

**STATISTICAL ASSESSMENT OF IMPACT OF CLIMATE CHANGE  
ON RICE PRODUCTION IN ODISHA (DURING THE TIME PERIOD  
OF 2000 -2018)**

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SUBMITTED BY

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## **CERTIFICATE**

This is to certify that the dissertation entitled “STATISTICAL ASSESSMENT OF IMPACT OF CLIMATE CHANGE ON RICE PRODUCTION IN ODISHA (DURING THE TIME PERIOD OF 2000 -2018)” submitted by **Mr. Shubham kumar** (Enrollment No.- **20/07/DSTAT/21**) in partial fulfillment of requirements for the award of Master of Science in Statistics is a bona fide work carried out by him by my supervision. I consider that the dissertation has reached the standards and fulfilling the requirements of the rules and regulations relating to the nature of the degree.

The dissertation has not been submitted previously in part or in full to this or another University or Institution for the award of any degree or diploma.

**( Signature of Supervisor )**

**(Head of the Department)**



## **DECLARATION**

I certify that the work contained in this dissertation is original and has been done myself under the supervision of my mentor Dr. Mahesh Kumar Panda, Assistant Professor (Head I/C), Department of Statistics, Central University of Odisha. This work is submitted to Department of Statistics, Central University of Odisha as a project report, as per the requirement of partial fulfilment for the award of degree Master of Science in Statistics. This work or similar title, has not been previously submitted for any academic purpose.

Date: 10/May/2022

Place: Koraput

(Signature of the Candidate)



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# **CHAPTER I**

## **INTRODUCTION**

# CHAPTER I

## INTRODUCTION

### 1.1 Climate change

Climate change is a controversial topic in today's day and age. Some are skeptical as to whether it is actually happening and some know for a fact that climate change is real and is really a threat. Even if one doesn't believe that the globe is warming up, one should at least be concerned about the carbon footprint that we are leaving behind us and how all our waste and is hurting the environment. But the issue has been so politicized that if someone on the Left says he believes in climate change and wants to help prevent it, someone on the Right will fight against him because of the political divide and the unwillingness of to get along. That is unfortunate for this simple reason: Climate change is a very serious issue in our today. It is a rapidly worsening issue and there aren't enough people trying to prevent this issue from getting worse and becoming irreversible. In the twenty-first century, rapid change in global climate is a serious concern worldwide. According to the special report of IPPC (Intergovernmental Panel on Climate Change), global temperature has raised by 1.5 °C during the last century which is the most remarkable increase in global temperature over the last 1000 years. Climate change is also a change in Earth's climate. This could be a change in Earth's usual temperature. Or it could be a change in where rain and snow usually fall on Earth. Weather can change in just a few hours. Climate takes hundreds or even millions of years to change. Earth's climate is always changing. There have been times when Earth's climate has been warmer than it is now. There have been times when it has been cooler. These times can last thousands or millions of years. People who study Earth see that Earth's climate is getting warmer. Earth's temperature has gone up about one degree Fahrenheit in the last 100 years. This may not seem like much. But small changes in Earth's temperature can have big effects. Some effects are already happening. Warming of Earth's climate has caused some snow and ice to melt. The warming also has caused oceans to rise. And it has changed the timing of when certain plants grow.

As our climate continues to heat up and the impacts of that warming grow more frequent and severe, farmers and farm communities around the world will be increasingly challenged. And Indian farmers won't be spared the damage that climate change is already beginning to inflict. In fact, the industrial model that dominates our nation's agriculture—a model that neglects soils,

reduces diversity, and relies too heavily on fertilizers and pesticides—makes Indian farms susceptible to climate impacts in several ways.

Climate change has a strong association with agriculture production and 20% greenhouse gases (GHGs) emission caused by agriculture. Food security has been susceptible by different factors, and it is expected to face new challenges in near future. Researchers of modern era and policymakers are evaluating the impact of climate change on agricultural production in order to ensure food security. Many factors are responsible for climate change and posing a negative impact on crops especially rice such as temperature variability, salt stress, water scarcity (drought), heavy rains, floods, and melting of glaciers.

