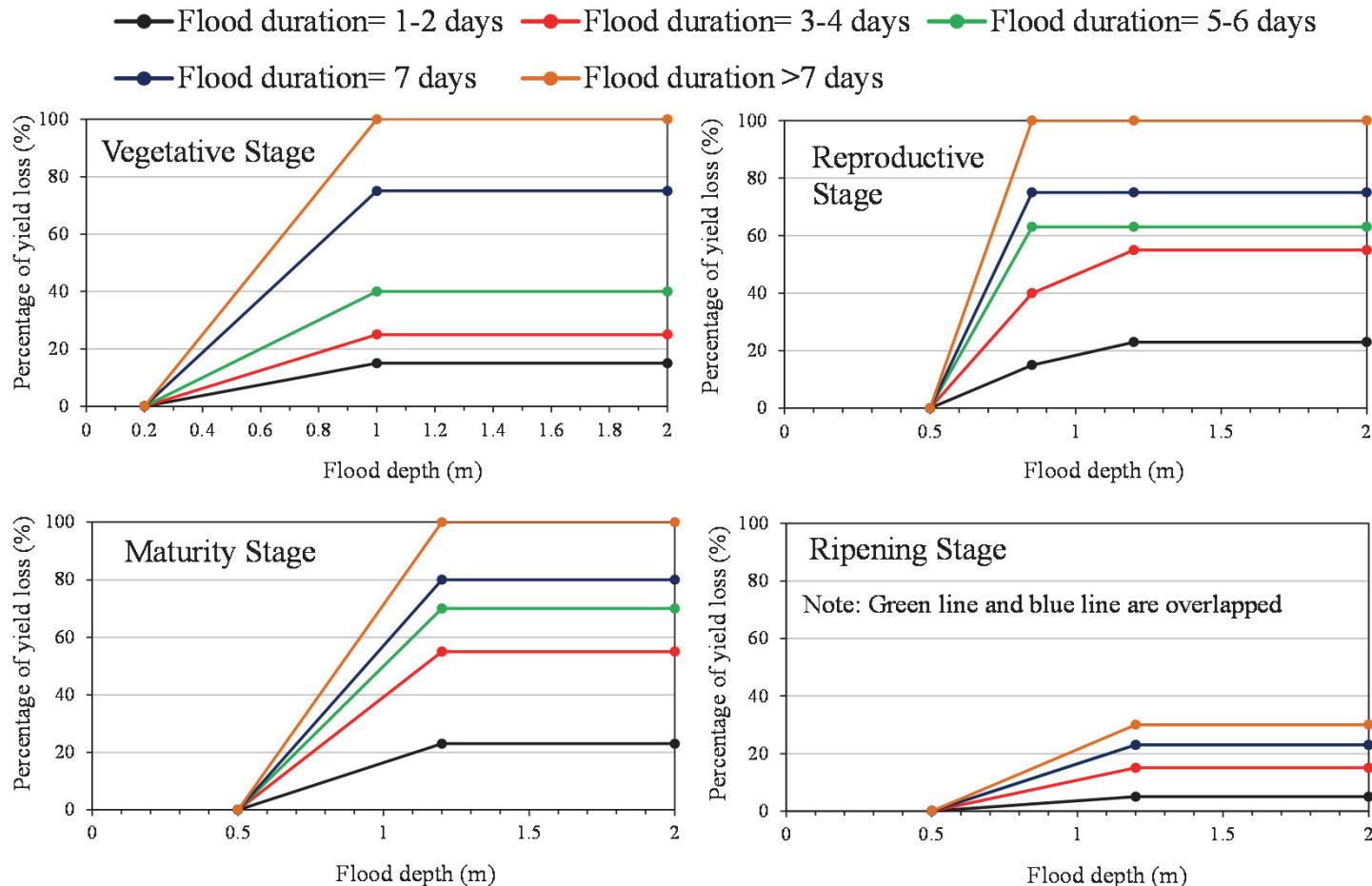


### 3. Research Methodology 3.2 Flood risk assessment

#### Development of Flood Damage Curves (Rice-Crops) (Cont.)

ICHARM's Damage Curve

The damage curve can consider growth stage, flood depth, and flood duration.

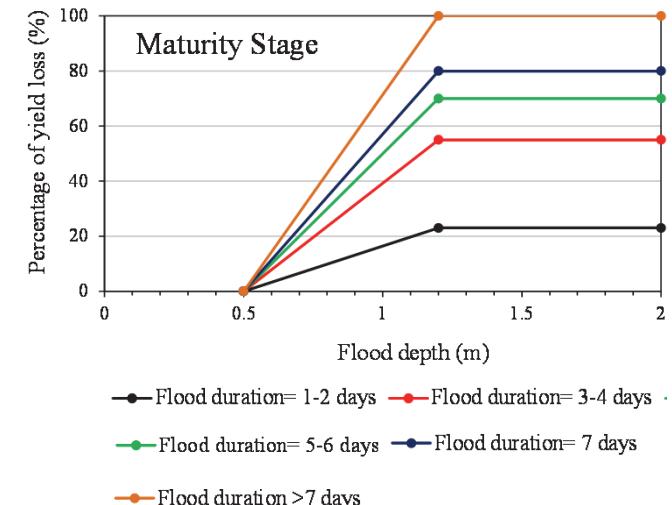
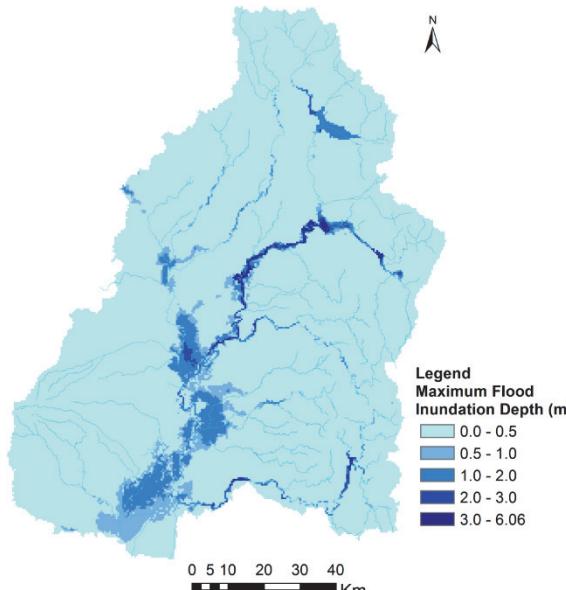
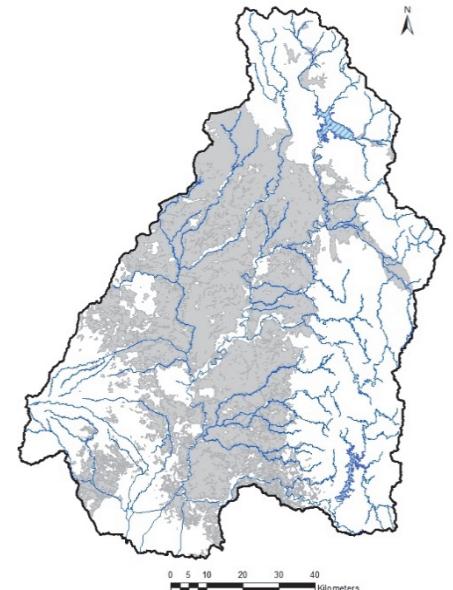


Reference: Shrestha, B. B., Okazumi, T., Mamoru, M. and Sawano, H.: Flood damage assessment in the Pampanga river basin of the Philippines, Journal of Flood Risk Management, Vol. 9, No. 4, pp.355-369, 2016. DOI: 10.1111/jfr3.12174

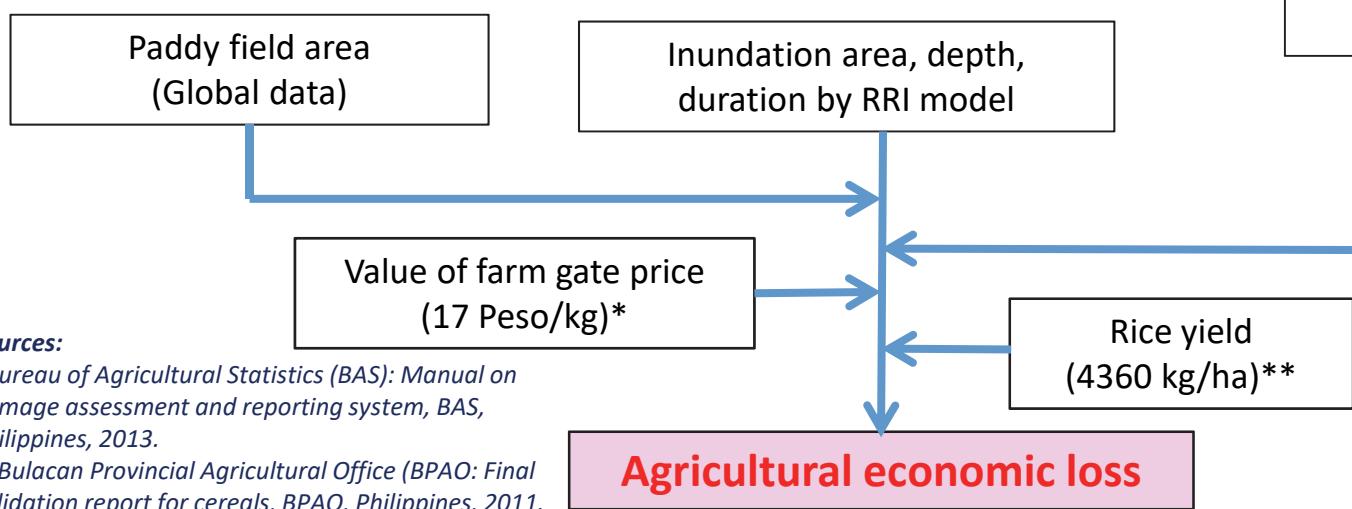
### 3. Research Methodology

#### 3.2 Flood risk assessment

#### Schematic of agricultural economic loss calculation (Rice production)



Damage function for rice production



Sources:

\*Bureau of Agricultural Statistics (BAS): Manual on damage assessment and reporting system, BAS, Philippines, 2013.

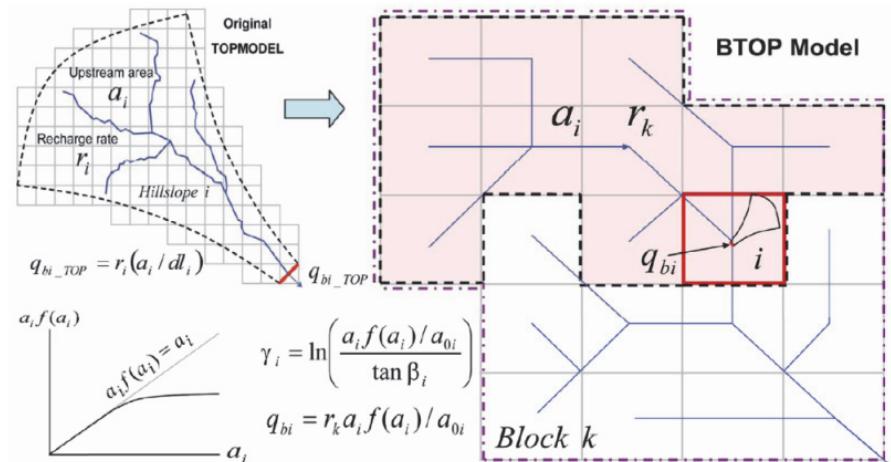
\*\*Bulacan Provincial Agricultural Office (BPAO): Final validation report for cereals, BPAO, Philippines, 2011.

### 3. Research Methodology

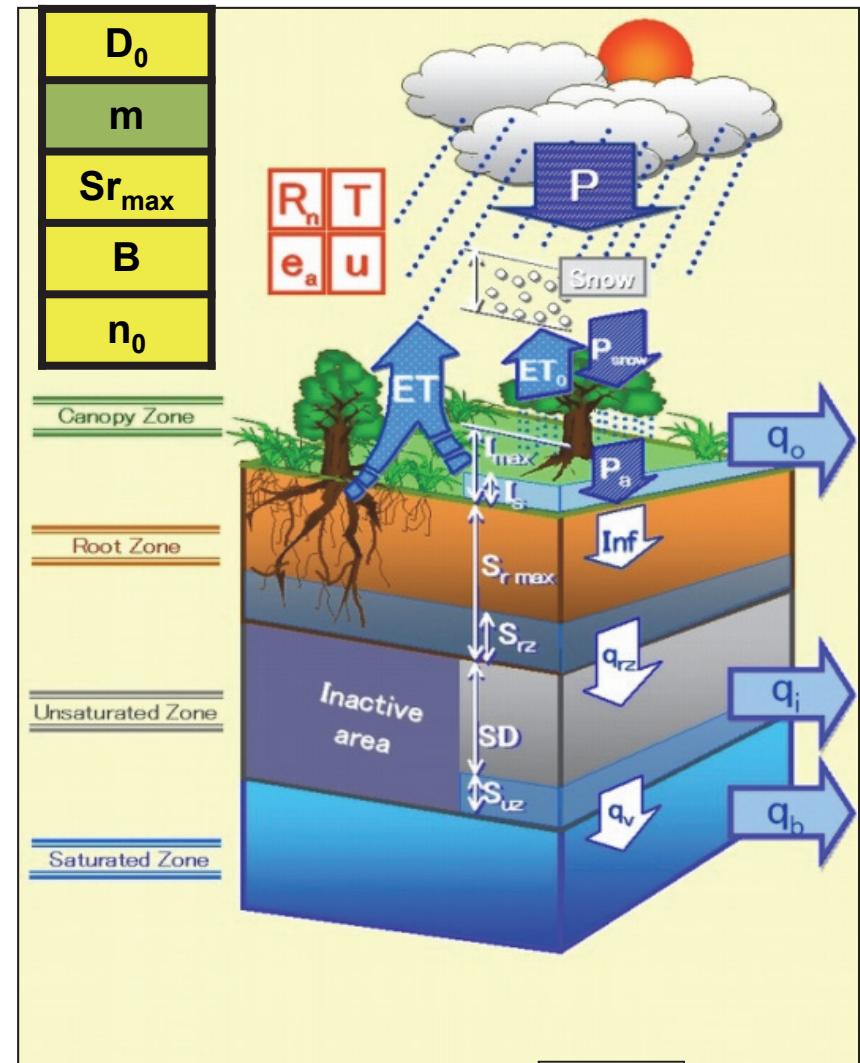
#### 3.3 Drought risk assessment

#### Distributed hydrological model - BTOP

##### Runoff Generation and Flow Routing



##### River Flow Routing



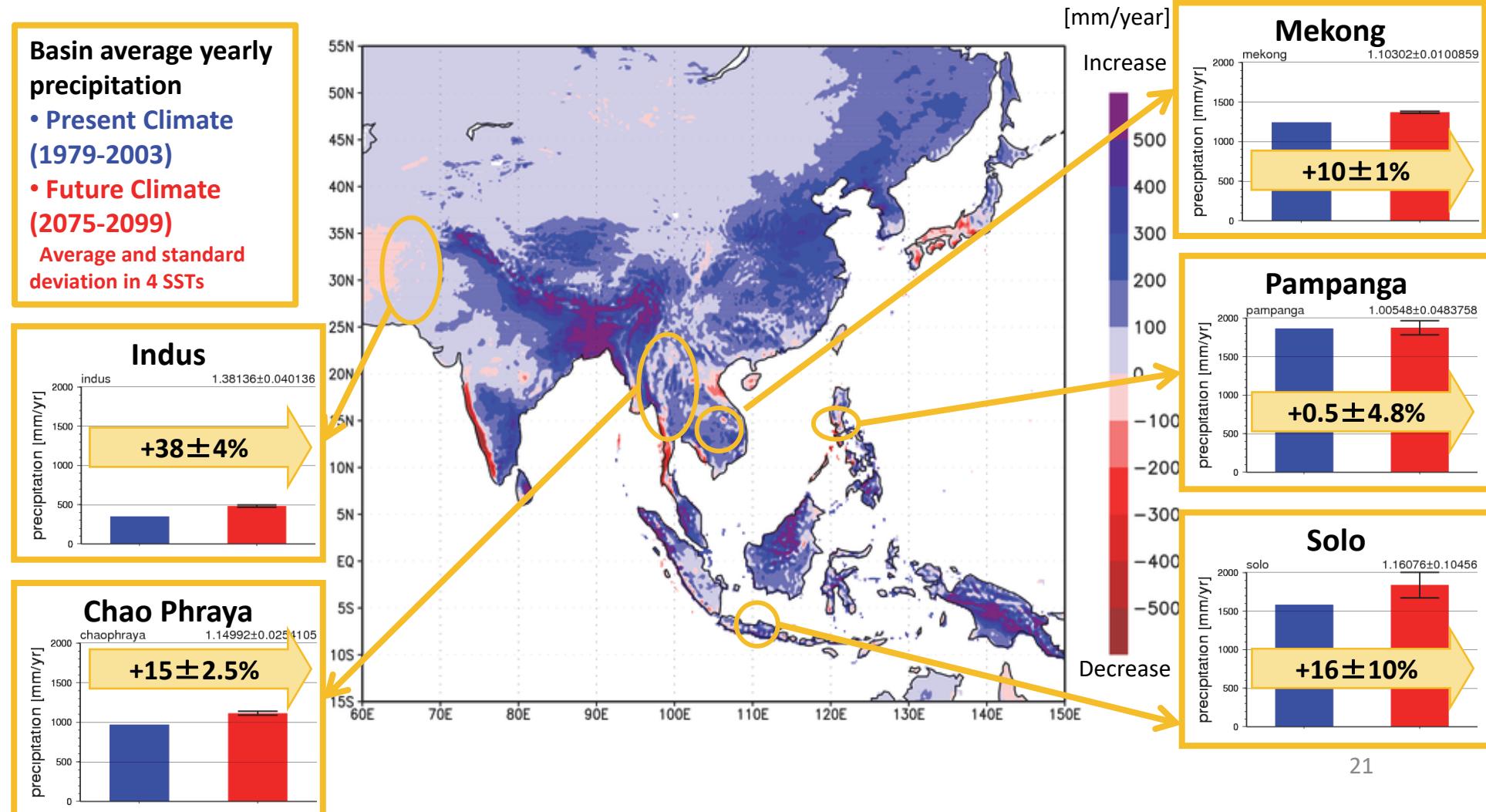
Reference: Takeuchi K, Hapuarachchi P, Zhou M, Ishidaira H, Magome J, A BTOP model to extend TOPMODEL for distributed hydrological simulation of large basins, Hydrological Processes, 22, 2008

