

Drought Risk Assessment in Changing Climate using Hydro-Meteorological and Socio-Economic Indicators

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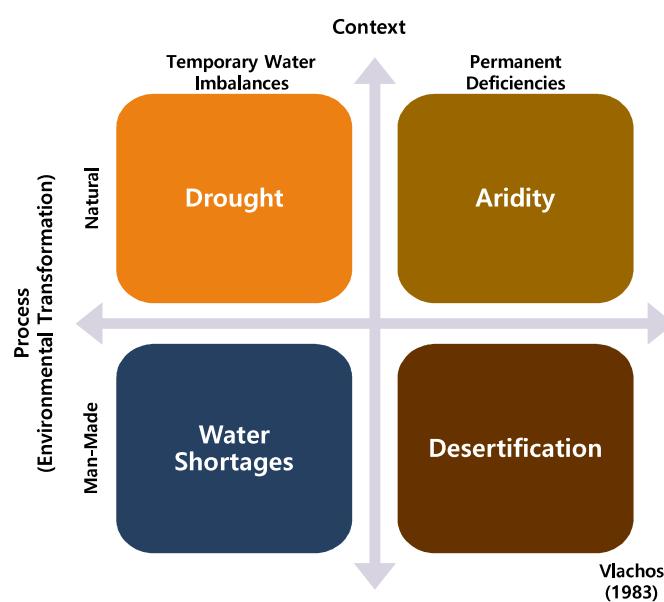
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Background

What is Drought?

Background

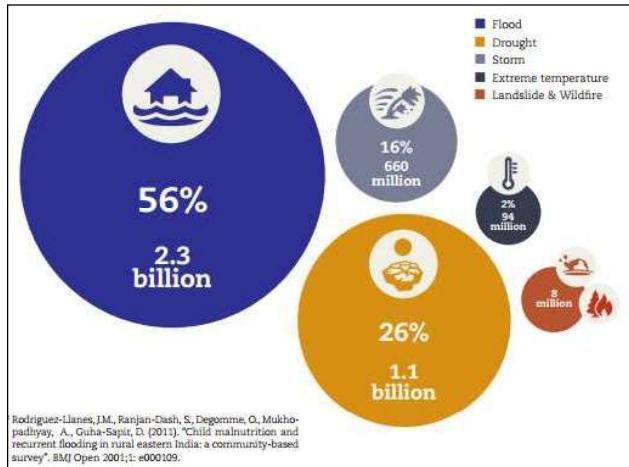
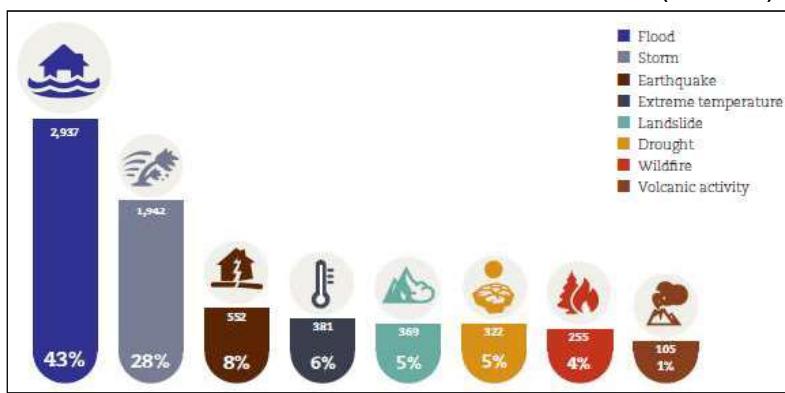


- Drought refers to the occurrence of an unusual water shortage.
- Drought should be assessed based on the shortfall of the climatic averages in the region
- If there is no disaster caused by water shortage, it is not necessary to define it as drought.

Natural Disasters in the World

Background

- ✓ Share of occurrence of natural disasters by disaster type (1994-2015)



- ✓ Number of people affected by disasters by disaster type (1994-2015)

(NB : deaths are excluded from the total affected)

Mega Drought Signals from Google

Background

California May Suffer A 35-Year-Long Megadrought If Planet Continues To Warm

The 2010–2015 megadrought in central Chile: impacts on regional hydroclimate and vegetation

NEWS / THAILAND

Thailand hit by its worst drought in decades

Thai dams run low as an El Niño-induced water shortage reduces reservoirs to critical levels.

30 provinces of Thailand declared drought disaster zones and will receive aid



Why Vietnam Is Running Dry, Worst Drought In Nearly 100 Years

The unusual 2013–2015 drought in South Korea in the context of a multicentury precipitation record: Inferences from a nonstationary, multivariate, Bayesian copula model

The Millennium Drought in southeast Australia (2001–2009): Natural and human causes and implications for water resources, ecosystems, economy, and society

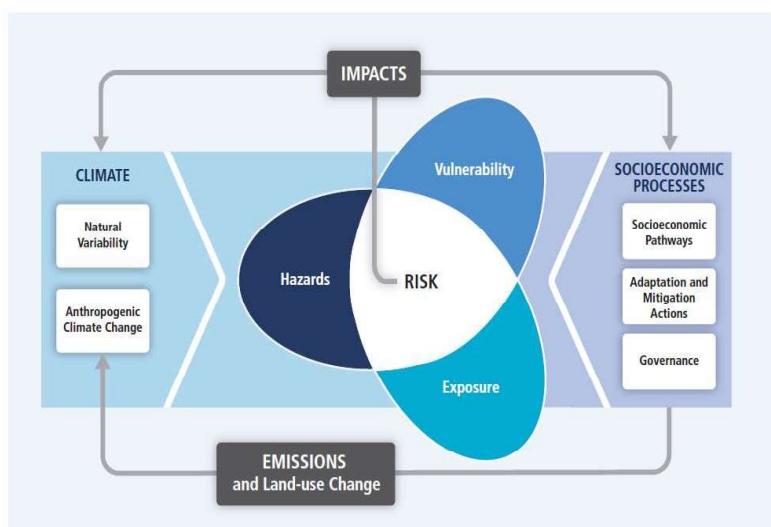
Drought Risk

What is Risk ?

Drought Risk

“Risk” is defined as the expectation value of losses (deaths, injuries, property, etc.) that would be caused by a hazard.

Disaster Risk = function (Hazard, Exposure, Vulnerability)

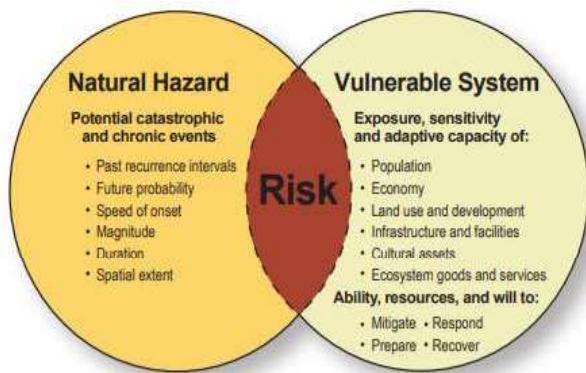


How to Assess Risk ?