The world's climate is changing rapidly, and it has a significant impact on agricultural production by increasing carbon dioxide (CO<sub>2</sub>) regimes, global temperature, and unpredictable changes in rainfall pattern. Such as, the intensity and frequency of extreme heat is expected to increase, which could harm overall food systems. While C3 agricultural crops for example rice, soybean, and wheat may get benefit from rising levels of CO<sub>2</sub> regimes. To increase the intensity and frequency of global temperature in the next few decades because of climate change, which is directly responsible to decrease the crop yields. Crop yield and growth is strongly associated with weather conditions. Some other research also reported that crop yields reduce as temperatures increase. So, a warming climatic weather could damage crop productions and world food security.

Rice is the primary staple crop after wheat and is the source of 50% calories for the almost 50% population of the world, and its demand will increase by 28% in 2050. However, rice production has stagnated in 35% of all rice-growing regions. Rice cultivation is very important because rice consumption is more as compare to other staple food. Rice cultivation is the source of earning for approximately 145 million people of the world and covering 165 mha which is about 11% of agriculture land. In current agriculture system, rice cultivation and farming system are coping with two tasks, one is providing adequate and nutritious food to meet the increased requirement of population and market, and second is to overcome climate change issue through sustainable agriculture escalation. So, rice cultivation deserves special attention concerning an interaction with climate change considering the increasing population pressure in future. It also affects arable land and productivity of crops. Therefore, it is essential to understand the factors



responsible for low rice growth and production caused by climate change. Previous different studies also showed that rice yield and production directly affected by increasing the global temperature. It's very important to understand the present scenario of global climate change because it is directly linked to crop production and yield.

## 1.2 What is Climate Change?

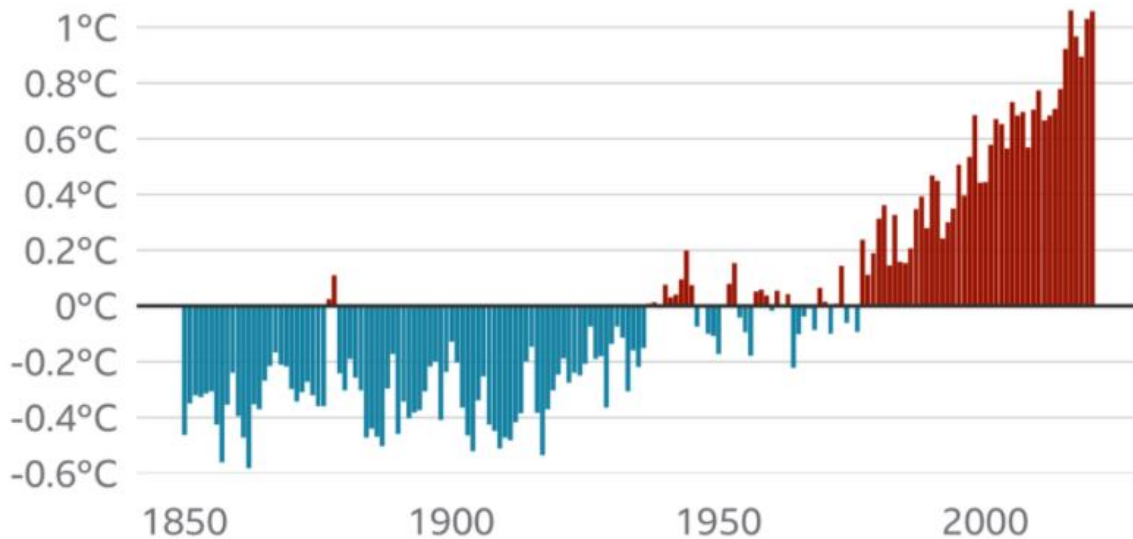
Climate is the average weather in a place over many years. While the weather can change in just a few hours, Climate takes hundreds, thousands, even million of years to change. And as you probably already know, there are lots of different types of climates on Earth. For example, hot regions are normally closest to the equator. The climate is hotter there because the Sun's light is most directly overhead at the equator. And the North and South Poles are cold because the Sun's light and heat are least direct there.

