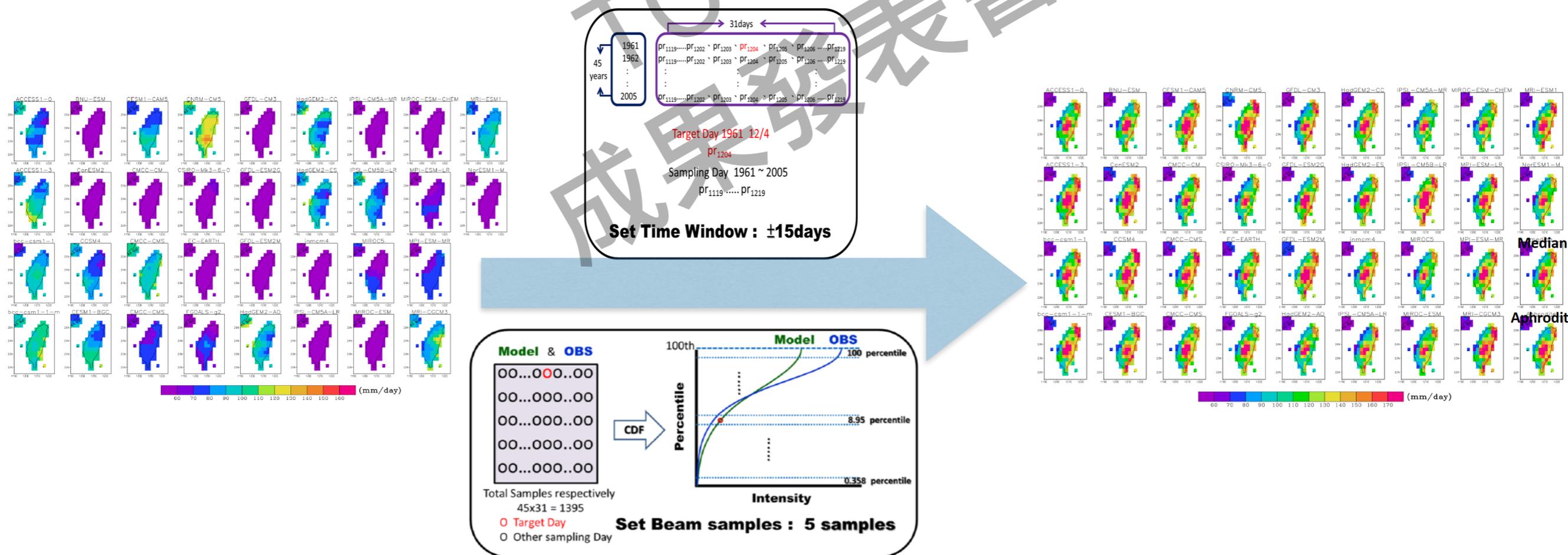


極端天氣與氣候指標的區域統計降尺度：從日資料到極端事件

Regional Statistical Downscaling of Extreme Weather and Climate Indices: From Daily Data to Extreme Events

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¹台灣師範大學地球科學系 ²國家災害防救科技中心



Why do we need downscaling?

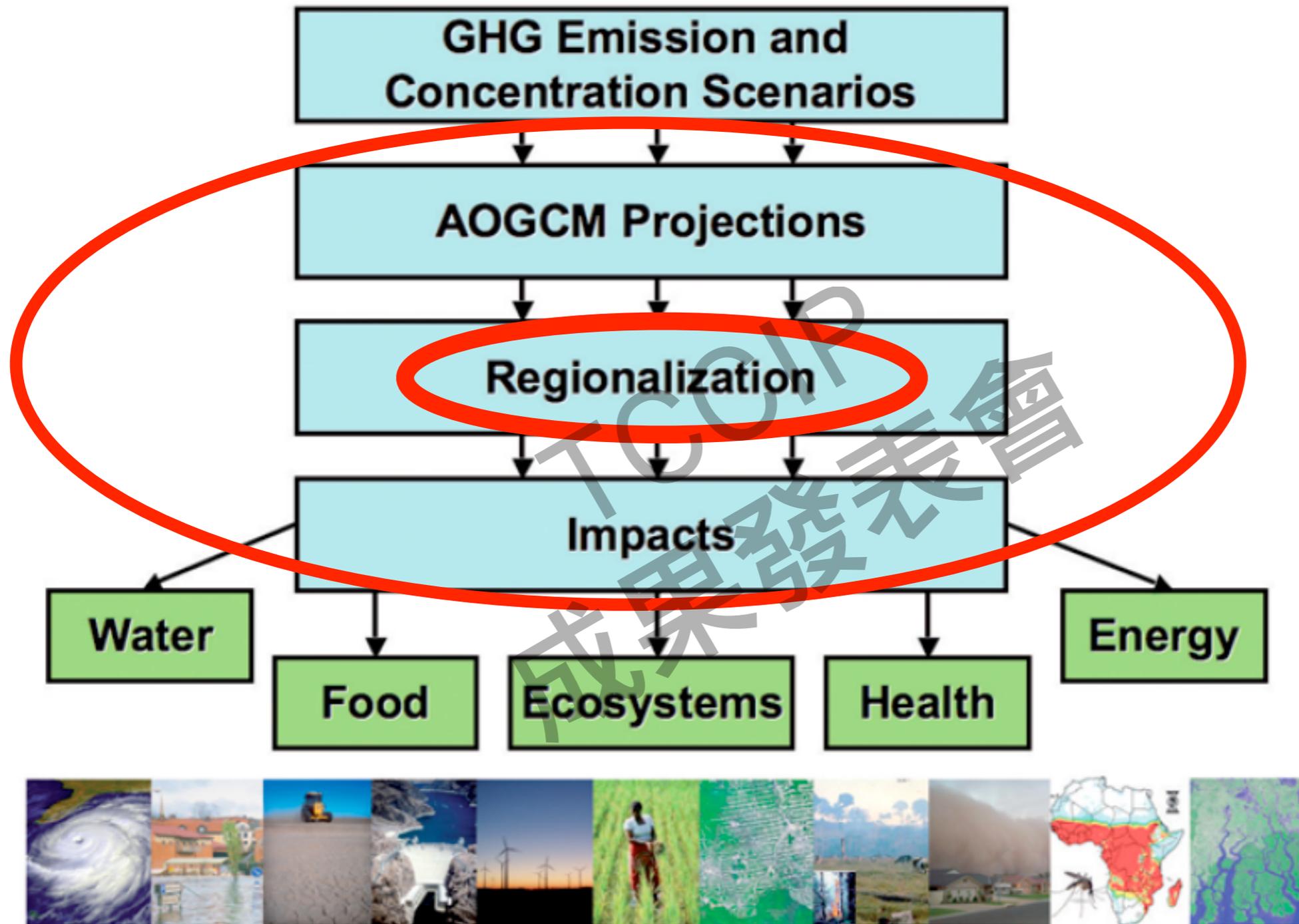
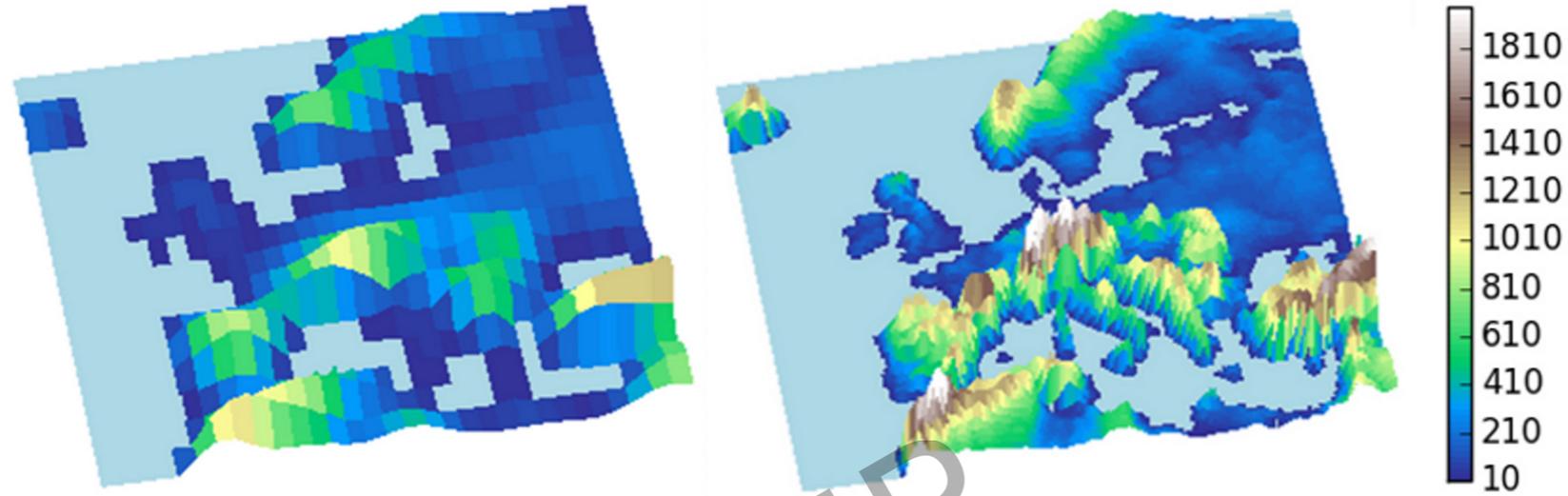


Figure 3 — Schematic depiction of the steps involved in the production of climate change information usable for impact assessment work via regionalization methods

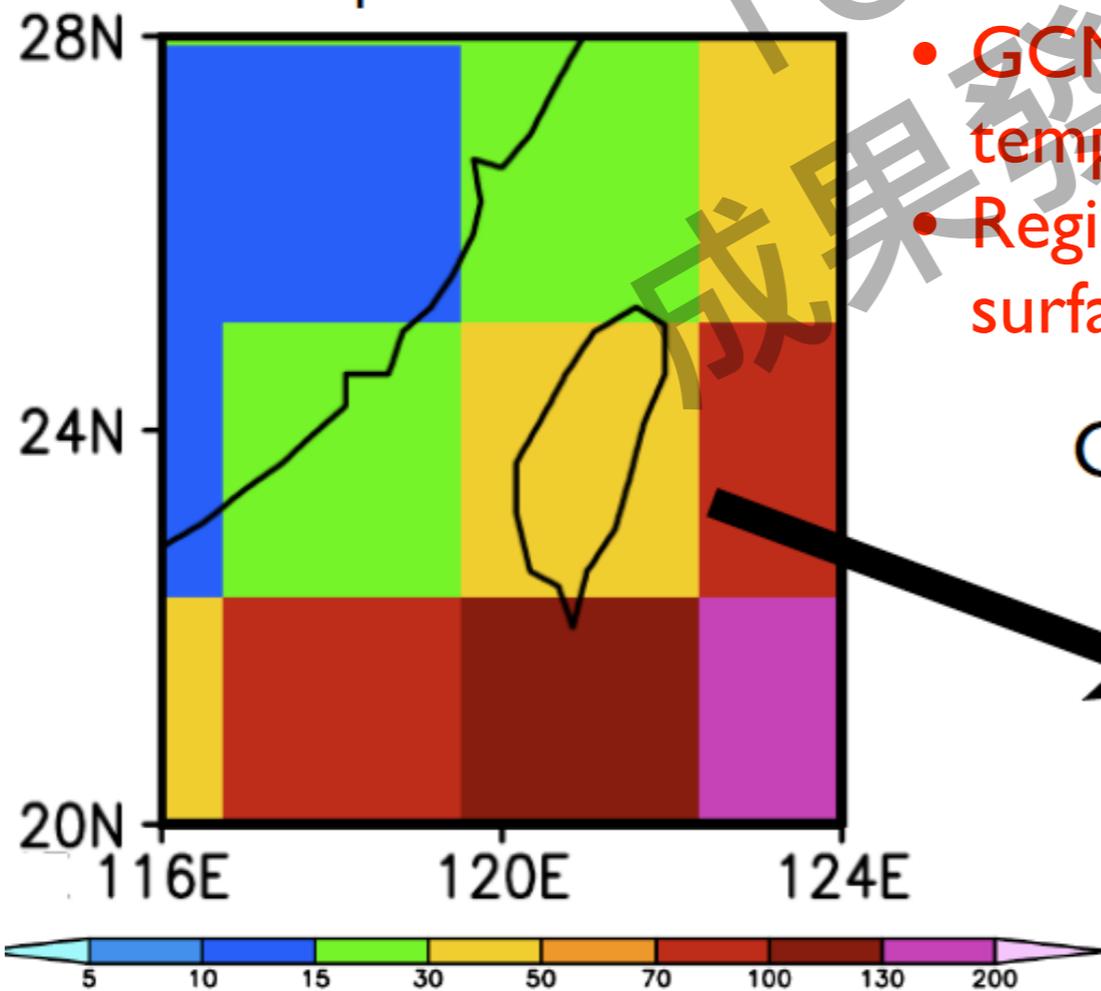
Source:
Giorgi (2008)

Why do we need downscaling?

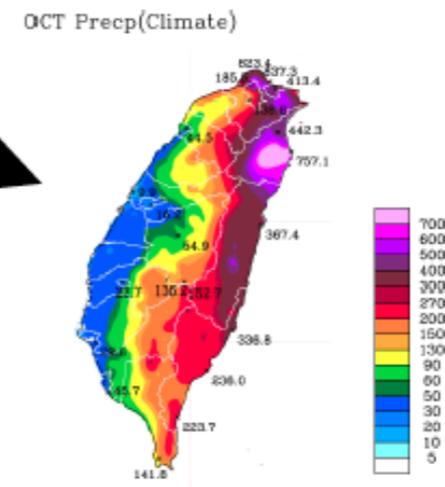


GCM (~300 km)
Precipitation October

- Problems:**
- GCM too coarse for local assessment
 - GCM biases in climatology (spatially and temporally)
 - Regional climate variability (topography, surface landscapes, coastlines)

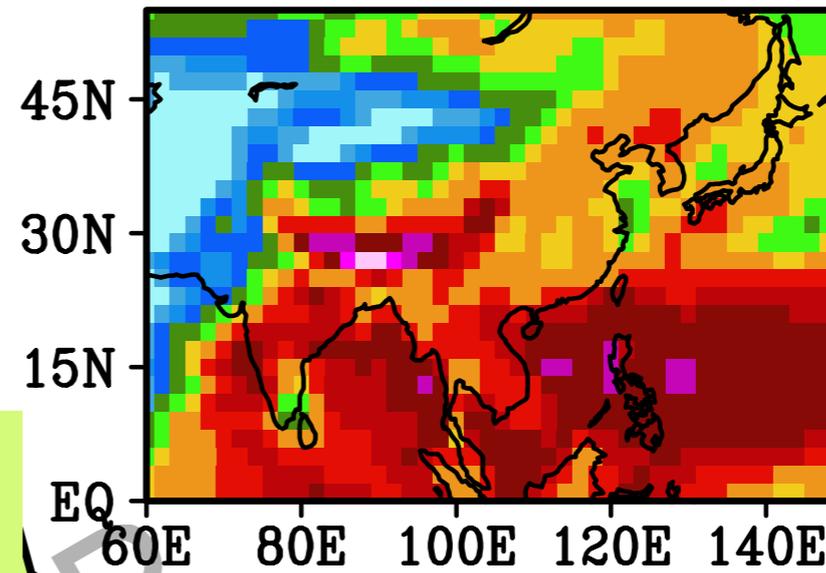


Observation (~5km)

