



# Development of an integrated framework for evaluating the effect of typhoon- induced inundation hazard on various agricultural crops

**Bing-Chen JHONG**, Feng-Wen CHEN

*Assistant Professor*

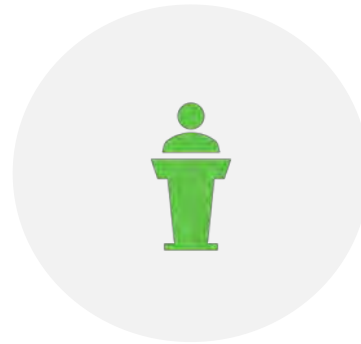
*Department of Marine Environment and Engineering*

*National Sun Yat-sen University (NSYSU)*

*Kaohsiung 80424, TAIWAN*



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# Outline

- Introduction
- Methodology
- Application
- Results and Discussion
- Conclusion

# Catastrophic Disasters



至少160人死亡，不過仍有數百人下落不明  
原文網址：<https://www.ettoday.net/news/20210717/2033320.htm#ixzz76MQG9D2j>

2021/07 德國西部城市科隆 (Cologne)，13與14日降雨量就超過150毫米，幾乎是7月份平均降雨量的兩倍之多。  
<https://www.cna.com.tw/news/firstnews/202107170195.aspx>



2021年7月河南水災，鄭州最大小時雨量達到了201.9公釐  
<https://newtalk.tw/news/view/2021-07-21/607497>; <https://news.ltn.com.tw/news/politics/paper/1462675>



以美國東岸各州為主(紐約、紐澤西)·遭大西洋颶風「艾達」(Ida)所帶來的風暴殘餘威力強襲。截至當地時間2021年9月2日晚間11點為止，美國東北地區已知至少45死，其中在23死的紐澤西，大多數人是在行車中被沖走；至少13死的紐約市，則是因為多起「地下室公寓淹水」多人滅頂至死。[https://global.udn.com/global\\_vision/story/8662/5719277](https://global.udn.com/global_vision/story/8662/5719277)

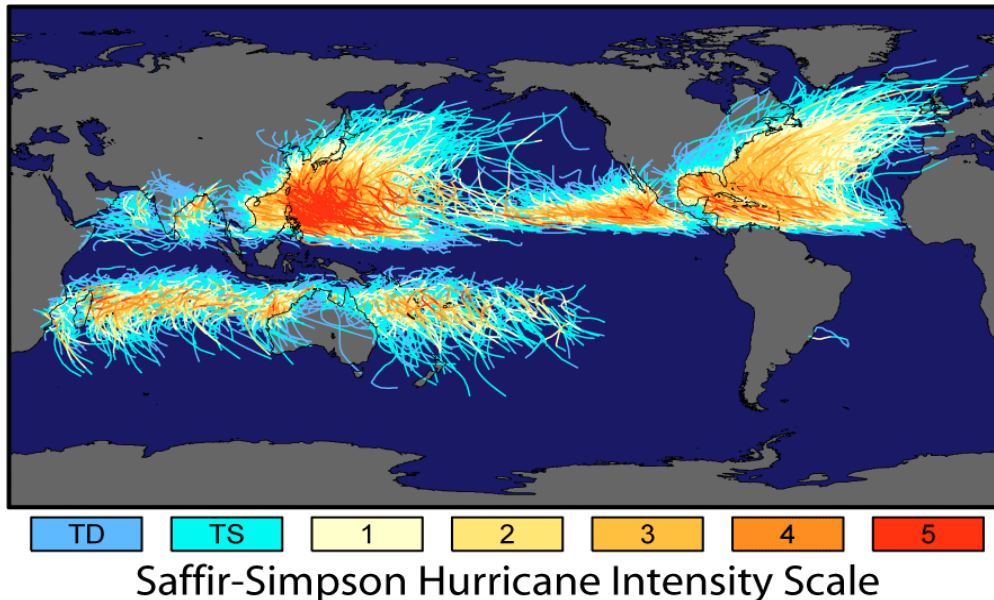
# Tropical Cyclone

- **Taiwan** is located in one of the main paths of typhoons.

**25.3**

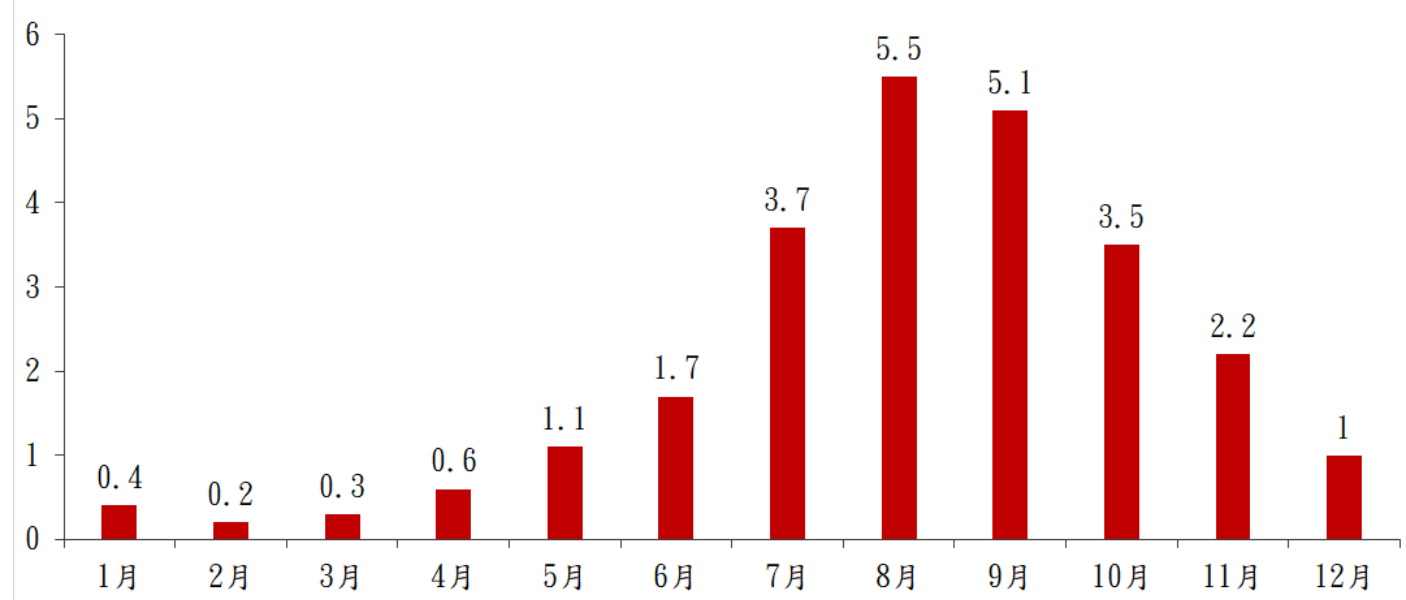
The climatological **average number** of **typhoons** formed annually in the Northwest Pacific over the period **1991-2020** is **25.3**, with the majority of typhoons forming between **July** and **October**.

Tracks and Intensity of All Tropical Storms



Source: Ho, C. R., Tsao, Y. H., Kuo, N. J., & Huang, S. J. (2011, January). Estimation of Tropical Cyclone Heat Potential From Oceanic Measurements. In International Conference on Offshore Mechanics and Arctic Engineering (Vol. 44380, pp. 817-822).

Number of Typhoons Formed in the Northwest Pacific (1991-2020)



Data Source: Central Weather Administration (CWA)

# Disasters in Taiwan

- The **torrential rainfall** brought by typhoons frequently leads to serious disasters, such as **inundation**.

### HAIKUI (2023)



[https://tw.news.yahoo.com/%E9%A2%B1%E9%A2%A8%E5%BE%8C%E8%8A%B1%E8%93%AE%E7%8E%89%E9%87%8C%E8%BE%B2%E7%94%B0%E8%B3%A1%E6%B0%B4-%E5%9C%96-05628196.html?guccounter=1&guce\\_refferer=ahR0cHM6LjB3d3cuZ29vZ2xLmNvBS88guce\\_refferer\\_sig=AQAAAEZePHxP\\_P335FPf62j8mod190gfm1xUSbPSgkH\\_8Gn\\_gl6ODGs02CSi84xeABVWj1T2kaJklwArAM3zuZbK6tu6baKS7pi-TwH8tp1Ylx\\_9VhB5xatFKT1m868jRVIO7ZJx6391wllQYHe96Ne9mdQIOVa7FAvc\\_0pXsWB](https://tw.news.yahoo.com/%E9%A2%B1%E9%A2%A8%E5%BE%8C%E8%8A%B1%E8%93%AE%E7%8E%89%E9%87%8C%E8%BE%B2%E7%94%B0%E8%B3%A1%E6%B0%B4-%E5%9C%96-05628196.html?guccounter=1&guce_refferer=ahR0cHM6LjB3d3cuZ29vZ2xLmNvBS88guce_refferer_sig=AQAAAEZePHxP_P335FPf62j8mod190gfm1xUSbPSgkH_8Gn_gl6ODGs02CSi84xeABVWj1T2kaJklwArAM3zuZbK6tu6baKS7pi-TwH8tp1Ylx_9VhB5xatFKT1m868jRVIO7ZJx6391wllQYHe96Ne9mdQIOVa7FAvc_0pXsWB)