Drought Risk



USGS

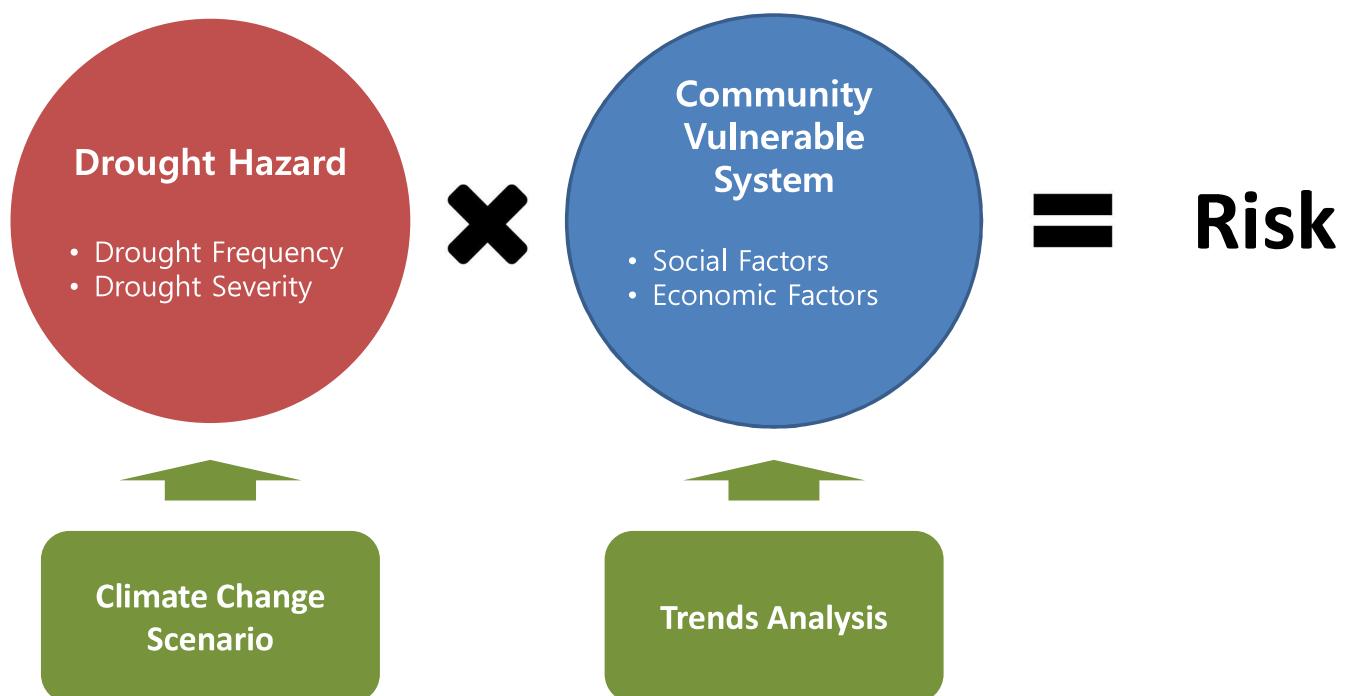


FEMA



How to Assess Future Drought Risk ?

Drought Risk



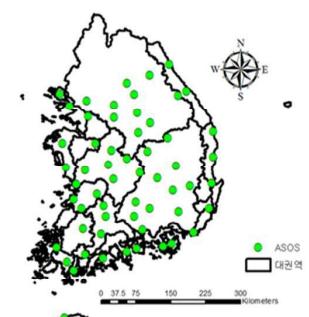
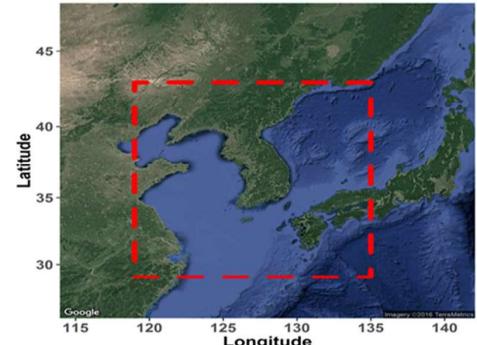
Climate Change

Climate Change Scenario

Climate Change

● CIMP5 GCMs

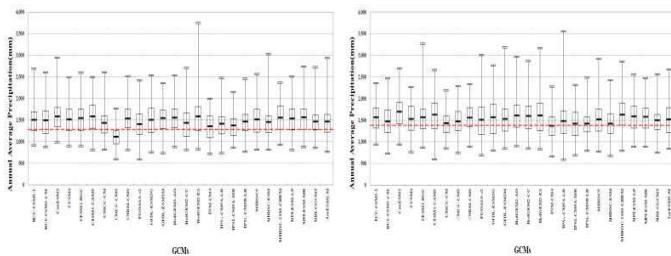
| GCMs | Resolution | Institution |
|----------------|---------------|---|
| CMCC-CM | 0.750 x 0.748 | Centro Euro-Mediterraneo per I Cambiamenti Climatici |
| CCSM4 | 1.250 x 0.942 | |
| CESM1-BGC | 1.250 x 0.942 | National Center for Atmospheric Research |
| CFSM1-CAM5 | 1.250 x 0.942 | |
| BCC-CSM1-1-M | 1.125 x 1.122 | Beijing Climate Center, China Meteorological Administration |
| MRI-CGCM3 | 1.125 x 1.122 | Meteorological Research Institute |
| CNRM-CM5 | 1.406 x 1.401 | Centre National de Recherches Meteorologiques |
| MIROC5 | 1.406 x 1.401 | Atmosphere and Ocean Research Institute (The University of Tokyo) |
| HadGEM2-AO | 1.875 x 1.250 | |
| HadGEM2-CC | 1.875 x 1.250 | Met Office Hadley Centre |
| HadGEM2-ES | 1.875 x 1.250 | |
| INM-CM4 | 2.000 x 1.500 | Institute for Numerical Mathematics |
| IPSL-CM5A-MR | 2.500 x 1.268 | Institut Pierre-Simon Laplace |
| MPI-ESM-LR | 1.875 x 1.865 | Max Planck Institute for Meteorology (MPI-M) |
| MPI-ESM-MR | 1.875 x 1.865 | |
| FGOALS-s2 | 2.813 x 1.659 | LASG, Institute of Atmospheric Physics, Chinese Academy of Sciences |
| NorESM1-M | 2.500 x 1.895 | Norwegian Climate Centre |
| GFDL-ESM2G | 2.500 x 2.023 | Geophysical Fluid Dynamics Laboratory |
| GFDL-ESM2M | 2.500 x 2.023 | Geophysical Fluid Dynamics Laboratory |
| IPSL-CM5B-LR | 3.750 x 1.895 | Institut Pierre-Simon Laplace |
| IPSL-CM5B-LR | 3.750 x 1.895 | |
| BCC-CSM1-1 | 2.813 x 2.791 | Beijing Climate Center, China Meteorological Administration |
| CanESM2 | 2.813 x 2.791 | Canadian Centre for Climate Modelling and Analysis |
| MIROC-ESM-CHEM | 2.813 x 2.791 | Japan Agency for Marine-Earth Science and Technology, Atmosphere and Ocean Research Institute (The University (Tokyo), and National Institute for Environmental Studies |
| MIROC-ESM | 2.813 x 2.791 | |



GCMs Assessment

Climate Change

➤ Annual Precipitation



➤ No. of dry days

| GCM | Scenario | RCP 4.5 | RCP 8.5 | GCM | Scenario | RCP 4.5 | RCP 8.5 |
|--------------|------------|---------|---------|----------------|----------|---------|---------|
| | BCC-CSM1-1 | 30,160 | 35,371 | HadGEM2-CC | 43,272 | 38,727 | |
| BCC-CSM1-1-M | | 37,119 | 33,614 | HadGEM2-ES | 40,381 | 45,097 | |
| CanESM2 | | 27,865 | 31,468 | INM-CM4 | 41,504 | 36,828 | |
| CCSM4 | | 30,936 | 38,028 | IPSL-CM5A-LR | 51,046 | 56,013 | |
| CESM1-BGC | | 34,263 | 37,991 | IPSL-CM5A-MR | 41,119 | 46,405 | |
| CESM1-CAM5 | | 37,166 | 38,398 | IPSL-CM5B-LR | 43,993 | 49,978 | |
| CNCC-CM | | 27,074 | 28,678 | MIROC5 | 39,849 | 35,449 | |
| CNRM-CM5 | | 33,116 | 30,449 | MIROC-ESM | 32,524 | 32,067 | |
| CNRM-CM5 | | 31,497 | 33,951 | MIROC-ESM-CHEM | 27,569 | 34,126 | |
| FGOALS-g2 | | 42,289 | 52,112 | MPI-ESM-LR | 48,919 | 44,575 | |
| GFDL-ESM2G | | 57,017 | 60,170 | MPI-ESM-MR | 42,053 | 40,634 | |
| GFDL-ESM2M | | 48,381 | 50,113 | MRI-CGCM3 | 27,436 | 32,158 | |
| HadGEM2-AO | | 44,636 | 41,201 | NorESM1-M | 47,602 | 56,333 | |

