

Precipitation and its Impacts for Global Scale Rice Production

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ABSTRACT: Rice plays a major role in the global supply and demand for sustainable food production. Rice production has consistently outpaced population growth. Thus, rice plays a crucial role in supporting continued global population growth. The progress of technology, irrigation and rice varieties made it possible for farmers to produce more rice with tolerance for climate change. In 1992, because of abnormal climatic conditions, the yield of rice in Japan fell to less than 90% that of annual average production, where the technology for agriculture is thought to be well developed. At that time, Japan had to import rice. Thus the impact of climate change cannot be ignored. When discussing yield of rice, the impact of climatic conditions should be discussed. In this study, we focused on the relationships between yield of rice and precipitation datasets. Monthly precipitation datasets are provided from Global Precipitation Climatology Centre in Germany (hereafter we called “GPCC”). The resolution of GPCC is 0.5 degree and from west to east, numbers of columns are 720 and from north to south, numbers of rows are 360 and covers from January 1900 to December 2007. Datasets from January 1981 to December 2003 are used to calculate the country based relationships in this study. The Cropping Calendar dataset includes spatial information and provides five patterns such as Planting, Vegetative, Heading, Filling and Harvesting. The resolution of the cropping calendar is almost the same that of GPCC. According to the cropping calendar, the lifecycle of rice which includes five patterns in each country is obtained. Single regression analysis is used to calculate the relationships among time series of monthly precipitation datasets and yield of rice. In another words, yield of rice is a function of GPCC. Due to data limitations and variety of resolutions of datasets, we could only use country based datasets to obtain the equations. The country based rice production per unit area in each country is calculated by dividing the rice production figures provided by the Food and Agriculture Organization (FAO) by the rice cultivation area.

KEYWORDS: Yield, Cropping Calendar, Precipitation

1. INTRODUCTION

More than 50% of world population lives in Asia and relies on rice production. Rice plays an important role. In 1962, Asian farmers produced 92% of world rice production. Rice producing system is steady. According to Food Balance Sheet (year 2002), use of rice as animal feed is less than 1.8% of total production (IRRI 2008). World rice production in 2007 was approximately 645 million tones, with Asian farmers producing 90% and China and India producing 50% of the global rice supply (Kawashima 2008). The top 5 rice producing countries are China, India, Indonesia, Bangladesh, Vietnam and Thailand. In Asian countries, governments buy rice from farmers or from international market and they provide rice to citizens with the price lower than that of government payment. This policy plays a very important role to stabilize society. The amount of rice on international market is not so large, This sometimes causes fluctuations of price. In 2009, Philippine was attacked by several typhoons and reduced the production of rice. In 2009, Philippine has decided to import rice from Vietnam around 2.05 million tons of rice. India also could produce 20% less production of rice than previous year, because of shortage of water. In this paper, we will focus on the relationships between yield of rice and precipitation. As for the precipitation, we concern the cropping calendar. If planting of rice begins in April and harvesting starts in September, total amount of precipitation from April to August is calculated and use to calculate the relationships with yield of rice country basis. The precipitation datasets are provided in gridded level, so we apply country based obtained equation for gridded precipitation datasets and as a result, spatial distribution of yield of rice could be obtained. In this study, the relationships between precipitation and yield in Japan is proposed.

2. Materials

2.1 Administrative Boundary Data

ESRI company provides administrative boundary datasets. For example, Japan is composed by 6 areas such as Hokkaido, Tohoku, Kanto, Chubu, Hokuriku, Kinki, Chugoku, Sikoku and Kyushu.

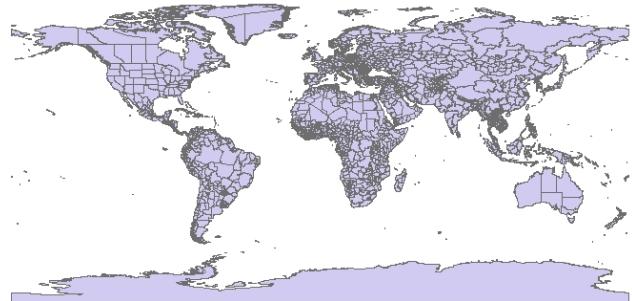


Figure 1 Administrative Boundary

2.2 Yield per unit area Data

We calculated the rice production per unit area in each country, by dividing the rice production figures provided by the Food and Agriculture Organization (FAO) by the rice cultivation area. We then applied the yield per unit area for each country uniformly to each of the regions in that country.