### MERANTI (2016)



這次受到莫蘭蒂颱風的影響

<https://www.thenewslens.com/article/49528>



<https://www.agriharvest.tw/archives/25282>

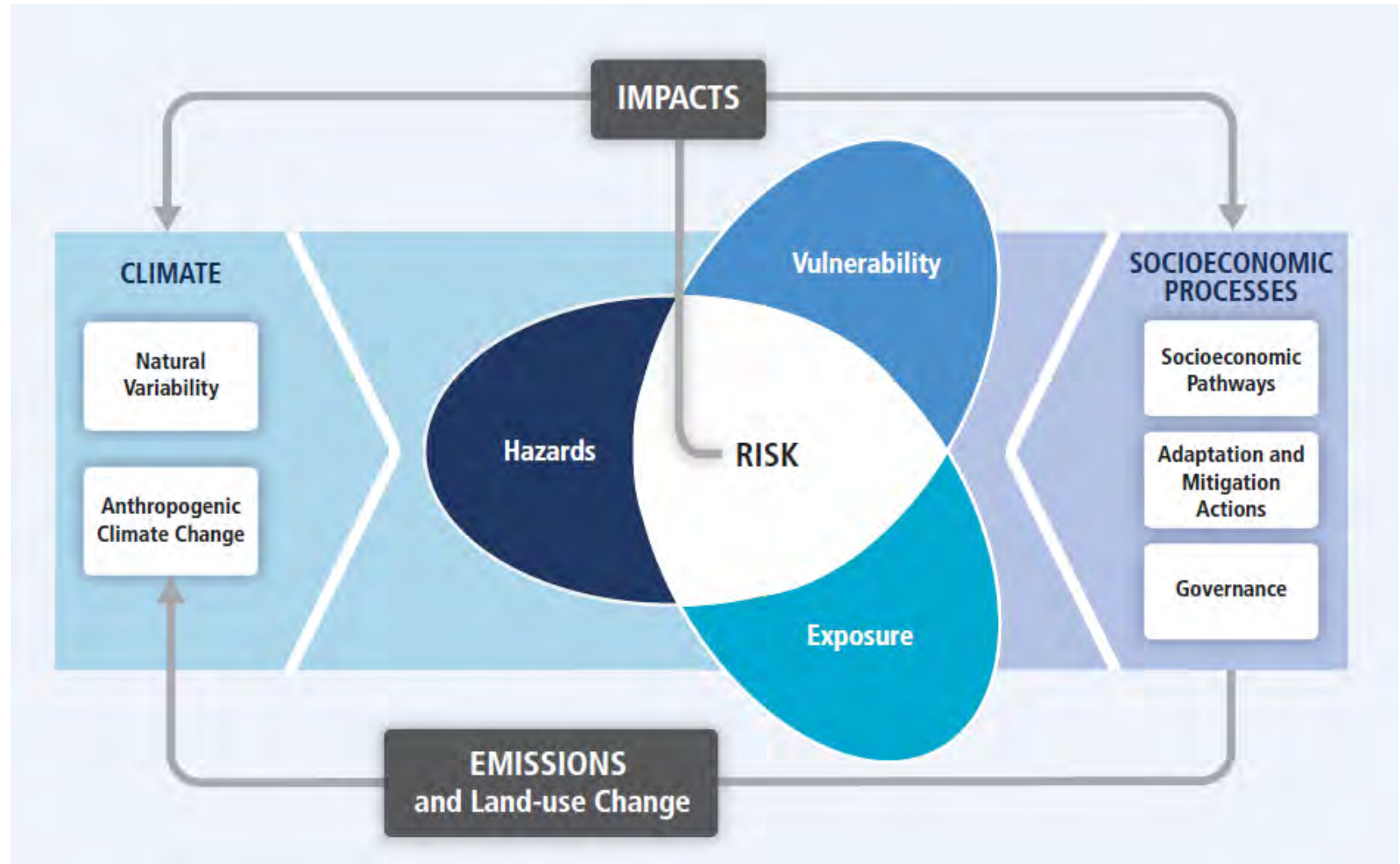
# Warning system



- The **warning system** can increase the mitigation time,
- which is a consequence of a reduction in the time of several actions
  - such as data collection, emergency notification and decision making.

# Climate Risk

	Warming Trend
	Extreme Temperature
	Drying Trend
	Extreme Precipitation
	Precipitation
	Snow Cover
	Damaging Cyclone
	Sea Level
	Carbon Dioxide Fertilization



# Real-time Climate Risk Assessment

A comprehensive framework



**Cause of risk  
resulted from climatic  
and non-climatic  
factors**

**Point A**



**Risk communication  
based on the same  
architecture**

**Point B**



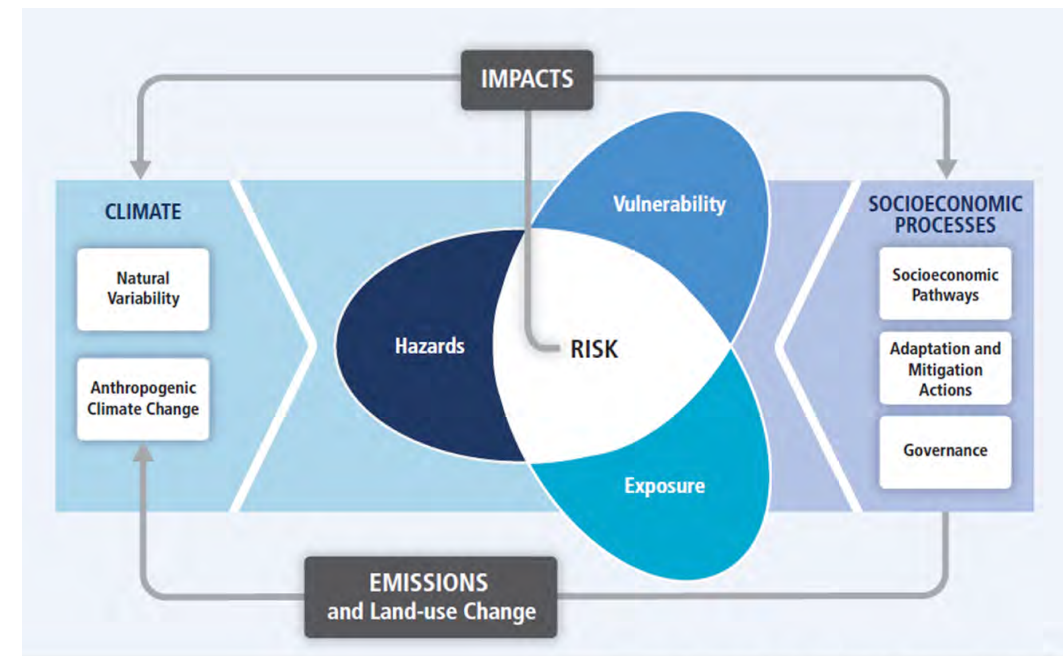
**Interdisciplinary  
integration and  
assessment**

**Point C**



# Purpose

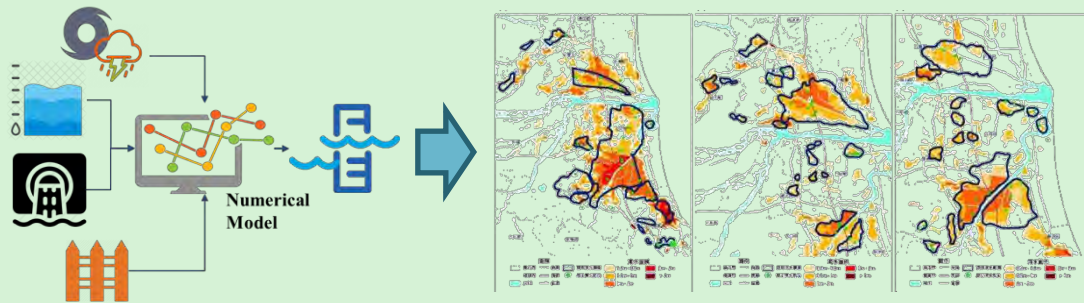
- Propose a generalized approach of **assessing real-time inundation dynamic risks** for paddy fields during typhoons
  - *Hazard*: Based on integrating a numerical model and AI-based approaches
  - *Exposure*: Protected target
  - *Vulnerability*: Sensitivity factors