➤ Annual precipitation from 2011 to 2099

➤ Drought Occurrence Frequency

| GCMs | Drought Spell | | Drought Spell | | GCMs | Scenario |
|--------------|---------------|--------|----------------|--------|-------|----------|
| | SPI < -1 | RCP4.5 | SPI < -1 | RCP8.5 | | RCP4.5 |
| BCC-CSM1-1 | 804 | 833 | HadGEM2-CC | 1,239 | 809 | |
| BCC-CSM1-1-M | 1,146 | 1,194 | HadGEM2-ES | 973 | 950 | |
| CanESM2 | 793 | 682 | INM-CM4 | 1,521 | 1,405 | |
| CCSM4 | 951 | 948 | IPSL-CM5A-LR | 1,352 | 1,317 | |
| CESM1-BGC | 948 | 858 | IPSL-CM5A-MR | 1,425 | 1,685 | |
| CESM1-CAM5 | 722 | 809 | IPSL-CM5B-LR | 843 | 1,055 | |
| CNCC-CM | 1,083 | 1,083 | MIROC5 | 1,057 | 1,068 | |
| CNRM-CM5 | 2,425 | 951 | MIROC-ESM | 996 | 1,212 | |
| FGOALS-g2 | 932 | 841 | MIROC-ESM-CHEM | 802 | 772 | |
| GFDL-ESM2G | 1,191 | 1,138 | MPI-ESM-LR | 736 | 724 | |
| GFDL-ESM2M | 941 | 1,035 | MRI-CGCM3 | 880 | 886 | |
| HadGEM2-AO | 888 | 856 | NorESM1-M | 1,139 | 1,106 | |



➤ Average Drought Severity

| GCMs | SPI | SPI < -1 | | GCMs | SPI | SPI < -1 | |
|--------------|--------|----------|----------------|--------|--------|----------|--------|
| | RCP4.5 | RCP8.5 | RCP4.5 | RCP8.5 | RCP4.5 | RCP8.5 | RCP8.5 |
| BCC-CSM1-1 | -1.63 | -1.63 | HadGEM2-CC | -1.72 | -1.62 | | |
| BCC-CSM1-1-M | -1.72 | -1.81 | HadGEM2-ES | -1.73 | -1.67 | | |
| CanESM2 | -1.56 | -1.54 | INM-CM4 | -1.74 | -1.81 | | |
| CCSM4 | -1.68 | -1.69 | IPSL-CM5A-LR | -1.78 | -1.90 | | |
| CESM1-BGC | -1.63 | -1.66 | IPSL-CM5A-MR | -1.72 | -1.81 | | |
| CESM1-CAM5 | -1.63 | -1.64 | IPSL-CM5B-LR | -1.65 | -1.59 | | |
| CNCC-CM | -1.64 | -1.69 | MIROC5 | -1.65 | -1.71 | | |
| CNRM-CM5 | -2.23 | -1.71 | MIROC-ESM | -1.69 | -1.80 | | |
| FGOALS-g2 | -1.80 | -1.85 | MIROC-ESM-CHEM | -1.66 | -1.72 | | |
| GFDL-ESM2G | -1.69 | -1.82 | MPI-ESM-LR | -1.53 | -1.59 | | |
| GFDL-ESM2M | -1.69 | -1.72 | MRI-CGCM3 | -1.59 | -1.60 | | |
| HadGEM2-AO | -1.69 | -1.66 | NorESM1-M | -1.70 | -1.72 | | |

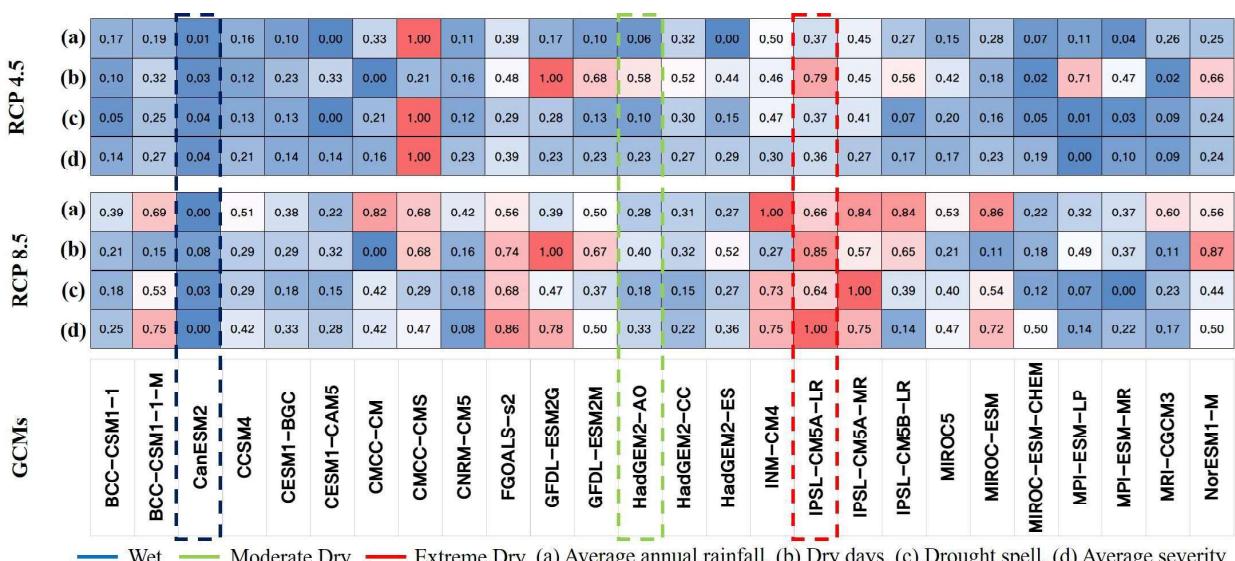


➤ Using SPI(6) using monthly precipitation

➤ Count the frequency of SPI < -1

GCM Selection for Drought Projection

Climate Change



— Wet — Moderate Dry — Extreme Dry (a) Average annual rainfall, (b) Dry days, (c) Drought spell, (d) Average severity

출처 : Assessment of CMIP5 GCMs for future extreme drought analysis (Hong et al., 2018)

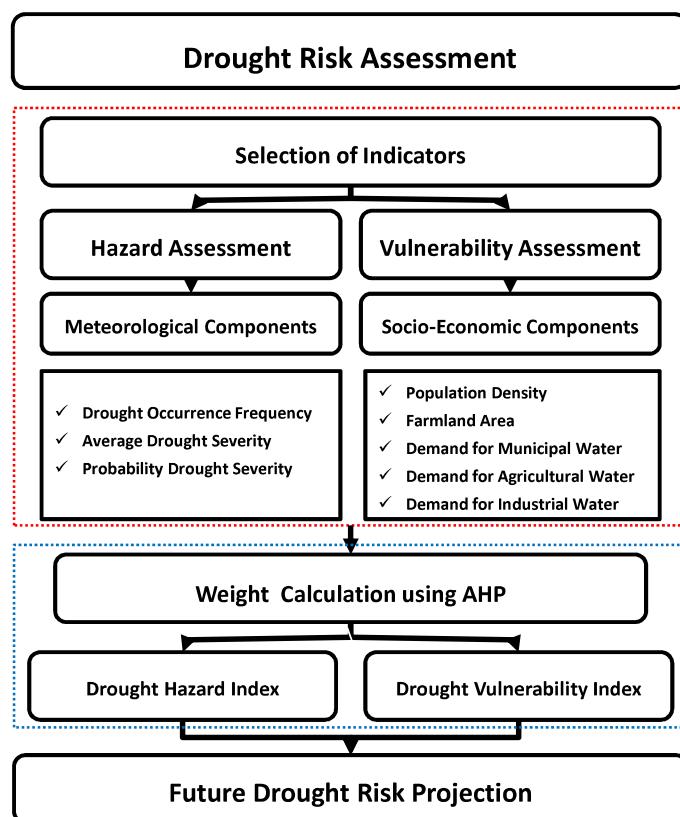
➤ Selected GCMs

IPSL-CM5A-LR(Extremely Dry), HadGEM2-AO(Moderate Dry), CanESM2(Wet)