# 4. Research Result

## 4.1 Rainfall change assessment

### Analysis result –Comparison of 5 river basin- (1/2)

Difference in average yearly precipitation between present and future climate  
for 4 Sea Surface Temperature (SST) patterns (MME, C1, C2, and C3)



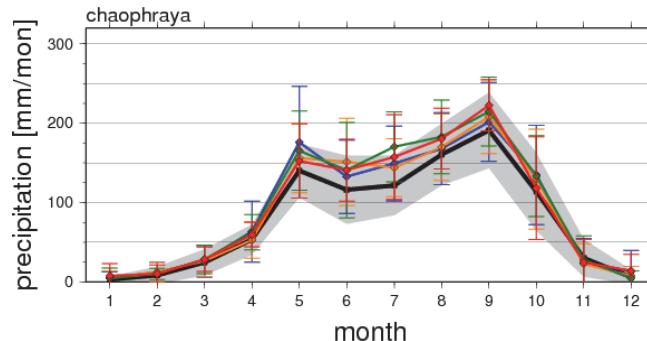
# 4. Research Result

## 4.1 Rainfall change assessment

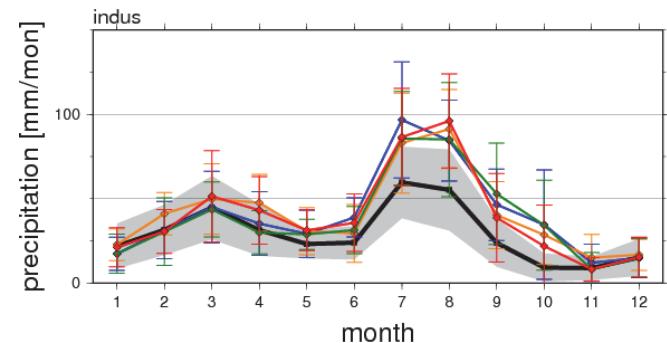
### Analysis result –Comparison of 5 river basin- (2/2)

Comparison of average monthly precipitation between present and future climate or 4 SST patterns (MME, C1, C2, and C3)

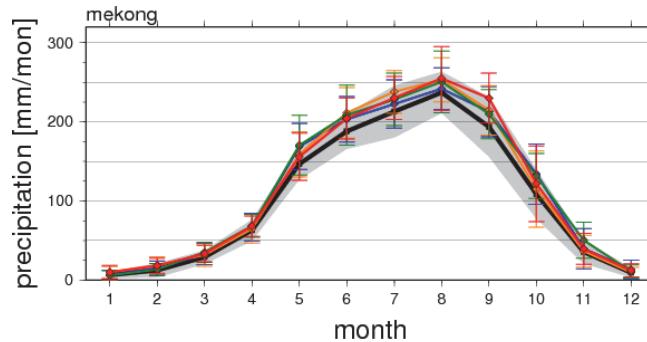
**Chao Phraya**



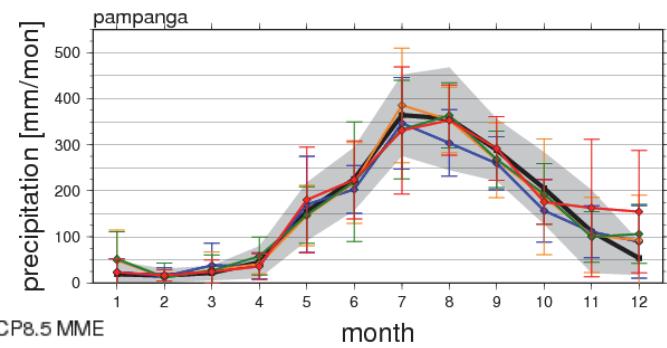
**Indus**



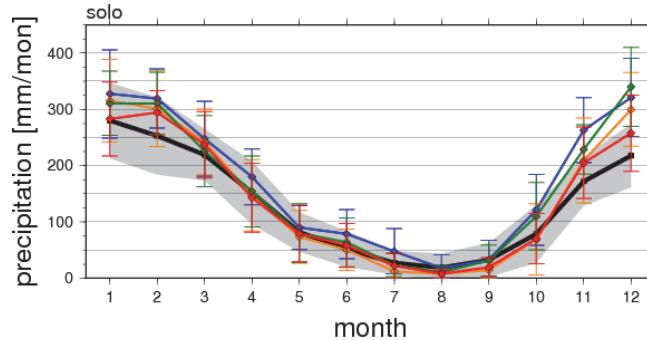
**Mekong**



**Pampanga**



**Solo**

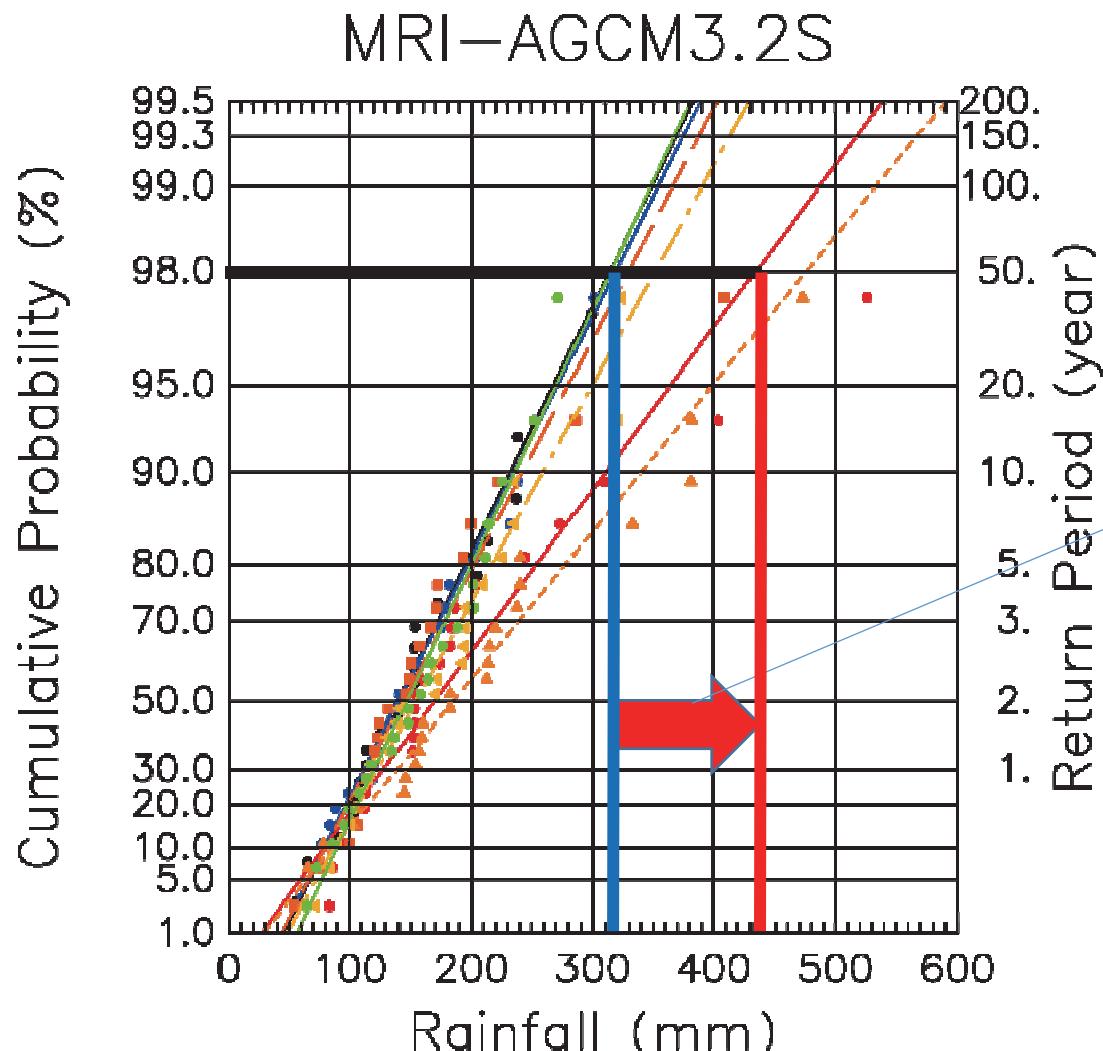


**Reference:** Iwami et al, Comparative study on climate change impact on precipitation and flood in the Asian river basins (2016), HRL

## 4. Research Result

### 4.1 Rainfall change assessment

#### Statistical analysis for extreme event



Example of statistical analysis of annual maximum 48-hour precipitation in MRI-AGCM3.2S

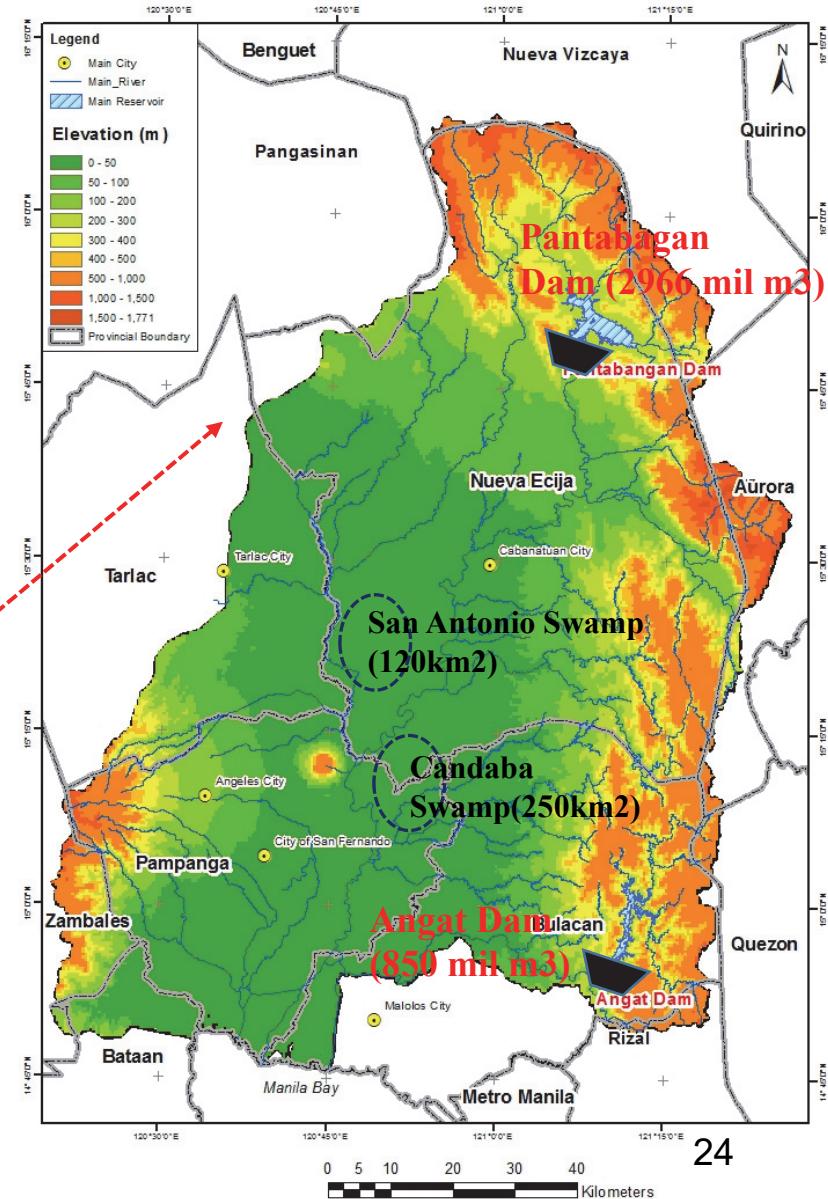
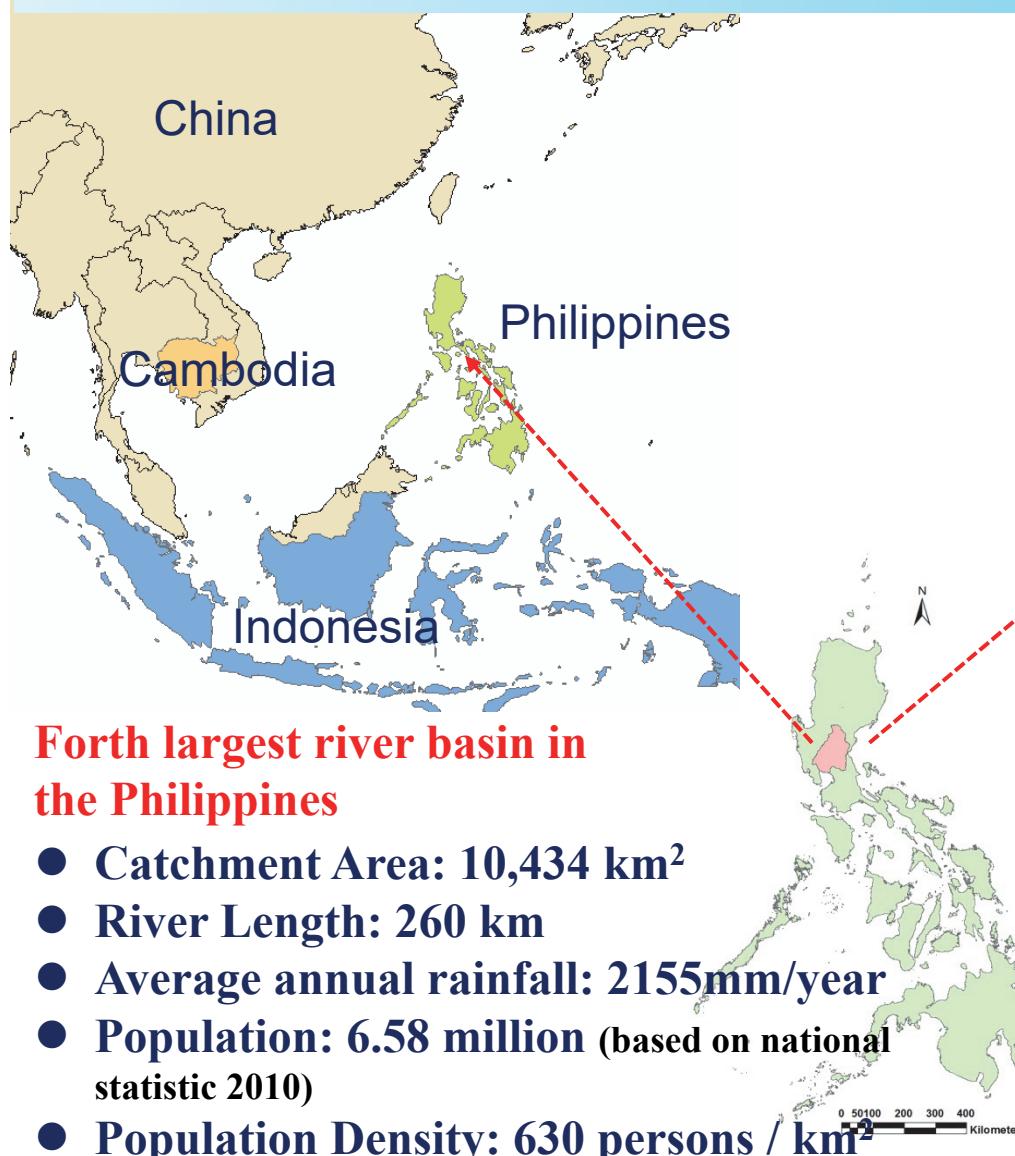
(Present) 320->  
(Future (RCP8.5 MME)) 440  
for 50-year return period