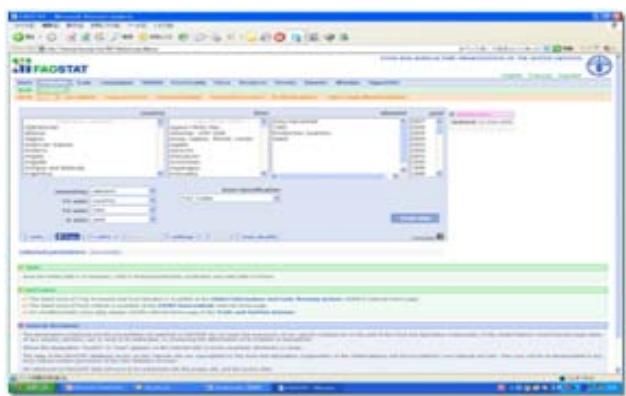


Figure 2 FAOSTAT web-site

2.3 Precipitation Data

We used precipitation datasets shown in figure 3. Monthly precipitation datasets are provided from Global Precipitation Climatology Centre in Germany (hereafter we called “GPCC”). The resolution of GPCC is 0.5 degree and from west to east, numbers

of columns are 720 and from north to south, numbers of rows are 360 and covers from January 1900 to December 2007. Each dataset consists of 3 columns such as column 1 : precipitation totals in mm/month, column 2 : deviation from normals v2008 in mm/month and column 3 : number of gauges per grid. We used precipitation totals in mm month.

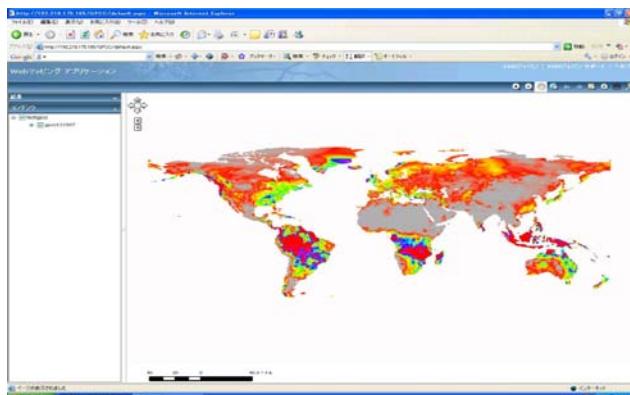


Figure 3 Global Precipitation Datasets

2.4 Vegetation Data

We used Vegetation Data sets developed by global mapping project. Figure 4 shows the overall of vegetation map. The resolution is 1km and includes 20 legends shown in Table 1.

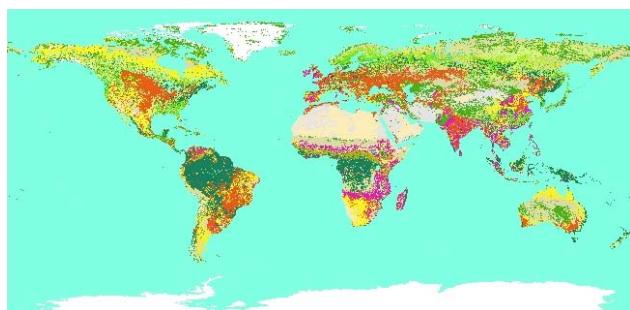


Figure 4 Global Land Cover (GLCNMO) Data

Table 1 Legend of Land Use and Land Cover

| code | Class name | code | Class name | code | Class name | code |
|------|-----------------------------|------|-----------------------------------|------|------------------------------------|------|
| 1 | Broadleaf Evergreen Forest | 6 | Tree Open | 11 | Cropland | 16 |
| 2 | Broadleaf Deciduous Forest | 7 | Shrub | 12 | Paddy field | 17 |
| 3 | Needleleaf Evergreen Forest | 8 | Herbaceous | 13 | Cropland / Other Vegetation Mosaic | 18 |
| 4 | Needleleaf Deciduous Forest | 9 | Herbaceous with Sparse Tree/Shrub | 14 | Mangrove | 19 |
| 5 | Mixed Forest | 10 | Sparse vegetation | 15 | Wetland | 20 |

In the legends, rice field is included and this will help us to understand the distribution of paddy field. Paddy field can be observed mainly in Asian countries. Cropland (Legend=11) is shown in Figure 5. Paddy Field(Legend=12) is shown Figure 6 and Cropland/Other vegetation Mosaic(Legend=13) is shown in Figure 7.