Assessment of Drought Risk

Methodology

Assessment of Drought Risk



Study Area

Korean 117 River Basin



Data

⇒ Assessment Period

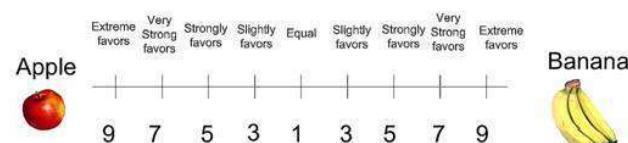
| Period | Year | Class | Information |
|--------|-----------|-------|-------------|
| Past | 1976-2005 | S0 | Past |
| Future | 2011-2040 | S1 | Near-future |
| | 2041-2070 | S2 | Mid-future |
| | 2071-2099 | S3 | Far-future |

⇒ Indicators for Drought Risk Assessment

| Period | Hazard | Vulnerability |
|--------|--------------------------------|--------------------------------|
| Past | ✓ SPI | ✓ Population Density |
| | ✓ Drought Frequency | ✓ Farmland Area |
| | ✓ Average Drought Severity | ✓ Demand of Municipal Water |
| | ✓ Probability Drought Severity | ✓ Demand of Industrial Water |
| Future | ✓ KMA | ✓ Demand of Agricultural Water |
| | ✓ APCC | |
| Source | ✓ WAMIS | |
| | ✓ Statistics of Korea | |

AHP (Analysis Hierarchy Process)

- A Multi Criteria decision making method to derive ratio scales from pair-wise comparisons.
- AHP allow some small inconsistency in judgment because human is not always consistent.



I. Meteorological factor (Hazard)

The following is an assessment of the importance of meteorological factor in the vulnerability priority rank assessment criteria. Please check(✓) the score box by assessing the relative importance of the two evaluation indexes.

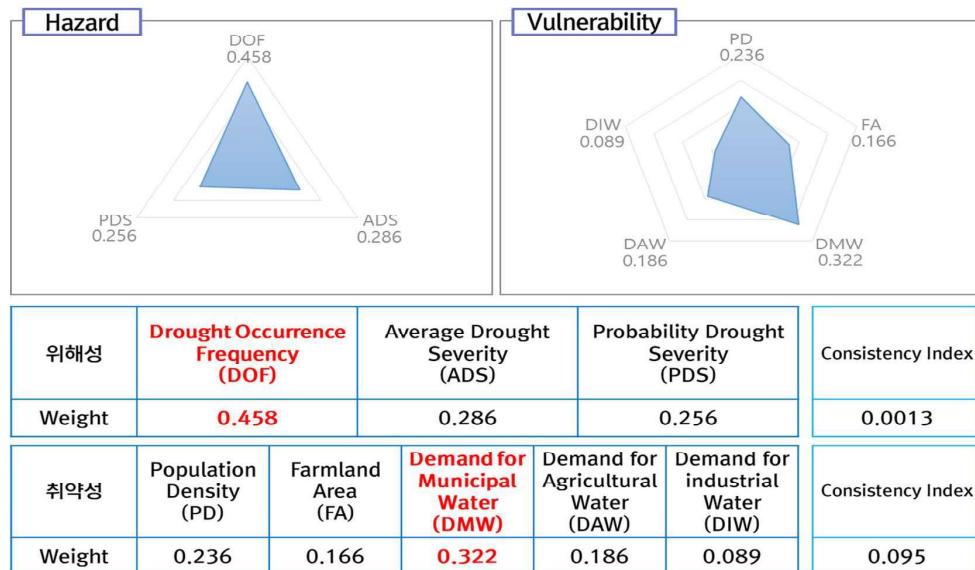
| Assessment Indicator | left more than important | | | | | | | | | | right more than important | | | | | | | | | | Assessment Indicator |
|------------------------------|--------------------------|----|----|----|----|----|----|----|----|----|---------------------------|----|----|----|----|----|----|----|----|----|----------------------|
| | AI | VI | Im | St | Se | St | Im | VI | AI | AI | VI | Im | St | Se | St | Im | VI | AI | AI | VI | |
| Drought Occurrence Frequency | ✓ | | | | | | | | | | | | | | | | | | | | |
| Average Drought Severity | | | | | | | | | | | | | | | | | | | | | |
| Probability Drought Severity | | | | | | | | | | | | | | | | | | | | | |
| Average Drought Severity | | | | | | | | | | | | | | | | | | | | | |
| Probability Drought Severity | | | | | | | | | | | | | | | | | | | | | |

II. Socio-Economic factor (Vulnerability)

The following is an assessment of the importance of socio-economic factors in the vulnerability priority rank assessment criteria. Please check(✓) the score box by assessing the relative importance of the two evaluation indexes.

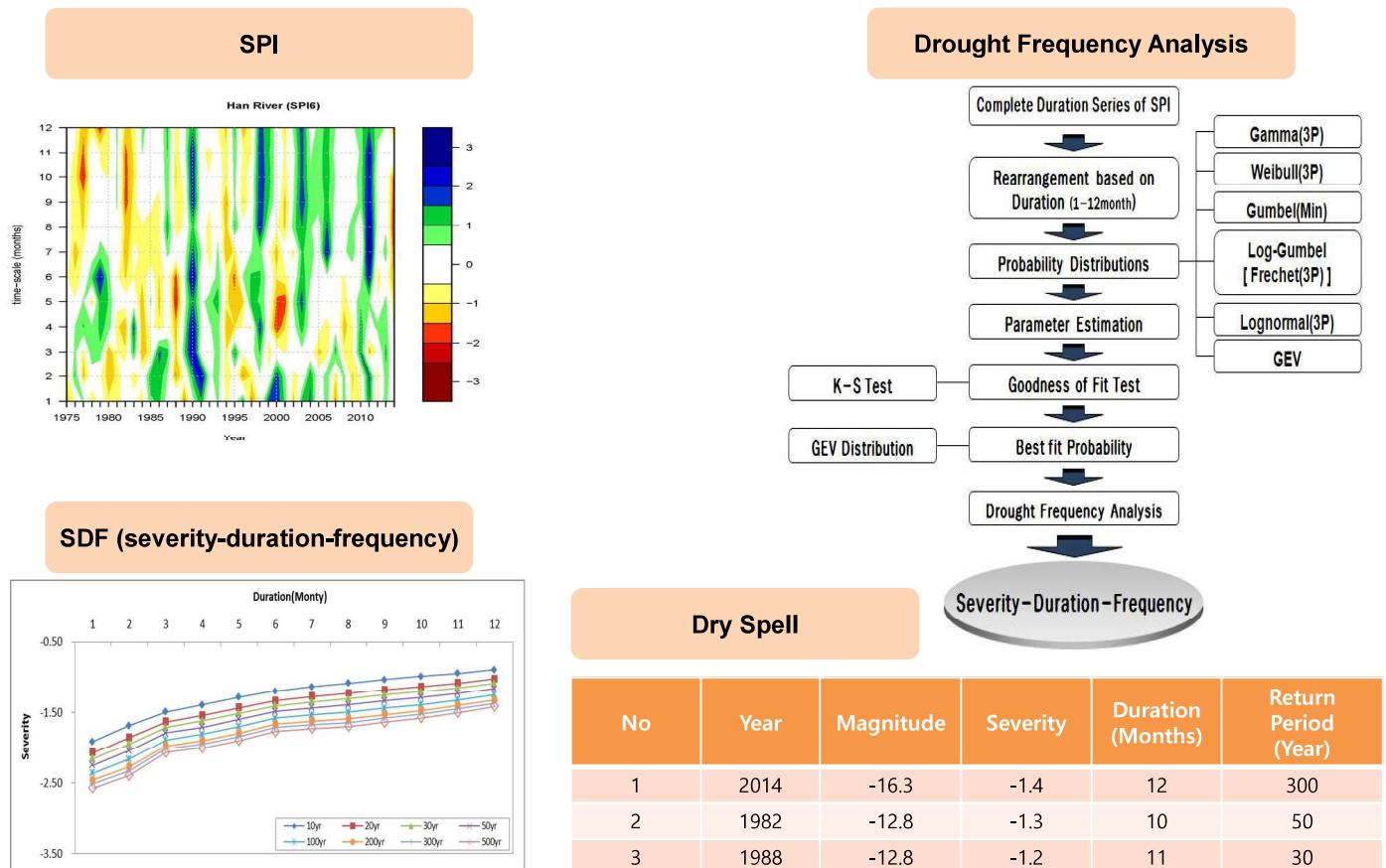
| Assessment Indicator | left more than important | | | | | | | | | | right more than important | | | | | | | | | | Assessment Indicator |
|------------------------------|--------------------------|----|----|----|----|----|----|----|----|----|---------------------------|----|----|----|----|----|----|----|----|----|----------------------|
| | AI | VI | Im | St | Se | St | Im | VI | AI | AI | VI | Im | St | Se | St | Im | VI | AI | AI | VI | |
| Population Density | | | | | | | | | | | | | | | | | | | | | |
| Farmland Area | | | | | | | | | | | | | | | | | | | | | |
| Demand of Municipal Water | | | | | | | | | | | | | | | | | | | | | |
| Demand of Agricultural Water | | | | | | | | | | | | | | | | | | | | | |