# Proposed Integrated Framework

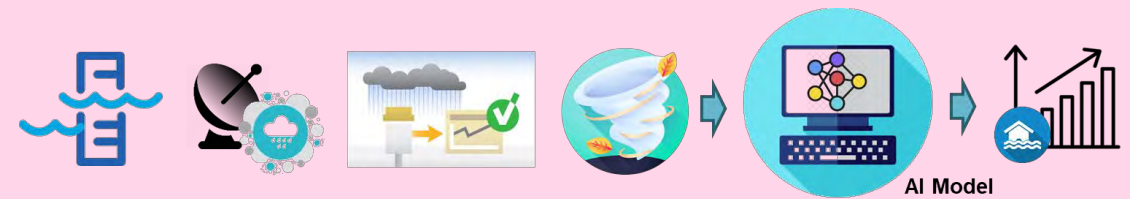
## 01 Numerical Model

- Inundation database simulation



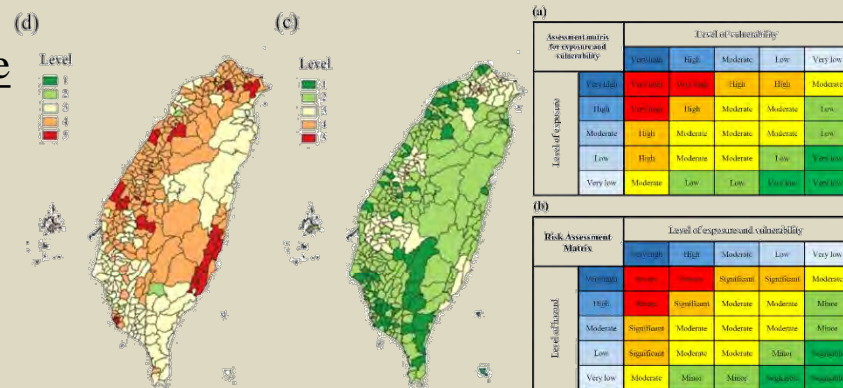
## 02 Forecasting AI Model

- Real-time forecasting of inundation depth
- An AI-based model with feature engineering



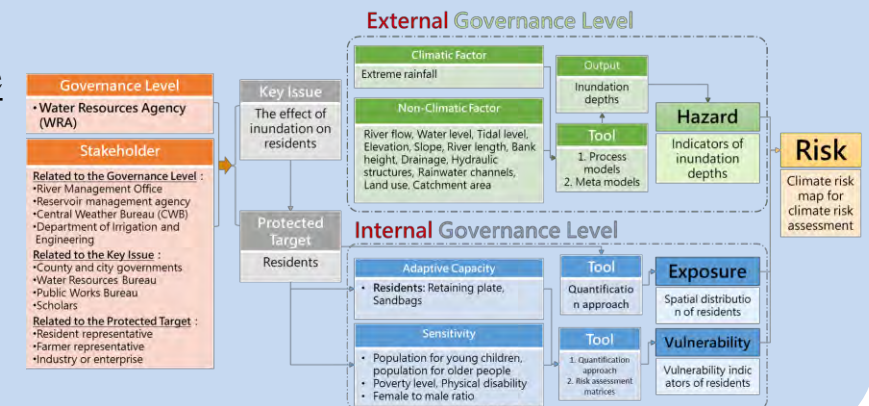
## 04 Spatial Risk Assessment

- Quantitative analysis
- Risk Maps



## 03 Climate Adaptation Algorithm

- Qualitative analysis
- Potential factors



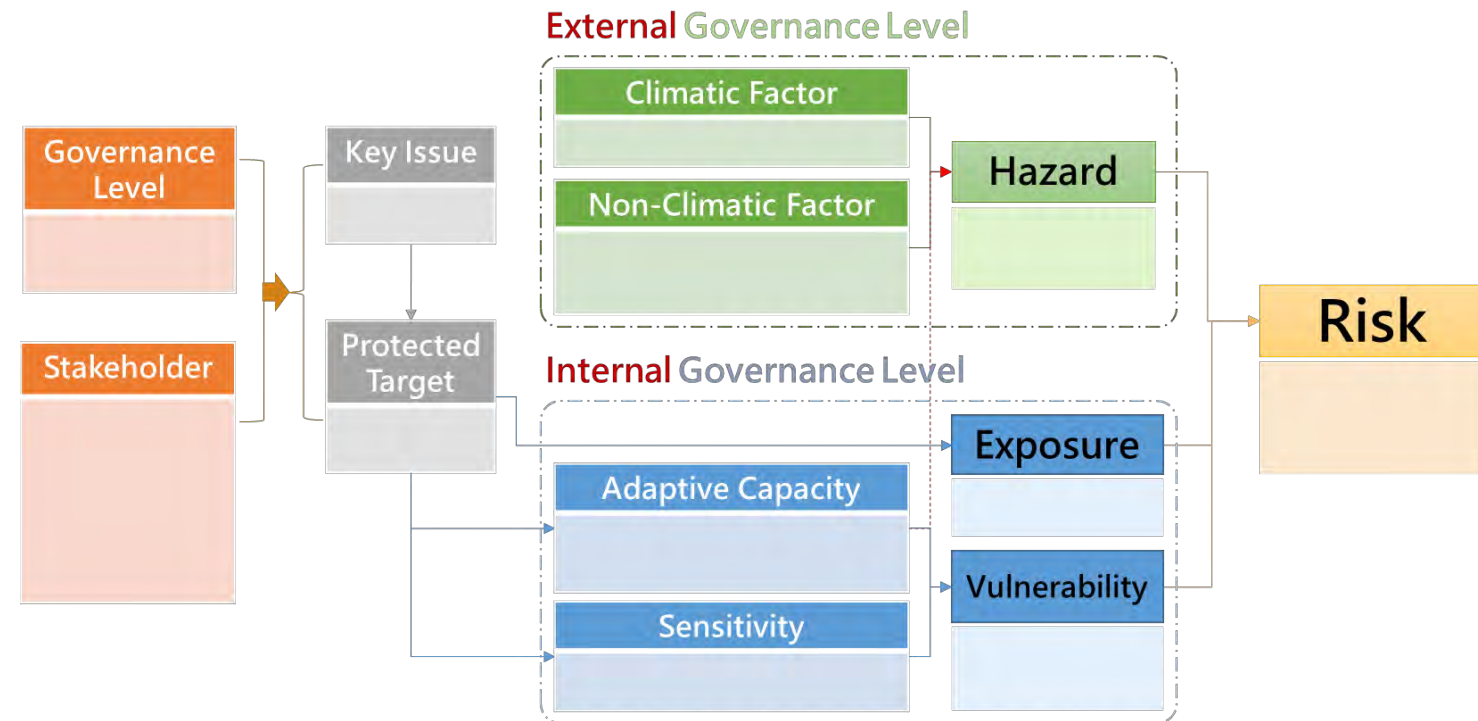
# Climate Adaptation Algorithm

- Climate Change Adaptation 6-Steps (CCA6Steps)
- Climate Risk Template (CRT)

(Tung et al., 2019)



Climate Change Adaptation 6-Steps

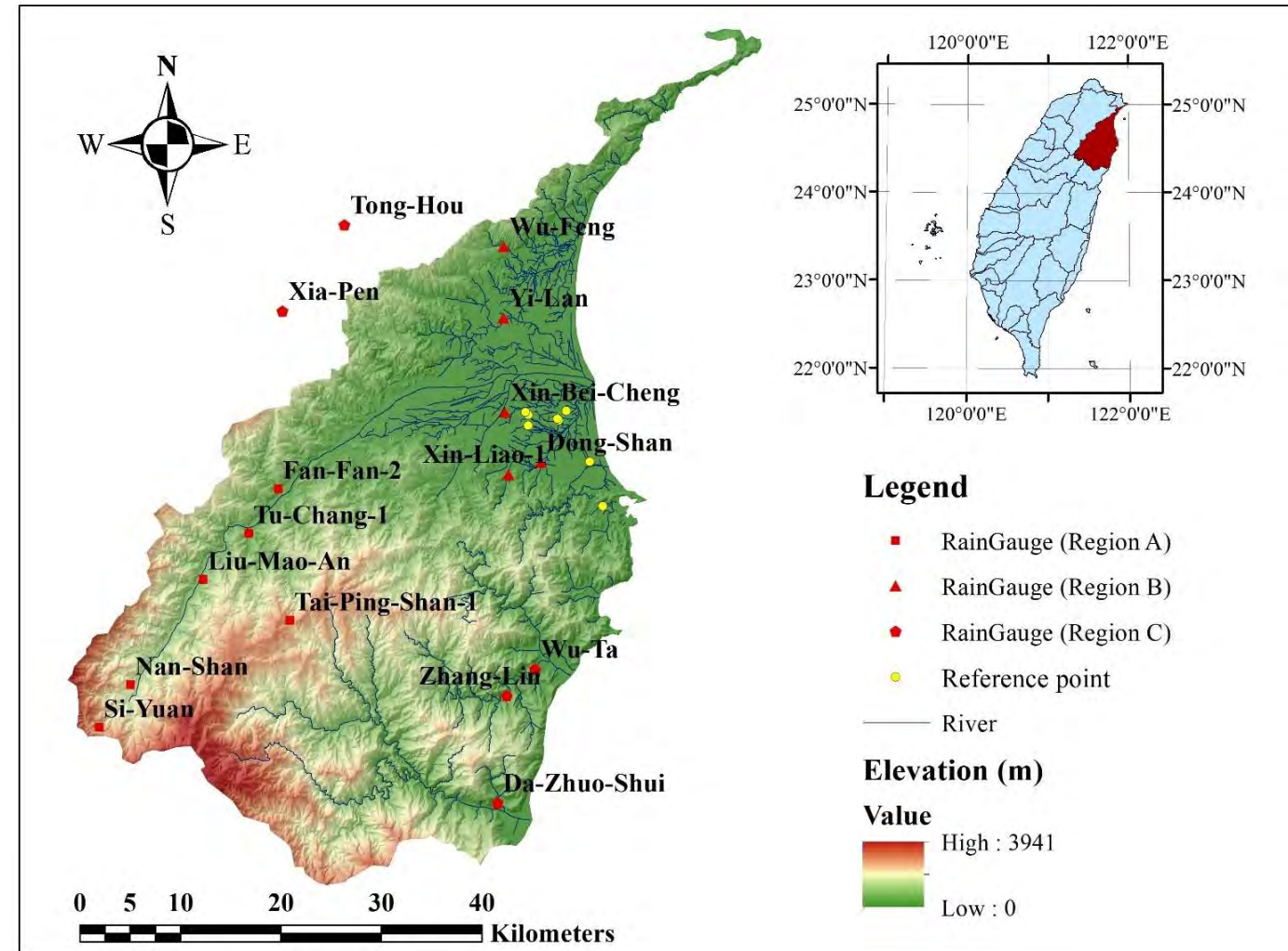


Climate Risk Template

# Study Area

## Yilan County

- The average annual rainfall is over **2,700 mm**.
- Rainy days throughout one year is more than **200** days.
- **16** raingauges and **5** typhoon events (2008~2015) are used.
- **9** sites are selected as reference points.
- **6** points of sewer water level data were utilized.