Raingauge — RCP8.5 MME —  
ERA-interim — RCP8.5 C1 - - -  
Present — RCP8.5 C2 - - -  
RCP8.5 C3 - - -

## 4. Research Result

### 4.2 Flood risk assessment

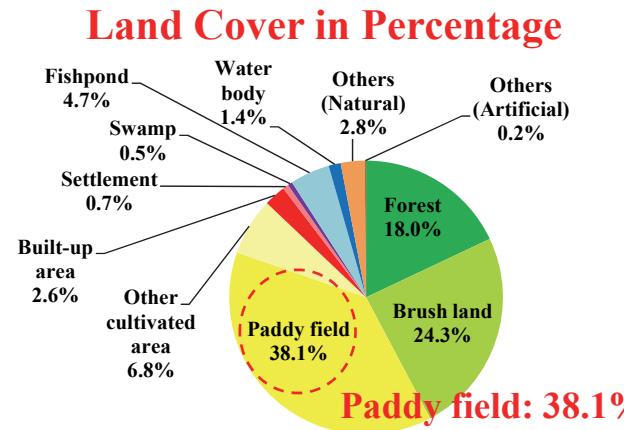
#### Pampanga River Basin: General Features



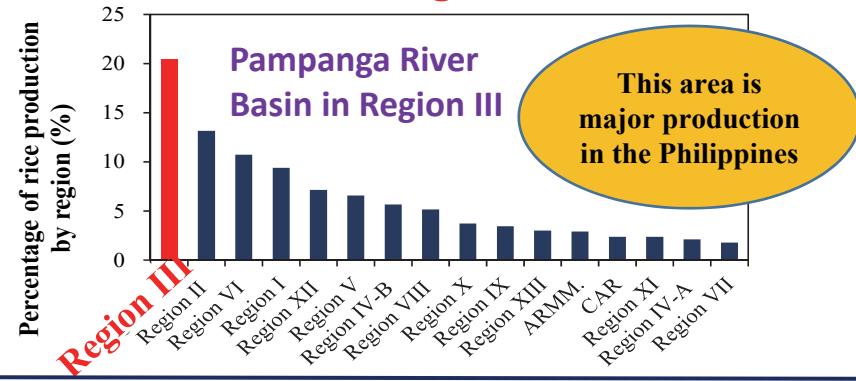
## 4. Research Result

### 4.2 Flood risk assessment

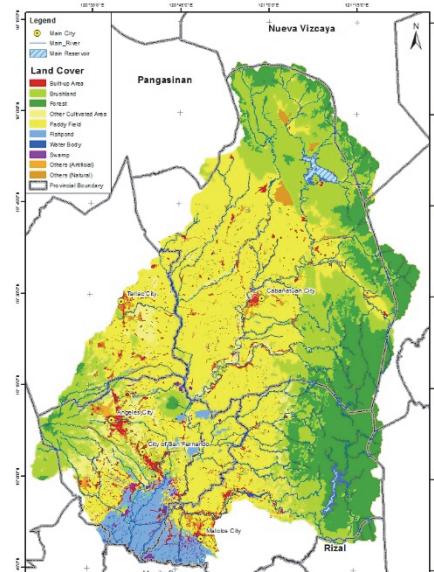
#### Pampanga River Basin: Agricultural production and damage



#### Rice Production in Percentage as of 2014 data

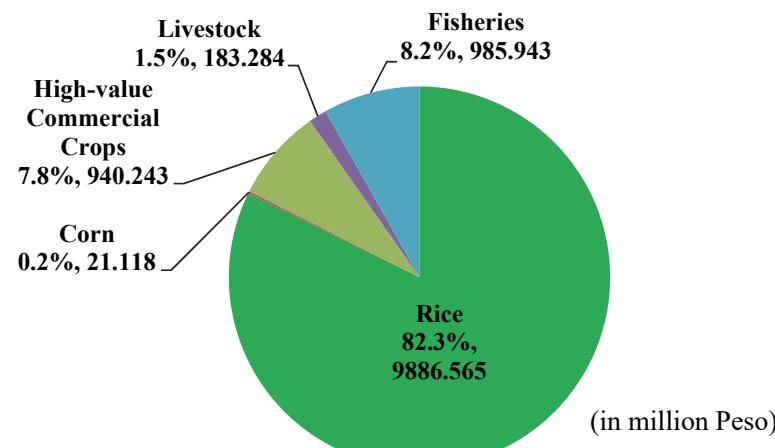


#### Land Cover Map



Source: JICA IWRM Report

#### Estimated value of Agricultural damages due to flood during September 24-26 ,2011



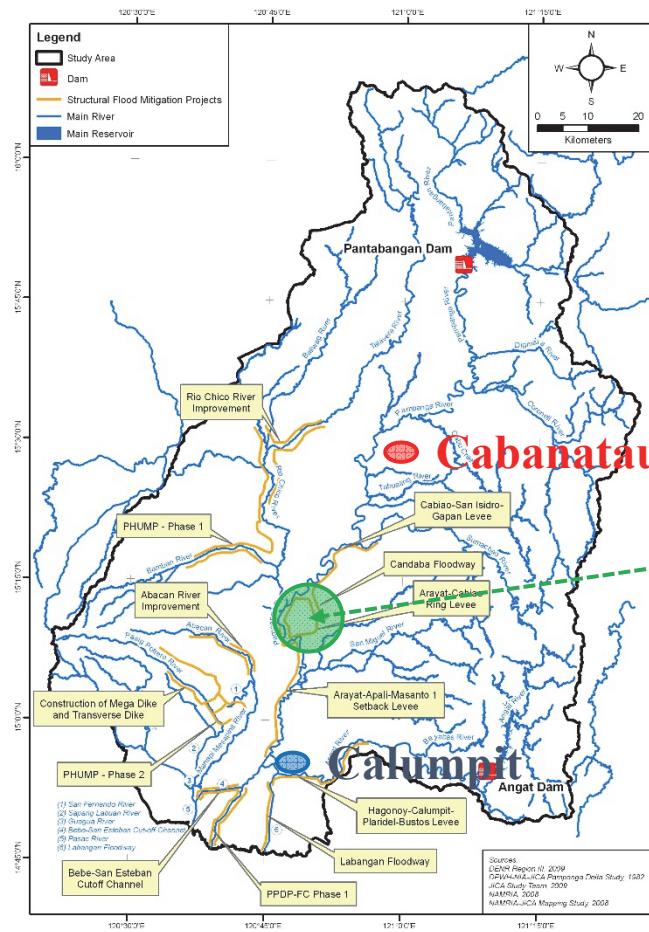
Source: Office of Civil Defense Region III

# 4. Research Result

## 4.2 Flood risk assessment

### Pampanga River Basin: Recent Floods

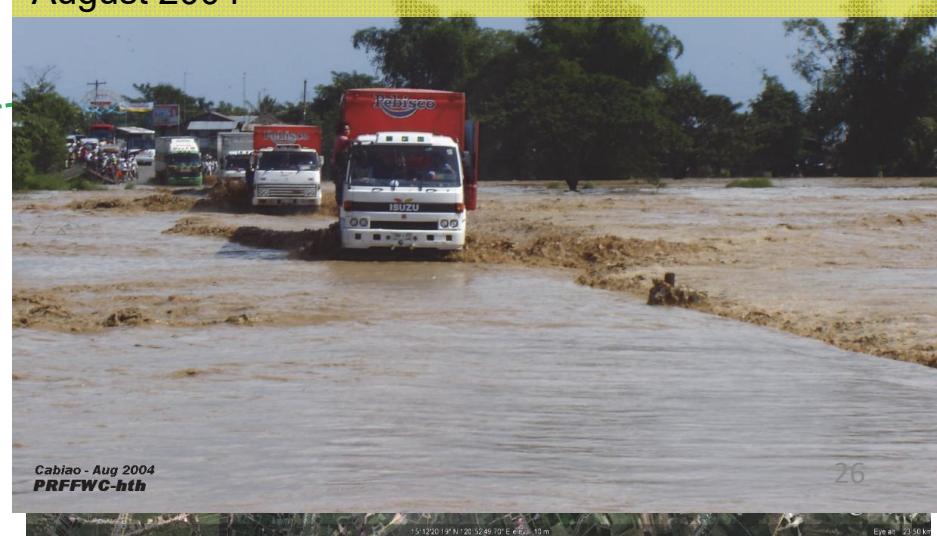
- 2015 Oct & Dec : Typhoon Lando and Nona
- 2012 August: Monsoon Rainfall
- 2011 September: Typhoon Pedring, Quiel
- 2009 September: Typhoon Ondoy, Pepeng



Cabanataun



Overflowing of Pampanga R. at Cabiao Floodway:  
August 2004



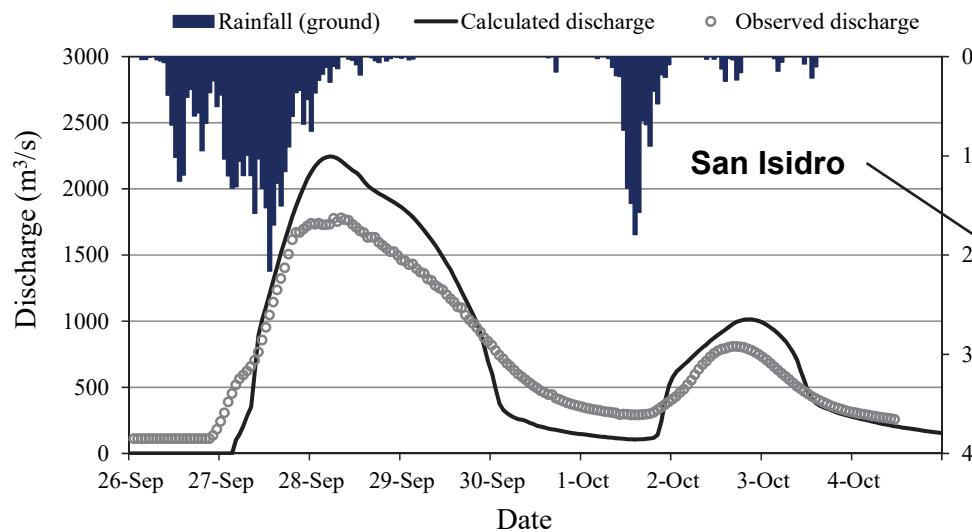
## 4. Research Result

### 4.2 Flood risk assessment

#### Verification of reproduction of past flood inundation by RRI Model

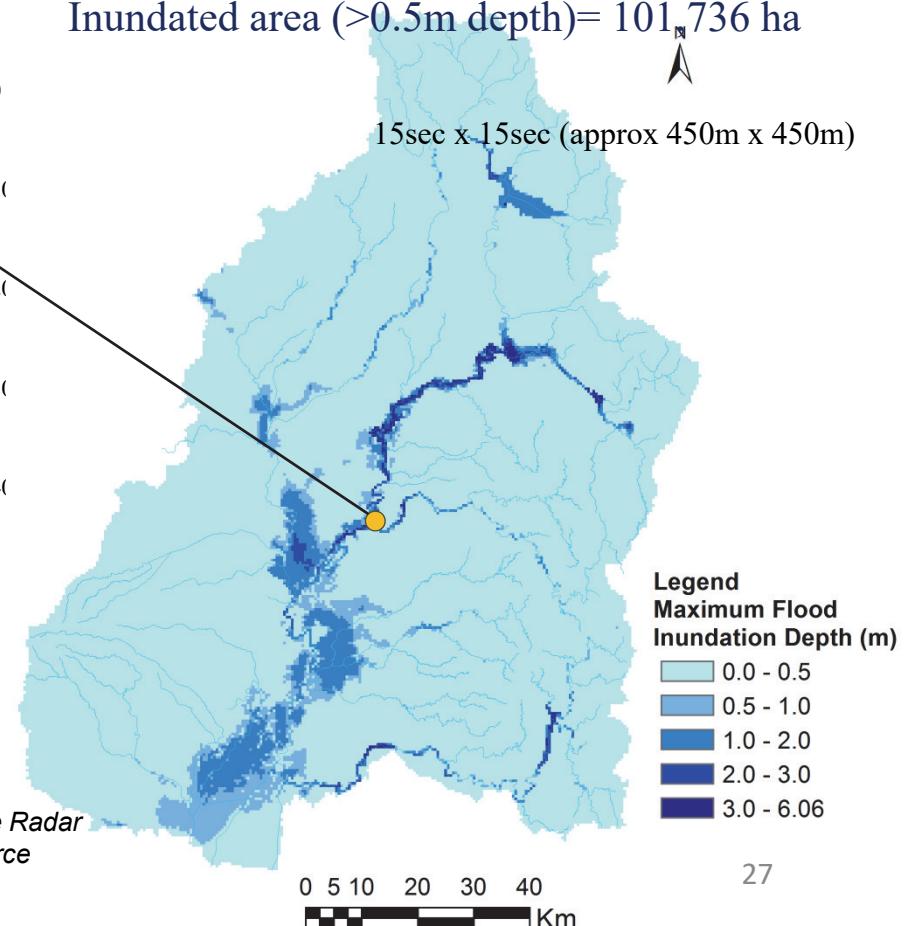
Flood event: 26 September to 4 October 2011 (Largest Recorded Flood Event)

Comparison of calculated and observed discharge at San Isidro Station



Maximum flood inundation depth calculated by RRI Model

Inundated area ( $>0.5\text{m}$  depth) = 101,736 ha

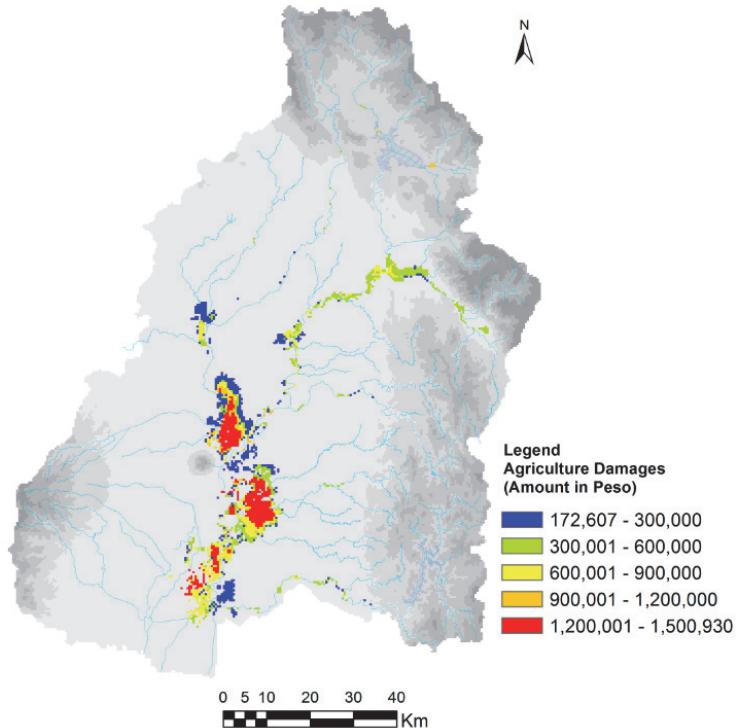


DEM: Intermap's airborne Interferometric Synthetic Aperture Radar (IfSAR) data was Provided by National Mapping and Resource Information Authority