Weighting Factors



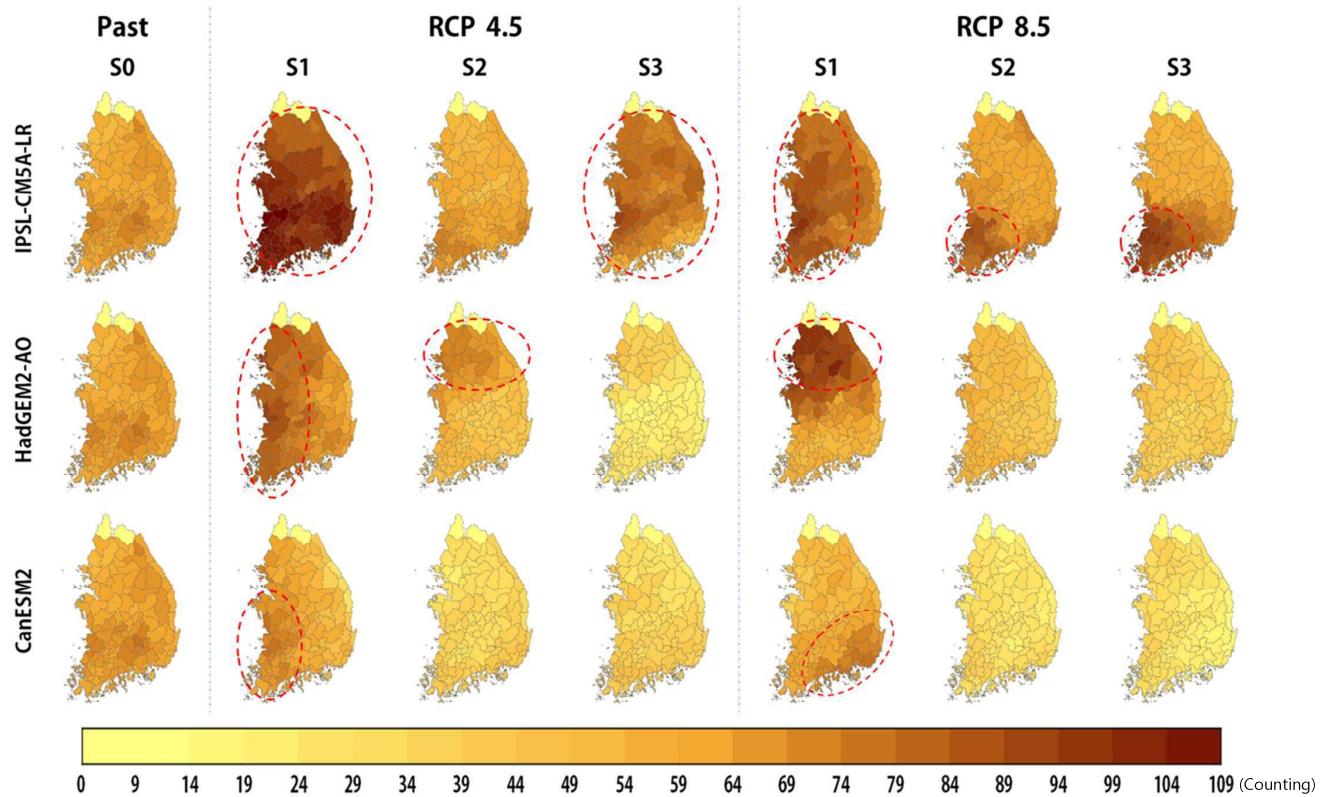
- Hazard = $0.458 \times DOF + 0.286 \times ADS + 0.256 \times PDS$
- Vulnerability = $0.236 \times PD + 0.166 \times FA + 0.322 \times DMW + 0.186 \times DAW + 0.089 \times DIW$
- Risk = Hazard \times Vulnerability