Climate is the average weather in a place over many years. Climate change is a shift in those average conditions. The rapid climate change we are now seeing is caused by humans using oil, gas and coal for their homes, factories and transport. When these fossil fuels burn, they release greenhouse gases - mostly carbon dioxide (CO<sub>2</sub>). These gases trap the Sun's heat and cause the planet's temperature to rise.

The world is now about 1.2C warmer than it was in the 19th Century – and the amount of CO<sub>2</sub> in the atmosphere has risen by 50%.

# The world is getting warmer

Annual mean land and ocean temperature above or below average, 1850 to 2020



**Source: NOAA (National Oceanic and Atmospheric Administration)**

Temperature rises must slow down if we want to avoid the worst consequences of climate change, scientists say. They say global warming needs to be kept to 1.5C by 2100.

## 1.3 Impact of Climate Change

The impacts of climate change on different sectors of society are interrelated. Drought can harm food production and human health. Flooding can lead to disease spread and damages to ecosystems and infrastructure. Human health issues can increase mortality, impact food availability, and limit worker productivity. Climate change impacts are seen throughout every aspect of the world we live in. Climate change is happening so fast that many plants and animal species are struggling to cope. Many terrestrial, freshwater and marine species have already moved to new locations. Some plant and animal species will be at increased risk of extinction if global average temperatures continue to rise unchecked.

We see climate change affecting our planet from pole to pole.

- Global temperatures rose about 34.7°F (1.5°C) from 1901 to 2021.
- Sea level rise has accelerated from 1.7 mm/year throughout most of the twentieth century to 3.2 mm/year since 1993.
- Glaciers are shrinking: average thickness of 30 well-studied glaciers has decreased more than 60 feet since 1980.
- The area covered by sea ice in the Arctic at the end of summer has shrunk by about 40% since 1979.
- The amount of carbon dioxide in the atmosphere has risen by 25% since 1958, and by about 40% since the Industrial Revolution.
- Snow is melting earlier compared to long-term averages.

Burning fossil fuels generates greenhouse gas emissions that act like a blanket wrapped around the Earth, trapping the sun's heat and raising temperatures. Examples of greenhouse gas emissions that are causing climate change include carbon dioxide and methane. These come from using gasoline for driving a car or coal for heating a building, for example. Clearing land and forests can also release carbon dioxide. Landfills for garbage are a major source of methane emissions. Energy, industry, transport, buildings, agriculture and land use are among the main emitters.

### **Greenhouse gas concentration are at their highest levels in 2 million years:**

And emissions continue to rise. As a result, the Earth is now about 1.1°C warmer than it was in the late 1800s. Many people think climate change mainly means warmer temperatures. But temperature rise is only the beginning of the story. Because the Earth is a system, where everything is connected, changes in one area can influence changes in all others.

### **People are experiencing climate change in diverse ways:**

Climate change can affect our health, ability to grow food, housing, safety and work. Some of us are already more vulnerable to climate impacts, such as people living in small island nations and other developing countries. Conditions like sea-level rise and saltwater intrusion have advanced to the point

where whole communities have had to relocate, and protracted droughts are putting people at risk of famine.

### **Every increase in Global Warming matters:**

In a series of UN reports, thousands of scientists and government reviewers agreed that limiting global temperature rise to no more than 1.5°C would help us avoid the worst climate impacts and maintain a livable climate. Yet based on current national climate plans, global warming is projected to reach around 3.2°C by the end of the century.