## 4. Research Result

### 4.2 Flood risk assessment

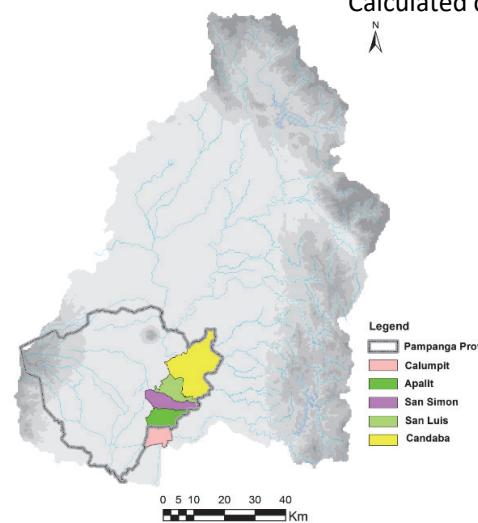
#### Verification of the damage function by ICHARM (Application for past flood event: September 2011 Flood)



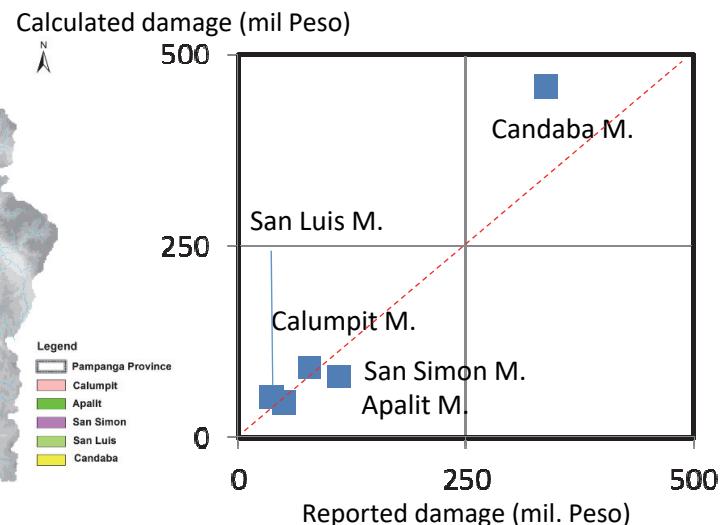
Calculated agricultural economic loss in Pampanga Province: 821 million Peso

Reported agricultural economic loss: 1376 million Peso

*The deference of the loss may be caused by other damage factors (wind, etc.)*



Comparison of agricultural economic loss between reported and calculated in areas where the main cause of the disaster was flood

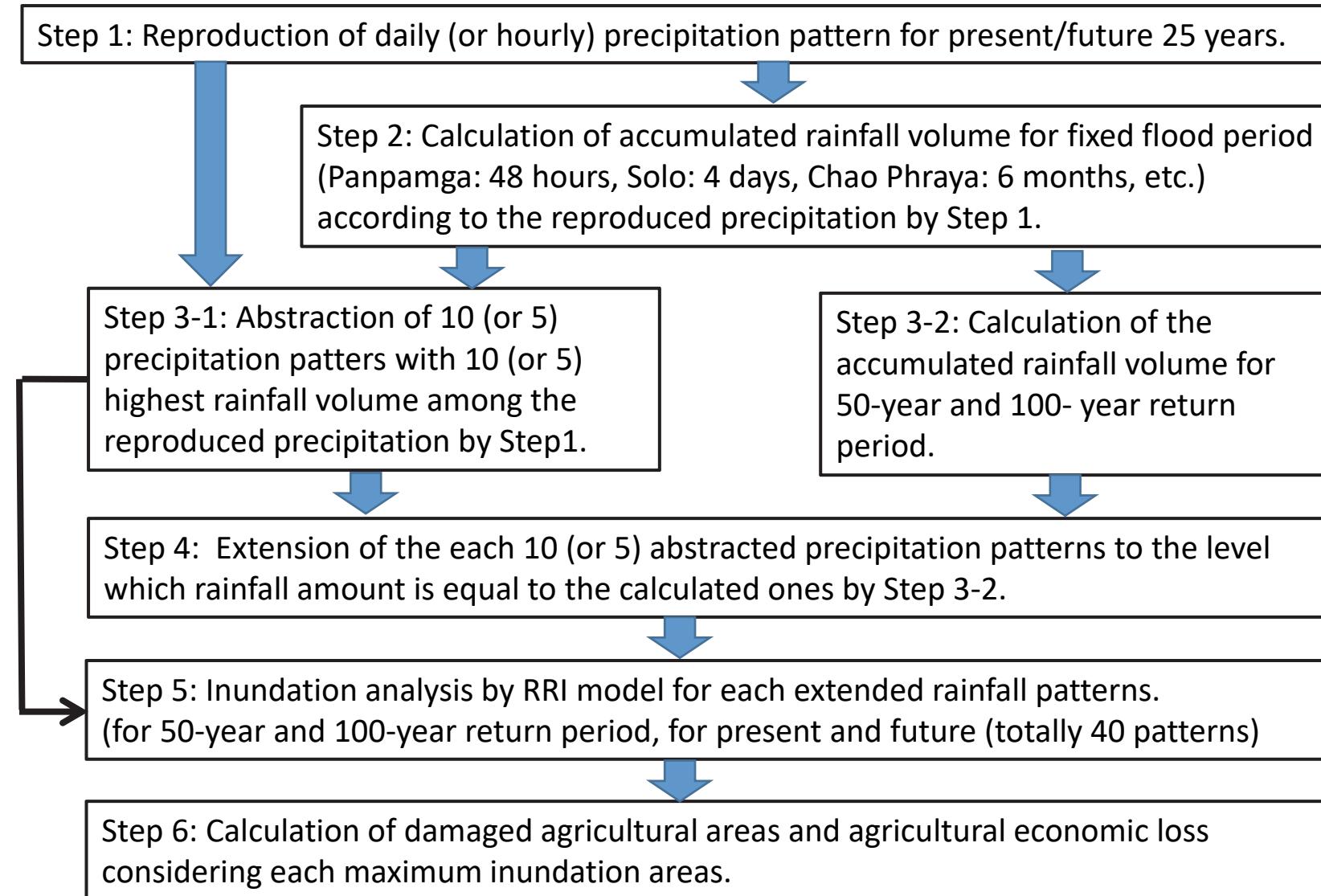


Province/ Municipality	Reported	Calculated (using IfSAR DEM)	
		Damage (mil. Peso)	Damage (mil. eso)
Pampanga Province	1376	821.59	19318
Calumpit M.	37	53.69	2308
San Luis M.	114.88 (50.29*)	46	1923
Apalit M.	109.69	80.04	2349
San Simon M.	78.08	92.05	1944
Candaba M.	337.5	457.6	8808.75

\* Estimated damage in inundated area by using proportion of inundation area and total paddy area in the municipality (Inundated area=1923.75ha, Total Paddy Area=4394.25ha).

## 4. Research Result 4.2 Flood risk assessment

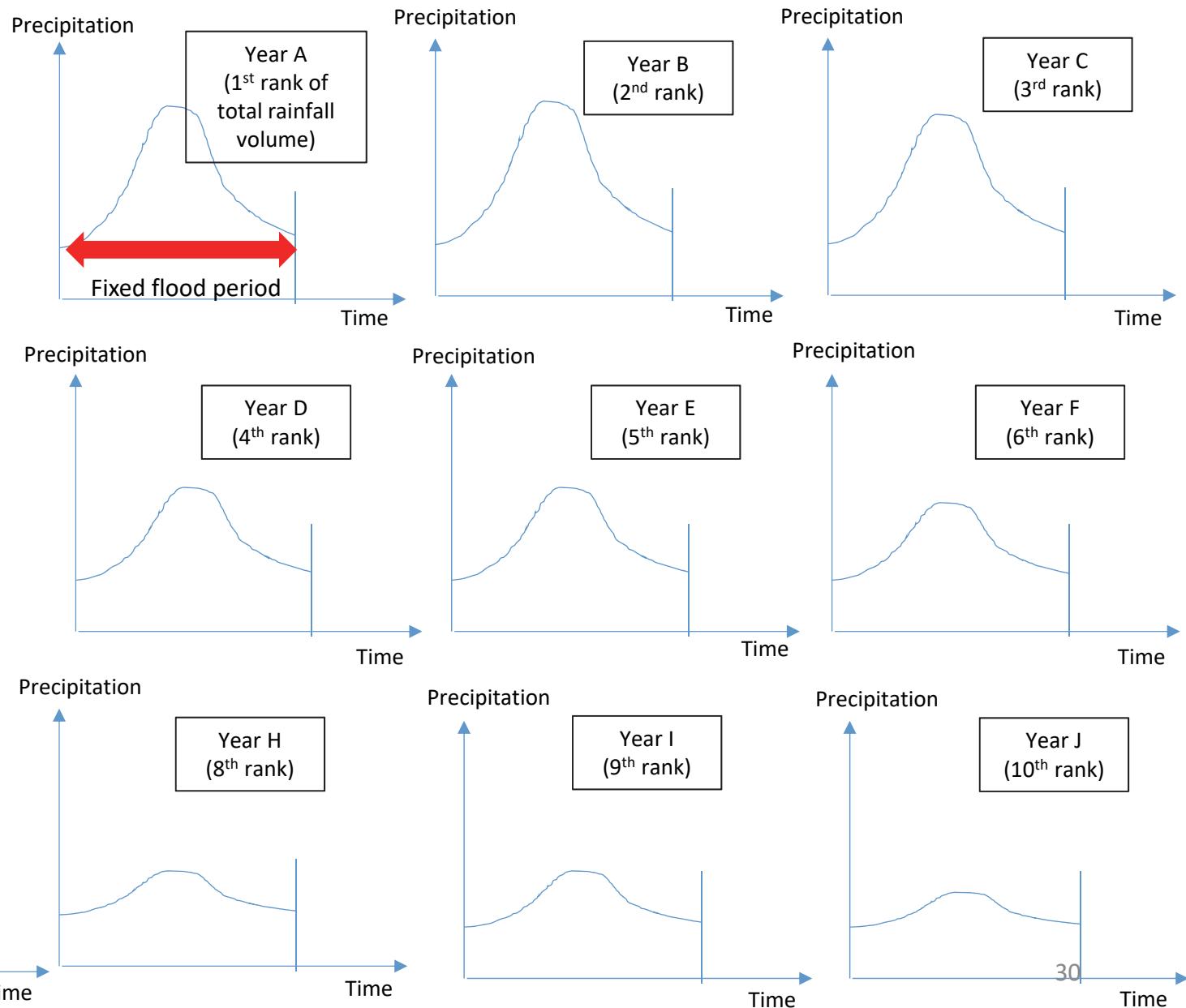
### Methodology of flood risk assessment considering various precipitation patterns for present/ future climate



## 4. Research Result 4.2 Flood risk assessment

### Methodology of flood risk assessment considering various precipitation patterns for present/ future climate

Step 3-1:  
Abstraction of 10  
(or 5) precipitation  
patterns with 10 (or  
5) highest rainfall  
volume

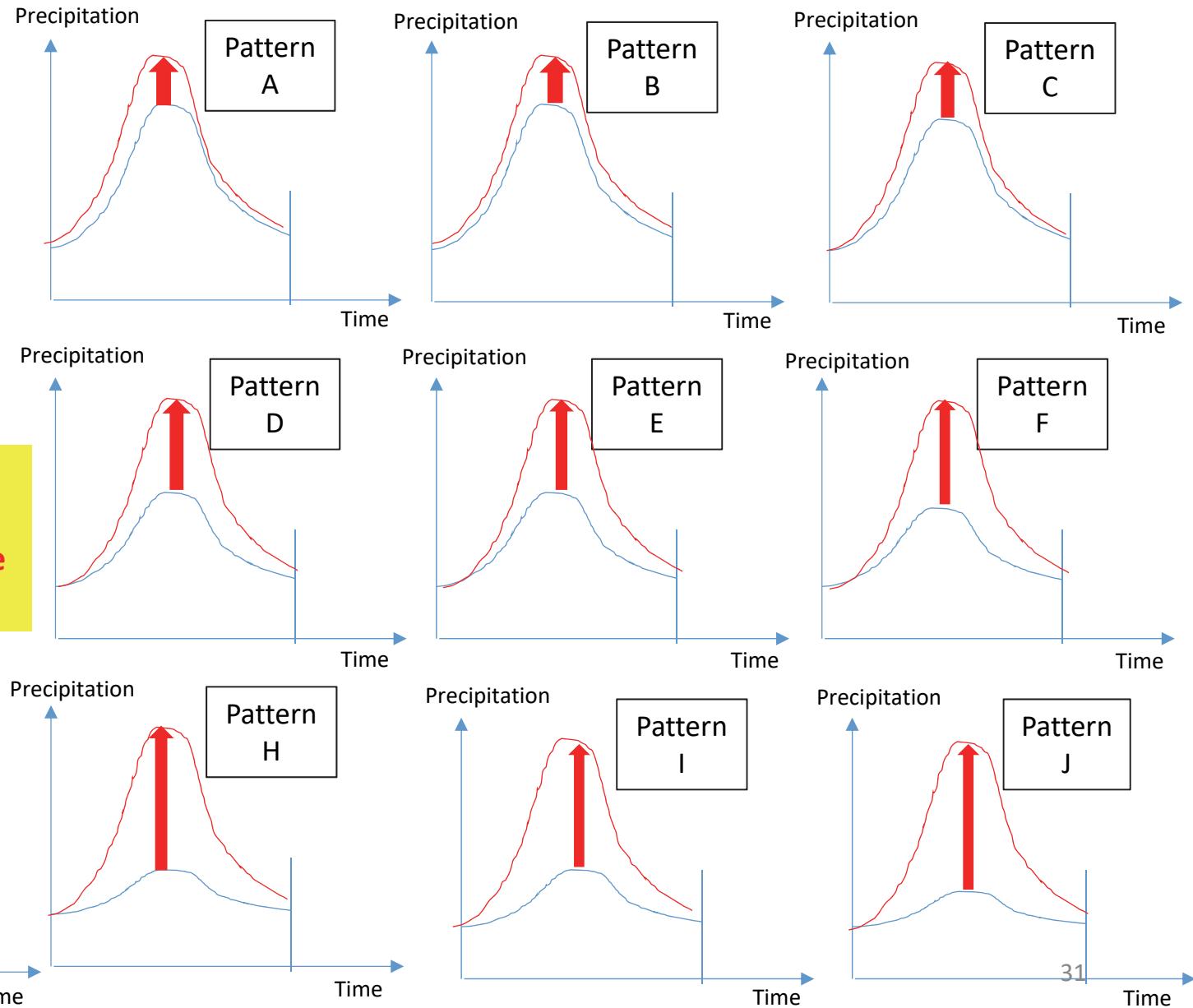


## 4. Research Result 4.2 Flood risk assessment

### Methodology of flood risk assessment considering various precipitation patterns for present/ future climate

Step 4:

Extension of the each 10 (or 5) abstracted precipitation patterns to the level which rainfall amount is equal to the calculated ones by Step 3-2



## 4. Research Result

### 4.2 Flood risk assessment

**Agricultural economic loss assessment: with 10 different rainfall patterns chosen from each climate (Original Rainfall)**

**Present Climate: (1979-2003)**

Rainfall pattern	48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	300.9	147,177.0	6434.3
B	252.7	139,097.3	5928.4
C	238.5	157,686.8	5867.6
D	232.6	172,854.0	7260.9
E	203.3	143,775.0	7494.5
F	181.9	110,119.5	3492.0
G	178.2	123,585.8	5733.1
H	174.5	119,738.3	5798.0
I	157.7	82,235.3	3082.9
J	154.8	88,512.8	2895.1
<b>Average</b>	<b>207.5</b>	<b>128,478.2</b>	<b>5,398.6</b>

**Future Climate: (2075-2099)**

Rainfall pattern	48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	526.4	204,160.5	7859.0
B	309.3	98,658.0	4532.5
C	273.8	172,833.8	7482.8
D	244.7	154,507.5	5618.1
E	204.1	138,064.5	6345.9
F	186.9	99,751.5	4315.5
G	184.0	115,101.0	4514.3
H	182.3	143,005.5	5688.6
I	174.7	132,495.8	7457.2
J	171.6	133,548.8	6199.7
<b>Average</b>	<b>245.8</b>	<b>139,212.7</b>	<b>6,001.3</b>

## 4. Research Result

### 4.2 Flood risk assessment

Agricultural damage assessment: with 10 different rainfall patterns chosen from each climate (50-Year Flood)

Present Climate: (1979-2003)

Rainfall pattern	Extended 48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	311.7	150,963.7	6559.2
B		155,580.7	6468.1
C		187,150.5	6847.0
D		200,434.5	8109.4
E		177,207.7	8573.9
F		169,816.5	5827.1
G		171,659.2	7316.4
H		146,448	7277.1
I		154,163.2	6129.8
J		151,449.7	5644.6
Average		166,487.4	6,875.2