Data for Hazard Assessment



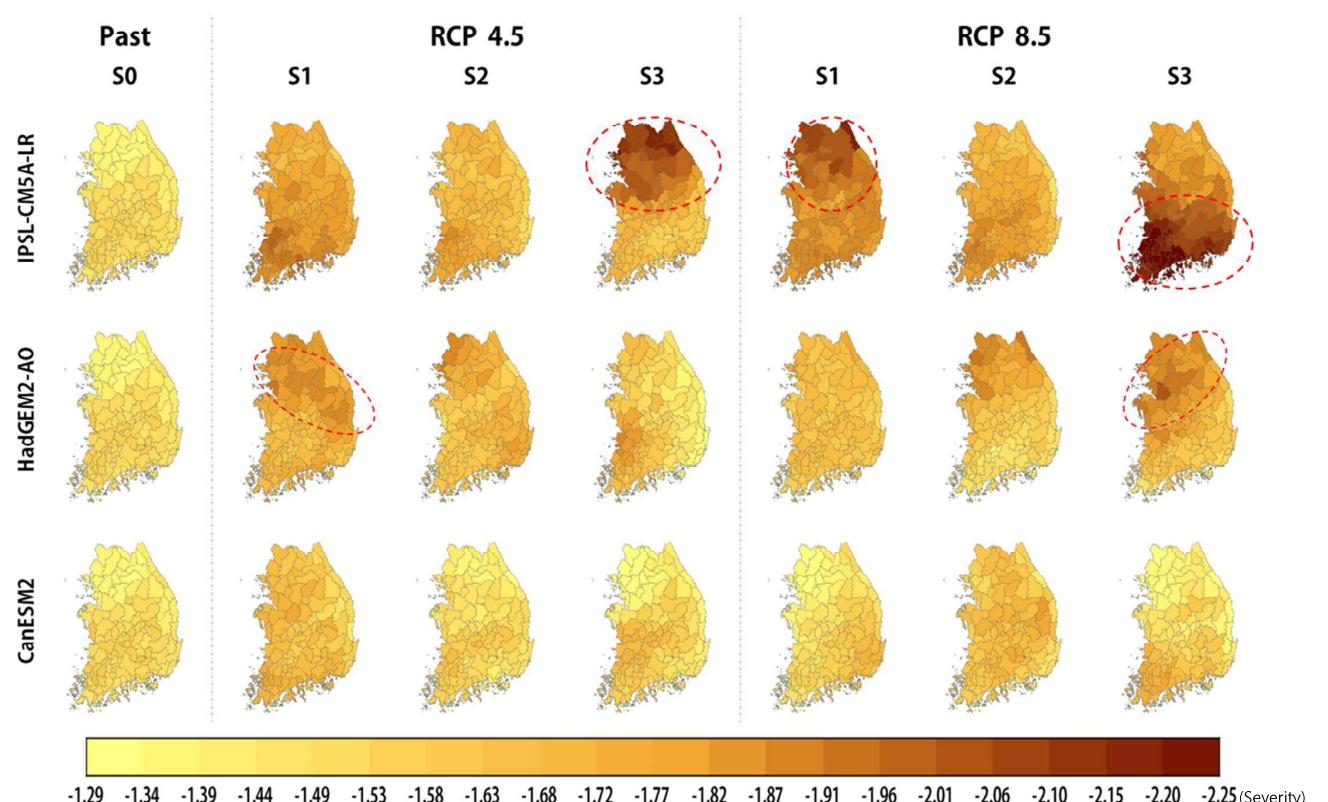
Hazard Indicators

- Drought Occurrence Frequency (DOF) – Dry Spell with SPI



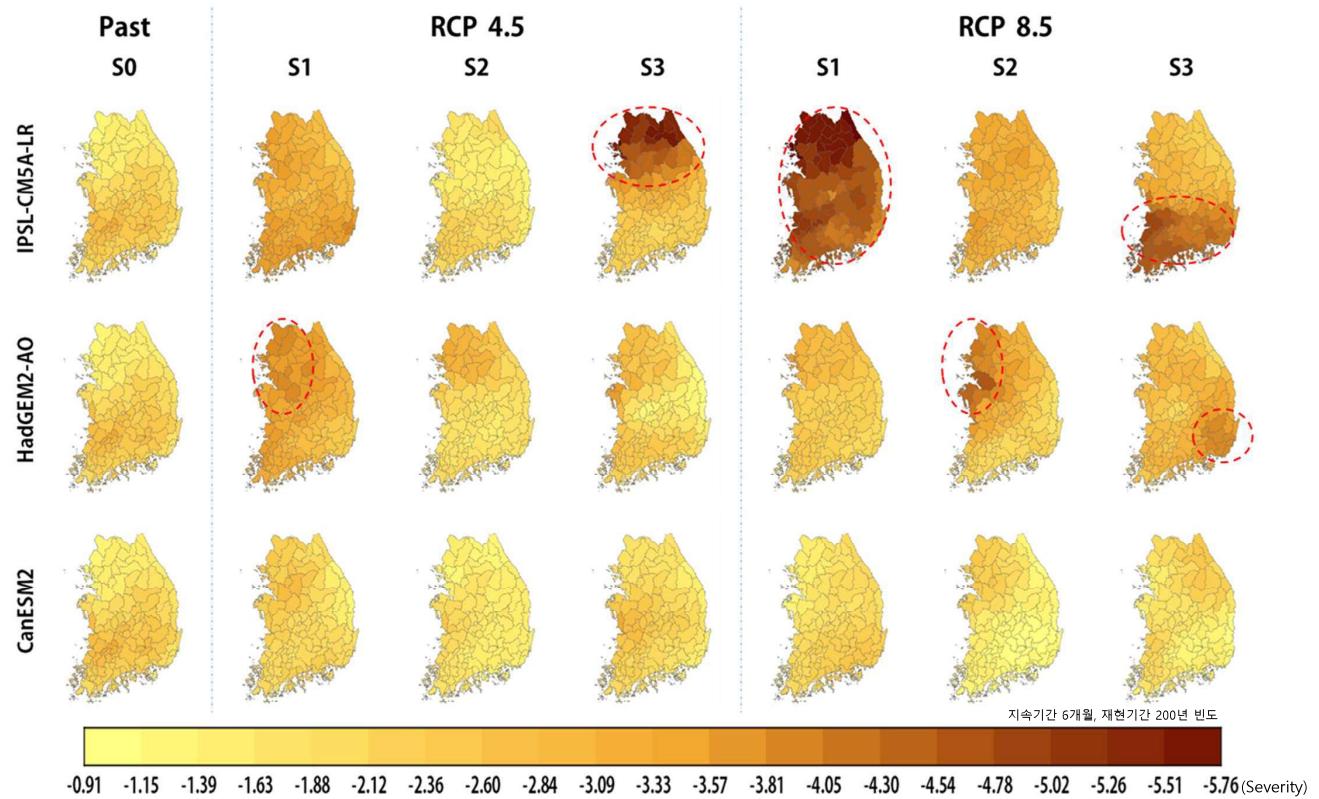
Hazard Indicators

- Average Drought Severity (ADS) – Dry Spell with SPI



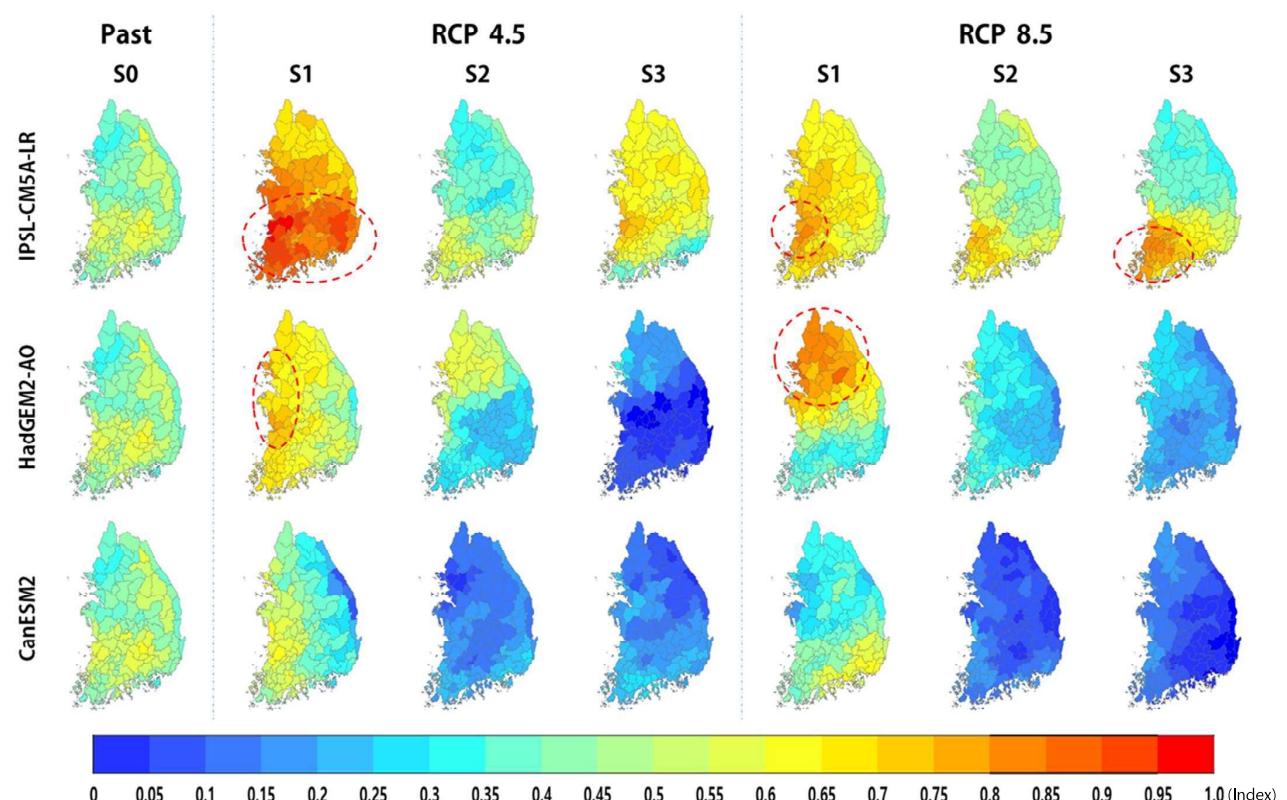
Hazard Indicators

- Probability Drought Severity (PDS) – Drought Frequency Analysis



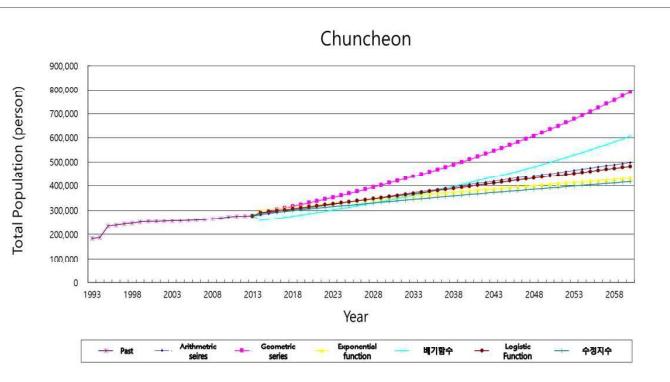
Drought Hazard Index (DHI)

$$\text{DHI} = 0.458 \times \text{DOF} + 0.286 \times \text{ADS} + 0.256 \times \text{PDS}$$



Data for Vulnerability Assessment

● Population



- Population data of National Statistical Office
- Forecast future population by five univariate time series prediction models(arithmetic, logistic function..)