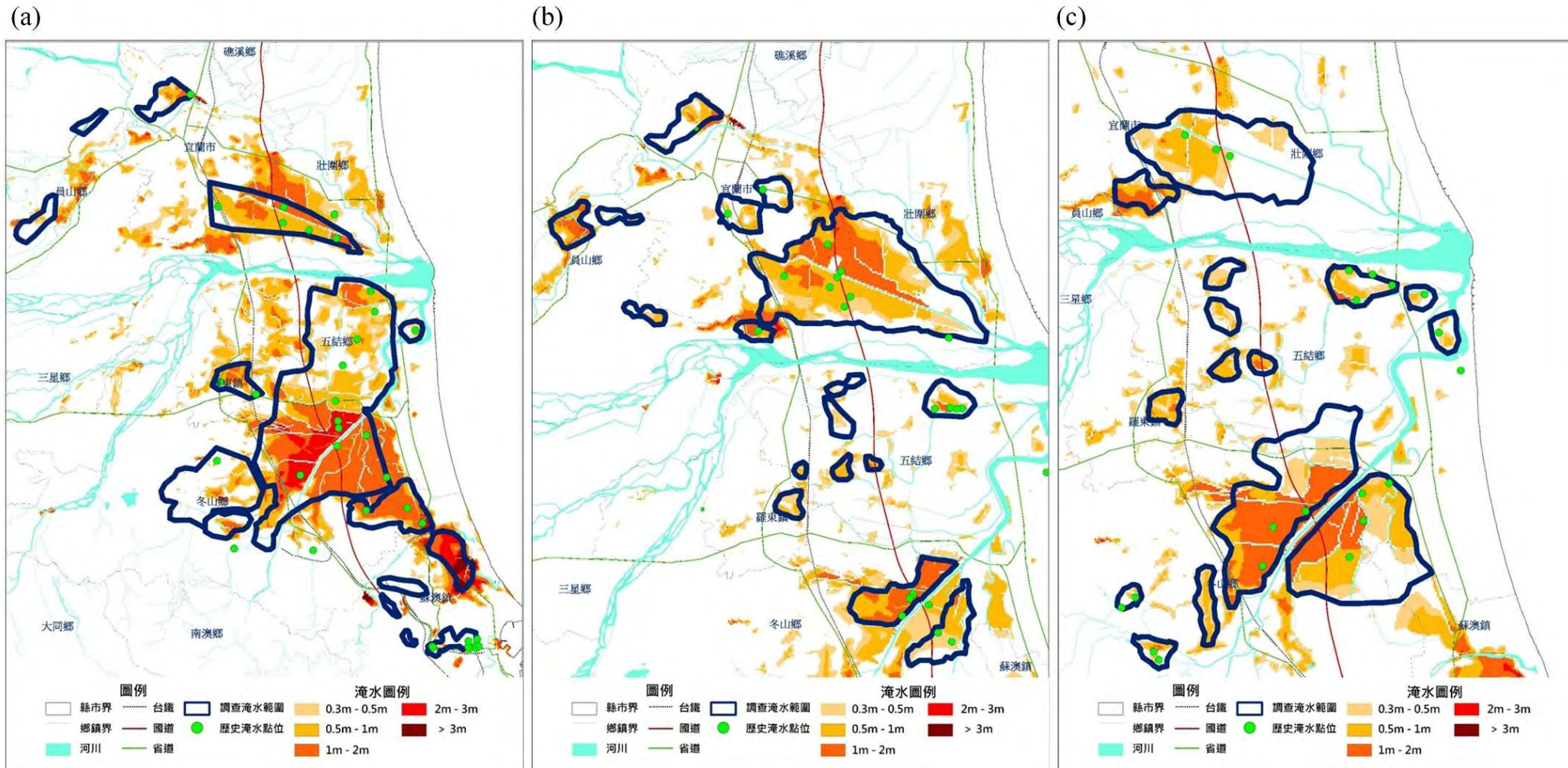
# Hazard (Inundation Database)

- The flow overflow process and inundation components of the study area were simulated by **SOBEK** model.
- Calibration: (a) Typhoon Megi (2010) and (b) Typhoon Saola (2012); Validation: (c) Typhoon Parma (2009)

## Hazard (H):

(Shrestha et al., 2014)

- I: 0~20 (cm)
- II: 20~50 (cm)
- III: 50~85 (cm)
- IV: 85~100 (cm)
- V: >100 (cm)



# Exposure & Vulnerability

- Exposure (E):

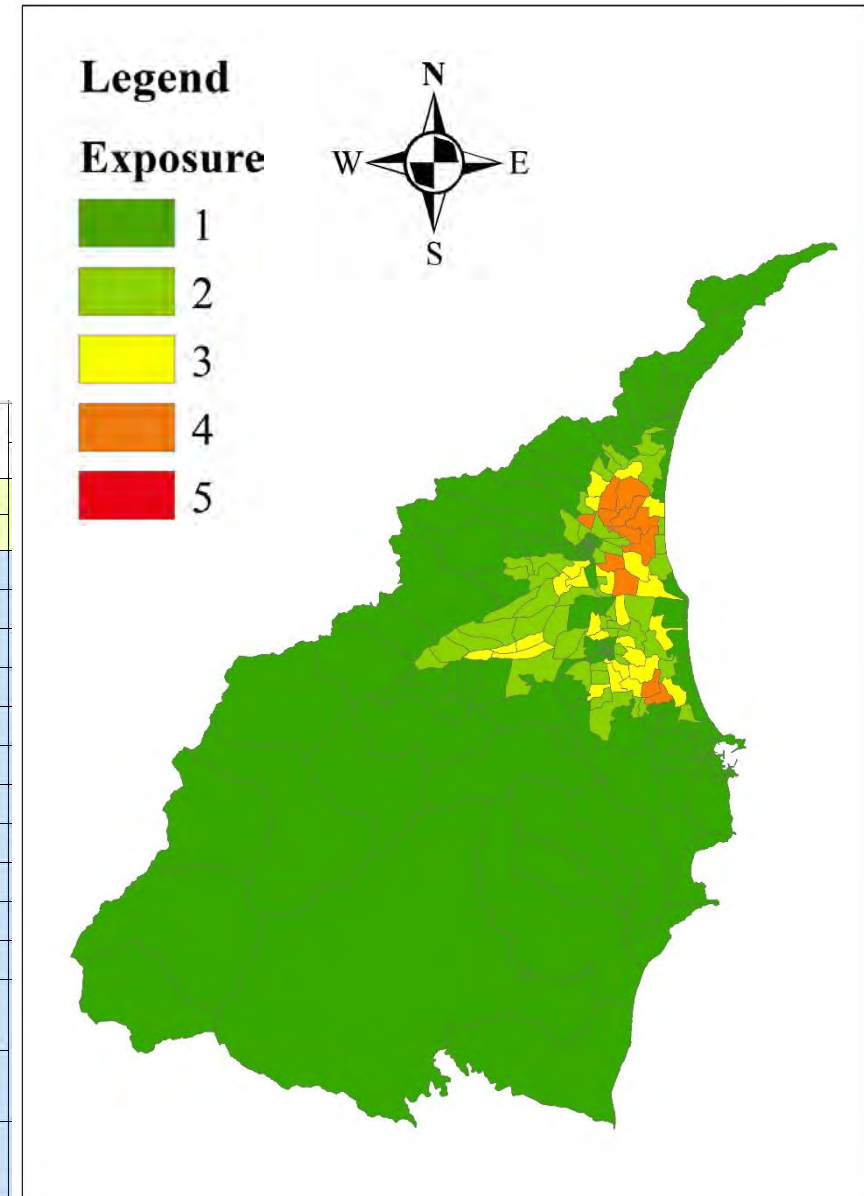
- The proportion of paddy field area to the total area within each administrative district.