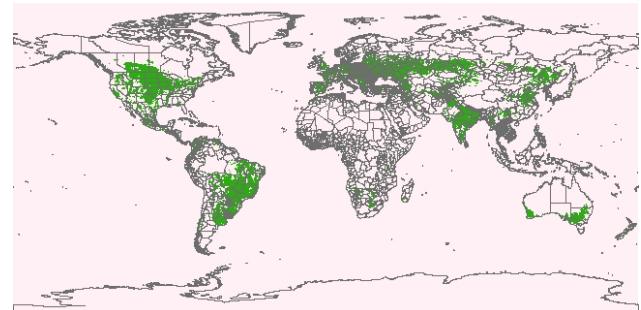


Figure 5 Cropland

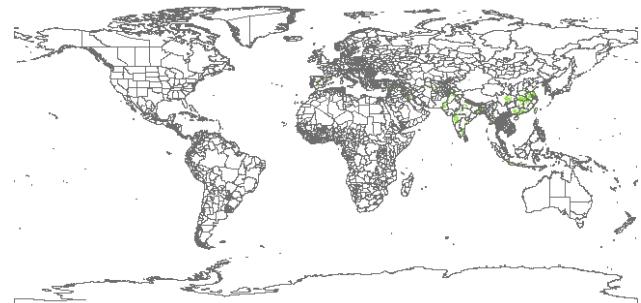


Figure 6 Paddy Field

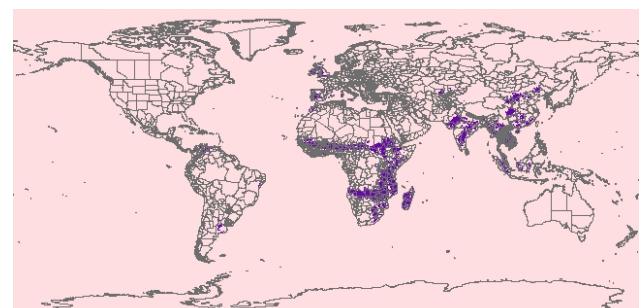


Figure 7 Cropland/Other vegetation Mosaic

2.5 Cropping Calendar

We used cropping calendar datasets to calculate the relationships between yield and precipitation. Wisconsin University provides cropping calendar data set including gridded maps of planting dates, harvesting dates and related variables.

3. Data Analysis

3.1 Cropping Calendar of Rice

Crops process four patterns such as Planting, Vigitative, Heading and Filling. Table 2 shows the list of cropping calendar of rice in each country. The total number of countries are 182.

Table 2 Cropping Calendar of Rice

| | PlantStart | PlantRange | HarvestStart | HarvestEnd |
|-------------------|------------|------------|--------------|------------|
| Falkland Is. | 284 | 71 | 71 | 131 |
| French Guiana | 314 | 172 | 121 | 293 |
| Guyana | 101 | 42 | 253 | 324 |
| South Georgia & t | 274 | 80 | 70 | 151 |
| Suriname | 71 | 163 | 253 | 294 |
| Trinidad & Tobag | 152 | 72 | 294 | 344 |
| Venezuela | 99 | 102 | 222 | 323 |
| Samoa | 284 | 134 | 111 | 202 |
| Argentina | 335 | 90 | 121 | 212 |
| Bolivia | 242 | 108 | 59 | 175 |
| Brazil | 305 | 30 | 70 | 141 |
| Chile | 109 | 67 | 103 | 207 |
| Ecuador | 284 | 71 | 71 | 132 |
| Paraguay | 281 | 133 | 112 | 203 |
| Peru | 279 | 72 | 71 | 142 |
| Uruguay | 341 | 102 | 131 | 233 |
| Canada | 274 | 80 | 69 | 151 |
| Guatemala | 113 | 46 | 256 | 305 |
| Mexico | 91 | 91 | 244 | 297 |
| Dominica | 101 | 102 | 253 | 20 |
| Martinique | 152 | 72 | 294 | 344 |
| Dominican Repub | 335 | 121 | 121 | 243 |
| Haiti | 79 | 94 | 147 | 268 |
| Jamaica | 105 | 134 | 177 | 332 |
| The Bahamas | 60 | 134 | 193 | 365 |
| Belize | 91 | 91 | 244 | 304 |
| Colombia | 40 | 42 | 223 | 293 |
| Costa Rica | 91 | 61 | 213 | 273 |
| Cuba | 60 | 134 | 193 | 365 |
| El Salvador | 121 | 61 | 305 | 31 |
| Honduras | 166 | 61 | 254 | 199 |
| Nicaragua | 151 | 31 | 273 | 333 |
| Panama | 102 | 101 | 222 | 293 |
| Puerto Rico | 32 | 89 | 152 | 273 |
| Faroe Is. | 95 | 54 | 269 | 310 |
| Greenland | 92 | 55 | 267 | 309 |
| Iceland | 95 | 54 | 269 | 310 |
| Ireland | 80 | 56 | 263 | 308 |
| Isle of Man | 95 | 54 | 269 | 310 |
| United Kingdom | 152 | 61 | 274 | 334 |
| Cape Verde | 93 | 121 | 242 | 363 |
| Cote d'Ivoire | 104 | 74 | 257 | 330 |
| Ghana | 91 | 122 | 244 | 365 |
| Liberia | 70 | 71 | 228 | 281 |
| Morocco | 24 | 65 | 241 | 301 |
| Portugal | 24 | 65 | 241 | 301 |
| Spain | 92 | 58 | 180 | 253 |
| Western Sahara | 330 | 32 | 65 | 122 |
| Burkina Faso | 121 | 123 | 274 | 31 |
| Guinea | 149 | 95 | 274 | 31 |
| Guinea-Bissau | 153 | 61 | 317 | 33 |
| Mali | 152 | 46 | 274 | 332 |