### **We face a huge challenge but already know many solutions:**

Many climate change solutions can deliver economic benefits while improving our lives and protecting the environment. We also have global frameworks and agreements to guide progress, such as the Sustainable Development Goals, the UN Framework Convention on Climate Change and the Paris Agreement. Three broad categories of action are: cutting emissions, adapting to climate impacts and financing required adjustments. Switching energy systems from fossil fuels to renewables like solar or wind will reduce the emissions driving climate change.

### **We can pay the bill now, or pay dearly in the future:**

Climate action requires significant financial investments by governments and businesses. But climate inaction is vastly more expensive. One critical step is for industrialized countries to fulfil their commitment to provide \$100 billion a year to developing countries so they can adapt and move towards greener economies.

#### **1.3.1 Climate change: IPCC warns India of extreme heat waves, droughts**

India will likely face irreversible impacts of climate change, with increasing heat waves, droughts and erratic rainfall events in the coming years if no mitigation measures are put in place, experts warn. "Heat extremes have increased while cold extremes have decreased, and these trends will continue over the coming decades," the report said regarding the Indian subcontinent. Experts say India, and South Asia in general, is particularly vulnerable to climate change. "The threat of climate change is real dangers are imminent and the future is catastrophic. This message from the

IPCC report confirms what we already know and can see in the world around us". Climate change has already hit India hard, causing huge economic and social losses past few years.

### **1.3.2 Climate Change: Is It Alarming For Agriculture**

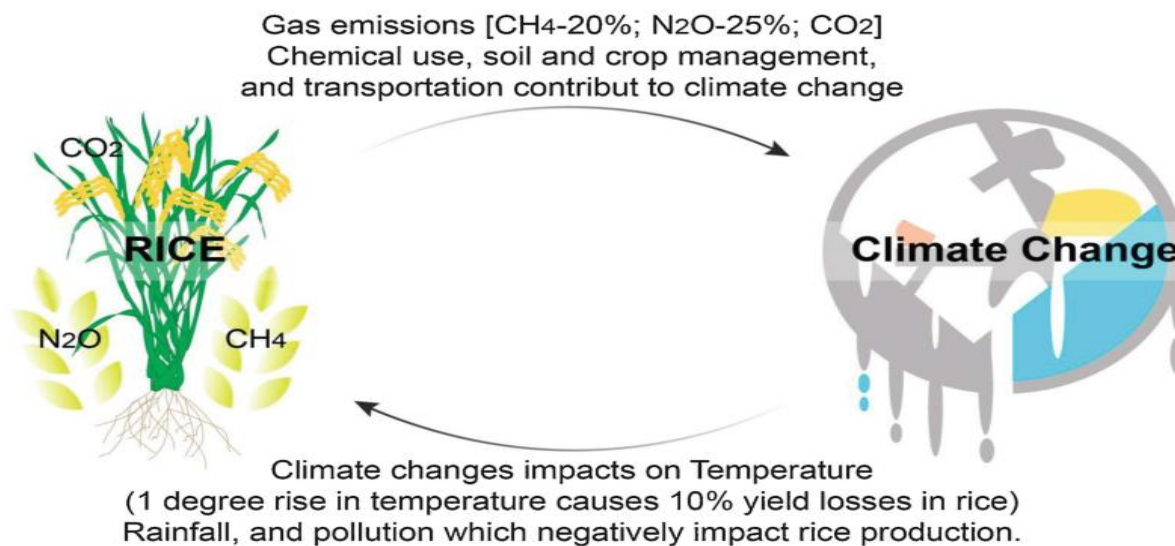
Climate change is adversely influencing the global community and ecosystem by affecting the temperature of the earth, frequency of precipitation, solar radiation, winds, relative humidity and hydrological cycles. Due to the anthropogenic activities, fossil fuels burning and solar irradiance, earth is becoming hotter causing global warming. These combined effects of climatic factors decrease the agricultural production of many important crops. Climate change has positive and negative impacts on agriculture by having noticeable effects on plant production, disease infestation, weed dynamics, soil properties, and microbial composition of the farming system. Temperature change could severely effect food production in tropical areas with a predicted 30% loss of food production in South Asia in 2050.