- Vulnerability (V):

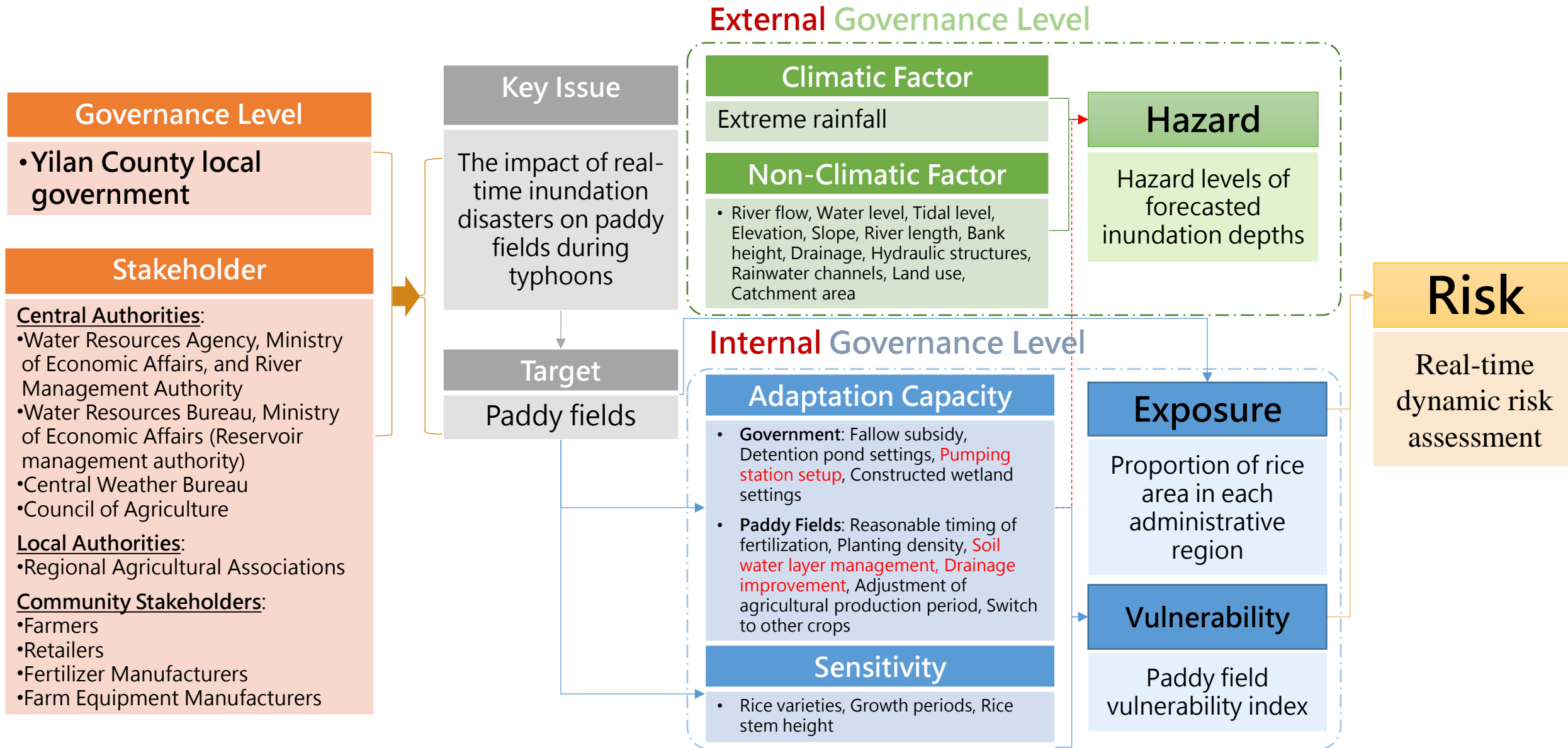
**Levels:**

- I: Maturity stage (成熟期)
- II: Heading stage (抽穗期)
- III: Booting stage (孕穗期)
- IV: Tillering stage (分蘖期)
- V: Seedling stage (秧苗期)

Target	Components	Factors	Indicators	
Risk	Hazard	Climatic Factor		
		Non-Climatic Factor		
	Vulnerability	Adaptive Capacity (Government)		Fallow subsidy
				Detention pond settings
				Pumping station setup
				Constructed wetland settings
		Adaptive Capacity (Protected Target)		Reasonable timing of fertilization
				Planting density
				Soil water layer management
				Drainage improvement
				Adjustment of agricultural production period
				Switch to other crops
	Sensitivity		Rice varieties	
		Growth periods		
		Rice stem height		
Exposure	Exposure	Proportion of rice area in each administrative region		



# Results I: Qualitative investigation of potential factors by the CRT



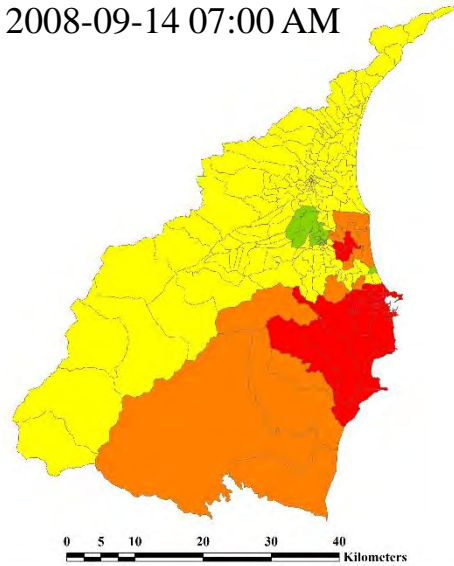
# Results II: Spatial analysis of real-time inundation forecasts

## Typhoon SINLAKU (2008)

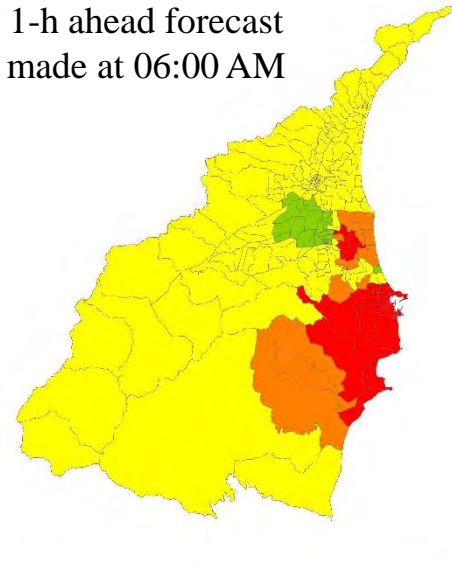
### Short lead times

- Maximum value of inundation depth
- at 07:00 AM on Sep-10, 2008

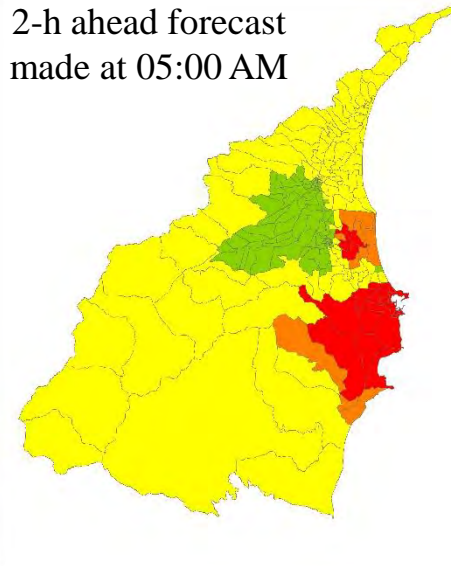
2008-09-14 07:00 AM



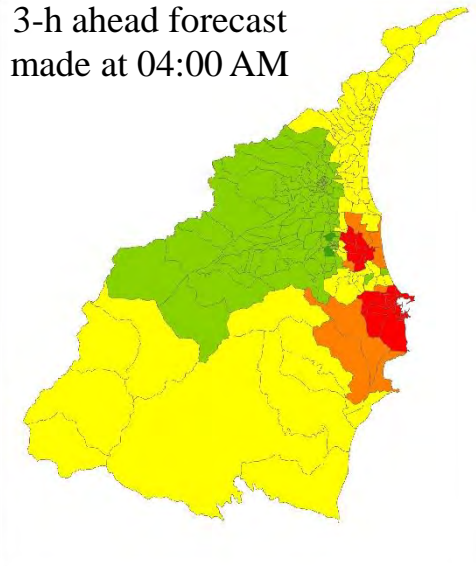
1-h ahead forecast  
made at 06:00 AM



2-h ahead forecast  
made at 05:00 AM



3-h ahead forecast  
made at 04:00 AM



### Long lead times

Legend

Depth (cm)