Table 2 Cropping Calendar of Rice (Continue)

| | PlantStart | PlantRange | HarvestStart | HarvestEnd |
|--------------------|------------|------------|--------------|------------|
| Mauritania | 152 | 91 | 305 | 35 |
| Senegal | 91 | 122 | 244 | 365 |
| Sierra Leone | 152 | 71 | 284 | 233 |
| The Gambia | 182 | 62 | 305 | 334 |
| Djibouti | 199 | 62 | 281 | 310 |
| Eritrea | 172 | 60 | 299 | 328 |
| Ethiopia | 104 | 52 | 235 | 287 |
| Mongolia | 157 | 80 | 299 | 338 |
| Sudan | 212 | 62 | 267 | 297 |
| Uganda | 106 | 46 | 258 | 287 |
| Iraq | 134 | 44 | 234 | 282 |
| Israel | 101 | 41 | 253 | 304 |
| Jordan | 132 | 23 | 252 | 274 |
| Kazakhstan | 95 | 54 | 269 | 310 |
| Norway | 110 | 40 | 253 | 291 |
| Russia | 95 | 54 | 269 | 310 |
| Sweden | 101 | 41 | 253 | 304 |
| West Bank | 72 | 102 | 254 | 294 |
| Algeria | 121 | 92 | 304 | 365 |
| Cameroon | 121 | 123 | 319 | 365 |
| Central African Re | 106 | 73 | 231 | 266 |
| Libya | 72 | 102 | 254 | 294 |
| Tunisia | 93 | 59 | 217 | 275 |
| Benin | 152 | 61 | 213 | 334 |
| Chad | 263 | 71 | 87 | 159 |
| Equatorial Guinea | 152 | 61 | 213 | 334 |
| Niger | 133 | 61 | 276 | 346 |
| Nigeria | 284 | 72 | 71 | 141 |
| Togo | 121 | 31 | 289 | 319 |
| Albania | 111 | 41 | 213 | 243 |
| Bosnia & Herzeg | 111 | 41 | 213 | 243 |
| Croatia | 103 | 48 | 241 | 277 |
| Italy | 95 | 54 | 269 | 310 |
| Macedonia | 111 | 41 | 213 | 243 |
| Serbia & Montene | 111 | 41 | 213 | 243 |
| Bulgaria | 108 | 50 | 225 | 258 |
| Cyprus | 101 | 41 | 253 | 304 |
| Egypt | 113 | 82 | 282 | 322 |
| Georgia | 101 | 40 | 252 | 302 |
| Greece | 110 | 44 | 216 | 247 |
| Lebanon | 101 | 41 | 253 | 304 |
| Syria | 101 | 42 | 253 | 304 |
| Turkey | 101 | 72 | 254 | 293 |
| Austria | 95 | 54 | 269 | 310 |
| Czech Republic | 95 | 54 | 269 | 310 |
| Denmark | 95 | 54 | 269 | 310 |
| Hungary | 109 | 43 | 221 | 252 |
| Poland | 101 | 49 | 249 | 286 |
| Slovakia | 107 | 45 | 228 | 261 |
| Slovenia | 95 | 54 | 269 | 310 |
| Svalbard | 95 | 54 | 269 | 310 |
| Belgium | 95 | 54 | 269 | 310 |
| France | 85 | 55 | 265 | 309 |
| Germany | 95 | 54 | 269 | 310 |
| Luxembourg | 95 | 54 | 269 | 310 |
| Netherlands | 95 | 54 | 269 | 310 |
| Switzerland | 95 | 54 | 269 | 310 |
| United States | 110 | 48 | 249 | 302 |
| Belarus | 107 | 53 | 228 | 262 |
| Estonia | 101 | 49 | 248 | 285 |
| Finland | 95 | 54 | 269 | 310 |
| Latvia | 105 | 46 | 235 | 270 |
| Lithuania | 106 | 45 | 232 | 265 |
| Moldova | 102 | 70 | 251 | 290 |
| Romania | 109 | 46 | 220 | 251 |
| Ukraine | 103 | 65 | 244 | 281 |
| India | 157 | 44 | 285 | 322 |
| Oman | 139 | 38 | 252 | 290 |

Table 2 Cropping Calendar of Rice (Continue)