### **1.3.3 Impacts of Climate Change on Rice Production**

Global climate change is projected to have wide ranging effects on environment, socio-economic and related sectors. Indian agriculture scientists have found that rising temperature will adversely hit rice productivity in the country. Experiments done in Tamil Nadu show that elevated temperature will have a negative impact on rice productivity, even nullifying the positive effects of higher level of carbon dioxide. Researchers at the Coimbatore-based Tamil Nadu Agricultural University (TNAU) conducted a study on rice which is a staple food for most people in the region. According to Manila-based International Rice Research Institute, rice provides 23 per cent of global human per capita energy and 16 per cent of global human per capita protein.

Rice is a key staple food crop; however, its growth and productivity are affecting by climate change. The low production along with high demand is due to climate change which affecting food security and economy of the world. Amongst the impacts of climate change, the high duration and intensity of high temperature results in drought, floods, and tropical storms and effects the distribution of rainfall, cause soil degradation, and intrusion of agricultural land by

saltwater due to rise of sea level. Overall, elevated temperature was found to have a negative impact on rice productivity, even nullifying the positive effects of higher level of carbon dioxide.



**Source: Department of Agriculture & Farmers Welfare**

### 1.3.4 Climatic Factors Affecting Rice Cultivation

There are many climate factors affecting the rice cultivation such as: rainfall, temperature, day length and sunshine. Rainfall is the most important element among the climate factors for rice cultivation. The rainfall distribution in different areas is influenced by the topographic factors such as mountains and plateau. Temperature is an important climatic factor having some positive and negative impacts on the growth, development and yield of rice. Rice is grown in tropical and sub-tropical climate and requires relatively higher temperature, optimally from 20 °C to 40 °C, with 30 °C and 20 °C day and night temperature. Rice requires different critical temperature at different growth stages such as ranging from 16 °C to 20 °C at flowering and fertilization, and 18 °C to 32 °C at ripening. If temperature is favorable for rice cultivation throughout the year then, two or three crops of rice could be grown in a year. Where rainfall is high and winter temperature is fairly low, only one crop of rice is grown.

### **1.3.5 Rice Production in India**

Rice production in India is an important part of the national economy. India is the world's second-largest producer of rice, and the largest exporter of rice in the world. Rice is one of the chief grains of India. Moreover, this country has the largest area under rice cultivation. As it is one of the principal food crops. It is, in fact, the dominant crop of the country. India is one of the leading producers of this crop. Rice is the basic food crop and being a tropical plant, it flourishes comfortably in a hot and humid climate. Rice is mainly grown in rain-fed areas that receive heavy annual rainfall. That is why it is fundamentally a kharif crop in India. It demands a temperature of around 25 degrees Celsius and above, and rainfall of more than 100 cm. Rice is also grown through irrigation in those areas that receive comparatively less rainfall. Rice is the staple food of eastern and southern parts of India. In financial year 2021, India's production volume of rice was over 122 million metric tons. Except for a few years, the production of rice in the country has increased over the last decade.

Rice can be cultivated by different methods based on the type of region. But in India, traditional methods are still in use for harvesting rice. The fields are initially plowed and fertilizer is applied which typically consists of cow dung, and then the field is smoothed. The seeds are transplanted by hand and then through proper irrigation, the seeds are cultivated. Rice grows on a variety of soils like silts, loams and gravels. It can tolerate alkaline as well as acid soils.