Future Climate: (2075-2099)

Rainfall pattern	Extended 48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	450.3	188,345.25	7284.7
B		129,640.5	5733.1
C		205,821	8796.2
D		217,424.25	7836.6
E		190,431	8274.2
F		177,066	7277.7
G		220,158	8057.2
H		224,370	8405.7
I		187,312.5	9243.9
J		208,271.25	8593.9
Average		194,884.0	7,950.3

## 4. Research Result

### 4.2 Flood risk assessment

**Agricultural damage assessment: with 10 different rainfall patterns chosen from each climate (100-Year Flood)**

**Present Climate: MRI AGCM3.2S SPA (1979-2003)**

Rainfall pattern	Extended 48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	344.8	161,676	6912.5
B		163,397.25	6769.5
C		196,890.75	7212.0
D		209,790	8412.2
E		185,976	8837.0
F		180,690.75	6255.5
G		180,589.5	7623.2
H		151,368.75	7523.9
I		166,070.25	6584.5
J		163,478.25	6074.2
<b>Average</b>		<b>175,992.8</b>	<b>7,220.4</b>

**Future Climate: MRI AGCM3.2S SFA rcp8.5 (2075-2099)**

Rainfall pattern	Extended 48-hour rainfall value (mm)	Damaged agricultural area (ha)	Agricultural economic loss (million Peso)
A	556.5	208,777.5	8031.0
B		147,237.75	6376.3
C		218,112.75	9262.6
D		237,836.25	8545.9
E		200,738.25	8766.9
F		200,616.75	8069.3
G		243,101.25	8756.7
H		236,641.5	8836.5
I		195,696	9607.2
J		222,162.75	9094.9
<b>Average</b>		<b>211,092.1</b>	<b>8,534.75</b>

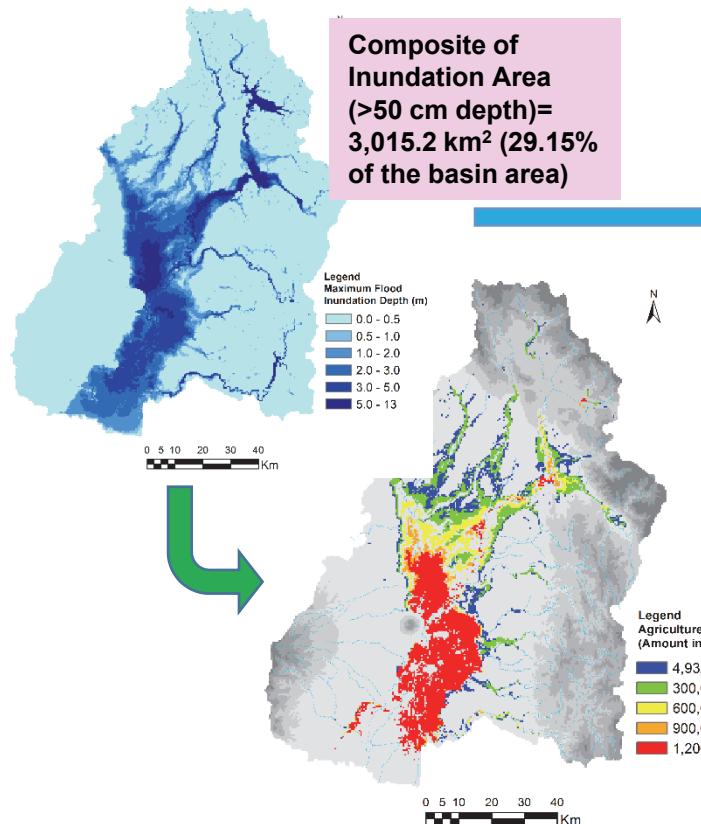
## 4. Research Result

### 4.2 Flood risk assessment

#### Comparison of Rice Crop Damage under Present/future Climate

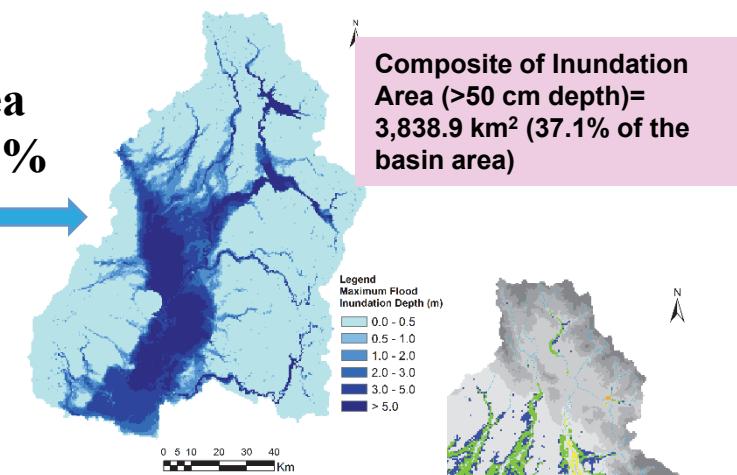
##### Worst Cases in terms of Agricultural Damage Area: Original Rainfall

Present Climate: (1979-2003)



Future Climate: MRI AGCM3.2S SFA rcp8.5  
(2075-2099)

Inundation area increased by 27 %



Damage area increased by 18 %

Economic loss increased by 8 %

Damage area= 172,854 ha  
Agricultural economic loss= 7,260.9 million Peso

Damage area= 204160.5 ha  
Agricultural economic loss = 7,858.9 million Peso <sup>25</sup>

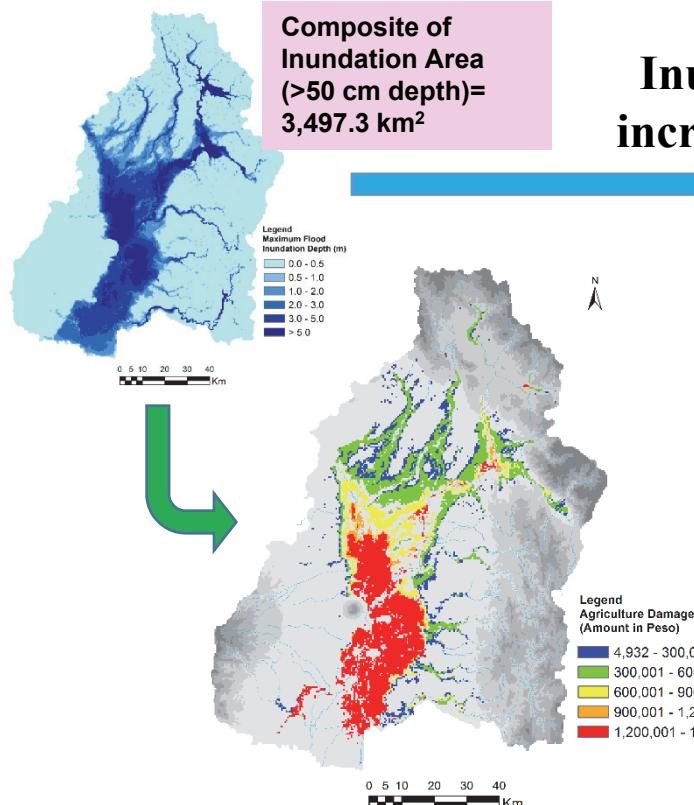
## 4. Research Result

### 4.2 Flood risk assessment

#### Comparison of Rice Crop Damage under Present/future Climate

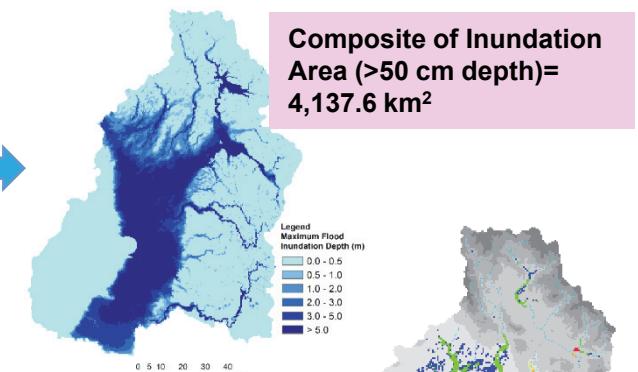
##### Worst Cases in terms of Agricultural Damage Area: 50-Year Flood

Present Climate



Future Climate

Inundation area increased by 18 %



Damage area increased by 12 %

Economic loss increased by 4 %

**Damage area= 200,434.5 ha**  
**Agricultural economic loss = 8,109.4 million Peso**

**Damage area= 224,370 ha**  
**Agricultural economic loss = 8,405.7 million Peso**

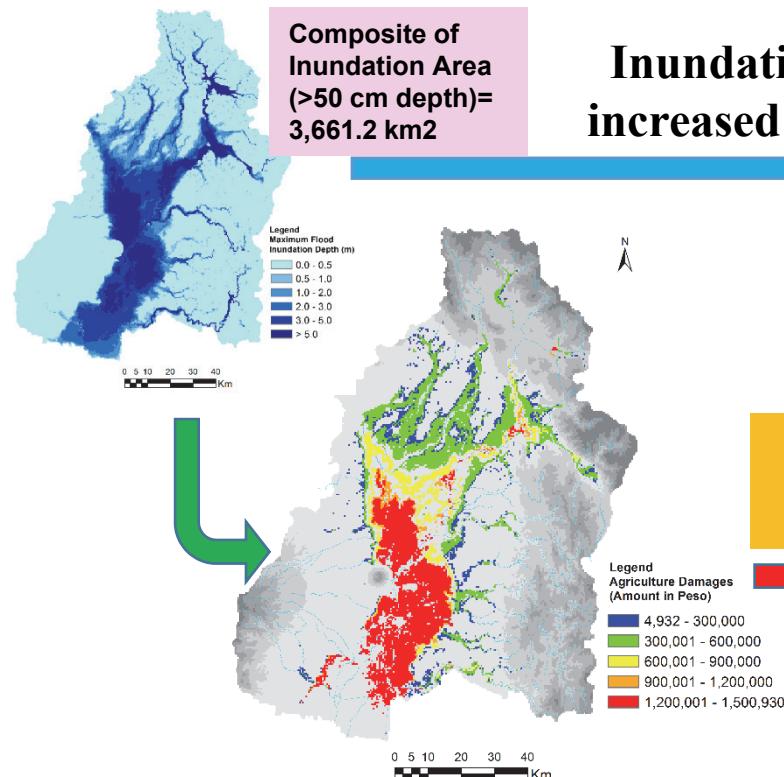
## 4. Research Result

### 4.2 Flood risk assessment

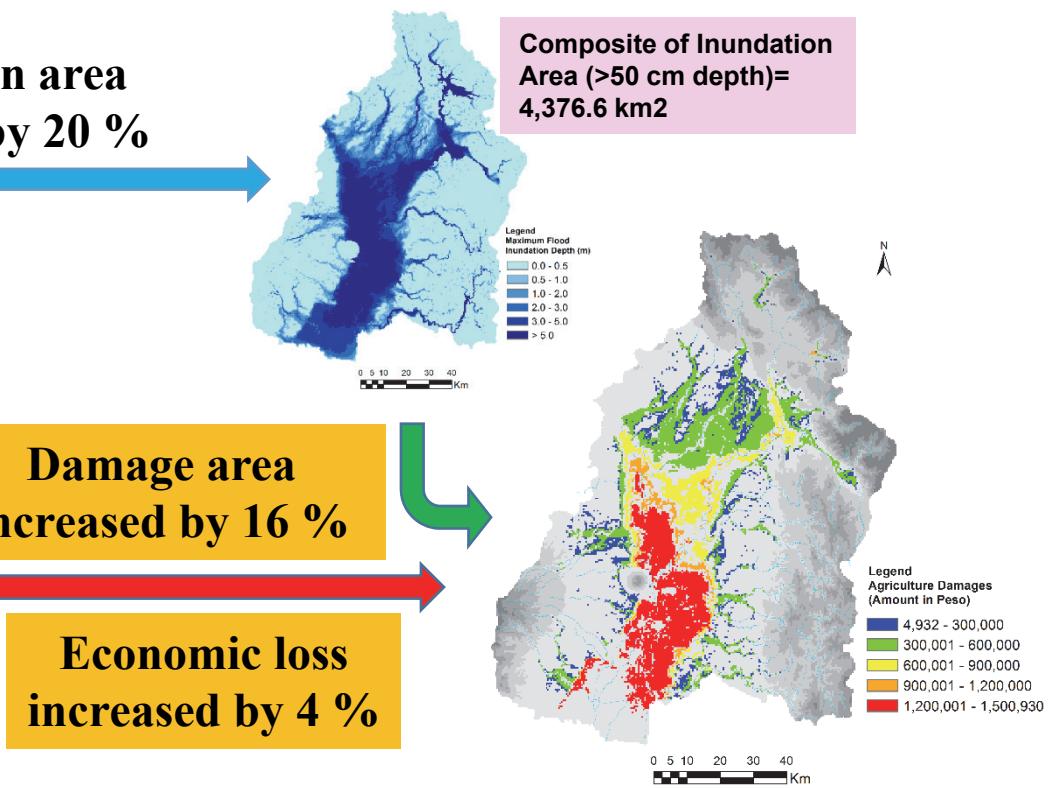
#### Comparison of Rice Crop Damage under Present/future Climate

#### Worst Cases in terms of Agricultural Damage Area: 100-Year Flood

Present Climate



Future Climate



**Inundation area increased by 20 %**

**Damage area increased by 16 %**

**Economic loss increased by 4 %**

**Damage area= 209,790 ha**  
**Agricultural economic loss = 8,412.1 million Peso**

**Damage area= 243,101.25 ha**  
**Agricultural economic loss = 8,756.7 million Peso**

## 4. Research Result

### 4.2 Flood risk assessment

#### Comparison of Rice Crop Damage under Present/future Climate

**Summary : Comparison with worst damage area case**

Rainfall Conditions	Present Climate		Future Climate		% Increased	
	Agricultural damage area (ha)	Agricultural economic loss (mil. Peso)	Agricultural damage area (ha)	Agricultural economic loss (mil. Peso)	Agricultural damage area	Agricultural economic loss
Original	172,854	7260.9	204,161	7859.0	18	8
50-Year Return Period	200,435	8109.4	224,370	8405.7	12	4
100-Year Return Period	209,790	8412.2	243,101	8756.7	16	4

## 4. Research Result

### 4.2 Flood risk assessment

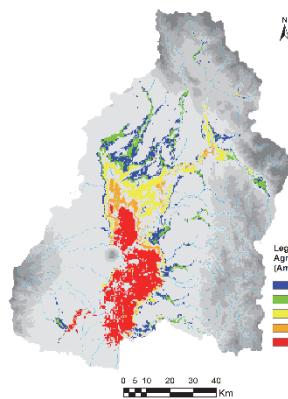
Agricultural damage assessment by conducting hazard analysis using 10 different precipitation patterns with rainfall amount of 50 year return period

50-Year Flood (1/2)

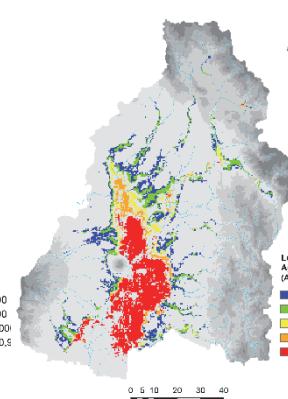
#### Under Present Climate (1979-2003): SPA