| | PlantStart | PlantRange | HarvestStart | HarvestEnd |
|-------------------|------------|------------|--------------|------------|
| Somalia | 127 | 62 | 218 | 279 |
| Sri Lanka | 244 | 111 | 10 | 111 |
| Turkmenistan | 104 | 16 | 225 | 242 |
| Uzbekistan | 116 | 28 | 238 | 271 |
| Yemen | 164 | 52 | 289 | 325 |
| Armenia | 101 | 34 | 246 | 287 |
| Azerbaijan | 101 | 14 | 224 | 237 |
| Iran | 101 | 12 | 222 | 232 |
| Kuwait | 106 | 46 | 258 | 288 |
| Qatar | 134 | 35 | 239 | 273 |
| Saudi Arabia | 182 | 12 | 324 | 334 |
| United Arab Emir. | 136 | 34 | 243 | 276 |
| Afghanistan | 137 | 62 | 262 | 343 |
| Kyrgyzstan | 169 | 35 | 288 | 322 |
| Nepal | 142 | 82 | 294 | 353 |
| Pakistan | 139 | 66 | 264 | 352 |
| Tajikistan | 156 | 48 | 278 | 335 |
| Bangladesh | 151 | 72 | 303 | 360 |
| Bhutan | 137 | 82 | 288 | 347 |
| Brunei | 161 | 103 | 344 | 109 |
| China | 87 | 64 | 209 | 270 |
| Japan | 132 | 71 | 258 | 324 |
| North Korea | 101 | 31 | 254 | 293 |
| Philippines | 91 | 79 | 254 | 349 |
| South Korea | 121 | 61 | 244 | 304 |
| Cambodia | 152 | 138 | 335 | 59 |
| Laos | 137 | 65 | 275 | 346 |
| Malaysia | 201 | 68 | 118 | 111 |
| Myanmar | 121 | 65 | 277 | 352 |
| Thailand | 128 | 116 | 279 | 38 |
| Vietnam | 160 | 93 | 286 | 190 |
| Botswana | 253 | 102 | 100 | 171 |
| Burundi | 335 | 62 | 121 | 151 |
| French Southern & | 253 | 102 | 100 | 171 |
| Heard I. & McDo | 91 | 61 | 274 | 334 |
| Kenya | 335 | 62 | 121 | 151 |
| Rwanda | 141 | 58 | 158 | 222 |
| Tanzania | 288 | 75 | 101 | 176 |
| Zambia | 274 | 92 | 91 | 181 |
| Zimbabwe | 251 | 62 | 89 | 161 |
| Antarctica | 305 | 77 | 91 | 181 |
| Lesotho | 253 | 102 | 100 | 171 |
| Malawi | 314 | 52 | 121 | 192 |
| Mozambique | 300 | 59 | 97 | 181 |
| South Africa | 253 | 102 | 100 | 171 |
| Swaziland | 284 | 41 | 10 | 140 |
| Angola | 284 | 72 | 71 | 141 |
| Congo | 257 | 81 | 155 | 205 |
| Congo, DRC | 275 | 62 | 193 | 222 |
| Fiji | 335 | 90 | 121 | 212 |
| Gabon | 286 | 71 | 87 | 151 |
| Namibia | 254 | 100 | 99 | 170 |
| New Zealand | 274 | 31 | 60 | 151 |
| Madagascar | 305 | 77 | 91 | 181 |
| Reunion | 305 | 77 | 91 | 181 |
| Indonesia | 305 | 77 | 91 | 181 |
| Timor Leste | 252 | 64 | 74 | 138 |
| Australia | 335 | 90 | 121 | 212 |
| New Caledonia | 294 | 40 | 90 | 161 |
| Papua New Guine | 335 | 90 | 121 | 212 |
| Solomon Is. | 328 | 84 | 109 | 194 |
| Vanuatu | 335 | 90 | 121 | 212 |

3.2 Integration of Precipitation and Yield

Based on cropping calendar, the precipitin data is

aggregated the periods between Planting to Heading and Filling. According to cropping calendar shown in Table 2, in Japan, Planting(April), Vegetative (May, June) and Heading and Filling (July and August, September). the precipitation from April to September is aggregated. When those data is aggregated, total days in month is also important, the number of cropping days are also calculated and applying for calculating total population. Single regression analysis is applied for calculating relationships between aggregated monthly precipitation and yield. Table 3 shows a result of relationships between precipitation and yield by country basis. Elasticity, Constant, Co-relation coefficient and significance are listed in Table 3. “0” means the countries where rice are not harvested.