### **1.3.6 Rice Production in Odisha**

Rice covers about 69% of the cultivated area and is the major crop, covering about 63% of the total area under food grains. It is the staple food of almost the entire population of Odisha; therefore, the state economy is directly linked with improvements in production and productivity of rice in the state. In the 1950s Odisha was a leading rice-producing state in the country and it used to supply a sizable amount of rice grain to the central pool of food stocks. But, the situation was strongly reversed in the post-high-yielding variety period. However, during the last 35 years, the state's rice area has stagnated around 4 million hectares, about 10% of the total rice area of the country. Odisha's share in the country's rice production was more than 11% in the pre-HYV period, which gradually declined to 7.9% in 2008-09. Rice in Odisha is now grown on an area of 4.4 million hectares, which accounts for 91% of the area under cereals and contributes about 94% of total cereal production in the state.

The state is located in the subtropical belt of India. The state broadly falls under hot and dry subhumid, warm and humid, hot and humid, and hot and moist subhumid regions and experiences four major seasons: winter, summer, rainy, and autumn. The monthly average minimum and maximum temperatures range between 14 °C in December to 38 °C in May. Whereas the mean maximum temperature is 32 °C in the coastal districts of the state, it sometimes goes up to 42° C in hilly areas. The location of the state, near the Bay of Bengal, moderates the temperature and adds humidity to its climate. The relative humidity of the state varies from 36% to 98%; the average bright sunshine hours range between 3.7 hours/day in July-August to 8.8 hours/day during March to May. Soils of Odisha are broadly divided into eight groups: Red Sandy and Red Loamy, Lateritic, Red and Yellow, Coastal Alluvial, Deltaic Alluvial, Black, Mixed Red and Black, and Brown Forest Soils. The soils are mostly red lateritic and acidic in nature.

The southwest monsoon enters the state during the second half of June and continues up to the first week of October. The annual normal rainfall of the state is 1,451.2 mm, with a unimodal distribution. More than 80% of the precipitation is received from mid-June to September. The rainfall pattern is highly unpredictable in timing, amount, and distribution and therefore the state suffers from either drought or flood. Odisha agriculture depends much on monsoon rains. The normal distribution of rainfall influences crop yield: failure of rain in drought years causes scarcity, while excess rainfall causes flood.



# **CHAPTER II**

## **REVIEW OF LITERATURE**

## CHAPTER II

### REVIEW OF LITERATURE

#### 2.1 K-mean clustering

Clustering, as a generic tool for finding groups or clusters in multivariate data, has found wide application in biology, psychology and economics. One of the main difficulties for cluster analysis is that, the correct number of clusters of different types of datasets is seldom known in practice. However, most of clustering algorithms are designed only to investigate the inherited grouping or partition of data objects according to a known number of clusters. Thus, identifying the number of clusters is an important task for any clustering problem in practice albeit it must be faced with many operational challenges. A tractable way for cluster analysis is to ask the end user to input the number of clusters in advance, which needs the expert domain knowledge over the underlying datasets (Trupti M Kodinariya et al.,2013). On the other hand, many statistical criteria or clustering validity indices have been investigated in the sense of automatically selecting an appropriate number of clusters. Several algorithms have been proposed in the literature for clustering. The k-means clustering algorithm is the most commonly used because of its simplicity. In this paper, we focus on one of problem of K-mean i.e .automation of number of cluster. In the literature several approaches have been proposed to determine the number of clusters for k-mean clustering algorithm. We focus on six different approaches : i) By rule of thumb; ii) Elbow method; iii) Information Criterion Approach; iv) An Information Theoretic Approach; v) Choosing k Using the Silhouette and vi) Cross-validation (Banerji et al.,2021).