Maximum damaged agricultural area

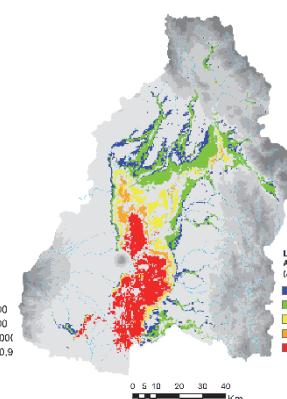
Pattern A



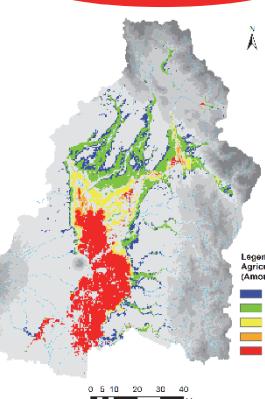
Pattern B



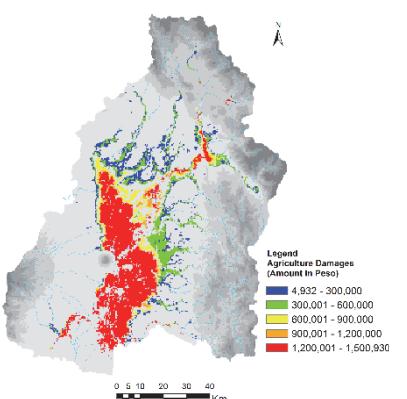
Pattern C



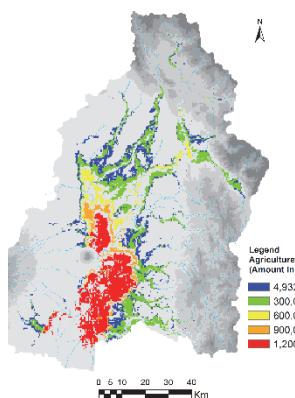
Pattern D



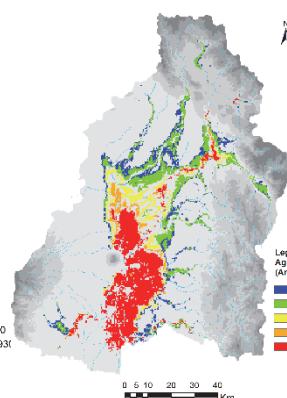
Pattern E



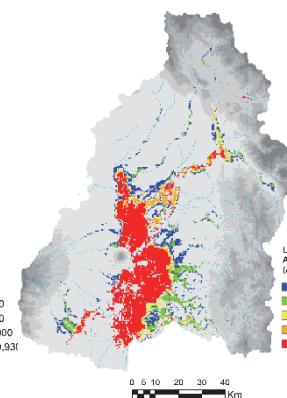
Pattern F



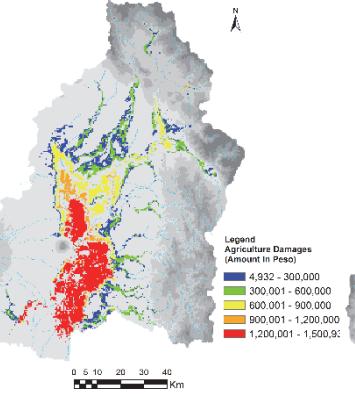
Pattern G



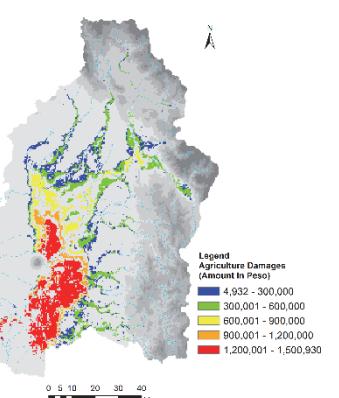
Pattern H



Pattern I



Pattern J



## 4. Research Result

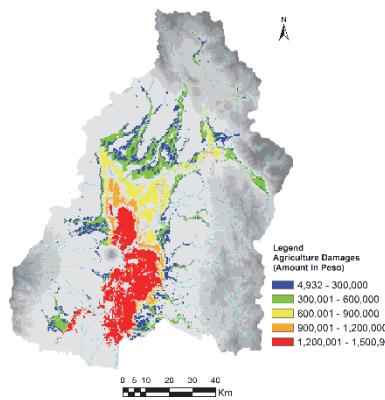
### 4.2 Flood risk assessment

Agricultural damage assessment by conducting hazard analysis using 10 different precipitation patterns with rainfall amount of 50 year return period

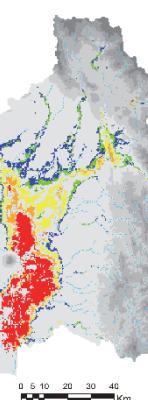
50-Year Flood (2/2)

#### Under Future Climate (2075-2099): SFA rcp8.5

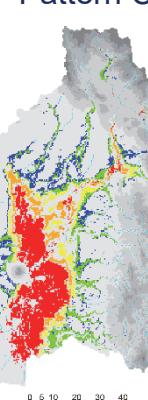
Pattern A



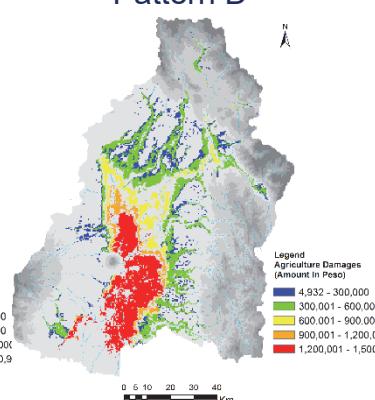
Pattern B



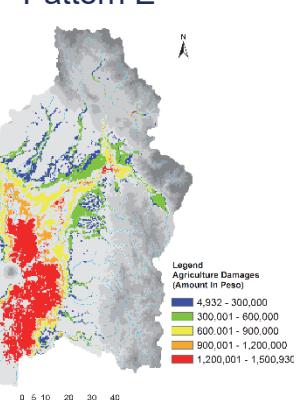
Pattern C



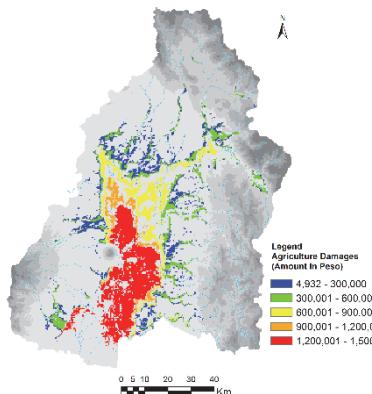
Pattern D



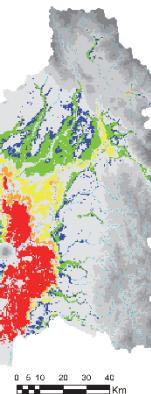
Pattern E



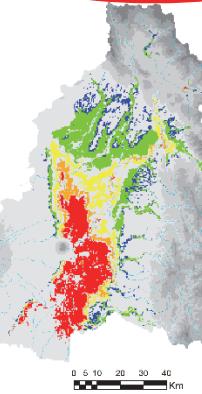
Pattern F



Pattern G

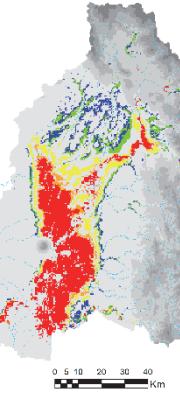


Pattern H

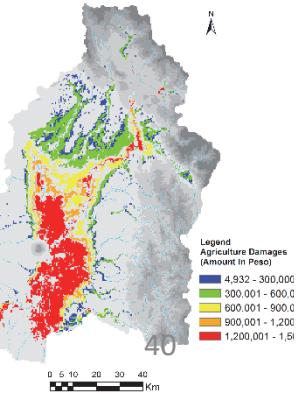


Maximum damaged agricultural area

Pattern I



Pattern J



## 4. Research Result

### 4.2 Flood risk assessment

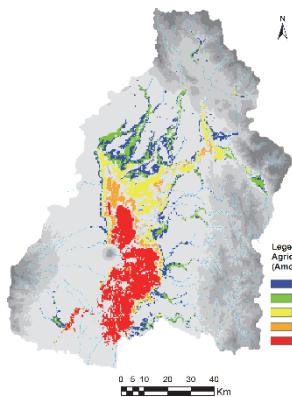
Agricultural damage assessment by conducting hazard analysis using 10 different precipitation patterns with rainfall amount of 100 year return period

100-Year Flood (1/2)

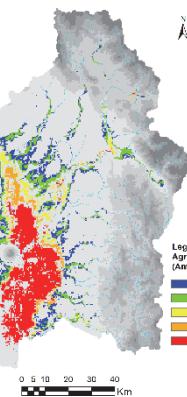
#### Under Present Climate (1979-2003): SPA

Maximum damaged agricultural area

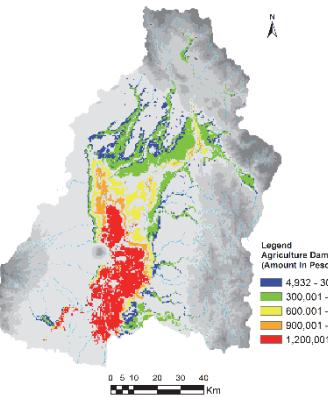
Pattern A



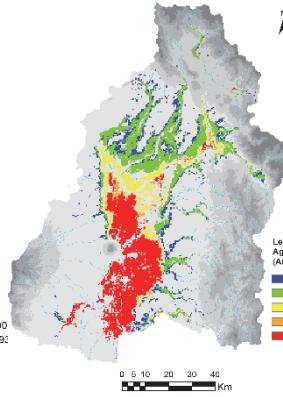
Pattern B



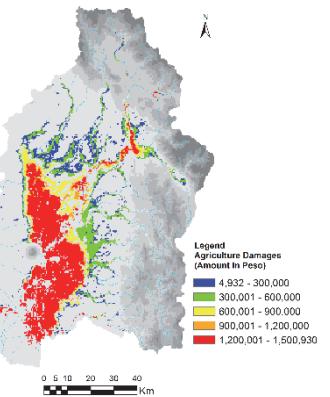
Pattern C



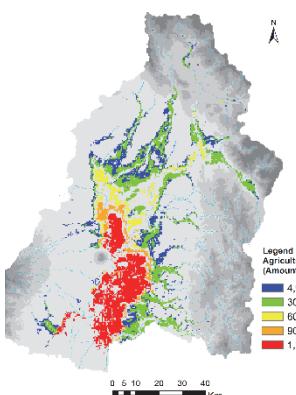
Pattern D



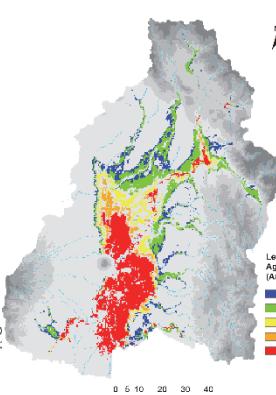
Pattern E



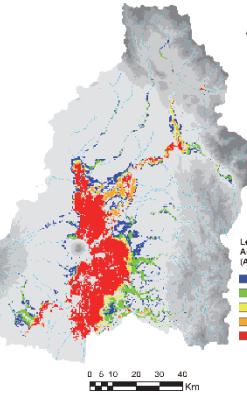
Pattern F



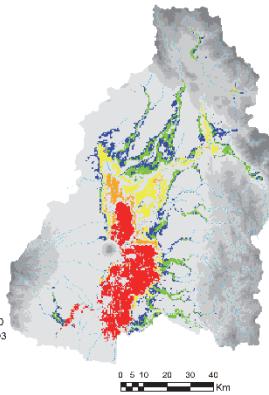
Pattern G



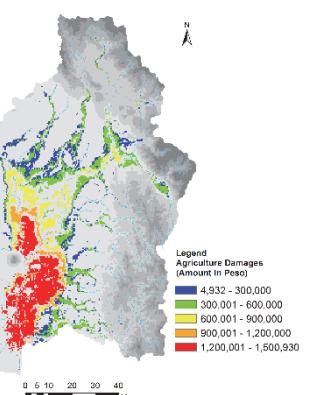
Pattern H



Pattern I



Pattern J



## 4. Research Result

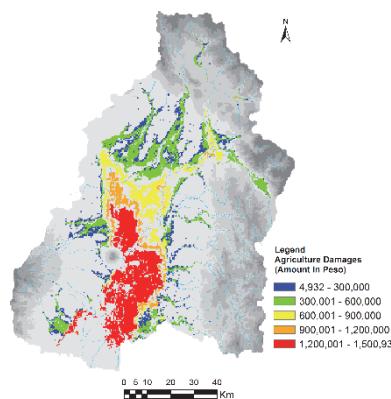
### 4.2 Flood risk assessment

Agricultural damage assessment by conducting hazard analysis using 10 different precipitation patterns with rainfall amount of 100 year return period

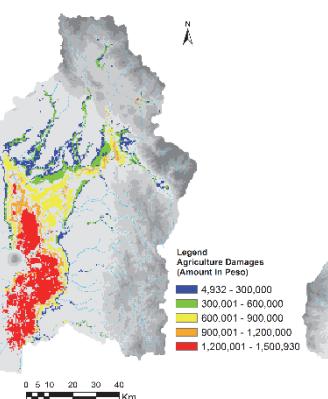
100-Year Flood (2/2)