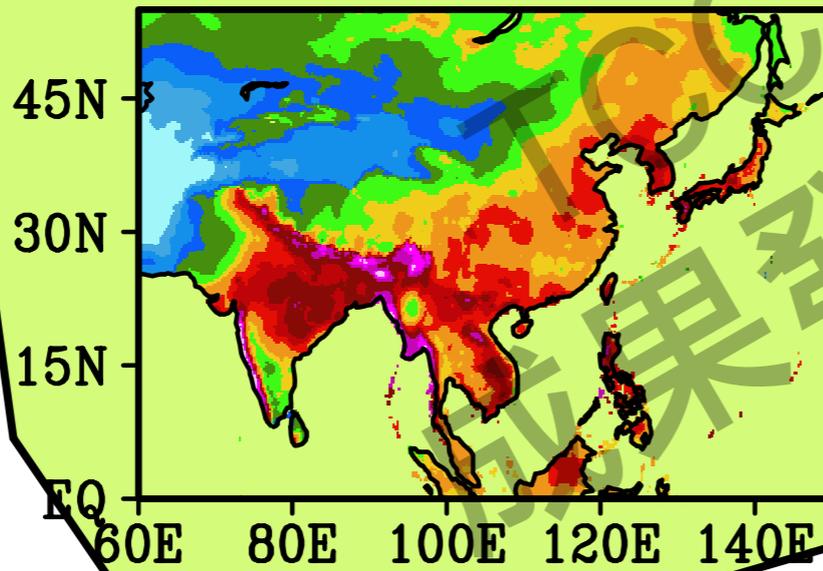


Statistical Downscaling

Climate Model

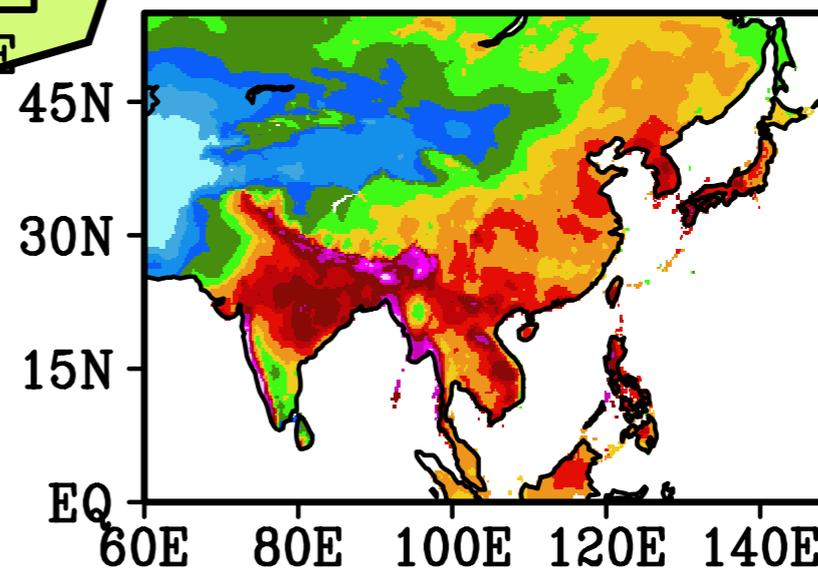


High Resolution Observation



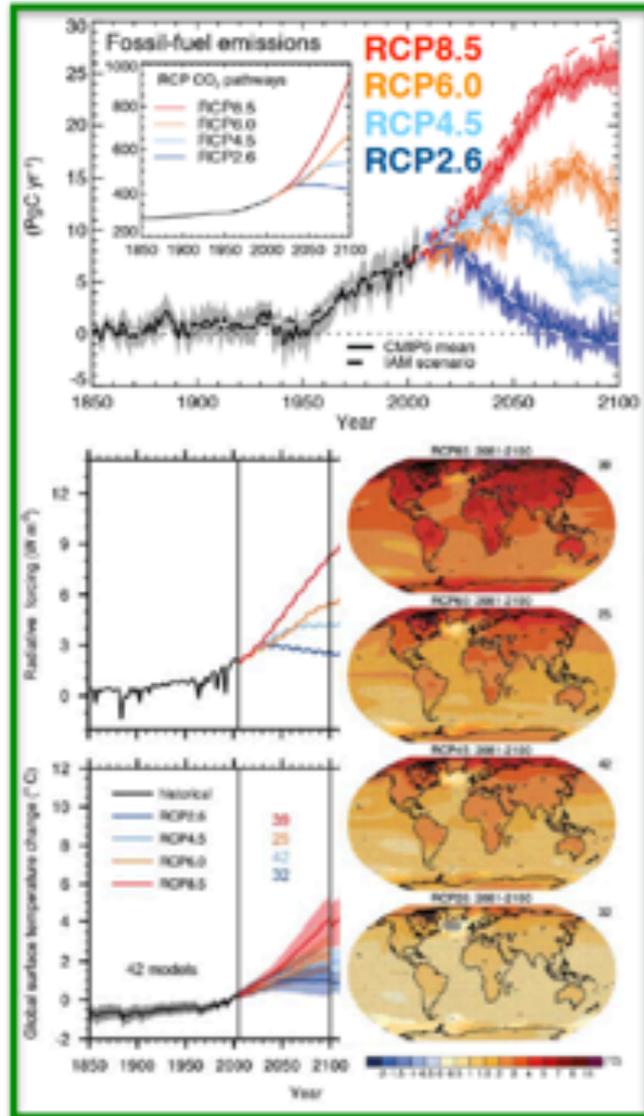
Develop
transfer function

Downscaled

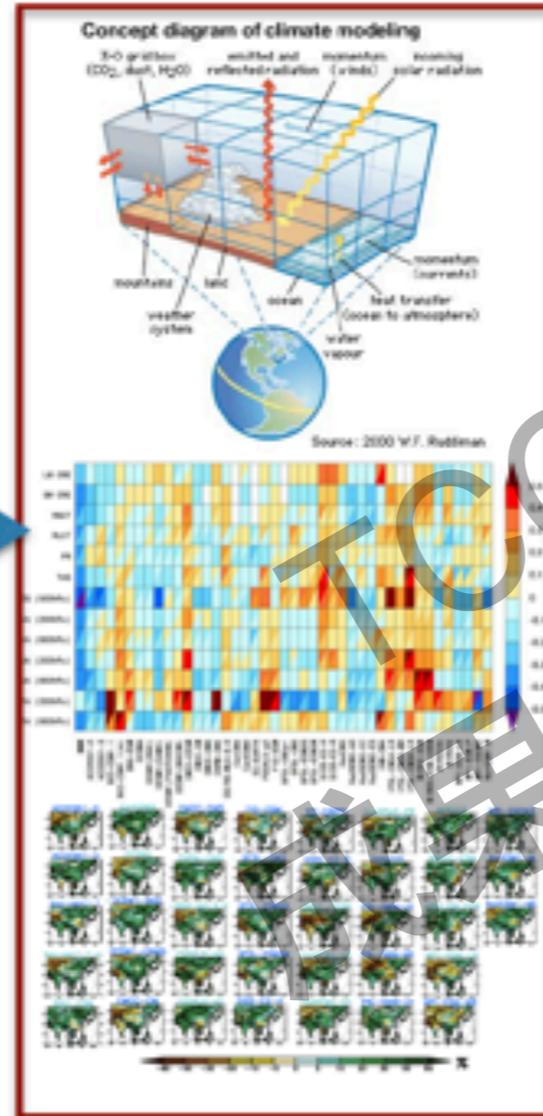


Future Climate Scenarios Cascade (Statistical Downscaling)

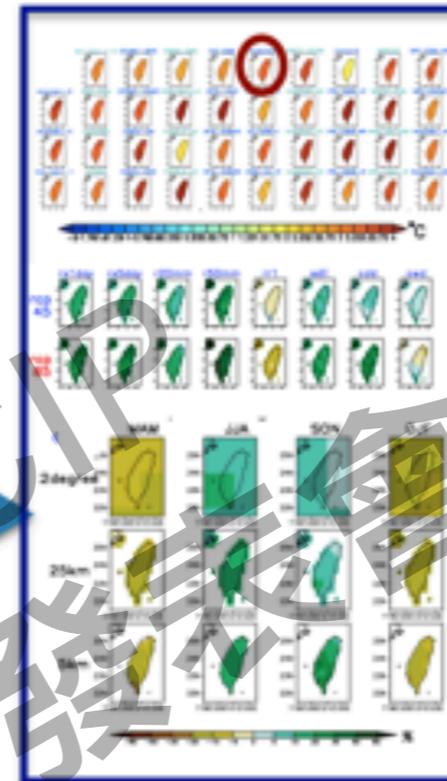
Emission Scenarios



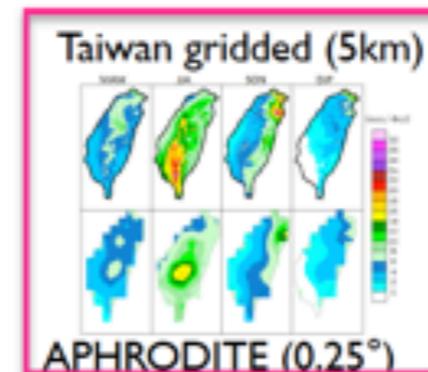
Climate Modeling All CMIP5 GCMs



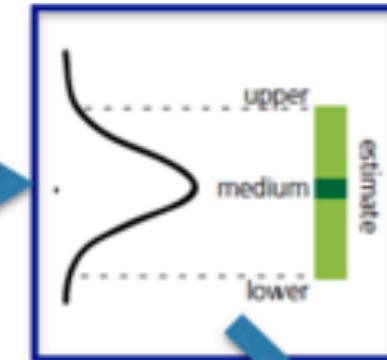
Regionalization from CMIP5 GCMs



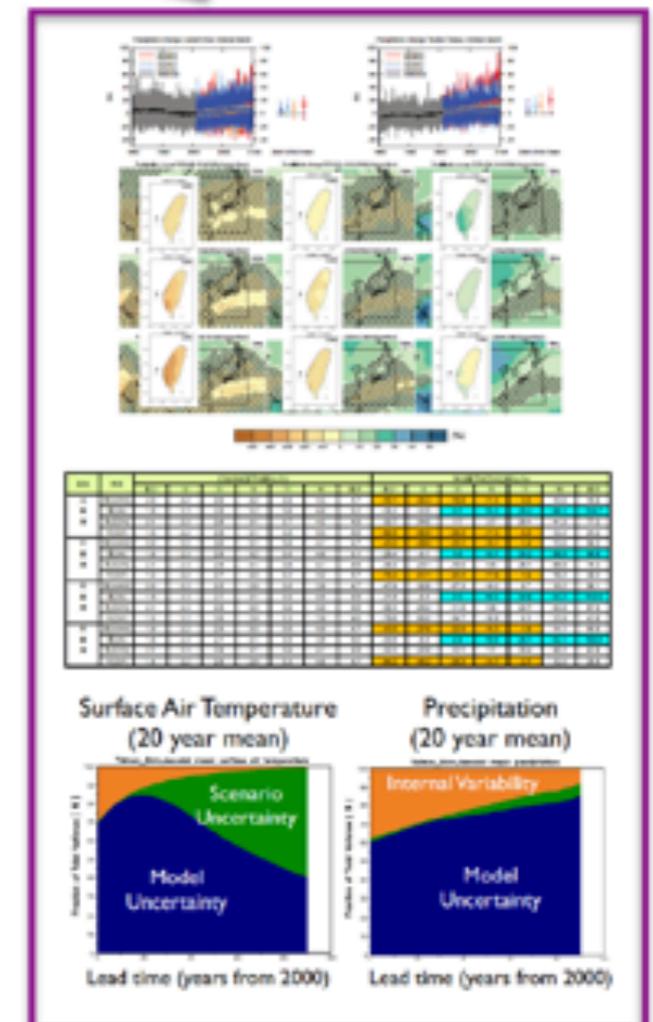
High resolution Observation



Probability Distribution



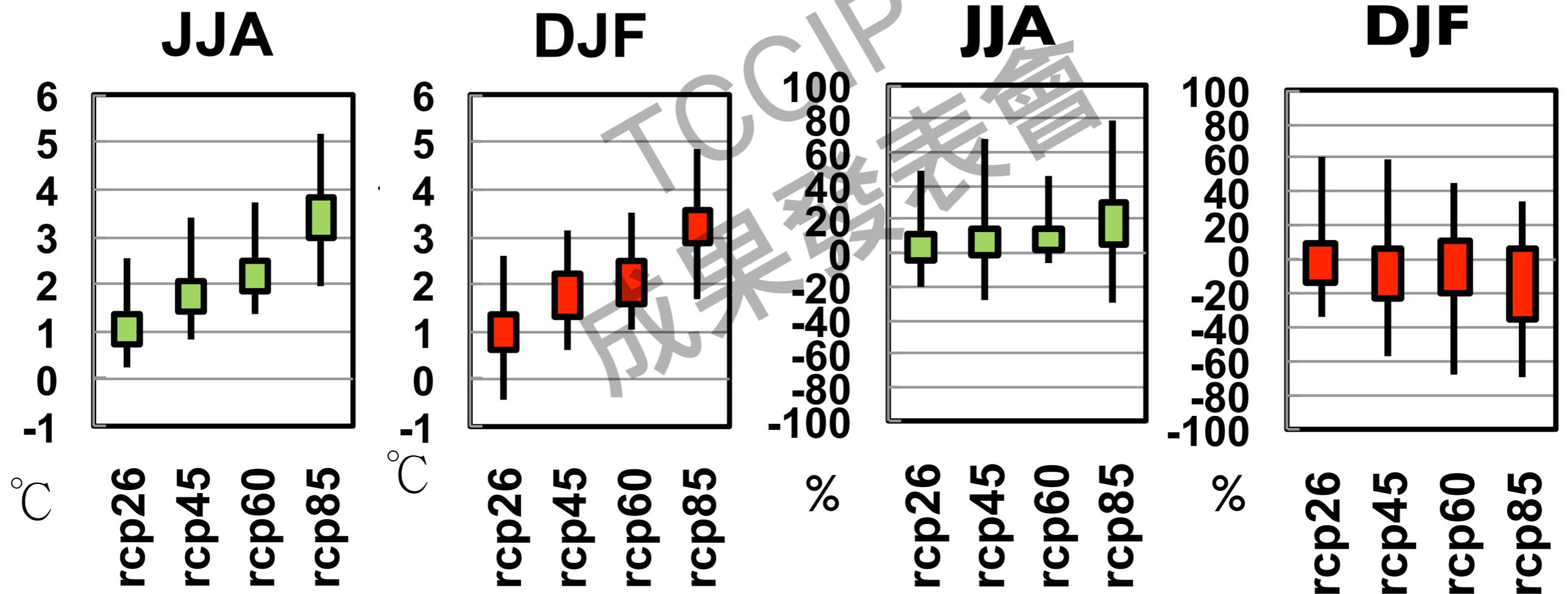
Future Climate Scenarios



Box-Whisker Plots of CMIP5 Model Projected Taiwan Mean Future (2080-2099) Climate Change with RCP8.5 scenario