Table 3 Relationships between Precipitation and Yield

| | | Aggregate d Month | Time Length | Regression Coefficient | Constant | Multiple Correlatio n | Significance | P Value |
|---------------------|---------|-------------------|-------------|------------------------|----------------|-----------------------|--------------|---------|
| Falkland Is. | | | | | | | | |
| French | Oct_Apr | 1983/200 | -1.340931 | 36135.842 | 0.0690296 [] | | 0.76622 | |
| Guiana | Mar_Aug | 1981/200 | 8.3284489 | 24584.458 | 0.396056 [] | | 0.06805 | |
| South | | | | | | | | |
| Georgia & the South | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Sandwich | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Suriname | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Trinidad & Tobago | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Venezuela | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Samoa | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Argentina | Nov_Apr | 1982/200 | 33.127229 | 30502.764 | 0.5019178 [*] | | 0.01730 | |
| Bolivia | Aug_Feb | 1982/200 | -11.64159 | 29290.244 | 0.3148102 [] | | 0.15358 | |
| Brazil | Oct_Feb | 1982/200 | -19.32364 | 40479.7 | 0.588109 (**) | | 0.00399 | |
| Chile | Mar_Jul | 1981/200 | 11.001526 | 36968.853 | 0.3838405 [] | | 0.07058 | |
| Ecuador | Sep_Feb | 1982/200 | -3.687809 | 35670.864 | 0.2028642 [] | | 0.36523 | |
| Paraguay | Sep_Mar | 1982/200 | 18.174371 | 13439.048 | 0.3653367 [] | | 0.09454 | |
| Peru | Sep_Feb | 1982/200 | 4.8417756 | 50512.961 | 0.0660927 [] | | 0.77011 | |
| Uruguay | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Canada | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Guatemala | Apr_Jul | 1981/200 | -0.02044 | 27389.657 | 0.000976 [] | | 0.99647 | |
| Mexico | Mar_Jul | 1983/200 | 12.574093 | 36756.88 | 0.1769978 [] | | 0.41913 | |
| Dominica | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Martinique | | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Dominican Republic | Nov_Mar | 1982/200 | 7.5241825 | 43360.734 | 0.2556817 [] | | 0.25078 | |
| Haiti | Feb_Apr | 1981/200 | 5.8810841 | 20214.63 | 0.3405007 [] | | 0.11187 | |
| Jamaica | Mar_May | 1981/200 | 8.9389216 | 20040.031 | 0.1331819 [] | | 0.54464 | |
| The | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Belize | Mar_Aug | 1981/200 | 9.5102352 | 12333.189 | 0.3658538 [] | | 0.08601 | |
| Colombia | Jan_Jul | 1981/200 | -5.738965 | 53624.3 | 0.3936487 [] | | 0.06311 | |
| Costa Rica | Mar_Jun | 1981/200 | -2.252931 | 38717.048 | 0.0747089 [] | | 0.73477 | |
| Cuba | Feb_Jun | 1981/200 | -10.84703 | 35101.146 | 0.2113711 [] | | 0.33296 | |
| El Salvador | Apr_Sep | 1981/200 | 4.1644855 | 40505.488 | 0.0817137 [] | | 0.71090 | |
| Honduras | Feb_Aug | 1981/200 | -2.716447 | 28080.338 | 0.1088199 [] | | 0.62113 | |
| Nicaragua | May_Aug | 1981/200 | 4.3714371 | 28897.15 | 0.2366966 [] | | 0.27686 | |
| Panama | Mar_Jul | 1981/200 | -2.118122 | 23431.75 | 0.3231648 [] | | 0.13255 | |
| Puerto Rico | Jan_Apr | 1981/198 | -164.6421 | 116072.99 | 0.3813364 [] | | 0.31124 | |
| Faroe Is. | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Greenland | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |
| Iceland | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | | 0.76944 | |

Table 3 Relationships between Precipitation and Yield (Continue)