0 - 20

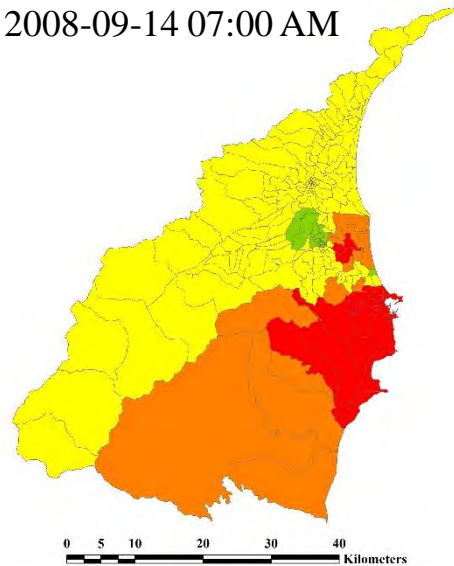
21 - 50

51 - 85

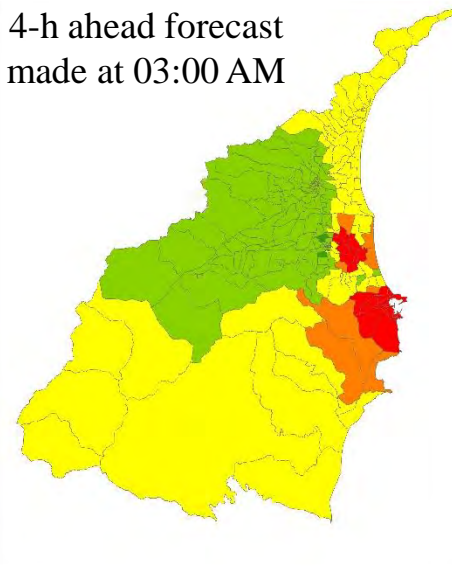
86 - 100

101 - 142

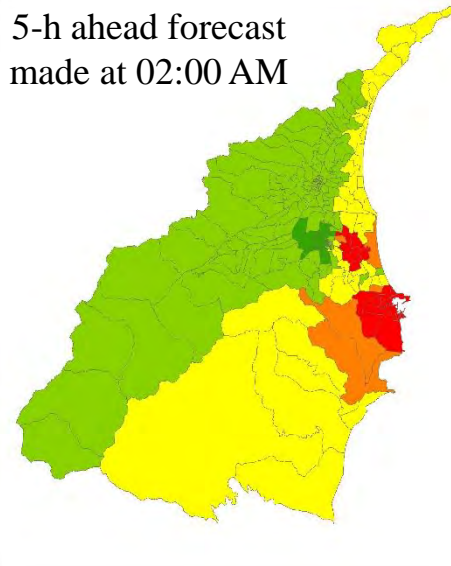
2008-09-14 07:00 AM



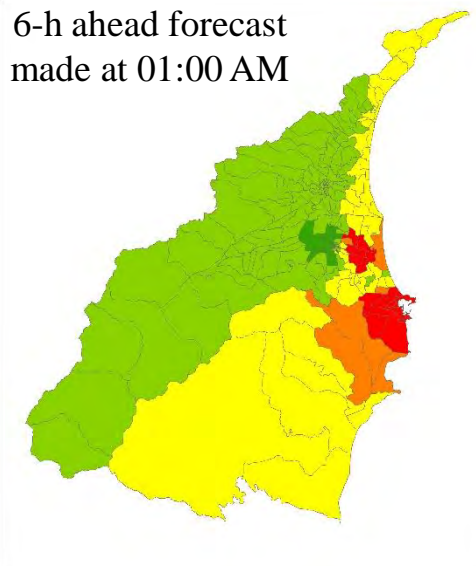
4-h ahead forecast  
made at 03:00 AM



5-h ahead forecast  
made at 02:00 AM



6-h ahead forecast  
made at 01:00 AM





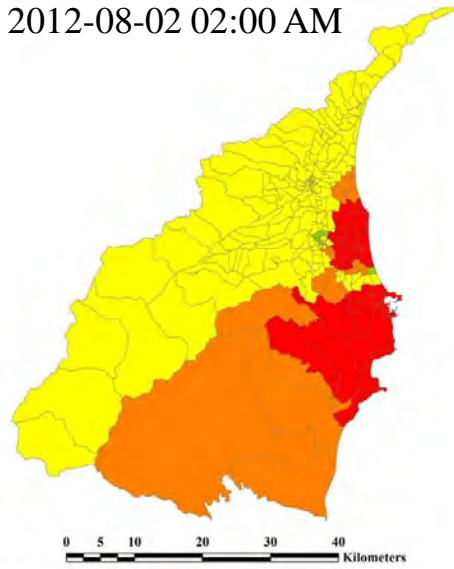
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## Typhoon SAOLA (2012)