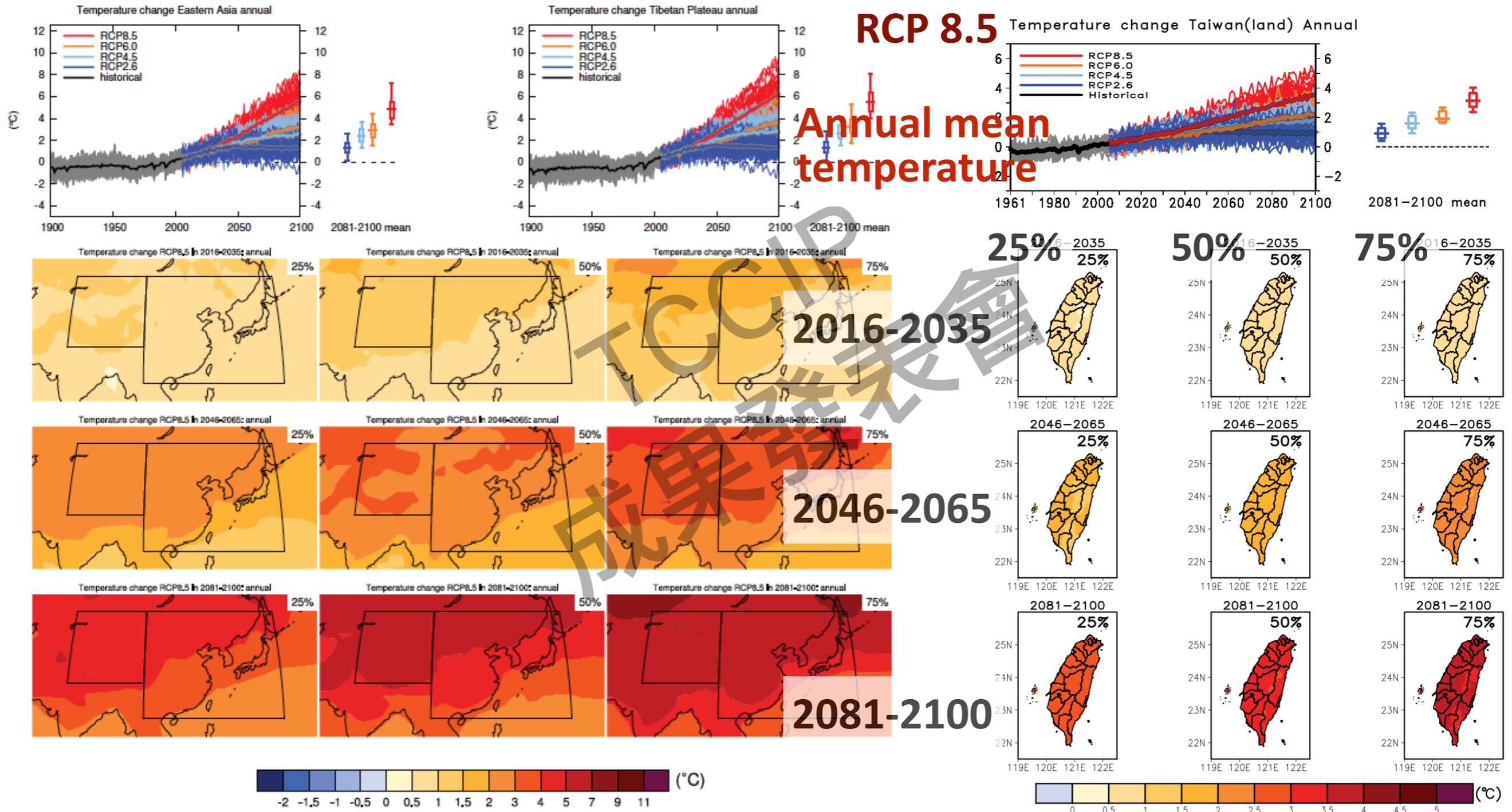
Taiwan Mean Temperature Change

Taiwan Mean Precipitation Change



IPCC AR5 Atlas

TCCIP Atlas

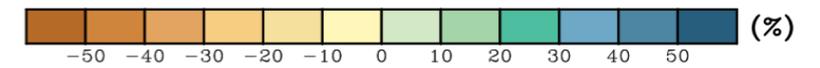
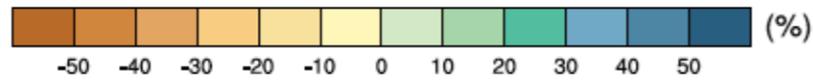
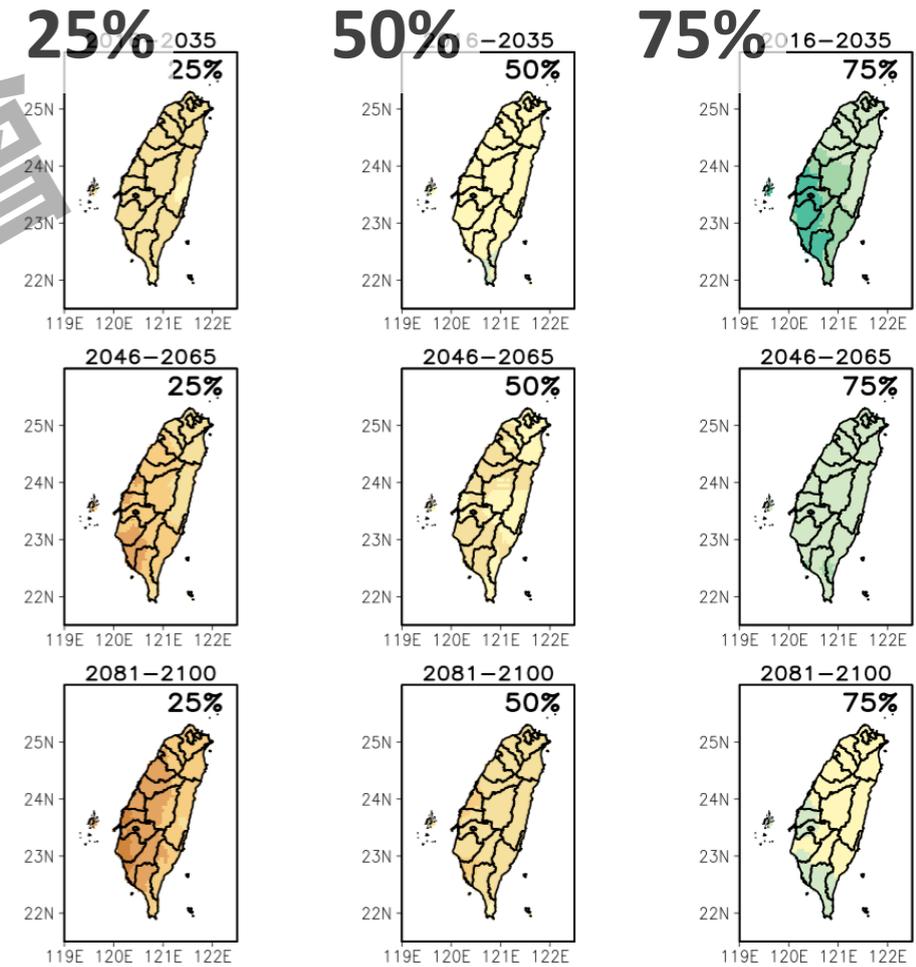
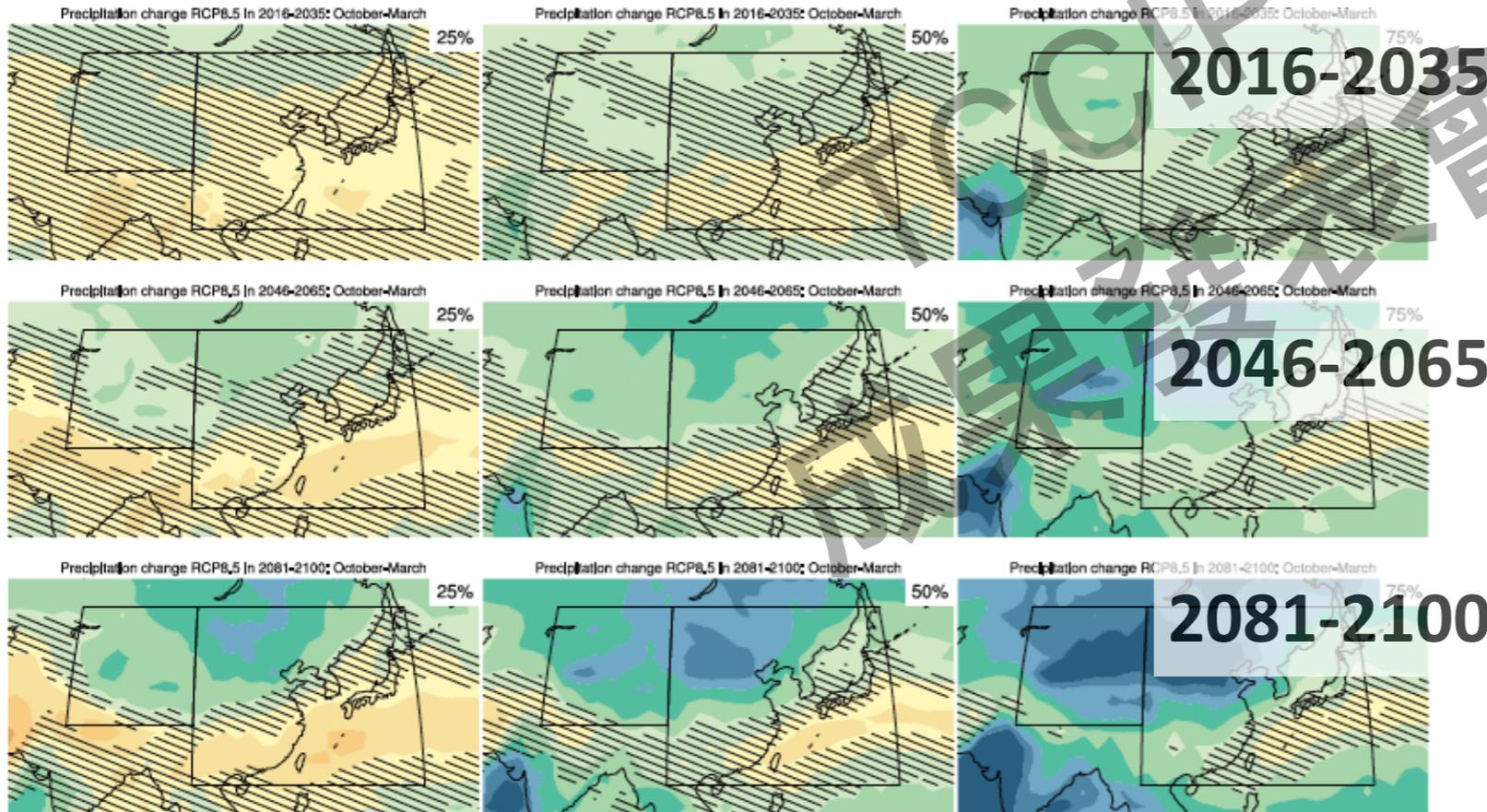
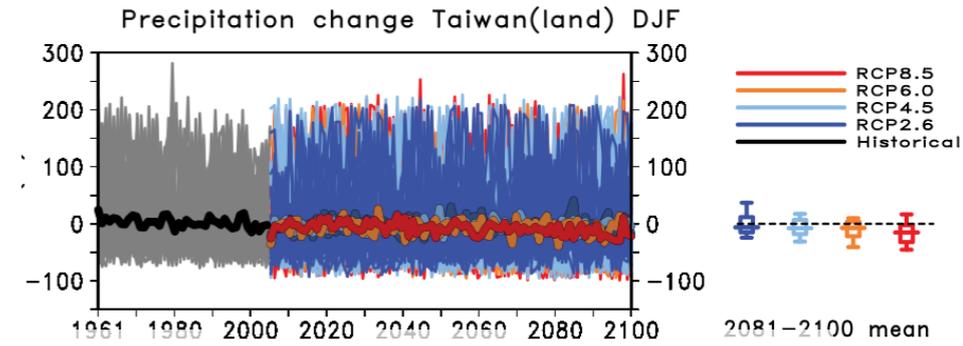
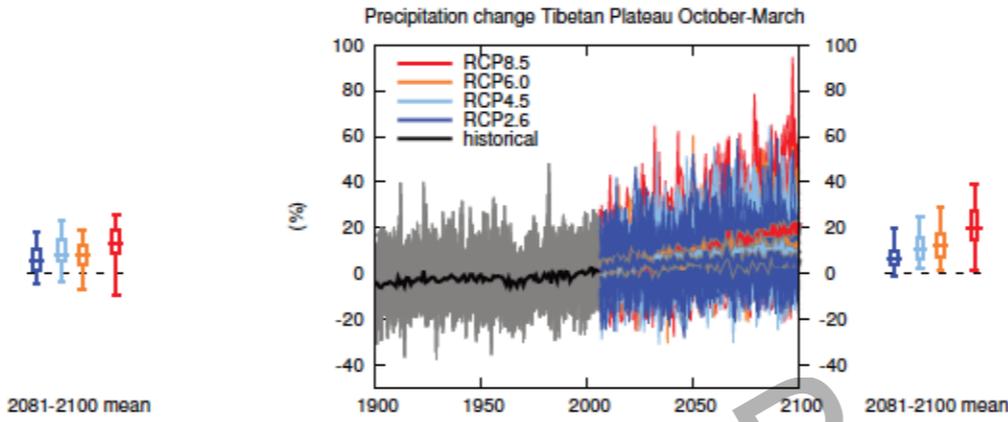
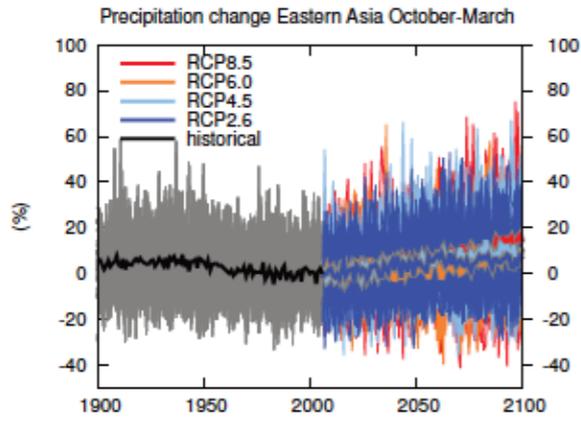