Under Future Climate (2075-2099): SFA rcp8.5

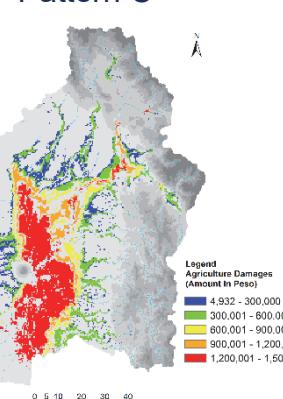
Pattern A



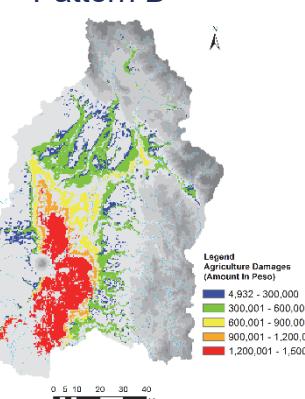
Pattern B



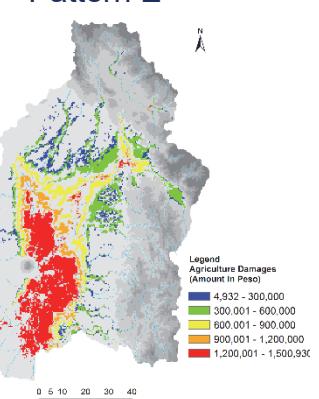
Pattern C



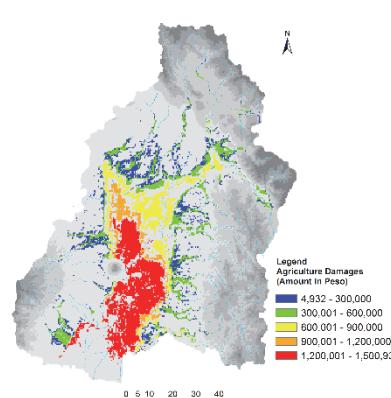
Pattern D



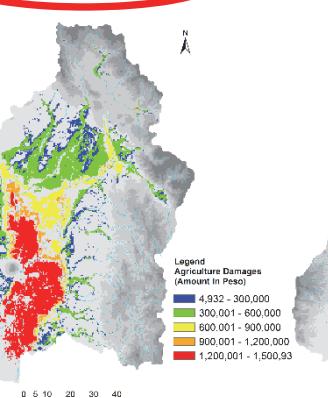
Pattern E



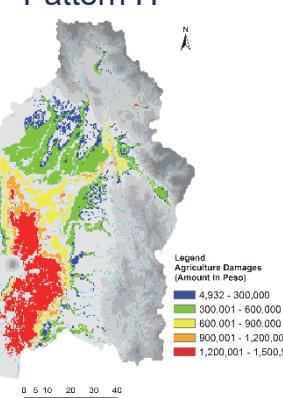
Pattern F



Pattern G

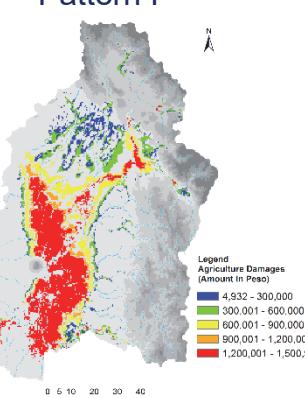


Pattern H

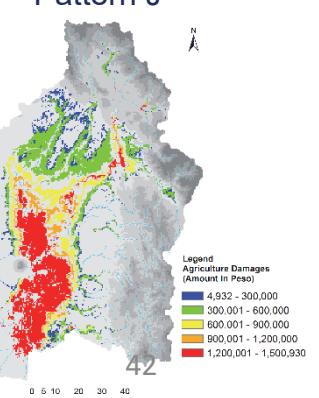


Maximum damaged agricultural area

Pattern I

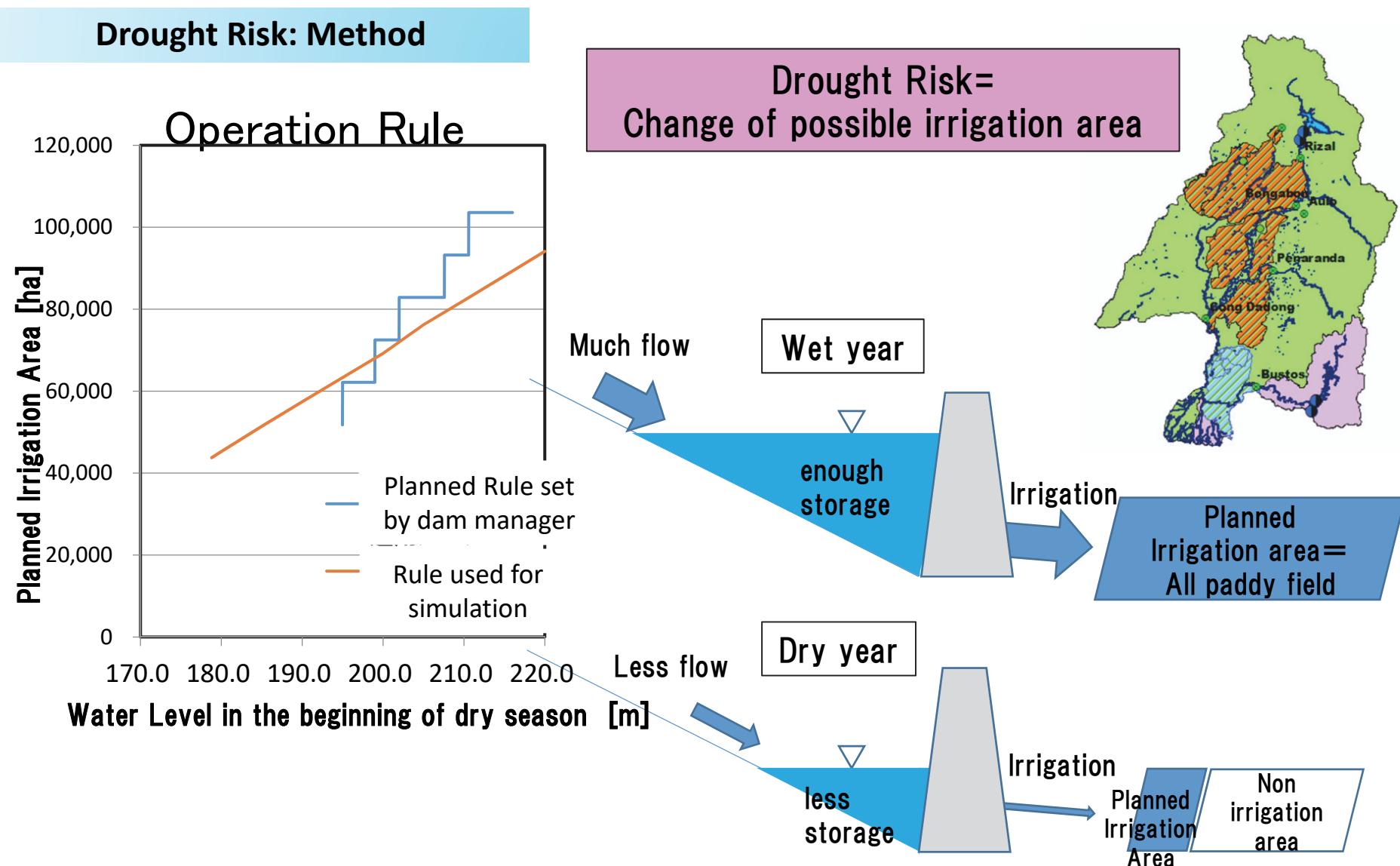


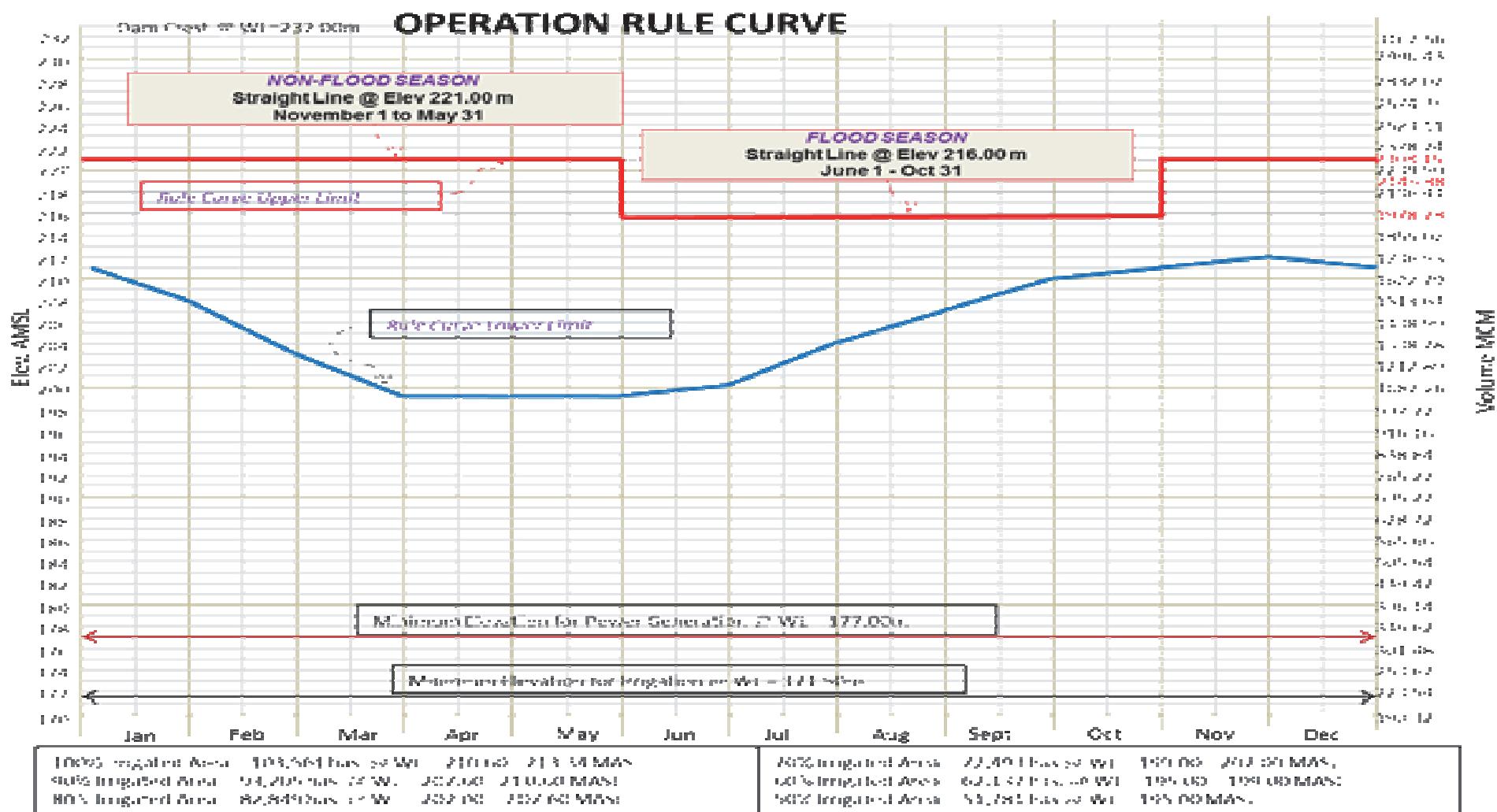
Pattern J



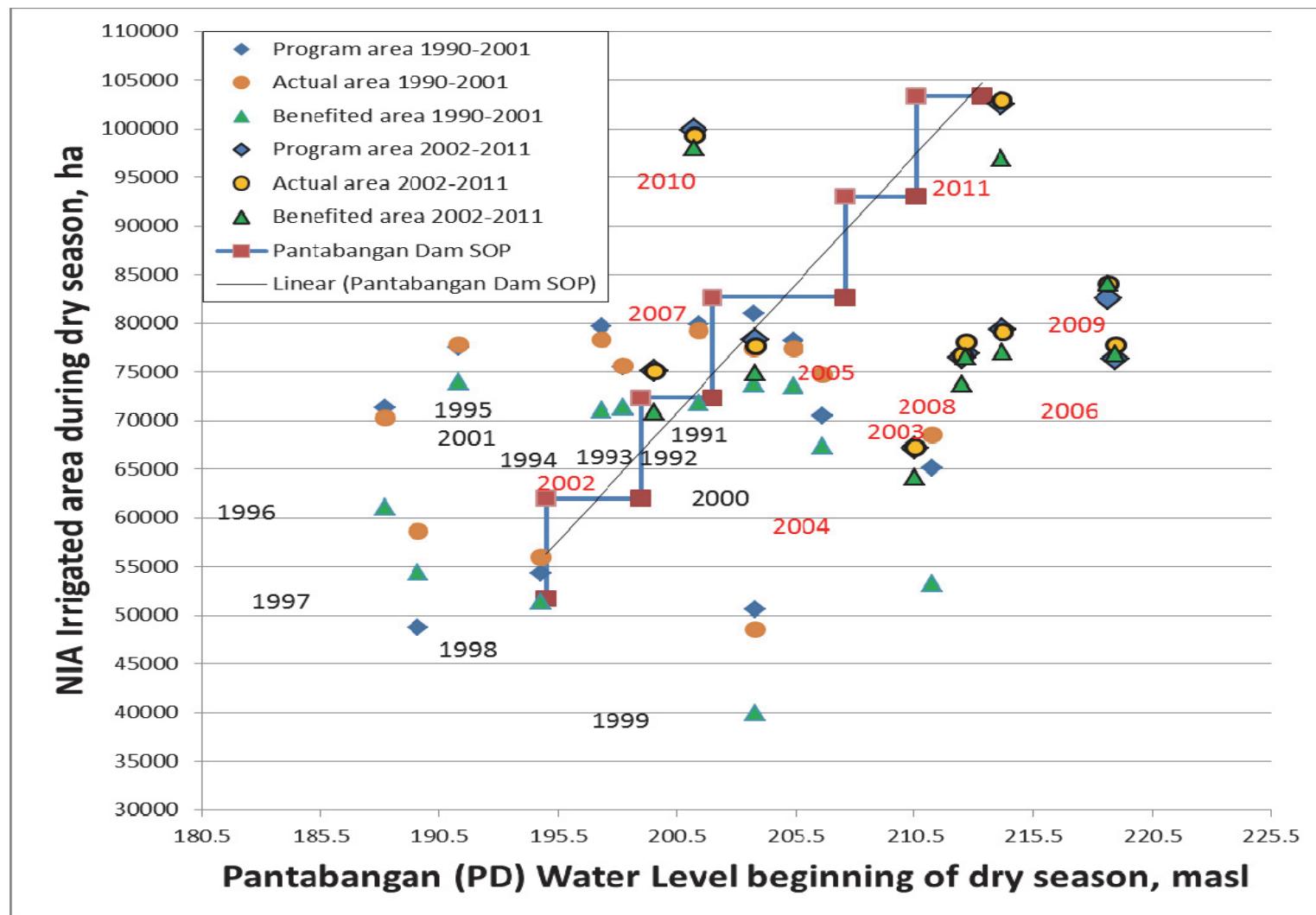
## 4. Research Result

### 4.3 Drought risk assessment under climate change





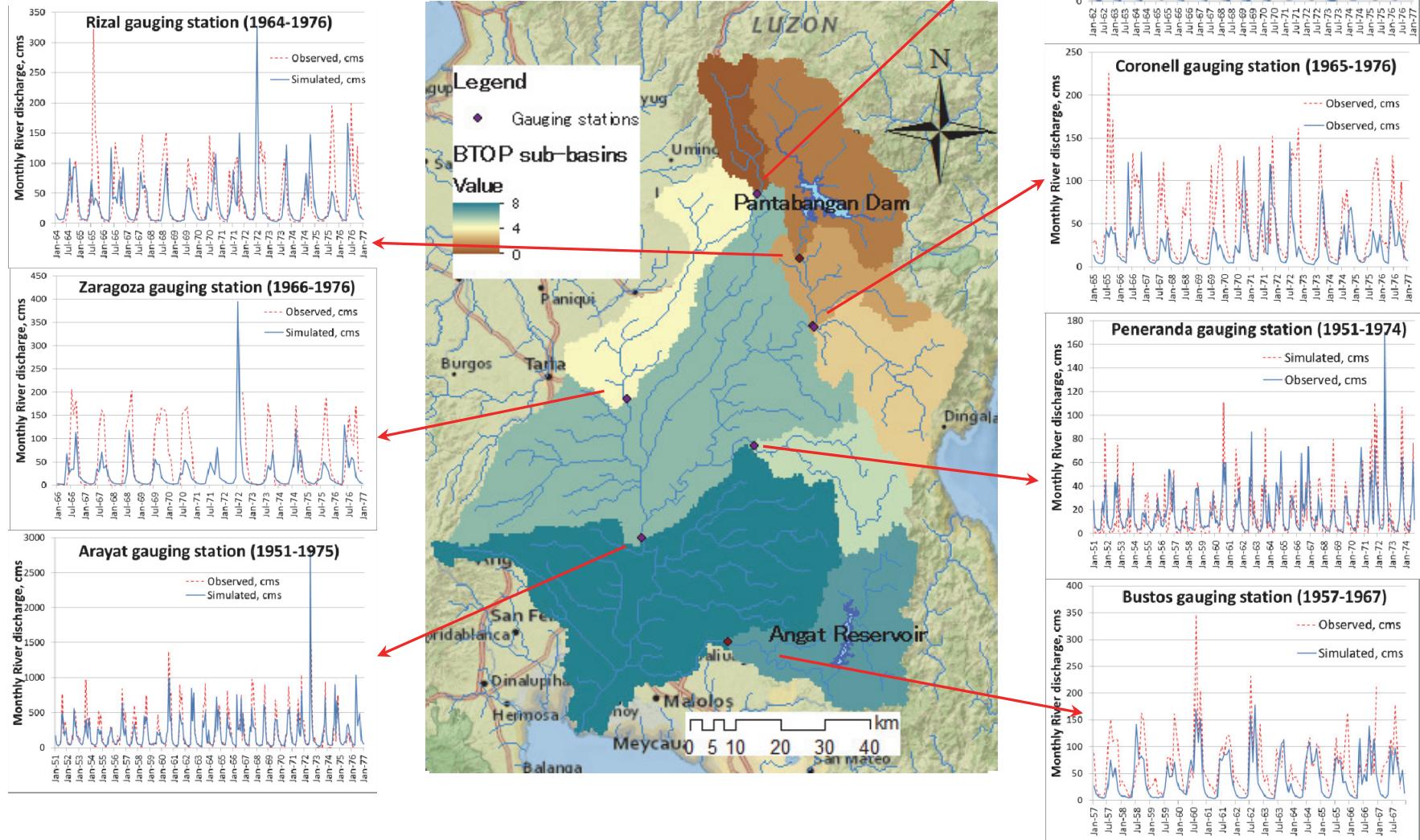
# Pantabangan Irrigated area from 1990-2011 (CASECNAN operation started in 2002)



# 4. Research Result

## 4.3 Drought risk assessment under climate change

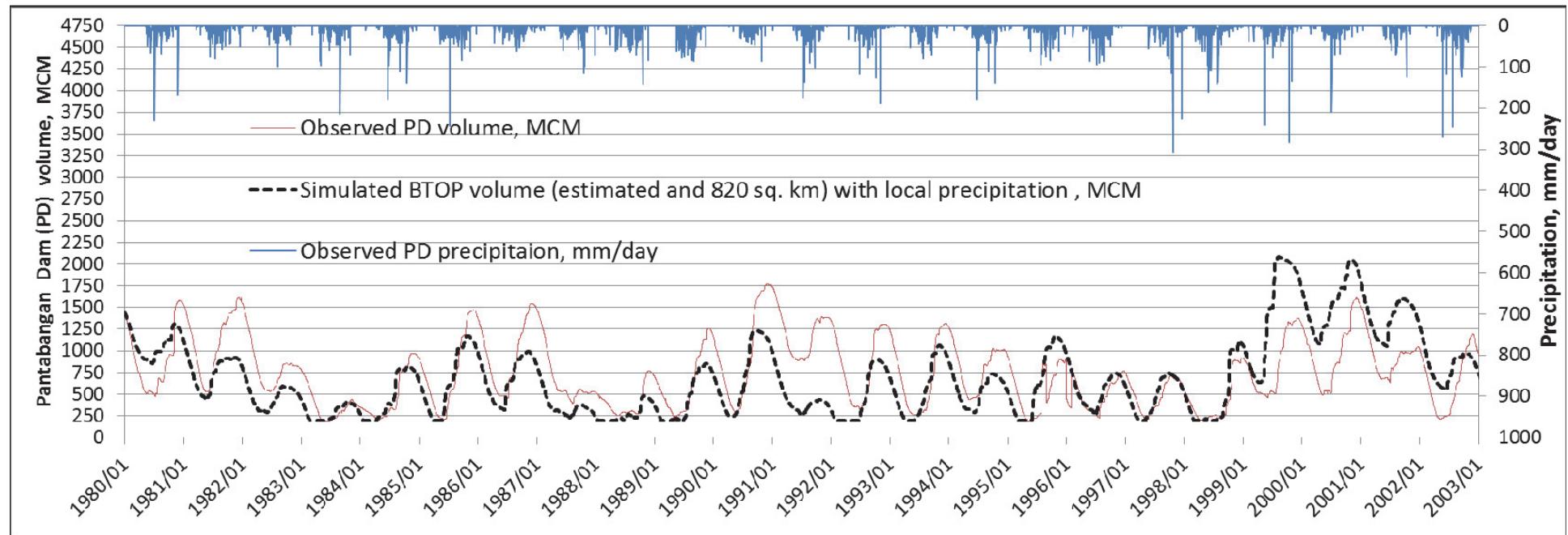
- Simulation period: 57 yrs with daily step on 0.5km grid size
- Precipitation: 1951-2007 APHROMA V1003R1 dataset
- Output: daily simulated soil moisture and river discharge
- Calibration: monthly river discharge at 7 gauging stations