| | Aggregate d Month | Time Length | Regression Coefficient | Constant | Multiple Correlatio n | Significance | P Value |
|--------------------------|-------------------|-------------|------------------------|-----------|-----------------------|--------------|---------|
| Ireland | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Isle of Man | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| United Kingdom | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Cape | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Cote d'Ivoire | Mar_Aug | 1981/200 | -5.133293 | 17296.509 | 0.3783131 [] | 0.07508 | |
| Ghana | Mar_Jul | 1981/200 | -8.976133 | 21181.881 | 0.2347823 [] | 0.28088 | |
| Liberia | Feb_Jul | 1981/200 | 0.7495651 | 10838.486 | 0.1427386 [] | 0.51588 | |
| Morocco | Feb_Jul | 1981/200 | -7.556966 | 45127.387 | 0.0330235 [] | 0.88109 | |
| Portugal | Feb_Jul | 1981/200 | -8.106182 | 53739.363 | 0.0842094 [] | 0.70245 | |
| Spain | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Western Sahara | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Burkina Faso | Apr_Aug | 1981/200 | 6.9624374 | 15666.454 | 0.2466625 [] | 0.25653 | |
| Guinea | May_Aug | 1981/200 | -0.096541 | 17219.15 | 0.3984742 [] | 0.05966 | |
| Guinea-Bissau | May_Sep | 1981/200 | 6.1868403 | 9945.7908 | 0.2843926 [] | 0.18845 | |
| Mali | May_Aug | 1981/200 | 3.1689437 | 14895.887 | 0.244078 [] | 0.26171 | |
| Mauritania | May_Sep | 1981/200 | 7.2752485 | 40207.984 | 0.1429917 [] | 0.51512 | |
| Senegal | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Sierra Leone | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| The Gambia | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Djibouti | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Eritrea | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Ethiopia | Mar_Jul | 1993/200 | -0.196185 | 18497.032 | 0.0721607 [] | 0.83301 | |
| Mongolia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Sudan | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Uganda | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Iraq | Apr_Jul | 1981/200 | -8.432106 | 23720.064 | 0.0479917 [] | 0.82786 | |
| Israel | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Jordan | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Kazakhstan | Mar_Aug | 1992/200 | 7.247922 | 29140.356 | 0.1247713 [] | 0.69923 | |
| Norway | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Russia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Sweden | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| West Bank | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Algeria | Apr_Sep | 1981/200 | 65.048423 | 21211.457 | 0.244941 [] | 0.25997 | |
| Cameroon | Apr_Sep | 1981/200 | 12.907121 | 21304.628 | 0.3888578 [] | 0.06668 | |
| Central African Republic | Mar_Jul | 1981/200 | -2.962965 | 16616.28 | 0.086506 [] | 0.69471 | |
| Libya | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Tunisia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Benin | May_Jul | 1981/200 | -7.164988 | 18320.255 | 0.2135482 [] | 0.32789 | |
| Chad | Sep_Mar | 1982/200 | -0.408269 | 13442.724 | 0.0047948 [] | 0.98310 | |
| Equatorial Guinea | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Niger | Apr_Aug | 1981/200 | 9.6282951 | 26708.249 | 0.1412216 [] | 0.52039 | |
| Nigeria | Oct_Feb | 1982/200 | -21.27195 | 20967.829 | 0.5978675 [**] | 0.00330 | |
| Togo | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Albania | Apr_Jun | 1981/199 | -8.344909 | 35047.531 | 0.0844904 [] | 0.78375 | |
| Bosnia & Herzegovina | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Croatia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Italy | Mar_Aug | 1981/200 | -8.514121 | 61690.473 | 0.1470604 [] | 0.50311 | |
| Macedonia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Serbia & Montenegro | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Bulgaria | Mar_Jul | 1981/200 | 7.5424164 | 36047.719 | 0.1107832 [] | 0.61481 | |
| Cyprus | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Egypt | Apr_Aug | 1981/200 | 73.61479 | 73133.709 | 0.1737739 [] | 0.42779 | |
| Georgia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Greece | Apr_Jun | 1981/200 | -16.87773 | 68332.123 | 0.0600876 [] | 0.78536 | |
| Lebanon | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Syria | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Turkey | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Austria | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Czech Republic | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Denmark | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Hungary | Apr_Jun | 1983/200 | 6.1350444 | 31244.432 | 0.0679533 [] | 0.75803 | |
| Poland | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Slovakia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Slovenia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Svalbard | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Belgium | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| France | Mar_Aug | 1981/200 | -18.95181 | 60126.278 | 0.2085839 [] | 0.33952 | |
| Germany | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Luxembourg | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Netherlands | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Switzerland | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| United | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |

Table 3 Relationships between Precipitation and Yield (Continue)