IPCC AR5 Atlas

RCP 8.5

ONDJFM mean precipitation

TCCIP Atlas

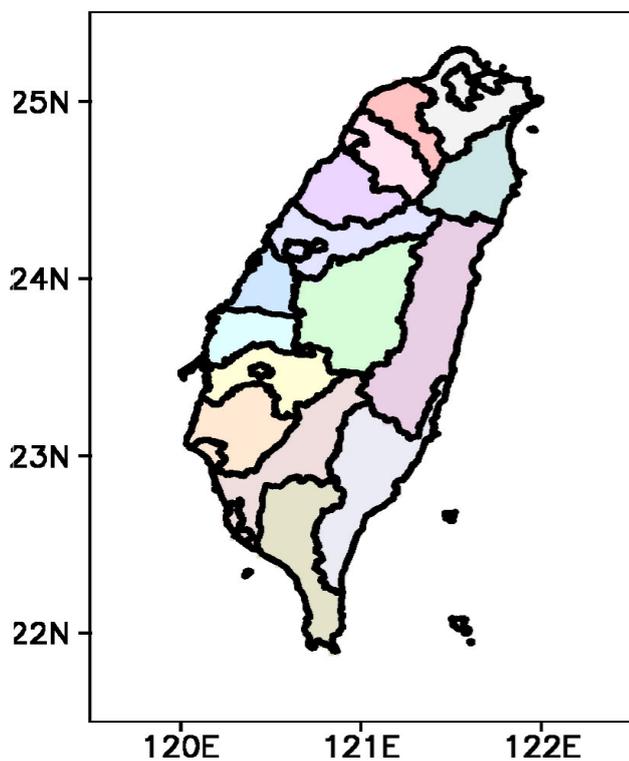


近地表氣溫變化 °C

降雨變化 °C

RCP8.5 2081-2100

MAM 春
JJA 夏
SON 秋
DJF 冬



- 臺北
- 桃園
- 新竹
- 苗栗
- 臺中
- 彰化
- 雲林
- 南投
- 嘉義
- 臺南
- 高雄
- 屏東
- 宜蘭
- 花蓮
- 臺東

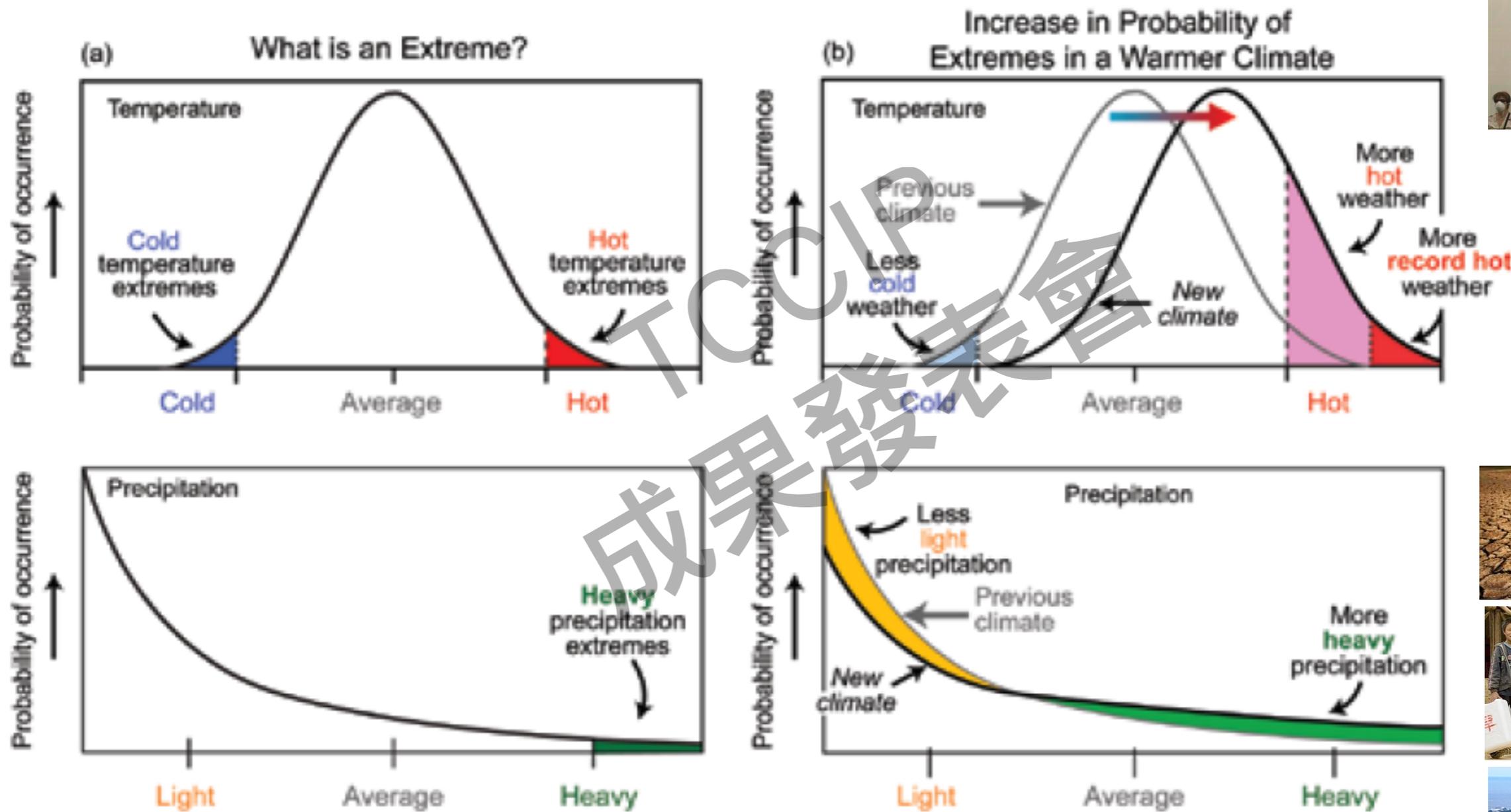
區域	季節	近地表氣溫平均變化 (°C)							降雨量平均百分比變化 (%)						
		最小	10	25	50	75	90	最大	最小	10	25	50	75	90	最大
北北基	春(MAM)	2.0	2.2	2.6	3.2	3.7	4.3	4.7	-36.3	-22.2	-16.7	-10.5	-2.9	10.5	43.2
	夏(JJA)	1.8	2.4	2.8	3.3	3.6	4.1	5.2	-34.9	-12.1	-0.4	15.9	25.1	43.9	117.8
	秋(SON)	2.1	2.4	2.9	3.2	3.7	4.3	4.9	-27.4	-19.8	-7.8	1.0	15.1	31.4	58.3
	冬(DJF)	1.5	2.2	2.8	3.1	3.5	4.4	4.9	-53.2	-34.3	-24.9	-15.2	-4.5	8.1	15.9
桃園	春(MAM)	1.9	2.2	2.6	3.2	3.6	4.3	4.7	-42.3	-26.0	-19.3	-11.1	-2.9	12.8	51.0
	夏(JJA)	1.8	2.4	2.8	3.3	3.6	4.1	5.3	-36.4	-12.8	-0.3	14.7	26.3	47.5	117.3
	秋(SON)	2.1	2.4	2.9	3.2	3.7	4.3	4.9	-33.1	-23.6	-8.0	1.8	19.7	39.5	75.6
	冬(DJF)	1.5	2.2	2.8	3.1	3.6	4.4	4.8	-60.3	-40.1	-27.6	-17.7	-5.4	11.9	22.2
新竹	春(MAM)	2.0	2.2	2.6	3.2	3.6	4.3	4.7	-41.7	-26.7	-20.0	-11.7	-3.4	13.7	52.0
	夏(JJA)	1.8	2.3	2.8	3.2	3.6	4.0	5.2	-35.6	-12.6	1.5	15.0	26.9	47.4	112.4
	秋(SON)	2.1	2.3	2.8	3.1	3.7	4.2	4.8	-34.1	-25.5	-8.0	2.9	20.7	42.8	81.6
	冬(DJF)	1.5	2.2	2.8	3.1	3.5	4.4	4.8	-63.2	-42.2	-28.7	-18.2	-5.7	13.6	27.1
苗栗	春(MAM)	1.9	2.2	2.6	3.2	3.6	4.3	4.7	-42.2	-27.7	-20.2	-12.4	-3.6	14.4	54.7
	夏(JJA)	1.7	2.3	2.7	3.1	3.6	3.9	5.1	-34.4	-12.6	2.1	15.1	27.1	47.0	110.8
	秋(SON)	2.1	2.2	2.8	3.0	3.6	4.2	4.8	-38.1	-30.2	-7.1	5.4	26.4	53.9	99.2
	冬(DJF)	1.5	2.2	2.8	3.1	3.6	4.4	4.8	-67.9	-47.5	-32.8	-19.0	-5.6	16.4	34.0
臺中	春(MAM)	2.0	2.2	2.6	3.2	3.6	4.2	4.7	-43.2	-27.2	-21.7	-13.7	-3.2	13.9	54.7
	夏(JJA)	1.7	2.2	2.7	3.1	3.5	3.9	5.1	-33.1	-12.2	2.2	16.1	26.4	44.8	110.7
	秋(SON)	2.1	2.2	2.8	3.0	3.6	4.1	4.8	-36.8	-26.8	-8.3	5.5	26.5	52.3	87.2
	冬(DJF)	1.5	2.2	2.8	3.1	3.5	4.4	4.8	-68.7	-50.2	-33.4	-18.8	-3.8	16.8	38.1
彰化	春(MAM)	2.0	2.3	2.6	3.1	3.6	4.2	4.7	-44.3	-28.8	-24.1	-14.2	-0.3	14.5	65.5
	夏(JJA)	1.9	2.5	2.9	3.3	3.6	4.1	5.2	-30.0	-10.4	0.9	16.8	25.4	40.3	104.5
	秋(SON)	2.1	2.3	2.9	3.1	3.7	4.2	4.9	-40.8	-25.8	-10.6	9.3	35.9	65.4	91.5
	冬(DJF)	1.5	2.2	2.8	3.1	3.5	4.3	4.7	-75.5	-58.6	-37.4	-20.1	-0.4	19.7	45.3
南投	春(MAM)	2.0	2.2	2.6	3.0	3.6	4.1	4.7	-41.7	-27.0	-22.6	-14.8	-2.0	13.1	50.0
	夏(JJA)	1.7	2.2	2.7	3.1	3.5	3.9	5.0	-28.3	-7.9	1.9	14.0	22.8	36.5	87.4
	秋(SON)	2.1	2.2	2.7	3.0	3.6	4.1	4.8	-30.3	-20.1	-9.8	3.2	20.9	39.1	62.4
	冬(DJF)	1.5	2.2	2.7	3.0	3.4	4.1	4.7	-66.1	-46.2	-31.3	-16.4	-2.5	15.8	32.7
雲林	春(MAM)	2.0	2.3	2.6	3.1	3.6	4.2	4.7	-45.5	-29.6	-24.1	-16.3	0.7	14.1	67.3
	夏(JJA)	1.9	2.4	2.9	3.3	3.6	4.1	5.1	-28.5	-9.2	1.6	17.5	26.9	38.0	103.4
	秋(SON)	2.1	2.3	2.9	3.1	3.7	4.2	4.9	-39.6	-24.4	-12.9	8.1	34.0	59.4	85.3
	冬(DJF)	1.5	2.1	2.7	3.0	3.5	4.2	4.7	-75.2	-57.4	-39.4	-19.2	2.0	21.6	44.7
嘉義	春(MAM)	2.0	2.3	2.6	3.0	3.6	4.1	4.7	-44.2	-29.4	-24.5	-17.3	-0.2	13.4	58.0
	夏(JJA)	1.9	2.4	2.8	3.2	3.6	4.1	5.1	-27.9	-7.1	0.9	17.0	27.8	36.9	101.7
	秋(SON)	2.1	2.3	2.8	3.1	3.7	4.1	4.8	-33.1	-22.7	-11.9	6.4	25.6	48.8	72.8
	冬(DJF)	1.5	2.2	2.7	3.0	3.4	4.1	4.7	-74.9	-54.0	-36.8	-17.3	0.0	21.7	42.4
臺南	春(MAM)	2.0	2.3	2.6	3.0	3.6	4.0	4.7	-48.4	-32.8	-27.6	-19.0	0.5	15.9	60.8
	夏(JJA)	1.9	2.4	2.8	3.2	3.5	4.0	5.0	-32.8	-7.9	2.5	20.4	34.7	44.7	127.6
	秋(SON)	2.1	2.3	2.8	3.1	3.7	4.1	4.8	-33.4	-27.2	-12.8	6.8	25.7	49.1	73.3
	冬(DJF)	1.5	2.1	2.6	2.9	3.4	4.0	4.7	-81.0	-57.5	-39.8	-18.4	-0.2	26.3	48.2
高雄	春(MAM)	2.0	2.3	2.6	3.0	3.6	4.0	4.7	-45.5	-30.8	-26.2	-17.4	-0.4	14.5	53.6
	夏(JJA)	1.8	2.3	2.7	3.1	3.5	4.0	5.0	-31.8	-6.1	2.3	19.6	32.7	42.7	114.9
	秋(SON)	2.1	2.2	2.7	3.0	3.6	4.0	4.8	-29.2	-23.4	-11.6	4.4	21.2	41.0	63.4
	冬(DJF)	1.5	2.2	2.6	2.9	3.3	3.9	4.6	-79.3	-65.0	-35.3	-17.8	-0.8	23.4	42.8
屏東	春(MAM)	1.9	2.2	2.5	2.9	3.5	3.9	4.7	-49.3	-34.3	-28.3	-18.7	1.9	15.4	55.1
	夏(JJA)	1.8	2.3	2.7	3.1	3.5	3.9	4.9	-31.0	-5.2	2.3	18.0	30.7	42.5	104.4
	秋(SON)	2.1	2.2	2.7	3.0	3.5	3.9	4.8	-29.3	-22.8	-11.4	6.0	21.8	43.0	66.1
	冬(DJF)	1.5	2.2	2.6	2.8	3.3	3.8	4.6	-78.9	-53.0	-29.9	-14.6	1.9	22.6	41.3
宜蘭	春(MAM)	1.9	2.2	2.6	3.1	3.6	4.1	4.7	-39.2	-24.3	-20.1	-12.6	-3.1	12.5	49.1
	夏(JJA)	1.8	2.3	2.7	3.2	3.5	4.0	5.1	-35.4	-11.4	2.5	17.5	27.0	46.3	118.0
	秋(SON)	2.1	2.3	2.8	3.2	3.7	4.2	4.9	-29.4	-21.9	-9.3	-2.2	16.8	32.6	54.1
	冬(DJF)	1.5	2.2	2.7	3.0	3.4	4.3	4.8	-60.9	-36.6	-26.2	-16.9	-4.7	8.5	19.9
花蓮	春(MAM)	1.9	2.2	2.5	2.9	3.6	4.0	4.7	-43.4	-27.6	-23.1	-15.5	-2.0	15.0	51.6
	夏(JJA)	1.7	2.2	2.7	3.1	3.5	3.8	5.0	-34.1	-8.4	2.8	15.0	24.5	42.4	104.3
	秋(SON)	2.1	2.3	2.8	3.1	3.6	4.1	4.9	-32.7	-23.4	-12.8	0.0	20.4	39.6	63.3
	冬(DJF)	1.4	2.2	2.6	2.9	3.3	4.0	4.6	-58.9	-36.4	-25.2	-14.3	-2.9	11.2	23.3
臺東	春(MAM)	1.9	2.2	2.5	2.9	3.5	3.9	4.7	-45.2	-29.8	-24.7	-16.8	-0.8	14.0	49.9
	夏(JJA)	1.8	2.3	2.7	3.1	3.5	3.9	4.9	-31.2	-6.2	1.9	16.1	27.8	38.8	99.5
	秋(SON)	2.1	2.2	2.7	3.0	3.6	4.0	4.8	-33.5	-22.4	-13.1	5.0	22.9	46.1	71.1
	冬(DJF)	1.5	2.2	2.6	2.9	3.3	3.9	4.6	-73.8	-48.0	-27.8	-13.9	-1.1	17.1	30.8
澎湖	春(MAM)	2.0	2.3	2.6	3.1	3.6	4.2	4.7	-42.7	-26.9	-21.6	-11.6	1.5	13.9	64.8
	夏(JJA)	1.9	2.5	2.9	3.3	3.6	4.1	5.1	-29.4	-10.4	1.8	16.7	31.4	42.7	119.4
	秋(SON)	2.1	2.4	2.9	3.2	3.9	4.3	4.8	-36.8	-25.4	-12.5	7.7	29.2	51.7	75.8
	冬(DJF)	1.5	2.1	2.7	3.0	3.4	4.2	4.7	-67.8	-52.0	-33.6	-17.3	1.9	16.4	39.0

兩期TCCIP計畫所產製的統計降尺度資料

TCCIP-I	TCCIP-II
CMIP3 降雨 月資料降尺度 (月) CMIP3 日均溫 月資料降尺度 (月) CMIP3 降水極端指標降尺度 (年)	CMIP3 日最高溫月資料降尺度 (月) CMIP3 日最低溫月資料降尺度 (月) CMIP5 降雨 月資料降尺度 (月) CMIP5 日均溫 月資料降尺度 (月) CMIP5 日最高溫月資料降尺度 (月) CMIP5 日最低溫月資料降尺度 (月) CMIP5 降水極端指標降尺度 (年) CMIP5 溫度極端指標降尺度 (年) CMIP5 日降雨資料降尺度 (日)
基期 : 1980~1999 近未來 : 2020-2039 21世紀末 : 2080-2099	基期 : 1986~2005 近未來 : 2021-2030 近未來 : 2041-2060 近未來 : 2061-2080 21世紀末 : 2081-2100
東亞地區 : 25 公里網格資料 臺灣地區 : 25、5 公里網格資料	臺灣地區 : 25、5 公里網格資料
CMIP3 情境 : B1、A1B、A2	CMIP3 情境 : B1、A1B、A2 CMIP5 情境 : RCP2.6、RCP4.5、RCP6.0、RCP8.5

High-impact and high-resolution climate information needed for:

- assessing environmental and societal relevant climate change impacts
- developing adaptation strategies and mitigation efforts



Let TN_{kj} be the daily minimum temperature in month k , period j . The minimum daily minimum temperature each month is then: $TN_{kj} = \min(TN_{kj})$

Let TN be the daily minimum temperature on day i in period j . Count the number of days where $TN_{ij} < 0^\circ\text{C}$

Let TX be the daily maximum temperature on day i in period j . Count the number of days where $TX_{ij} < 0^\circ\text{C}$

Core Set of 27 Extreme Indices Recommended by the ETCCDI.

Focused on Rainfall Related Extreme Indices

Let TN and TX be the daily minimum and maximum temperature respectively on day I in period j . If I represents the number of days in j , then: $DTR_j = \sum_{n=1}^I (TX_{nj} - TN_{nj}) / I$

Let PR_{ij} be the daily precipitation amount on day i in period j . The maximum 1 day value for period j are: $RX1day_j = \max(PR_{ij})$

Let PR_{kj} be the precipitation amount for the 5 day interval ending k , period j . Then maximum 5 day values for period j are: $RX5day_j = \max(PR_{kj})$

Let PR_{wj} be the daily precipitation amount on wet days, $PR \geq 1$ mm in period j . If W represents number of wet days in j , then: $SDII_j = (\sum_{w=1}^W PR_{wj}) / W$

Let PR_{ij} be the daily precipitation amount on day i in period j . Count the number of days where $PR_{ij} > 1$ mm

Let PR_{ij} be the daily precipitation amount on day i in period j . Count the number of days where $PR_{ij} > 10$ mm

Let PR_{ij} be the daily precipitation amount on day i in period j . Count the number of days where $PR_{ij} > 20$ mm

Let PR_{ij} be the daily precipitation amount on day i in period j . Count the largest number of consecutive days where $PR_{ij} < 1$ mm

Let PR_{ij} be the daily precipitation amount on day i in period j . Count the largest number of consecutive days where $PR_{ij} > 1$ mm

Let PR_{wj} be the daily precipitation amount on a wet day w ($PR \geq 1$ mm) in period i and let PR_{wn95} be the 95th percentile of precipitation on wet days in the 1961–1990 period. If W represents the number of wet days in the period, then: $R95p_j = \sum_{w=1}^W PR_{wj}$, where $PR_{wj} > PR_{wn95}$

Let PR_{wj} be the daily precipitation amount on a wet day w ($PR \geq 1$ mm) in period i and let PR_{wn99} be the 99th percentile of precipitation on wet days in the 1961–1990 period. If W represents the number of wet days in the period, then: $R99p_j = \sum_{w=1}^W PR_{wj}$, where $PR_{wj} > PR_{wn99}$

Let PR_{ij} be the daily precipitation amount on day i in period j . If I represents the number of days in j , then: $PRCPTOT_j = \sum_{n=1}^I PR_{ij}$