● Farmland Area Forecast

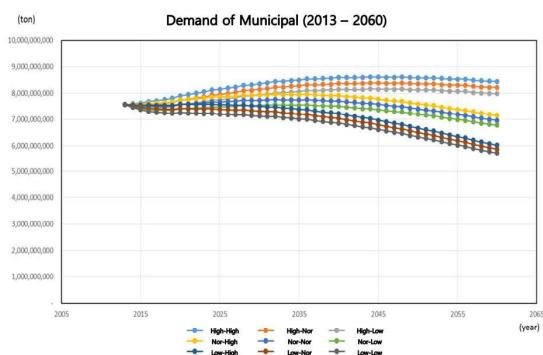
| Class | Content of key indicators by scenario |
|----------------|--|
| High Demand | Maintain the Farmland of 1,656,000ha in 2025 |
| Average Demand | Maintain the Farmland of 1,631,000ha in 2025 |
| Low Demand | Maintain the Farmland of 1,607,000ha in 2025 |

Source : Agricultural Outlook 2016, Korea Rural Economic Institute

- Farmland area of WAMIS Korea
- Forecast the future farmland area based on average demand in KREI's Agricultural Outlook (2016)

Data for Vulnerability Assessment

● Demand of Municipal Water



● Demand of Industrial Water



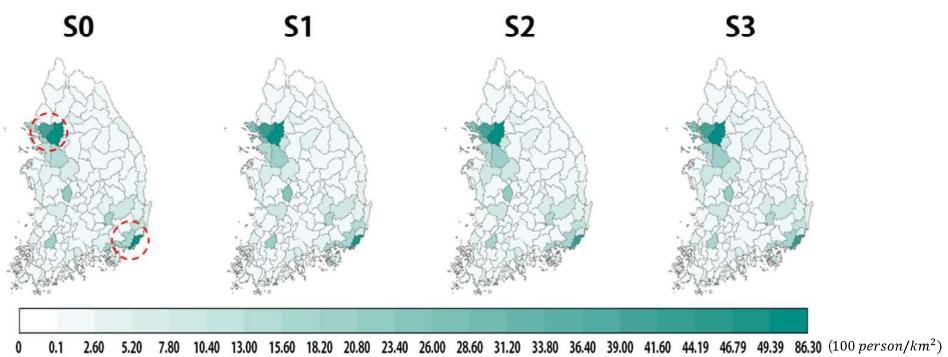
● Demand of Agricultural Water

- Population, lpcd, Industrial Area, Farmland Area
- National Master Plans for Water Resources Management of Korea (Water Vision2020)

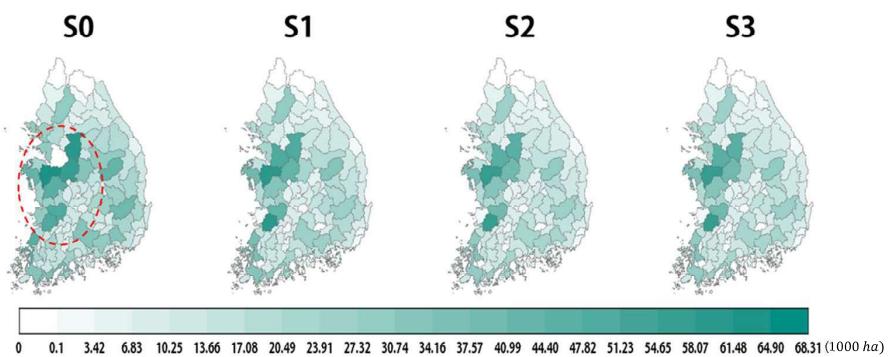
Vulnerability Indicators

Assessment of Drought Risk

● Population Density (PD)



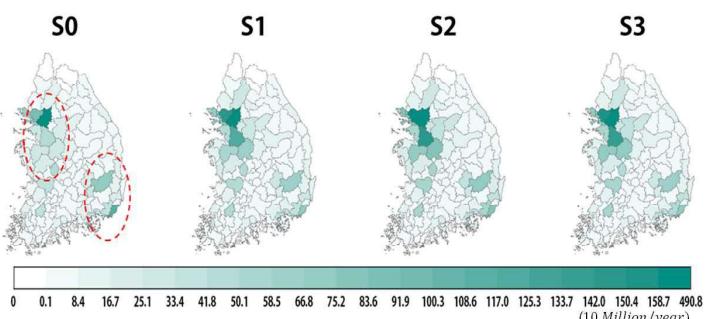
● Farmland Area (FA)



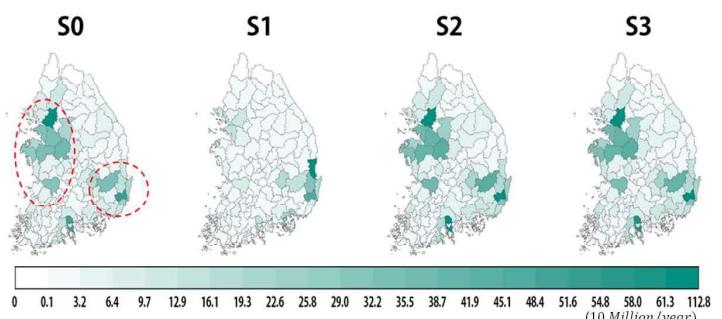
Vulnerability Indicator

Assessment of Drought Risk

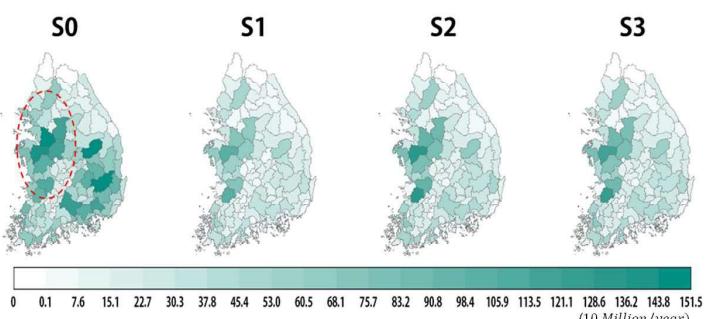
● Demand of Municipal Water (DMW)



● Demand of Industrial Water (DIW)



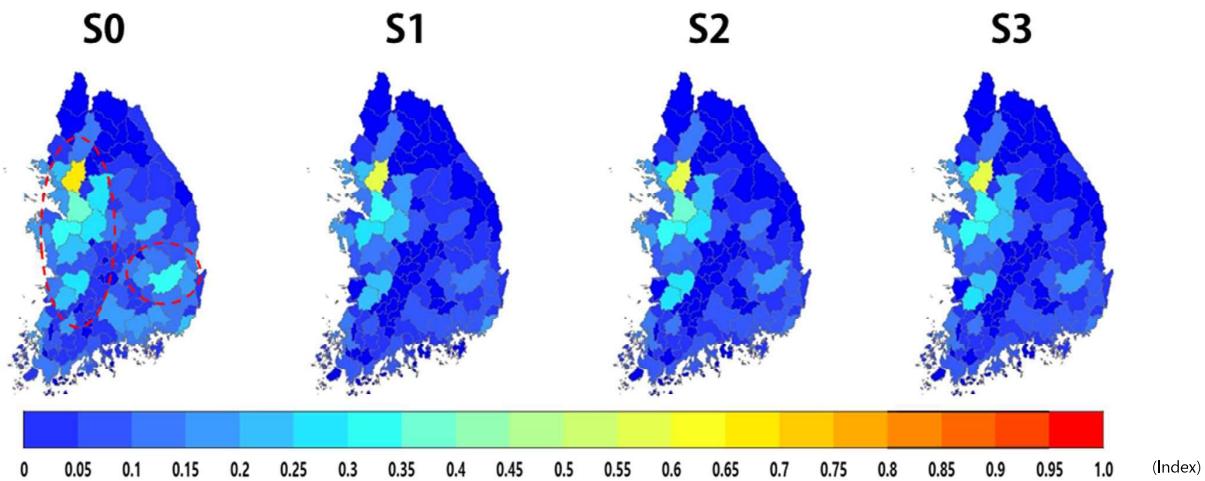
● Demand of Agricultural Water (DAW)