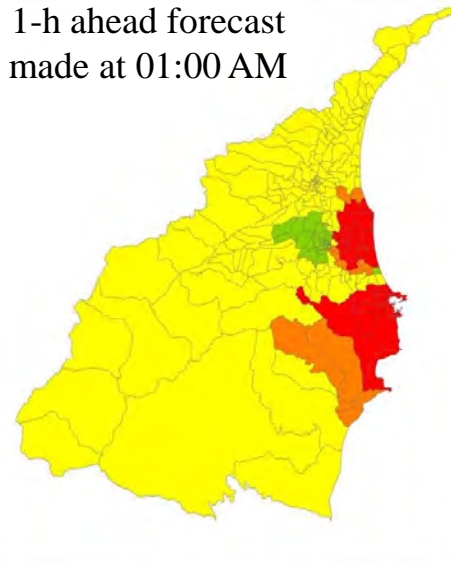
### Short lead times

- Maximum value of inundation depth
- at 02:00 AM on Aug-2, 2012

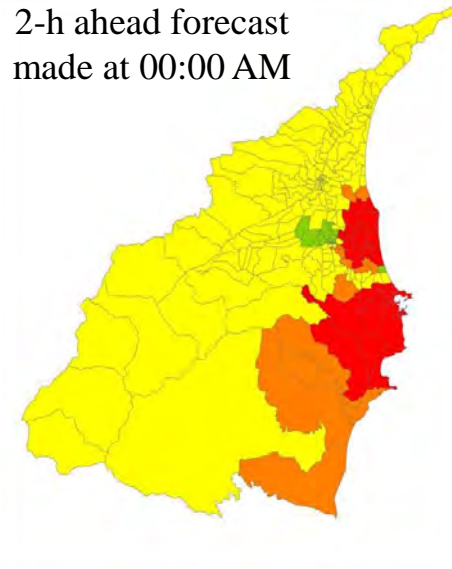
2012-08-02 02:00 AM



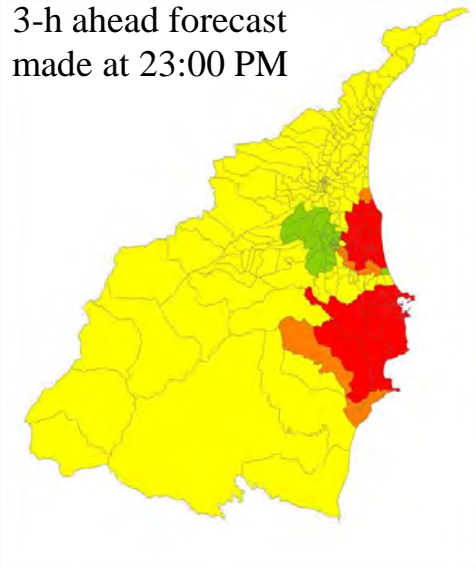
1-h ahead forecast made at 01:00 AM



2-h ahead forecast made at 00:00 AM

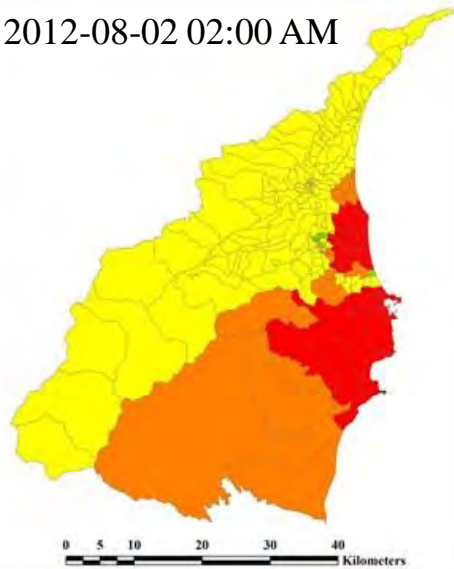


3-h ahead forecast made at 23:00 PM

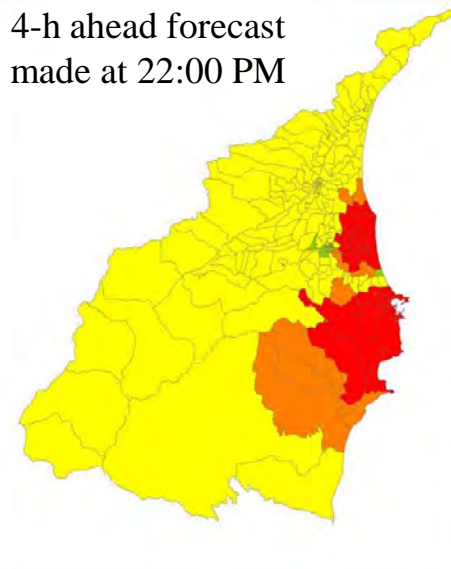


### Long lead times

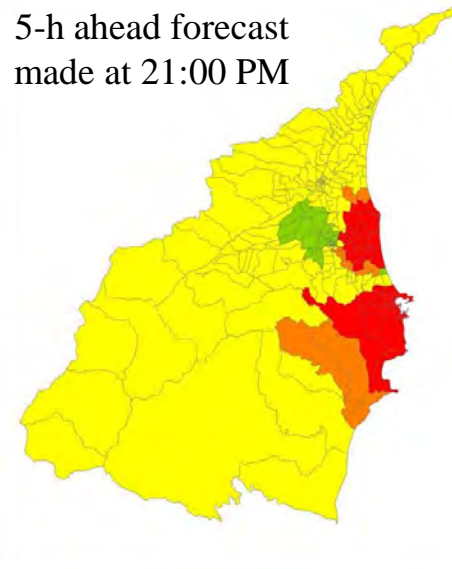
2012-08-02 02:00 AM



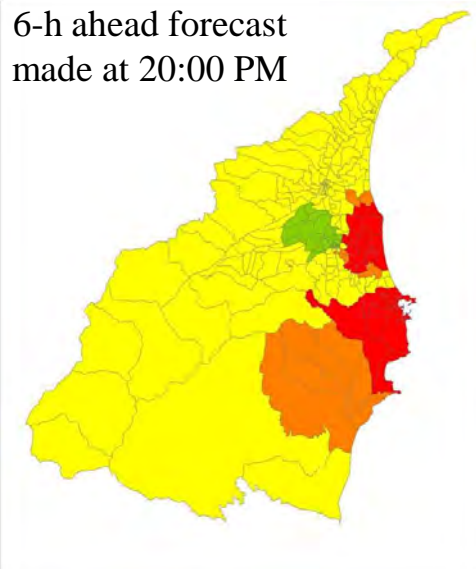
4-h ahead forecast made at 22:00 PM



5-h ahead forecast made at 21:00 PM

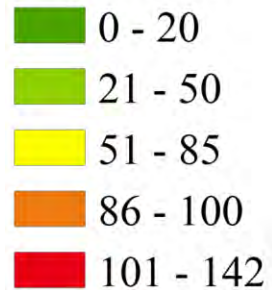


6-h ahead forecast made at 20:00 PM



#### Legend

#### Depth (cm)



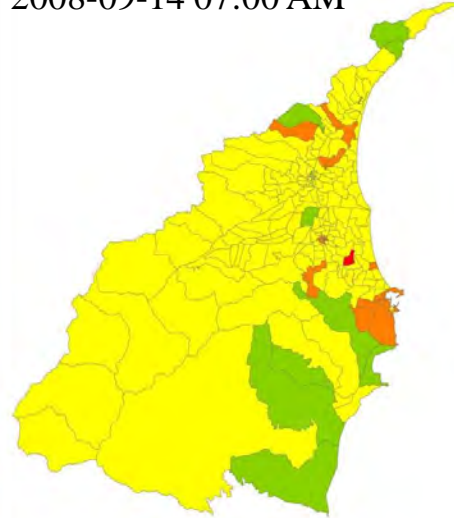
# Results III: Real-time dynamic risk assessment results

## Typhoon SINLAKU (2008)

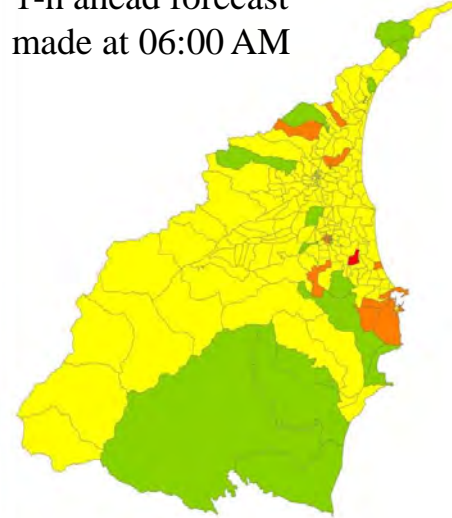
### Short lead times



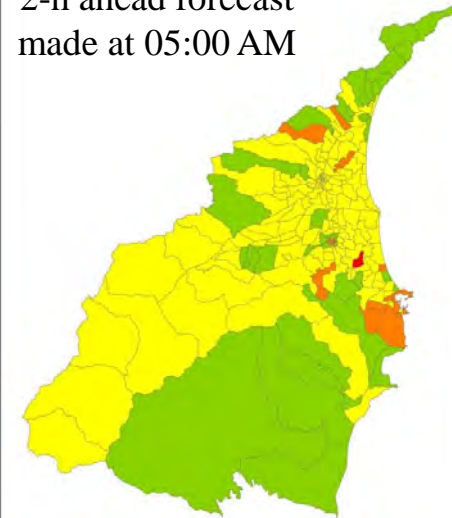
2008-09-14 07:00 AM



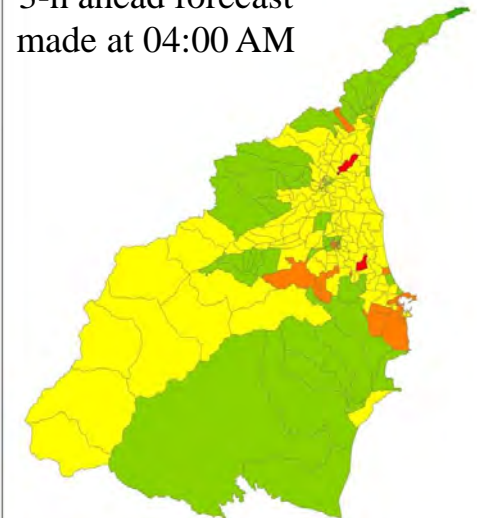
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2-h ahead forecast  
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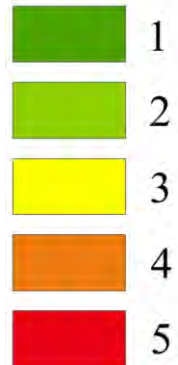


3-h ahead forecast  
made at 04:00 AM

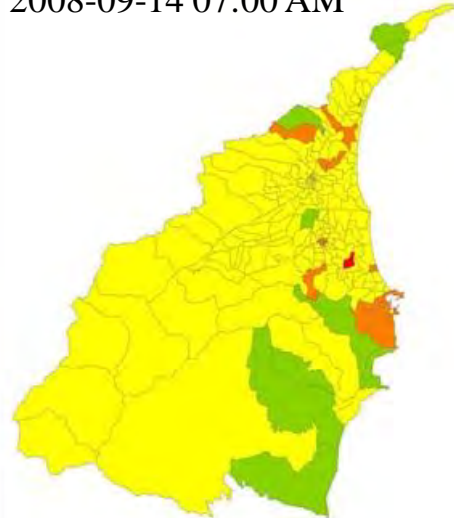


### Long lead times

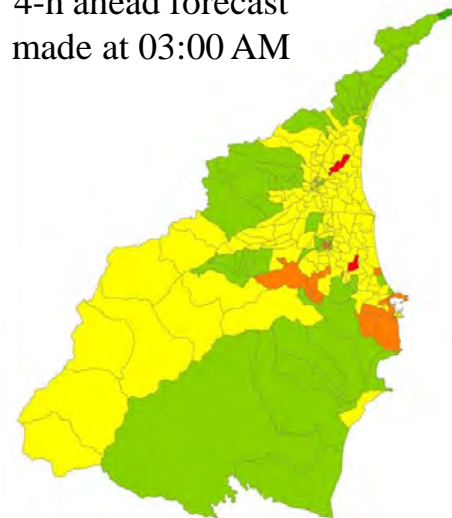
#### Legend



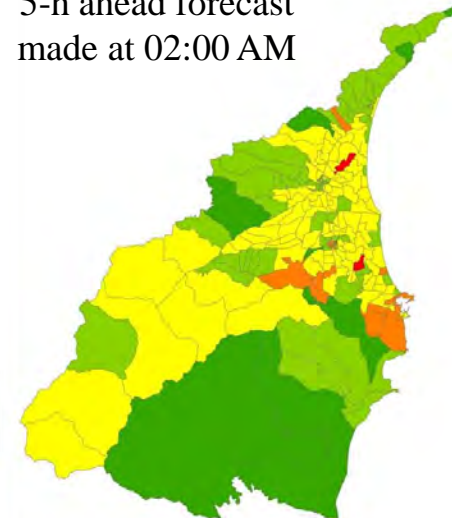
2008-09-14 07:00 AM



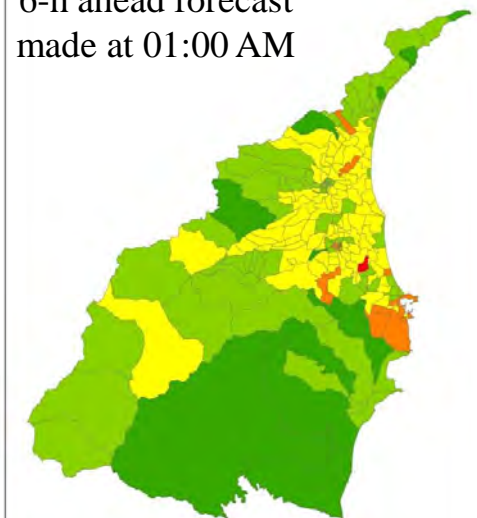
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5-h ahead forecast  
made at 02:00 AM