| | Aggregate d Month | Time Length | Regression Coefficient | Constant | Multiple Correlatio n | Significance | P Value |
|-----------------------------------|-------------------|-------------|------------------------|-----------|-----------------------|--------------|---------|
| Belarus | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Estonia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Finland | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Latvia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Lithuania | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Moldova | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Romania | Apr_Jun | 1981/199 | -33.77344 | 33732.642 | 0.1517754 [] | 0.57471 | |
| Ukraine | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| India | May_Sep | 1981/200 | 0.4582602 | 25456.483 | 0.0224847 [] | 0.91889 | |
| Oman | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Somalia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Sri Lanka | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Turkmenistan | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Uzbekistan | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Yemen | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Armenia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Azerbaijan | Mar_Jul | 1992/200 | -2.949947 | 38757.381 | 0.0199616 [] | 0.92797 | |
| Iran | Mar_Jul | 1981/200 | 2.2792053 | 25760.534 | 0.2284402 [] | 0.29445 | |
| Kuwait | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Qatar | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Saudi | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| United Arab Emirates | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Afghanistan | Apr_Aug | 1981/200 | -0.835507 | 21455.168 | 0.0089873 [] | 0.96754 | |
| Kyrgyzstan | Aug_Sep | 1992/200 | -41.50226 | 27289.984 | 0.3035121 [] | 0.33754 | |
| Nepal | Apr_Sep | 1981/200 | 1.6429748 | 20390.925 | 0.1179787 [] | 0.59187 | |
| Pakistan | Apr_Aug | 1981/200 | 2.2792053 | 25760.534 | 0.2284402 [] | 0.29445 | |
| Tajikistan | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Bangladesh | May_Sep | 1981/200 | -5.396816 | 35023.025 | 0.4800564 [*] | 0.02043 | |
| Bhutan | May_Sep | 1981/200 | -2.562535 | 20770.804 | 0.2513865 [] | 0.24724 | |
| Brunei | May_Nov | 1981/200 | 7.456899 | 2666.5706 | 0.5442355 [**] | 0.00726 | |
| China | Mar_Jun | 1981/200 | 12.273833 | 54019.985 | 0.3128649 [] | 0.14607 | |
| Japan | Apr_Aug | 1981/200 | -9.493868 | 67686.183 | 0.2999194 [] | 0.16441 | |
| North Korea | Mar_Sep | 1981/200 | -12.63678 | 51055.649 | 0.2046807 [] | 0.34884 | |
| Philippines | Mar_Aug | 1981/200 | 6.6437107 | 21589.215 | 0.5872908 [**] | 0.00322 | |
| South Korea | Apr_Jul | 1981/200 | 0.6801633 | 62908.773 | 0.0301775 [] | 0.89128 | |
| Cambodia | May_Oct | 1981/200 | 5.4412076 | 6919.4934 | 0.5341 [**] | 0.00866 | |
| Laos | Apr_Aug | 1981/200 | 10.278694 | 11402.738 | 0.2836422 [] | 0.18966 | |
| Malaysia | Jun_Mar | 1982/200 | -0.217223 | 29105.552 | 0.0272762 [] | 0.90657 | |
| Myanmar | Apr_Aug | 1981/200 | -1.546186 | 33234.846 | 0.38668 [] | 0.06835 | |
| Thailand | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Vietnam | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Botswana | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Burundi | Nov_Mar | 1982/200 | 6.4092029 | 26744.632 | 0.1702949 [] | 0.44864 | |
| French Southern & Antarctic Lands | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Heard I. & McDonald Islands | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Kenya | Nov_Mar | 1982/200 | 5.6579339 | 35777.918 | 0.1764092 [] | 0.43226 | |
| Rwanda | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Tanzania | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Zambia | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Zimbabwe | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Antarctica | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Lesotho | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Malawi | Oct_Mar | 1982/200 | 2.1305377 | 14416.499 | 0.1678069 [] | 0.45539 | |
| Mozambique | Oct_Feb | 1981/200 | 0.3389122 | 8132.4078 | 0.0347736 [] | 0.87790 | |
| South Africa | Oct_Apr | 1981/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Swaziland | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Angola | Oct_Jan | 1982/200 | 12.798295 | 4831.1057 | 0.2429933 [] | 0.27587 | |
| Congo | Sep_Apr | 1982/200 | 2.5346575 | 5596.6945 | 0.1568594 [] | 0.48573 | |
| Congo, Dem. | Sep_May | 1982/200 | 0.0262321 | 7741.3265 | 0.0188634 [] | 0.93360 | |
| Fiji | Nov_Mar | 1982/200 | 6.2834638 | 19219.851 | 0.3336679 [] | 0.12912 | |
| Gabon | Oct_Feb | 1982/200 | 1.2143925 | 19454.67 | 0.0907344 [] | 0.68800 | |
| Namibia | Oct_Apr | 1983/200 | 0 | 0 | 0 | 0 | 0.00000 |
| New Zealand | Oct_Apr | 1983/200 | -1.282703 | 36481.453 | 0.069967 [] | 0.76944 | |
| Madagascar | Oct_Feb | 1982/200 | 2.1889983 | 18406.856 | 0.2212633 [] | 0.32238 | |
| Reunion | 0 | 0 | 0 | 0 | 0 | 0 | 0.00000 |
| Indonesia | Oct_Feb | 1982/200 | -1.806324 | 43962.203 | 0.1052998 [] | 0.66 | |

4. Results and Discussion

Precipitation datasets with spatial information are aggregated by country and average precipitation in each country is obtained. Monthly precipitation is aggregated based on cropping calendar. The relationships between precipitation and yield of rice are calculated for rice producing countries. Extracting from results shown in Table 3, Table 4 shows the results of those countries with significance.

Table 4 Relationships between Precipitation and Yield with significance

| | Aggregate d Month | Time Length | Regression Coefficient | Constan t | Multiple Correlation Coefficient | Significance |
|-------------|-------------------|-------------|------------------------|-----------|----------------------------------|--------------|
| Argentina | Nov_Apr | 1982/200: | 33.127229 | 30503 | 0.50192 | [*] |
| Brazil | Oct_Feb | 1982/200: | -19.32364 | 40480 | 0.58811 | [**] |
| Nigeria | Oct_Feb | 1982/200: | -21.27195 | 20968 | 0.59787 | [**] |
| Bangladesh | May_Sep | 1981/200: | -5.396816 | 35023 | 0.48006 | [*] |
| Brunei | May_Nov | 1981/200: | 7.456899 | 2667 | 0.54424 | [**] |
| Philippines | Mar_Aug | 1981/200: | 6.6437107 | 21589 | 0.58729 | [**] |
| Cambodia | May_Oct | 1981/200: | 5.4412076 | 6919 | 0.53410 | [**] |

The rice yield in Argentina, Brazil, Nigeria, Bangladesh, Brunei, Philippines and Cambodia could be influenced by precipitation. In another word, irrigation system or reserving water system are not well equipped, or we might say those countries might attacked by typhoons. Very simple way but we will be able to build a system which can forecast rice yield. Putting precipitation dataset on this formula and we might forecast yield of rice. When discussing yield of rice, the impact of climatic conditions should be discussed. Establishing forecasting system of rice production is an urgent matter and those information should be open to the public in an easier manner. Those countries without significance, we have to progress our study on other valuables. There are also another factor such as NDVI (Normalized Vegitation Index), but we will discuss about this in another paper.

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