FD Frost days

ID Ice days

SU

TR

GSL

DTR Diurnal temperature range

RX1day Max 1 day precipitation

RX5day Max 5 day precipitation

SDII Simple daily intensity

R1mm* Number of wet days

R10mm Heavy precipitation days

R20mm Very heavy precipitation days

CDD Consecutive dry days

CWD Consecutive wet days

R95p Very wet days

R99p Extremely wet days

PRCPTOT Total wet-day precipitation

days

days

°C

mm

mm

mm

days

days

days

days

days

days

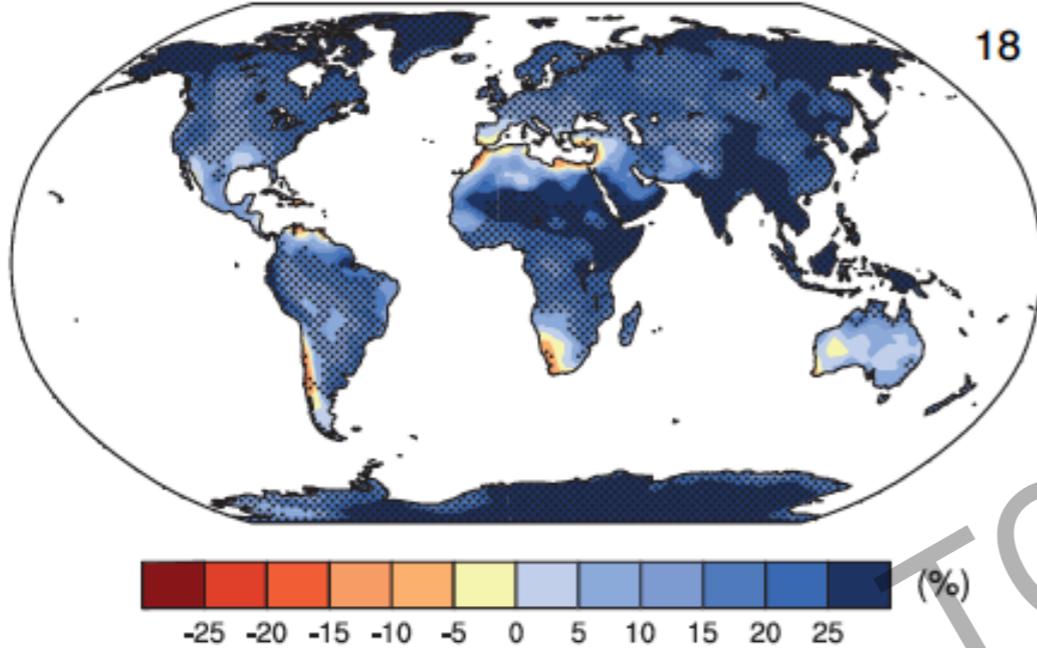
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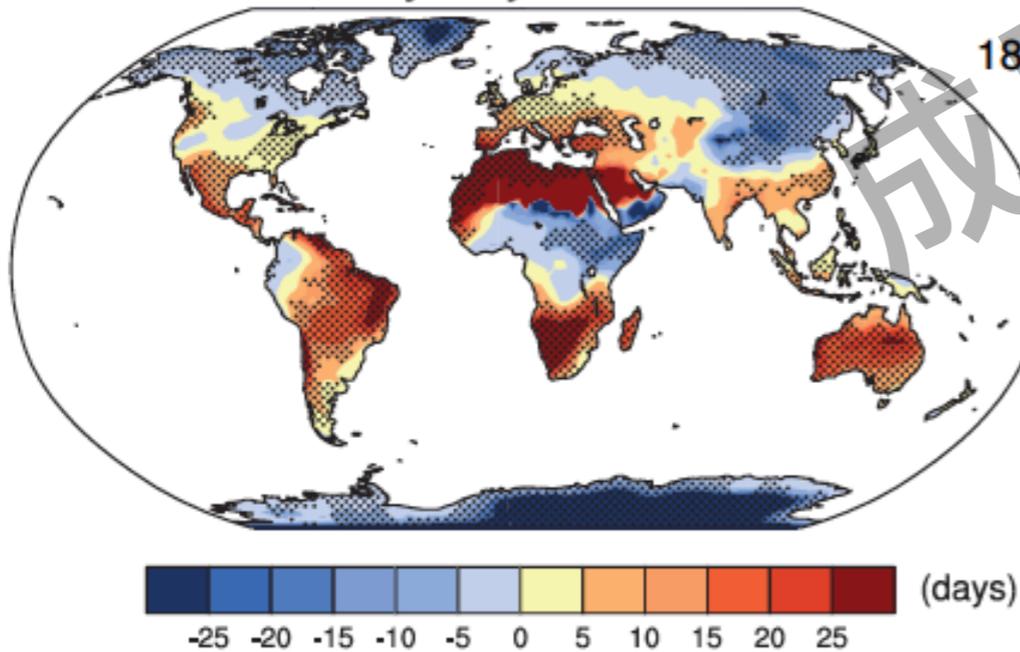
mm

Wet Get Wetter and the Dry Drier

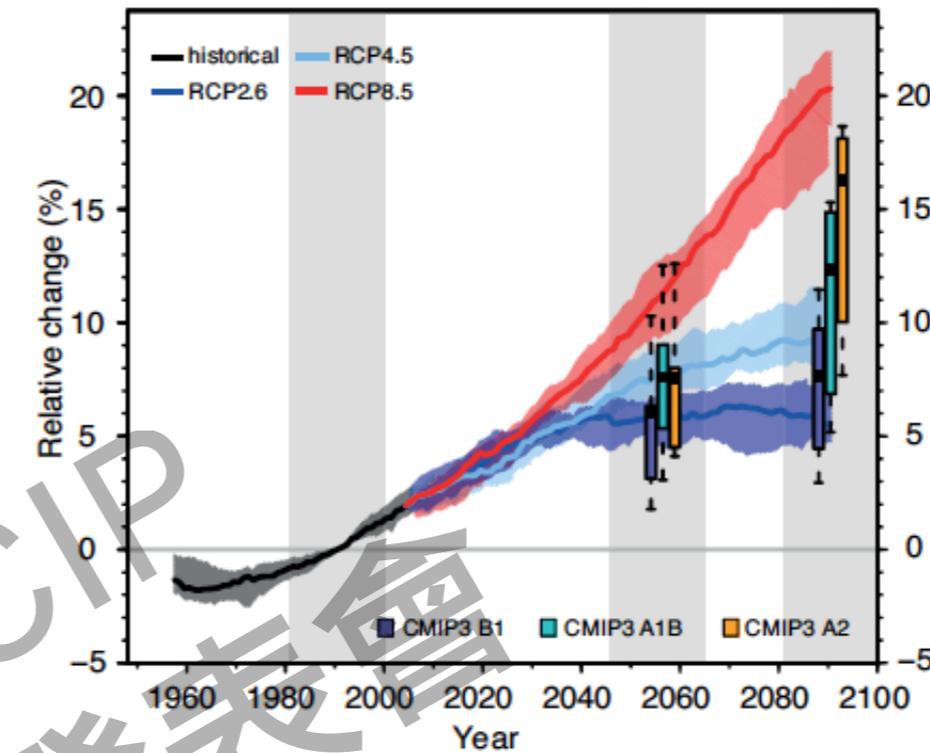
b) max. 5 day precip RCP8.5: 2081-2100



c) Consecutive Dry Days RCP8.5: 2081-2100

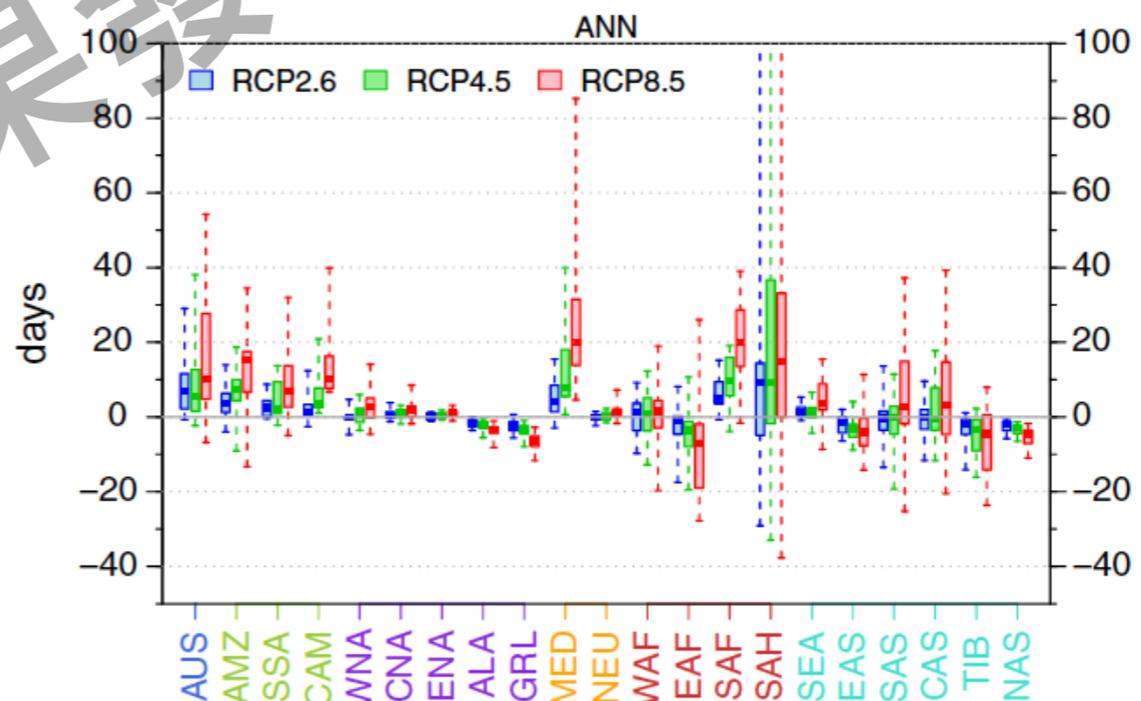


a) Wettest consecutive five days (RX5day)



RX5day

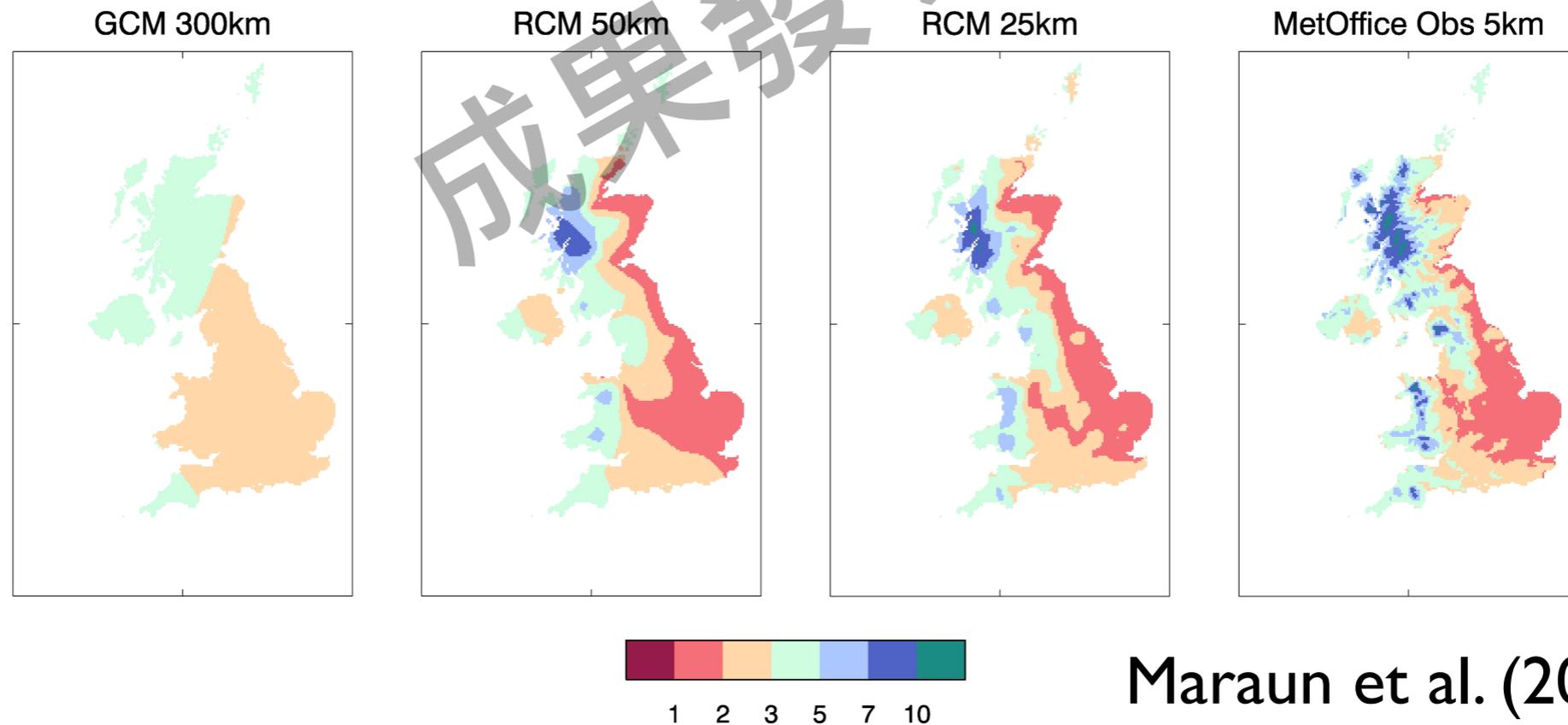
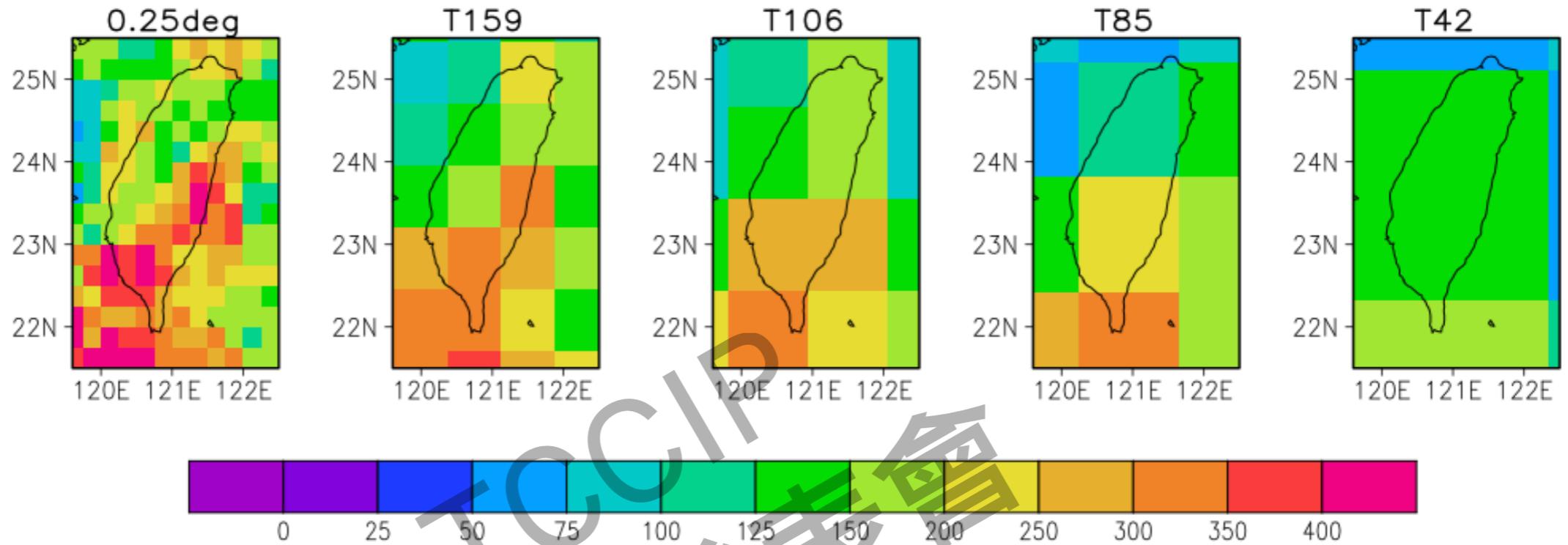
Consecutive Dry Days (CDD) in 2081-2100