We describe here a novel 3-D image segmentation technique capable of robust segmentation using -mean clustering and knowledge-based morphological operations. This technique aims at solving the problems encountered in the segmentation of images consisting of regions that may be separate in anatomy but indistinguishable in intensity. The proposed adaptive K-mean clustering algorithm is adopted from and is capable of initial segmentation of the structures characterized by spatially varying intensity distributions. Spatial constraints are incorporated in the form of Gibbs random fields in our adaptive K-mean clustering algorithm to enforce the neighborhood configuration to overcome the noise in the given image. Simple morphological operations are then applied to clear the results obtained from K-mean clustering to form the initial segmented regions. Although we are able to overcome the difficulties originating from spatially varying intensity distributions and image acquisition noise with adaptive K-mean

clustering and simple morphological operations, resolving the anatomical ambiguity presented in many biomedical image segmentations is still a challenging task. It is this challenge that motivated the development of the algorithm for knowledge based morphological operations which determines desired final segmentation according to the a priori anatomical knowledge of the region-of-interest(**Chang-Wen Chen. et. Al,1983**) To illustrate the effectiveness of this proposed algorithm, we have successfully implemented a robust segmentation on a sequence of cardiac CT volumetric images to extract time-varying chamber of left ventricle. The volumes of left ventricle extracted using this approach compare favorably with the volumes obtained using operator manual outlining. However, such knowledge-based segmentation is fast, reproducible, and without operator bias.

The application of the proposed algorithm to other applications of image segmentation can be easily adopted as long as the a priori knowledge of the structure-of-interest is available. In many biomedical image segmentation tasks, such knowledge is usually available since we often study certain biomedical structures with known anatomical information. The anatomical information can be used in the design of K- mean clustering when it is necessary to set the value and to incorporate the spatial characteristics of each class. Such information is crucial in the design of knowledge based morphological operations since it is the only way of intelligently identifying the anatomical structures from the possibly ambiguous segmentations obtained through adaptive K-mean clustering. It is true that a particular implementation scheme of 3-D image segmentation would depend on individual applications. However, the principles of this knowledge-based approach will provide, without doubt, the methodology in the design of an individualized 3-D image segmentation algorithms (**Rizwan et. al,2020**).

Climate change is a long term change in the statistical distribution of weather patterns over periods ranging from decades to millions of years. It may be a change in average weather conditions or the distributions of events around that averages (i.e. more and fewer extreme weather events. It may be limited to a specific region or may occur across the whole world. Climate change reflects a change in the energy balance of the climate system i.e. changes the relative balance between incoming solar radiation and outgoing infrared radiation from .Earth.In the context of climate variation, anthropogenic factors are human activities which affect climate. The scientific consensus on climate change is that climate is changing and these changes are in large part caused by human activities and it is largely irreversible. Consequently, the debate is

shifting to reduce further human impact and to find ways to adapt to change that has already occurred and is anticipated to occur in the future.

## **2.2 Impact of climate change in agricultural field**

In order to study climate change on a regional scale using Earth System Models, it is useful to partition the spatial domain into regions according to their climate changes. The aim of this work is to divide the European domain into regions of similar projected climate changes using a simulation of daily total precipitation, minimum and maximum temperatures for the recent-past (1986–2005) and long-term future (2081–2100) provided by the Coupled Model Inter-comparison Project (CMIP5). The difference between the long-term future and recent-past daily climatologies of these three variables is determined. Aiming to objectively identify the grid points with coherent climate changes, a *K*-Mean Cluster Analysis is applied to these differences. This method is performed for each variable independently (univariate version) and for the aggregation of the three variables (multivariate version). A mathematical approach to determine the optimal number of clusters is pursued (Carvalho, M. J. et. al,2016). However, due to the method characteristics, a sensitivity test to the number of clusters is performed by analysing the consistency of the results. This is a novel method, allowing for the determination of regions based on the climate change of multiple variables. Results from the univariate application of this method are in accordance with results found in the literature, showing overall similar regions of changes. The regions obtained for the multivariate version are mainly defined by latitude over European land, with some features of land-sea interaction. Furthermore, all regions have statistically different distributions of at least one of the variables, providing confidence to the regions obtained.