Drought Vulnerability Index (DVI)

Assessment of Drought Risk

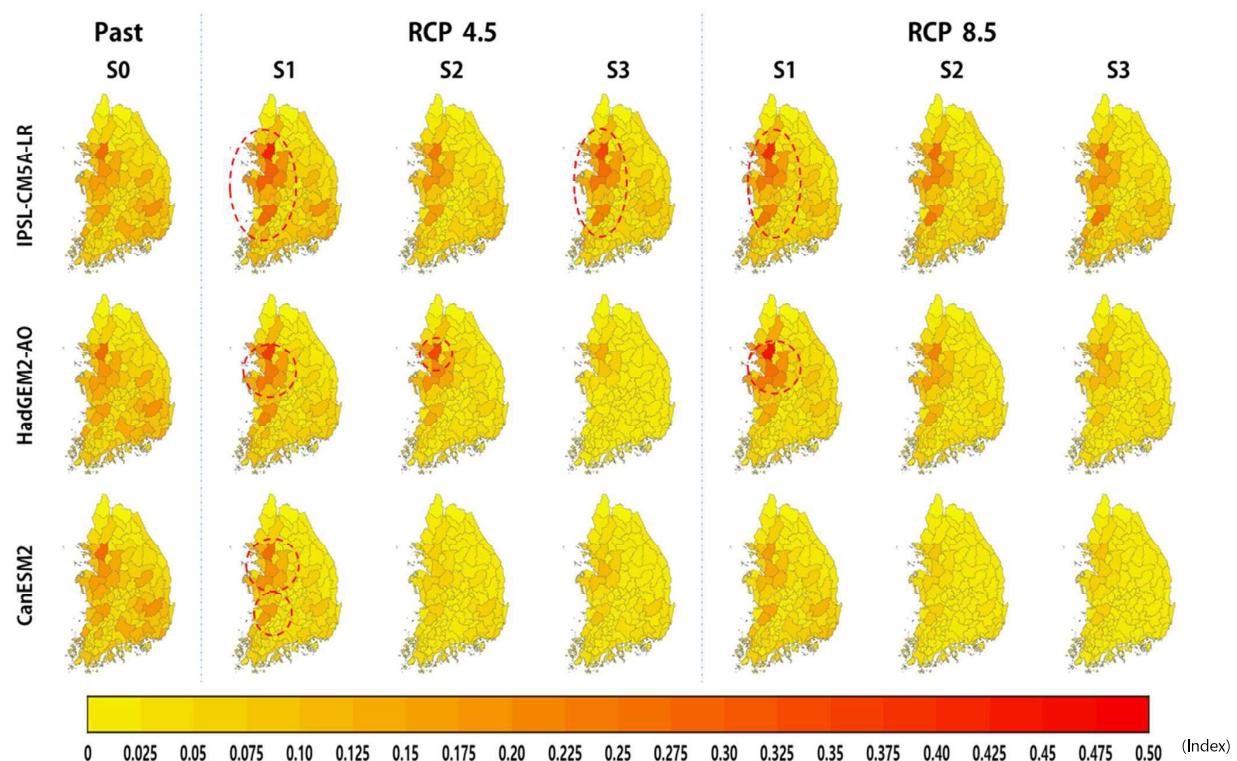
$$\bullet \text{ DVI} = 0.236 \times \text{PD} + 0.166 \times \text{FA} + 0.322 \times \text{DMW} + 0.186 \times \text{DAW} + 0.089 \times \text{DIW}$$



Drought Risk Index (DRI)

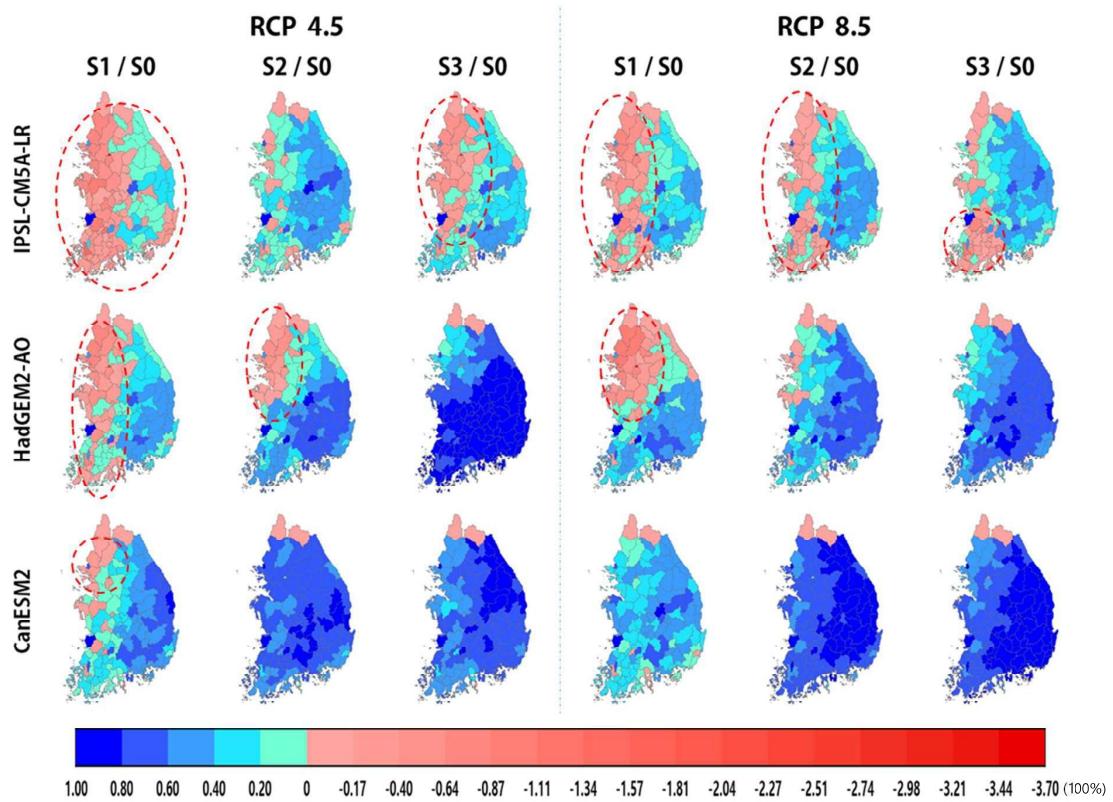
Assessment of Drought Risk

$$\bullet \text{ DRI} = \text{DHI} \times \text{DVI}$$



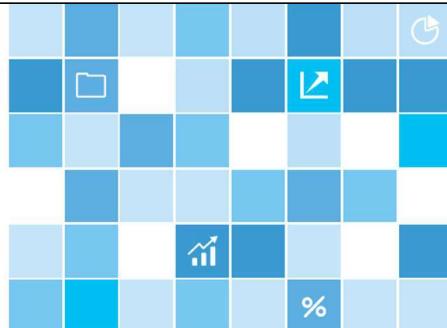
Change of Future Drought Risk

Assessment of Drought Risk



Conclusions

- The future drought risk of the Korean peninsula varies according to climate change scenarios.
- According to the projected drought risk, the risk of drought in the Han River and Yeongsan River basins increased compared to the past.
- According to future period analysis, the drought risk in S1 (near future) period is increased most severely.
- The results the future drought risk projection are expected to be used as basic data for drought management and preparedness.



Thank You

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