## 4. Research Result

### 4.3 Drought risk assessment under climate change

#### Verification of BTOP model

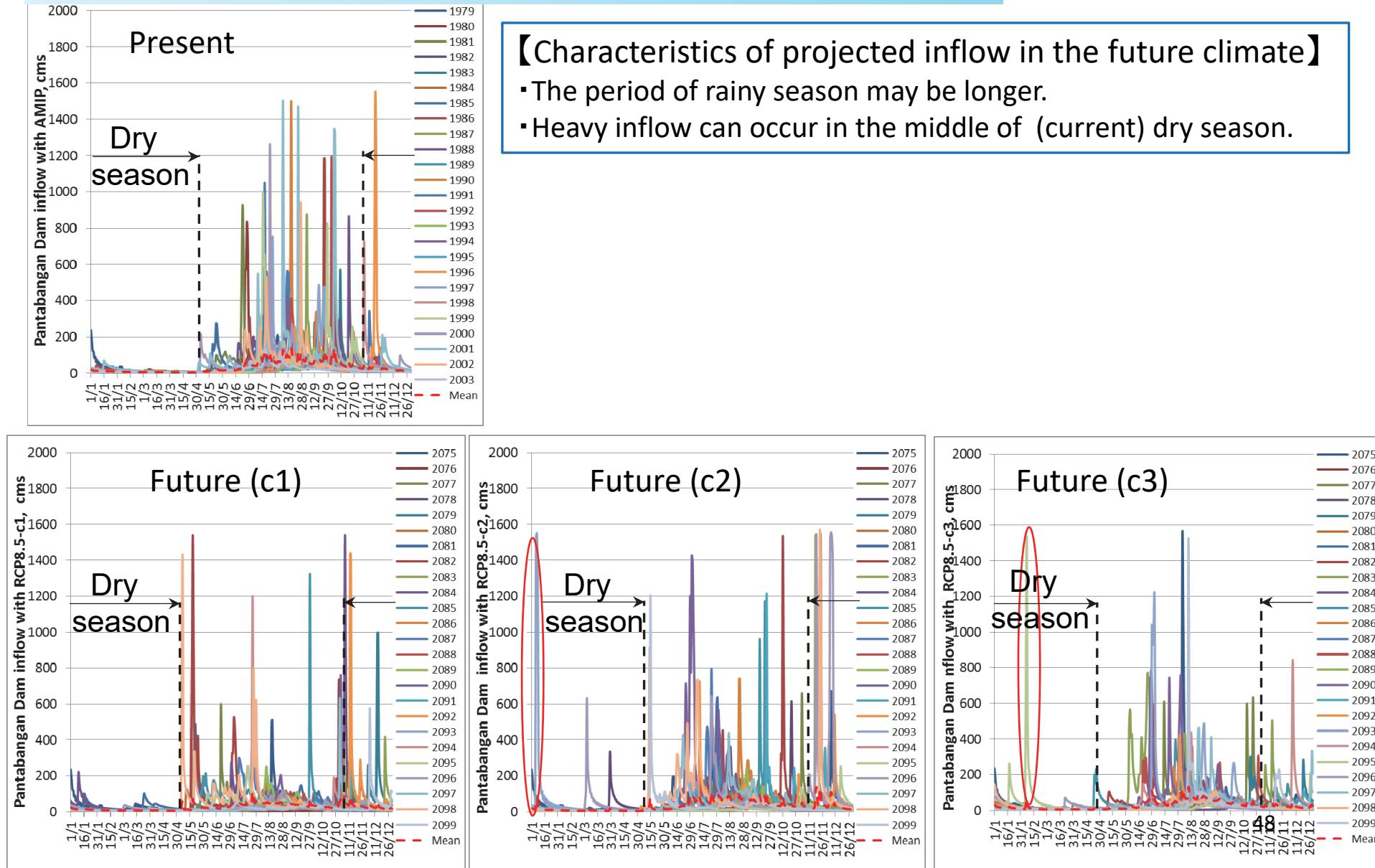


Simulated successive change in storage of  
Pampanga dam reservoir in the past

## 4. Research Result

### 4.3 Drought risk assessment under climate change

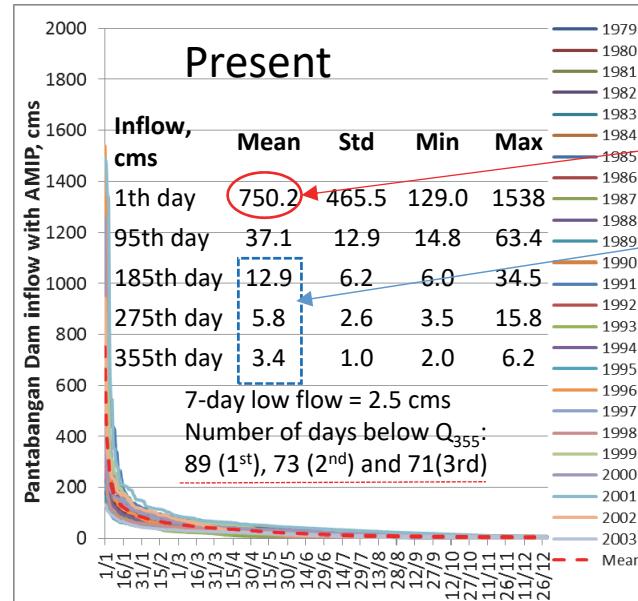
#### Projected changes in the inflow into Pantabangan Dam (1/2)



## 4. Research Result

### 4.3 Drought risk assessment under climate change

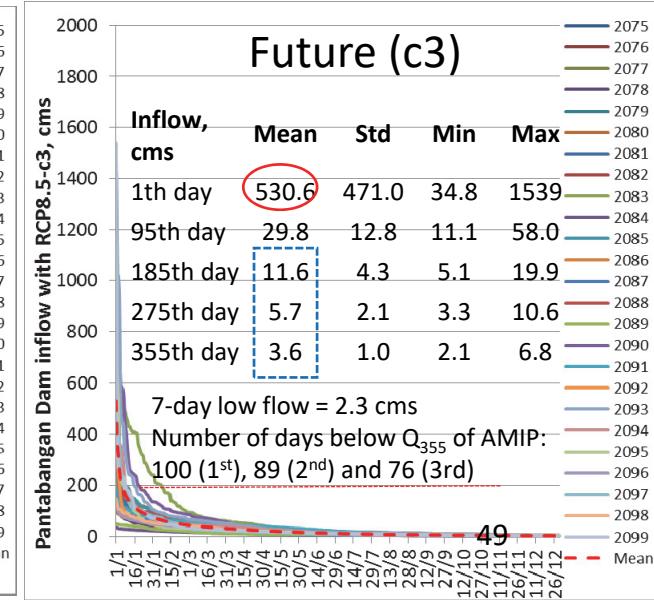
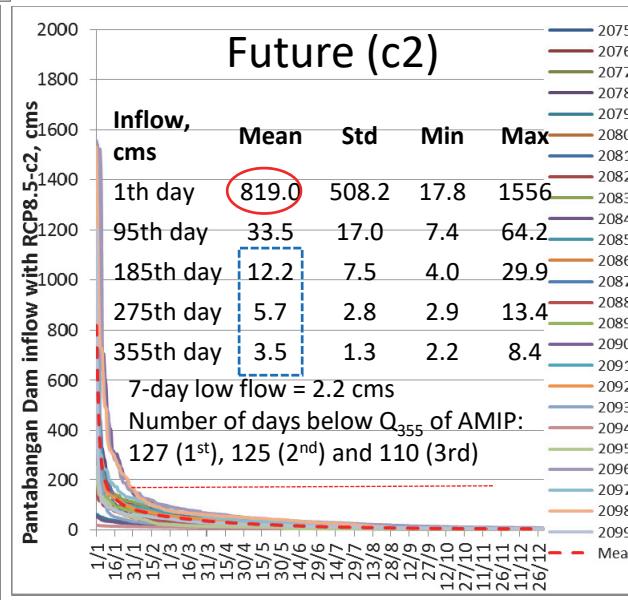
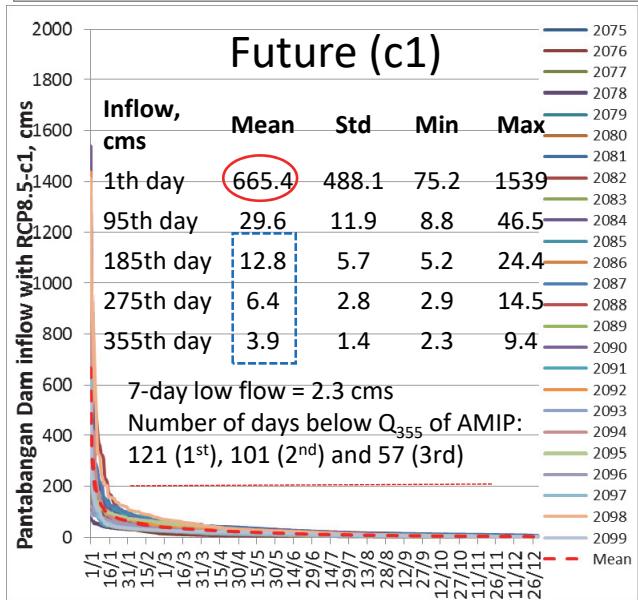
#### Projected changes in the inflow into Pantabangan Dam (2/2)



#### 【Characteristics of projected inflow in the future climate】

- Mean of maximum yearly inflow may be decreased for c1 and c3 case, but may be increased for c2 case.
- Mean of normal flow (185<sup>th</sup>-day inflow), low flow (275<sup>th</sup>-day inflow) and drought flow (355<sup>th</sup>-day inflow) is not be changed so much.

Std: Standard deviation



**Period below 250 MCM based on simulated Pantabangan Dam volumes with AMIP(01/1979-12/2003) and RCP8.5 ensemble average (01/2075-12/2099) , cluster 1 (c1), cluster 2 (c2), and cluster 3 (c3) precipitation**

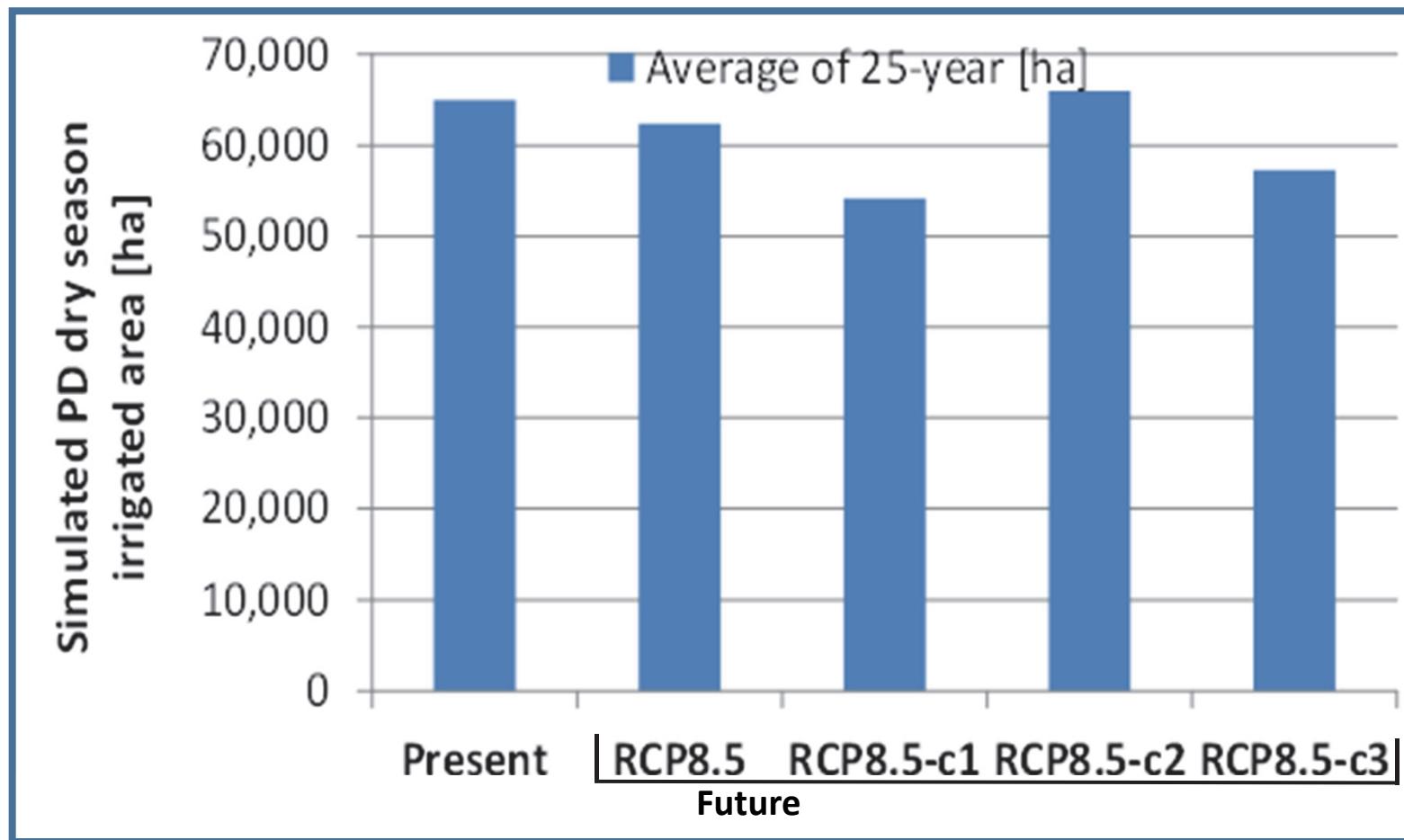
Total number of days below 250 MCM						
		1 st	2 nd	3 rd	4 th	5 th
Present	AMIP	188 Days from Feb 3 <sup>rd</sup>	170	139	134	123
Future	RCP8.5	247 Jan 10 <sup>th</sup>	189	178	175	166
	RCP8.5-c1	244 Jan 28 <sup>th</sup>	239	187	180	168
	RCP8.5-c2	310 Jan 1 <sup>st</sup>	202	191	163	155
	RCP8.5-c3	228 Jan 9 <sup>th</sup>	217	196	189	155

Based on the BTOP analysis, the longest period of zero water supply in present 25 years is for 188 days. Above figure shows period of the drought in the future will be longer.

## 4. Research Result

### 4.3 Drought risk assessment under climate change

#### Expected yearly-average rice crop yield in dry season



# 5. Summary

## [Flood Risk]

- The results show that flood damage to rice-crops area can be increased in the future by 12 % in the case of 50-year flood and 16 % in the case of 100-year flood.
- The results of flood damage assessment can be used to implement flood mitigation actions as well as to formulate the policies for flood disaster risk reduction.
- The presented method of flood damage assessment can be applied in other river basins of developing countries.

## [Drought Risk]

- The period of rainy season may be longer.
- Heavy inflow can occur in the middle of (current) dry season.
- Average of maximum yearly inflow may be decreased for c1 and c3 case, but may be increased for c2 case.
- Mean of normal flow (185<sup>th</sup>-day inflow), low flow (275<sup>th</sup>-day inflow) and drought flow (355<sup>th</sup>-day inflow) is not be changed so much.

## 6. Issues to be solved

- Data/information on past flood damage/hazard and socio-economical information are essential for risk assessment. It is thus essential to establish mechanism to collect and accumulate damage/hazard data.
- In further study, assessment of flood damage to other crops is also necessary.