CDD

Extreme events often has spatial scale dependence

TRMM
Rx 1 day

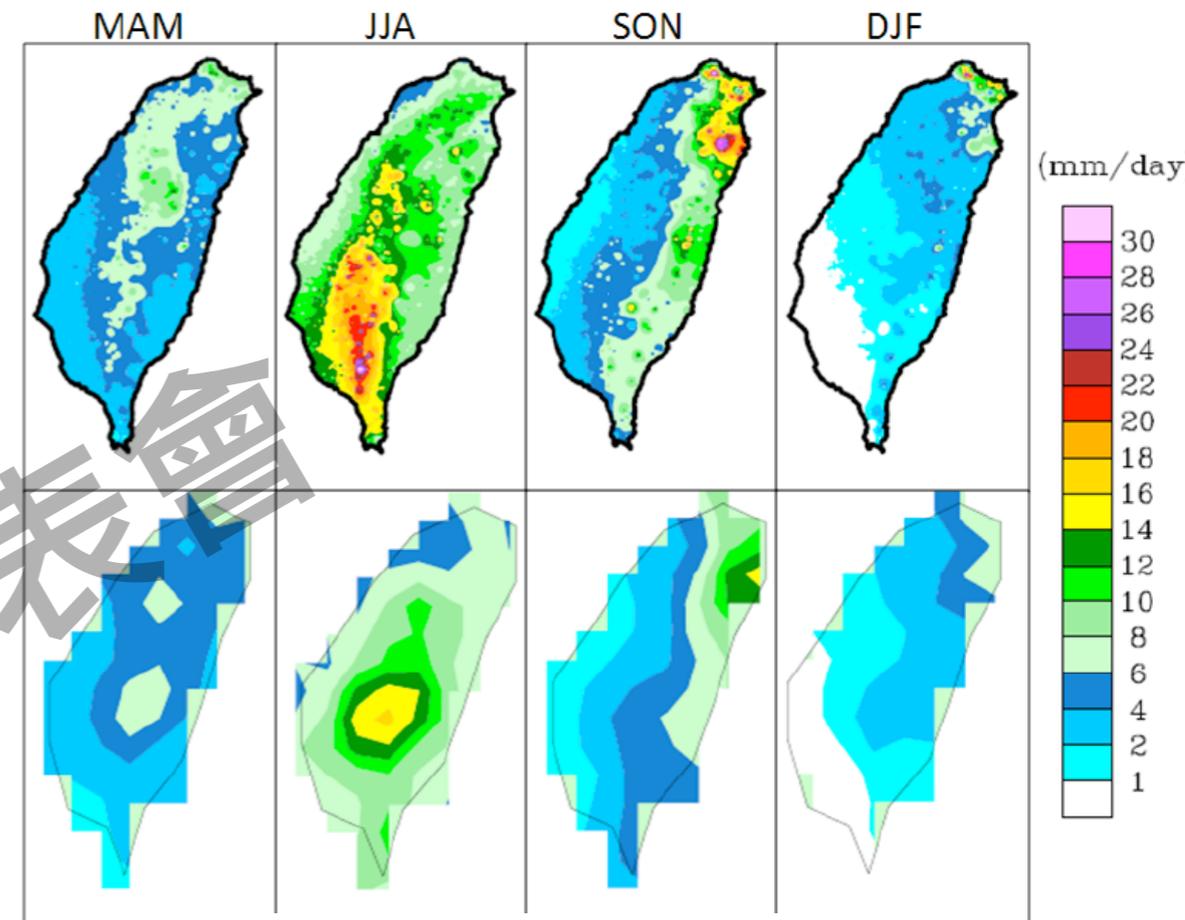
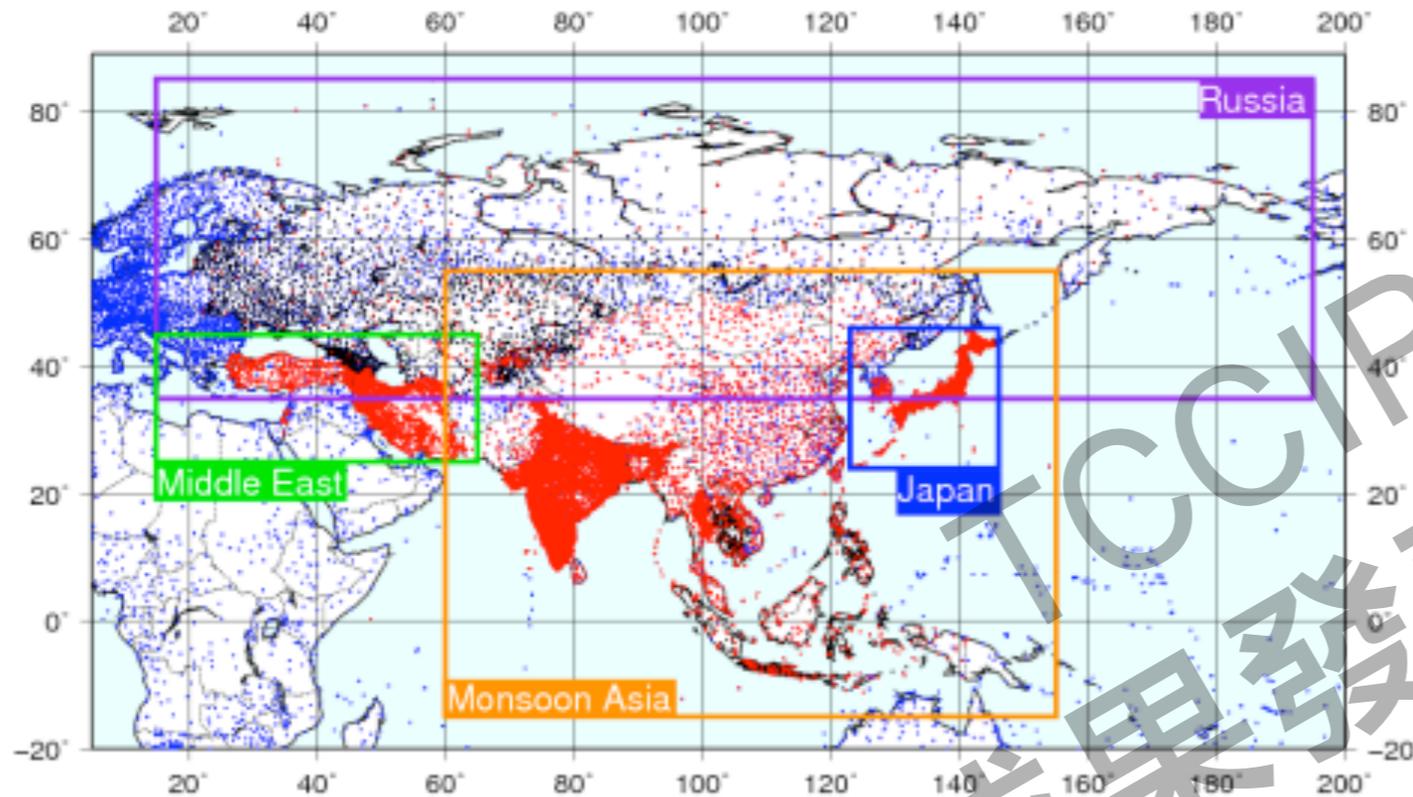


Maraun et al. (2010)

Require long-term high-resolution observations

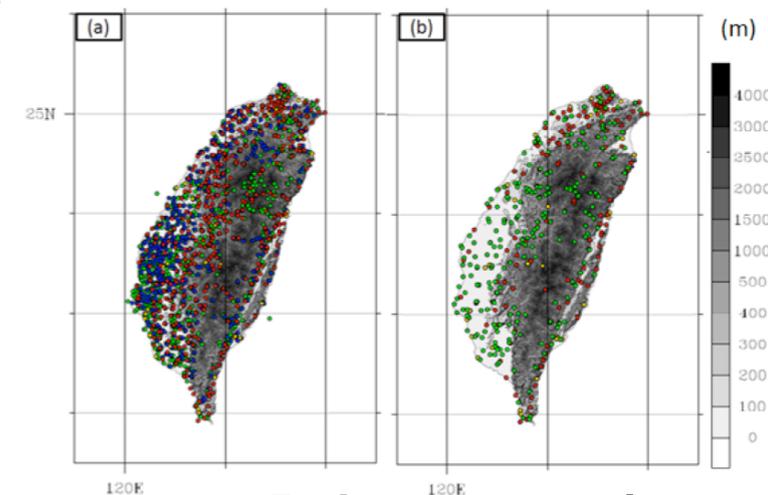
APHRODITE (0.25°)

New high-resolution (5km) gridded climate data over Taiwan



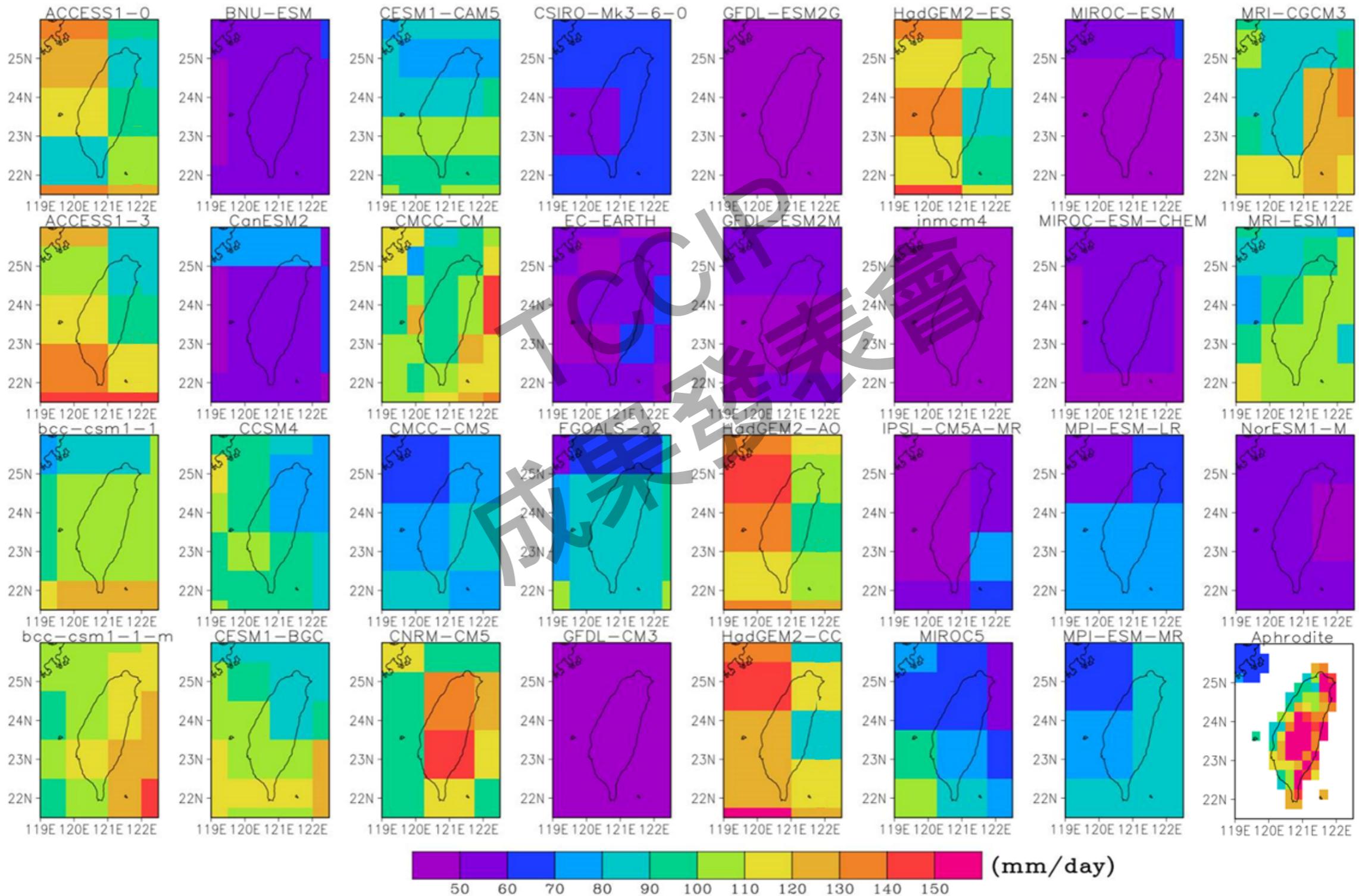
Current version: V1003R1 [Download](#) » [Readme](#) » [Errata](#)

Name	Domain	Resolution	Period
Monsoon Asia (MA)	60°E-150°E, 15°S-55°N	0.5° and 0.25°, daily	1951-2007
Middle East (ME)	15°E-65°E, 25°N-45°N		
Russia (RU)	15°E-165°W, 34°N-84°N		