6-h ahead forecast  
made at 01:00 AM



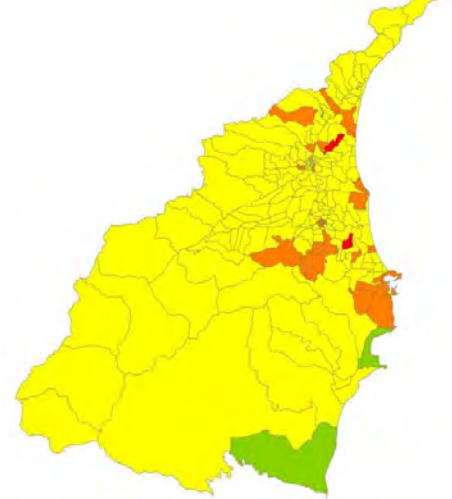
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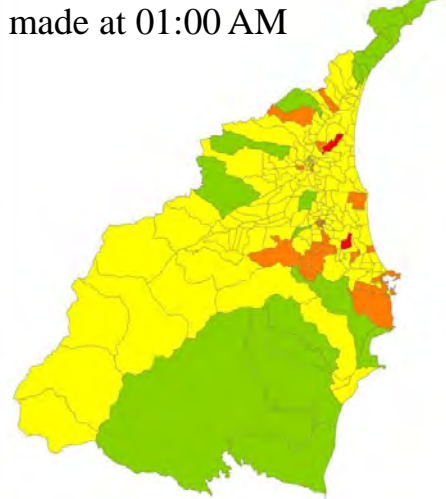
### Short lead times



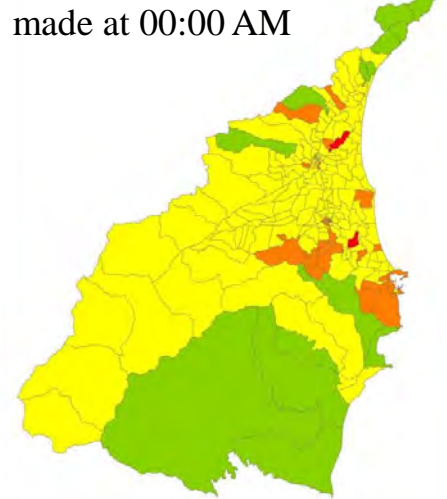
2012-08-02 02:00 AM



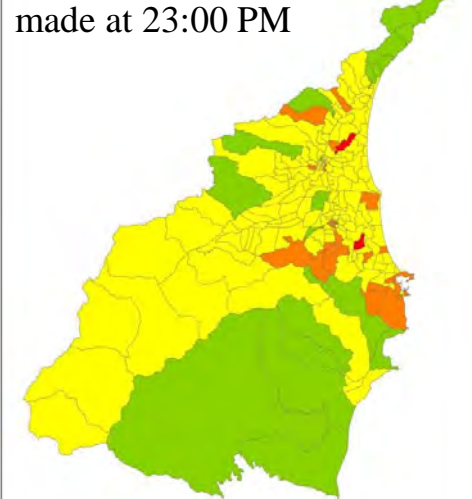
1-h ahead forecast  
made at 01:00 AM



2-h ahead forecast  
made at 00:00 AM

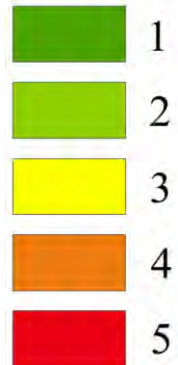


3-h ahead forecast  
made at 23:00 PM

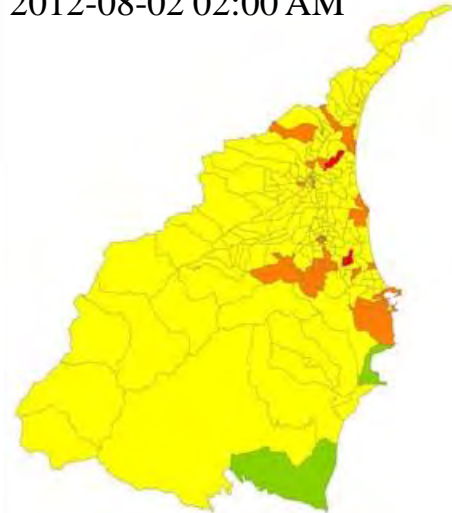


### Long lead times

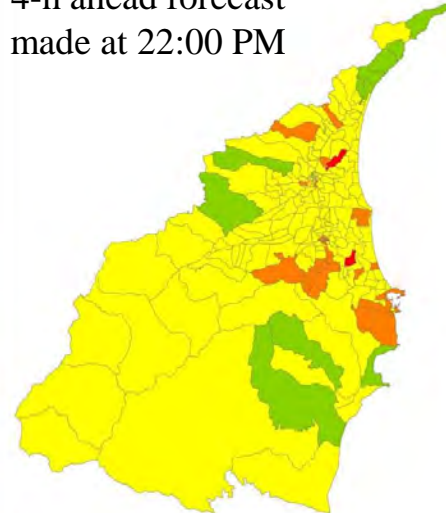
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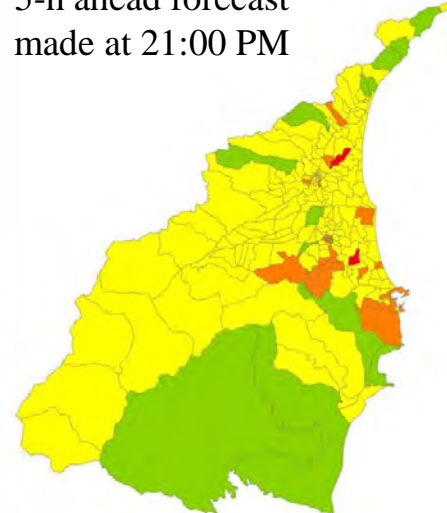
2012-08-02 02:00 AM



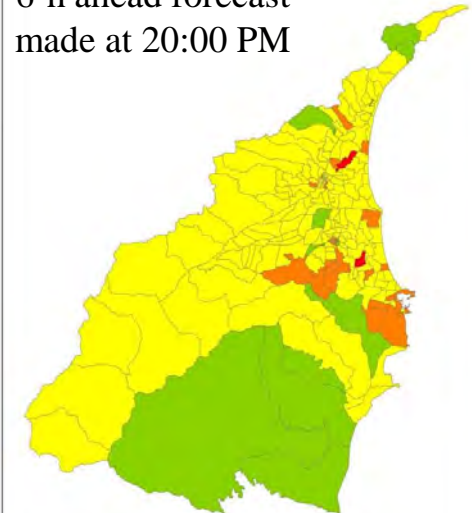
4-h ahead forecast  
made at 22:00 PM



5-h ahead forecast  
made at 21:00 PM



6-h ahead forecast  
made at 20:00 PM



# Conclusion

- Based on **real-time hourly inundation forecasts**,
  - the **dynamic risk** affecting on paddy crops can be **assessed**.
- Using the **CRT**,
  - the **potential factors** of HEVR can be **investigated** for spatial risk assessment, and
  - the **selection** and **implementation** of **adaptation measures** can be further investigated.



The proposed approach is expected to be **useful** for **agricultural disaster management**.

# Rerference (Related)

1. Jhong BC\*, Lin CY, Jhong YD, Chang HK, Chu JL, Fang HT, 2022.07, Assessing the effective spatial characteristics of input features by physics-informed machine learning in inundation forecasting during typhoons, *Hydrological Sciences Journal*, Vol. 67, No. 10, pp. 1527–1545. <https://doi.org/10.1080/02626667.2022.2092406> (SCI)
2. Huang CC, Fang HT, Ho HC, Jhong BC\*, 2019.06, Interdisciplinary application of numerical and machine-learning based models to predict half-hourly suspended sediment concentrations during typhoons, *Journal of Hydrology*, Vol. 573, pp. 661–675. <https://doi.org/10.1016/j.jhydrol.2019.04.001> (SCI)
3. Jhong BC, Wang JH, Lin GF, 2017.04, An integrated two-stage support vector machine approach to forecast inundation maps during typhoons, *Journal of Hydrology*, Vol. 547, pp. 236–252. <http://dx.doi.org/10.1016/j.jhydrol.2017.01.057> (SCI)
4. Jhong BC, Fang HT, Huang CC, 2021.05.11, Assessment of Effective Monitoring Sites in a Reservoir Watershed by Support Vector Machine Coupled with Multi-Objective Genetic Algorithm for Sediment Flux Prediction during Typhoons, *Water Resources Management*, Vol. 35, pp. 2387–2408. <https://doi.org/10.1007/s11269-021-02832-4> (SCI)
5. Fang HT, Jhong BC, Tan YC, Ke KY, 2018.12.07, A two-stage approach integrating SOM- and MOGA-SVM-based algorithms to forecast spatial-temporal groundwater level with meteorological factors, *Water Resources Management*, Vol. 33, No. 2, pp. 797–818. <https://doi.org/10.1007/s11269-018-2143-x> (SCI)
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***Thank you  
for your attention!***



**Bing-Chen JHONG**



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# Final Remarks



Future Sustainable and  
Quality Life