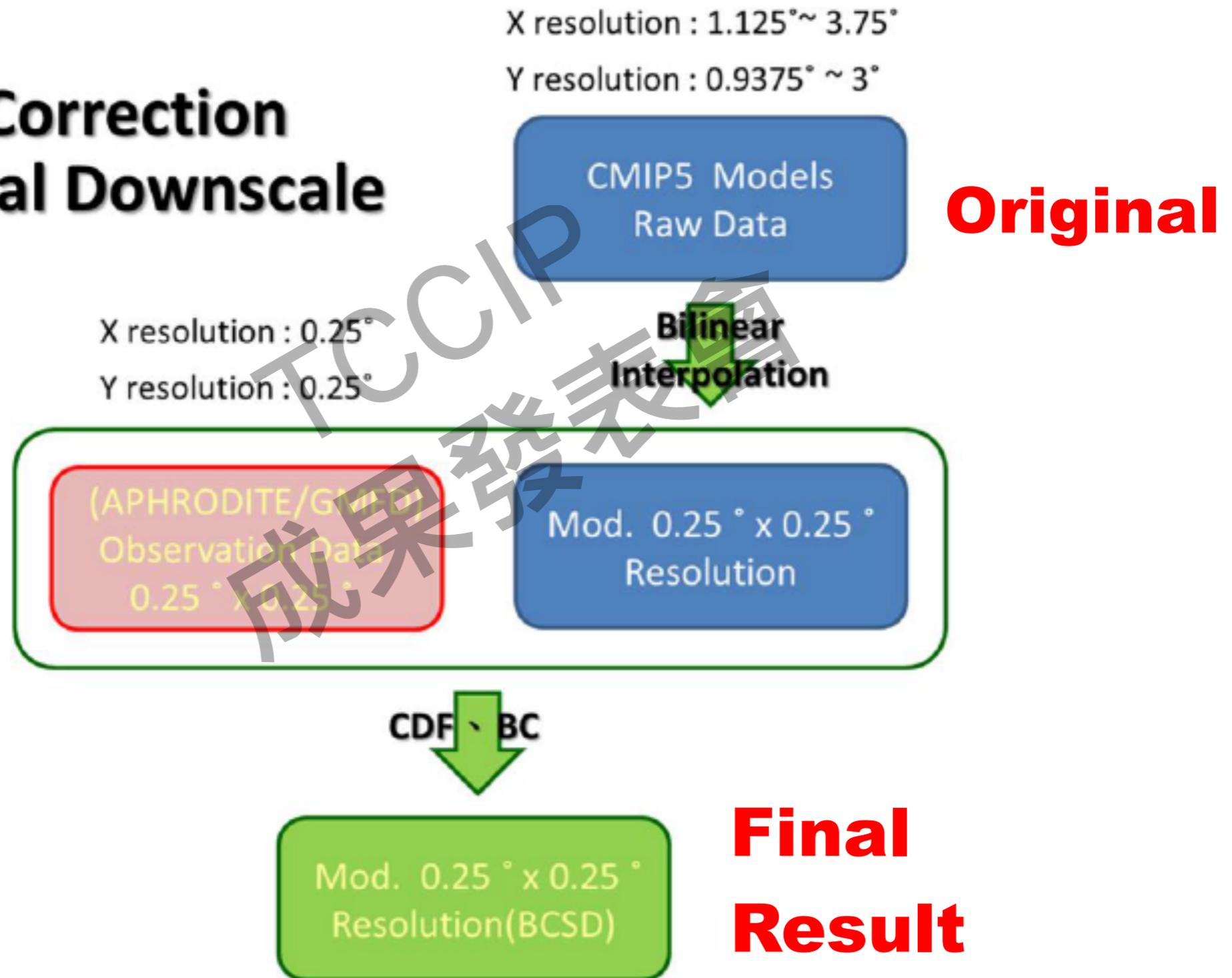
翁叔平、楊承道

RX1day from CMIP5 Historical Run with Original Model Resolution

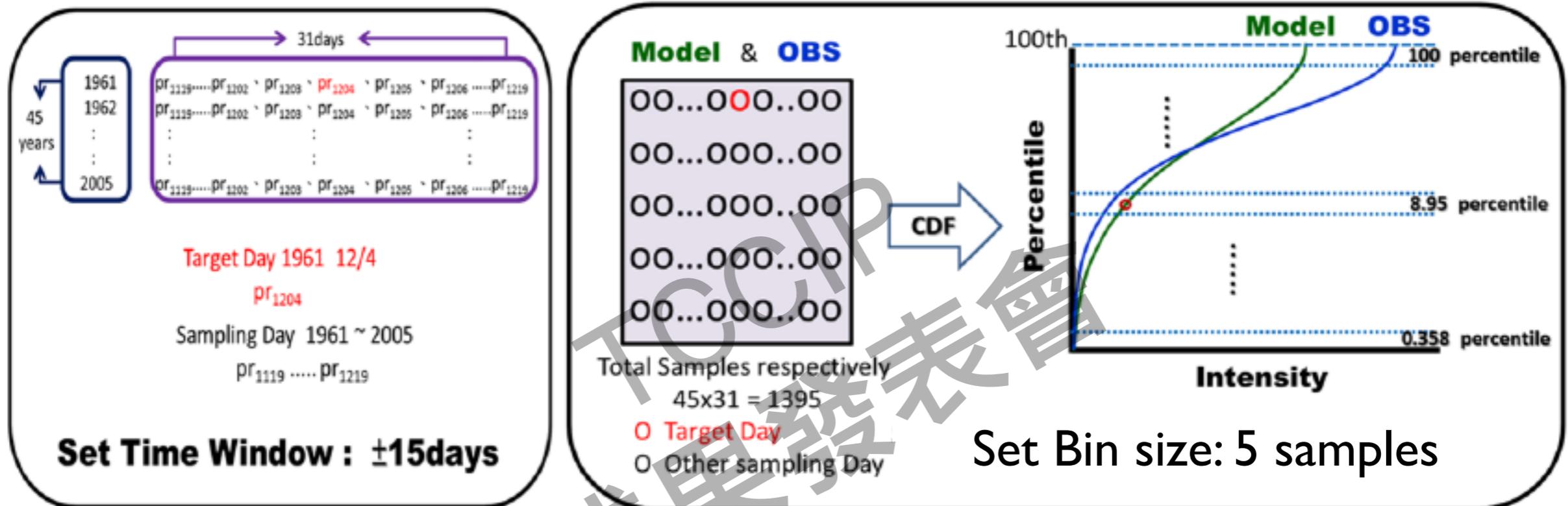


Statistical downscaling for daily data from CMIP5 models

Bias Correction Spatial Downscale



Daily Data Bias Correction



$$\mathbf{OBS}_{8.95p} = \sum Pr_{obs:121st-125th} / 5$$

$$\mathbf{Model}_{8.95p} = \sum Pr_{model:121st-125th} / 5$$

Target Day 1961 12/4 Model Bias Correction

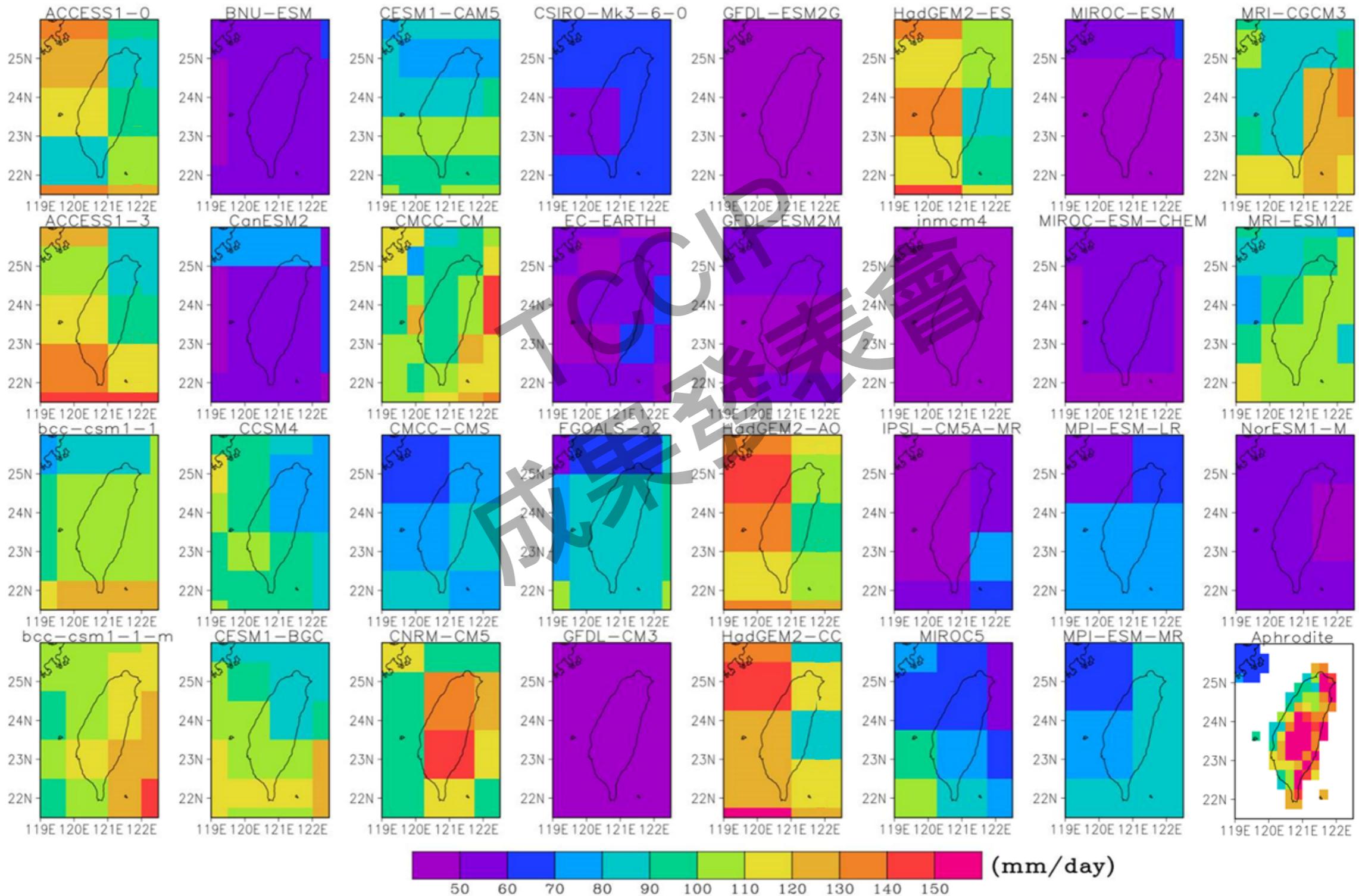
$$\mathbf{Model_BC}_{Pr_{1204}} = (\mathbf{Model}_{Pr_{1204}} \times \mathbf{OBS}_{8.95p} / \mathbf{Model}_{8.95p})$$

← Model Range of Extremes →

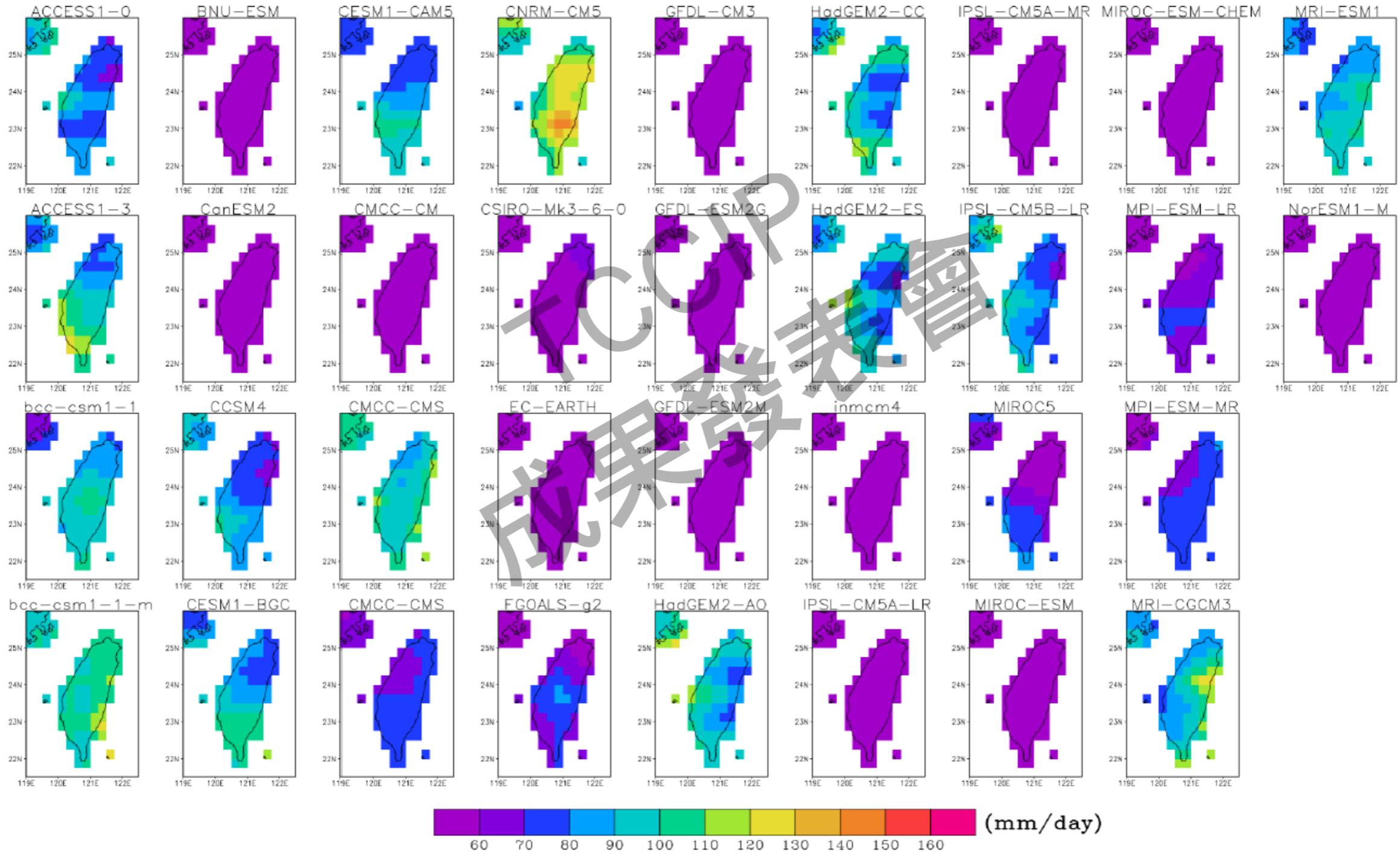
Observation

氣候指標	Min	10th %	25th%	Median	75th %	90th %	Max	Mean	aphrodite	單位
rx1day	106.7	116.1	121.9	128.4	136.4	141.9	152.3	129.1	131.4	mm
rx5day	238.2	254.3	270.6	293.2	321.3	339.6	384.1	297.0	253.9	mm
scll	11.0	11.5	11.8	12.1	12.4	12.8	13.3	12.1	11.9	mm
rr1	126.5	129.3	131.1	133.0	134.9	136.5	138.6	133.0	124.7	day
r10mm	36.8	39.5	40.3	41.3	42.4	43.5	45.2	41.4	38.7	day
r20mm	18.5	19.7	20.3	21.0	21.8	22.6	23.8	21.1	19.6	day
r50mm	4.7	5.2	5.5	5.9	6.3	6.7	7.4	6.0	5.3	day
r80mm	1.6	2.0	2.2	2.5	2.8	3.1	3.6	2.5	2.2	day
cdd	25.6	27.9	29.8	31.9	34.6	37.0	41.4	32.3	31.9	day
cwd	11.4	12.5	14.0	15.5	17.4	18.6	20.5	15.7	11.8	day
r95pTOT	572.1	598.1	610.9	628.3	646.1	662.5	691.5	629.3	610.4	mm
r99pTOT	256.5	281.2	300.4	324.0	353.9	386.1	440.2	330.3	338.5	mm
prcpTOT	1475.4	1529.9	1572.9	1613.6	1666.2	1726.7	1802.3	1622.3	1508.0	mm

RX1day from CMIP5 Historical Run with Original Model Resolution

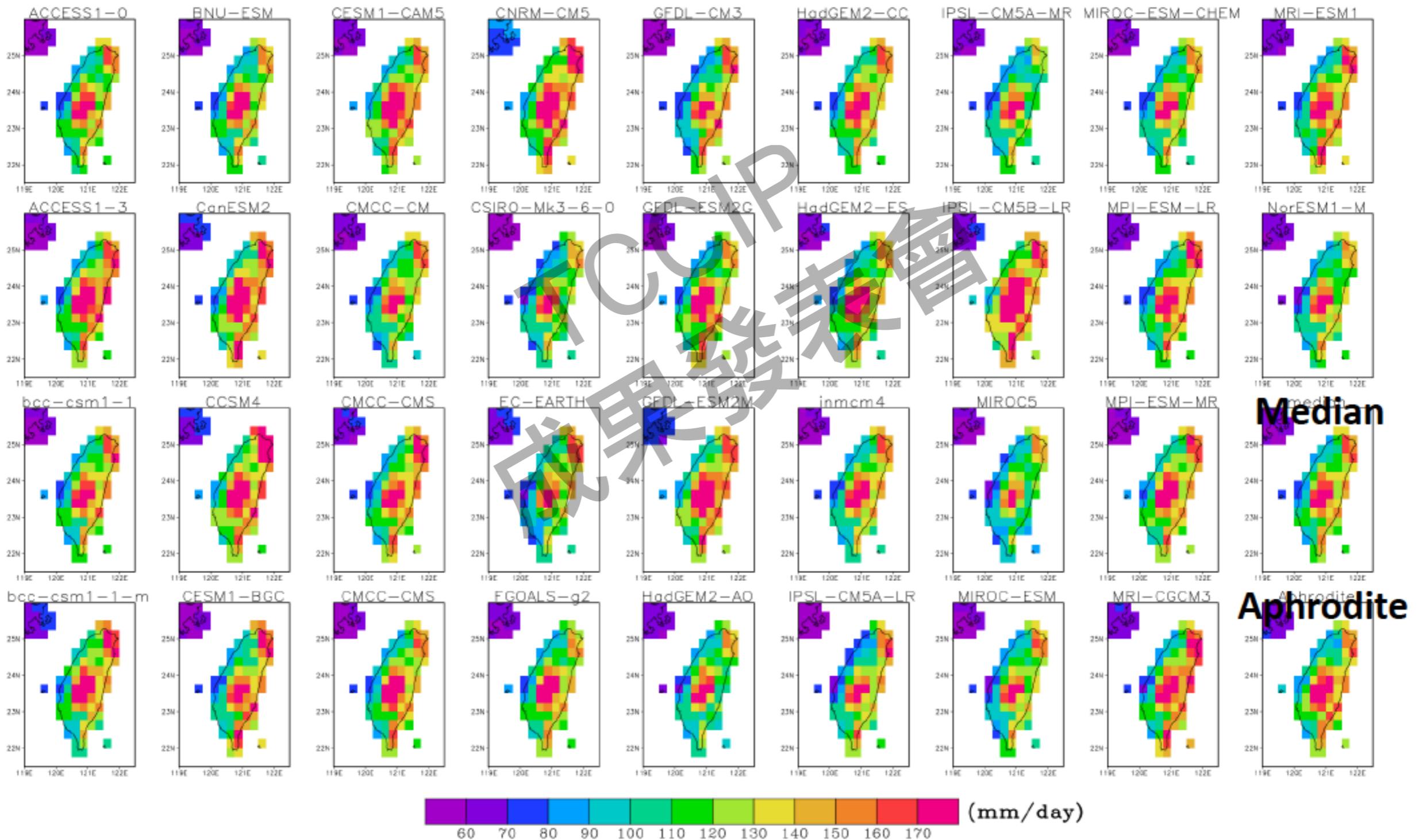


RX1day from CMIP5 Historical Run spatially interpolate to 0.25° Resolution

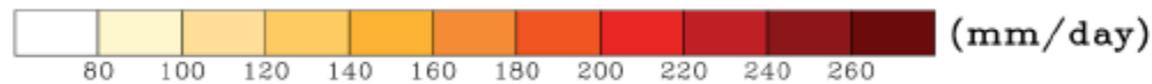
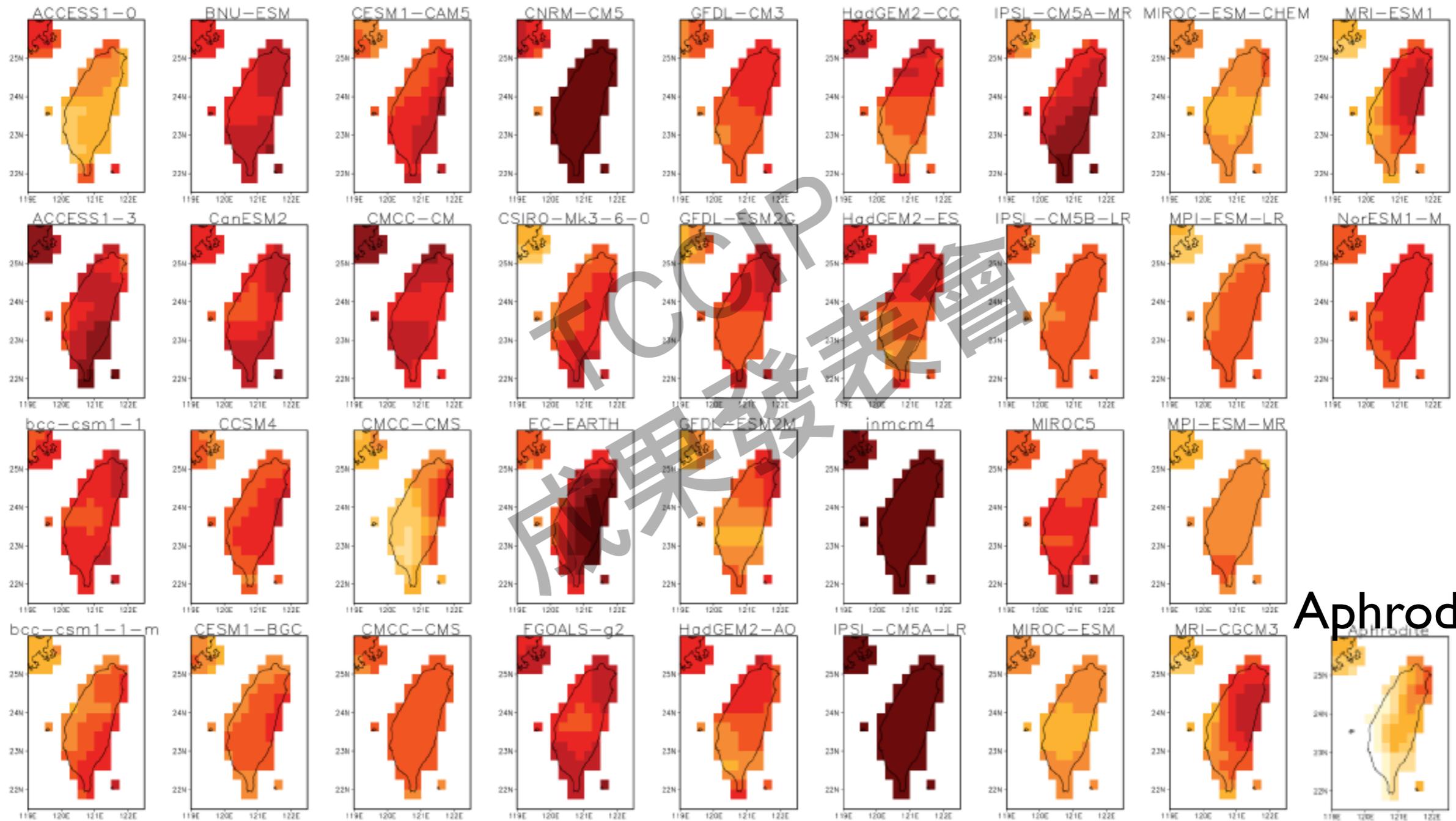


RX1day from CMIP5 Historical Run

Daily Downscaling Precipitation

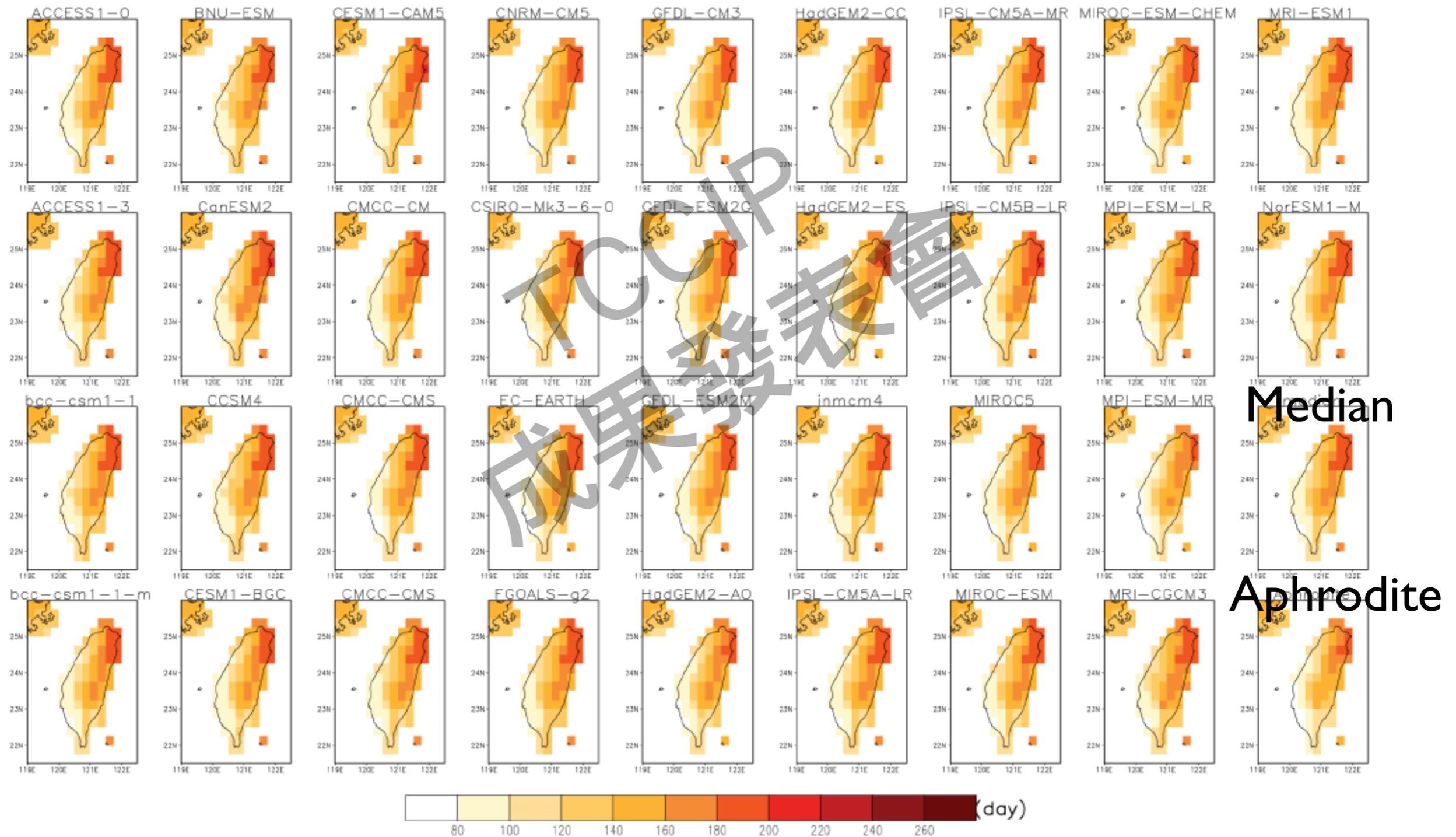


Wet-day Frequency (RR1) from CMIP5 Historical Run Daily Downscaling Precipitation

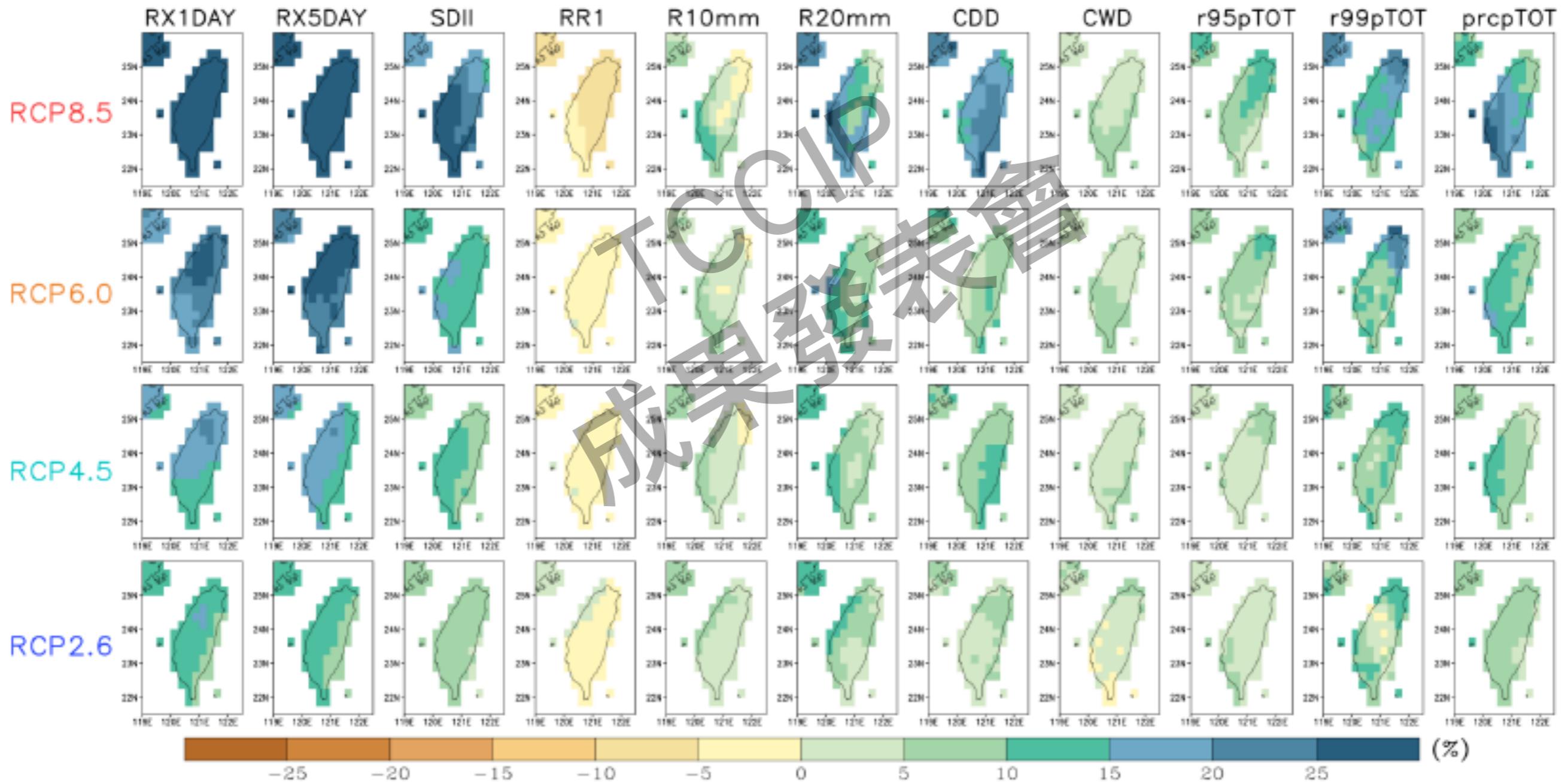


Aphrodite

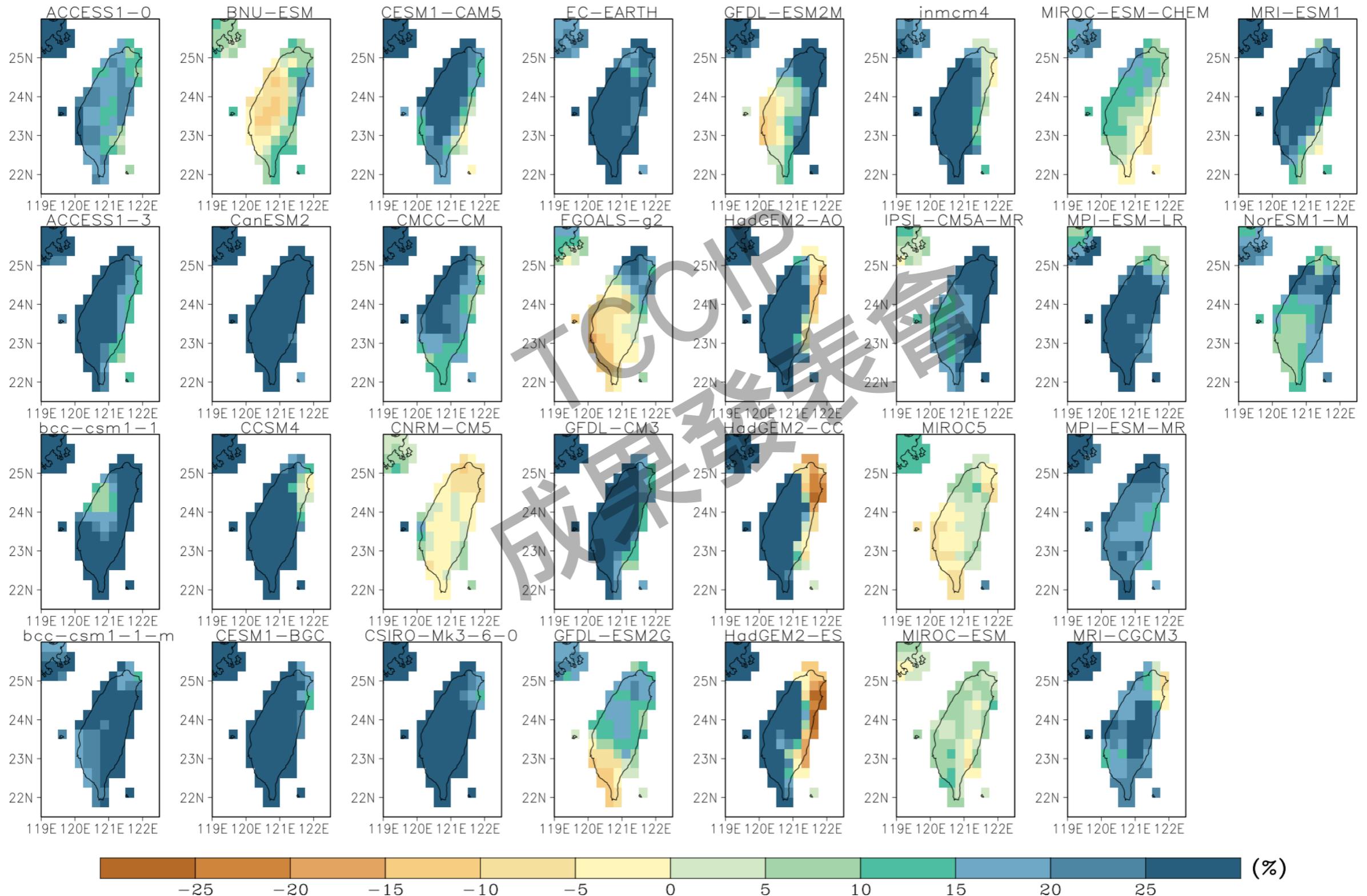
Wet-day Frequency (RR1) from CMIP5 Historical Run Daily Downscaling Precipitation



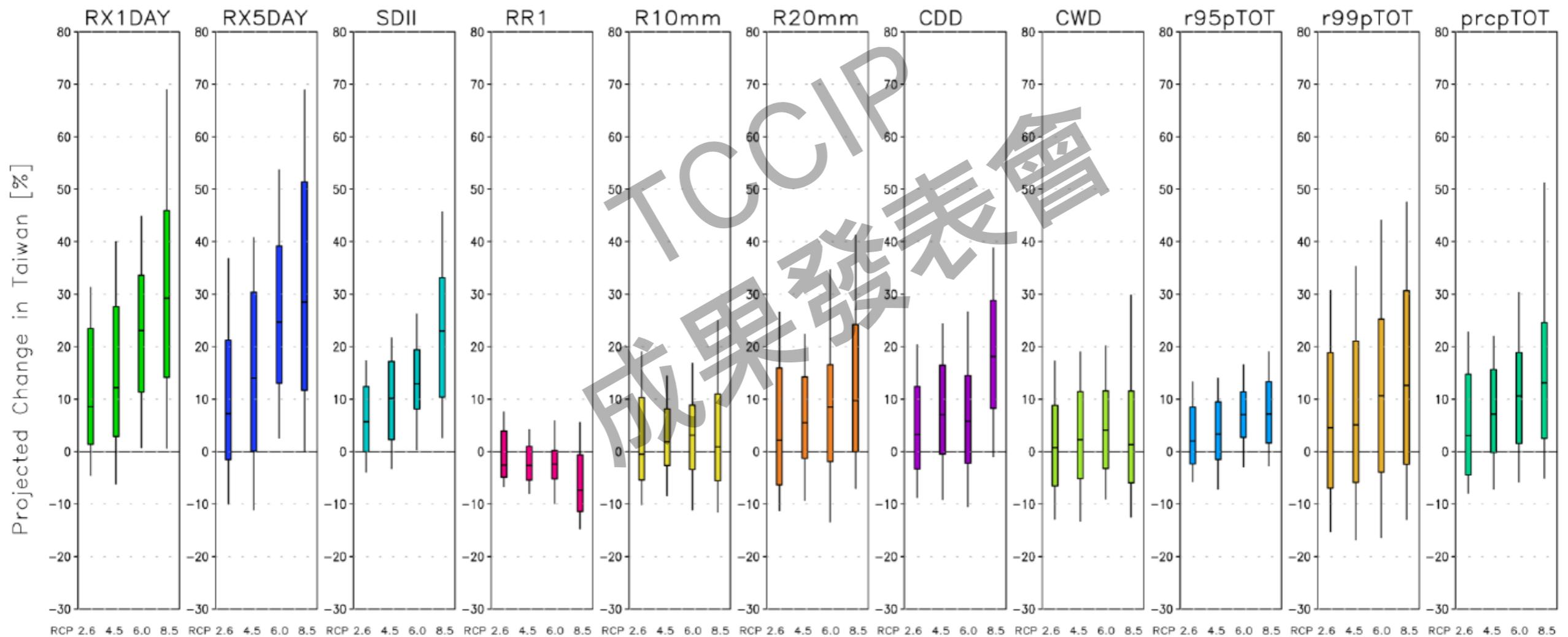
Projected multi-model ensemble mean future changes (%) in 11 rainfall related extremes indices from CMIP5 downscaling daily precipitation with different scenarios



Projected future changes (%) in RX1day from CMIP5 models under RCP8.5 scenarios (Uncertainty)



Uncertainty range of projected future Taiwan area averaged changes (%) in 11 rainfall related extreme indices from CMIP5 models under 4 different RCP scenarios (Uncertainty)



Summary and Concluding Remarks

- Large resources are needed for dealing with all the uncertainties using dynamical downscaling approach. **Statistical approach is a relatively simple and cheap alternative.**
- **Statistical downscaling methods for both monthly and daily climate data have been applied to CMIP data archive to derive high-resolution regional data for impact and adaptation studies based on high-resolution observation.**
- Must consider the other major uncertainties (emission scenario, model, etc.) regarding future climate in addition to downscaling to local scale. **Probabilistic projection better represent the uncertainty.**

- 收集與運用全球氣候模式資料與高解析度觀測資料，發展將氣候模式所產生日資料降尺度到台灣區域的方法，並進一步用以計算極端天氣與氣候指標以及機率分佈特性。
- 以觀測資料驗證CMIP5低解析氣候模式資料中所模擬的極端天氣與氣候指標，探究統計降尺度方法細部調整對極端天氣與氣候指標模擬誤差修正與未來推估可能範圍的影響，比較不同氣候模式模擬結果表現與分佈範圍，分析模式不確定性。

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成果發表會