This document is a synthesis of science literature on the effects of climate change on agriculture and issues associated with agricultural adaptation to climate change. Information is presented on how long-term changes in air temperatures, precipitation, and atmospheric levels of carbon dioxide will affect crop production, livestock production, natural resources, the agricultural economy, and sociological networks that support farming communities. The publication provides an overview of how changes in climate affect both biotic and abiotic aspects of agricultural production. A-biotic components include air temperature, the hydrologic cycle,

atmospheric carbon dioxide and ozone levels, and factors that can limit the amount of sunlight reaching the Earth's surface, such as cloud cover and ambient particulate matter concentrations. Biotic components include weeds and invasive species that can compete with crops and overrun productive farmlands and rangelands; insect pests, pathogen diversity, migration, and evolution; and threats to insect pollinators. The report also details how adaptations in current agricultural practices will enable farmers to continue crop and animal production in ways that partially offset the negative direct and indirect effects of climate changes—and even take advantage of new opportunities that may result (C.L., Hatfield et. al, 2013).

### **2.2.1 Impact of global warming in agriculture**

Climate change caused by anthropogenic greenhouse emissions leads to impacts on a global and a regional scale. A quantitative picture of the projected changes on a regional scale can help to decide on appropriate mitigation and adaptation measures. In the past, regional climate change results have often been presented on rectangular areas. But climate is not bound to a rectangular shape and each climate variable shows a distinct pattern of change. Therefore, the regions over which the simulated climate change results are aggregated should be based on the variable(s) of interest, on current mean climate as well as on the projected future changes. A cluster analysis algorithm is used here to define regions encompassing a similar mean climate and similar projected changes. The number and the size of the regions depend on the variable(s) of interest, the local climate pattern and on the uncertainty introduced by model disagreement. The new regions defined by the cluster analysis algorithm include information about regional climatic features which can be of a rather small scale. Comparing the regions used so far for large scale regional climate change studies and the new regions it can be shown that the spacial uncertainty of the projected changes of different climate variables is reduced significantly, i.e. both the mean climate and the expected changes are more consistent within one region and therefore more representative for local impacts (Eri Saikawa et. al, 2017).

### **2.2.1 Agriculture affects atmosphere by releasing green house gases**

Agriculture affects atmosphere by releasing green house gases and get affected in turn, from climate change. This paper reviews the literature on both the aspects and test empirically that what affects emissions of carbon dioxide to the atmosphere. Data on carbon emissions, energy consumption and agriculture related national level variables are obtained for 120 countries from

the World Bank's Green Data Book. Multiple linear regression analysis revealed that agricultural land, irrigation, forest area, biomass energy, and energy use efficiency negatively affect the Carbon dioxide emission. But, fertilizer use and per capita energy use affect it positively. The analysis confirms that the people in rich countries are more responsible for carbon emission than the people in poor countries. It recommends for cross subsidization for low external input agriculture, particularly for organic farming in poor countries.

These adaptations could include altering planting dates, using more water-efficient crops, supplementing precipitation shortfalls with irrigation, and altering tillage practices. Livestock producers, in turn, could focus on breeding and maintaining animals that can tolerate higher temperatures, have more natural resistance to pests, and can meet their dietary needs with existing vegetation. An important message is that adaptation will require a balance of new crop and livestock types and new management strategies that enable production while providing stewardship of soil resources. Discussions are included on how to support effective decision-making for future climate scenarios across multiple dimensions of the U.S. agricultural system, and the need for climate information and near-term forecasts that is scaled appropriately to ensure their relevance for local and regional decision-making, and strategic planning. At the same time, regional and national near-term and longer-term climate projections will be needed for effective research, development, and adaptation planning and policy-making by state and federal governments and agribusiness. More complete modeling/simulation systems will allow scientists to study how a diverse and simultaneous range of environmental and sociological stressors might interfere with the U.S. agricultural system (**National Climate Assessment Report, 2013**).

The implications of climate change for agriculture and food are global concerns, and they are very important for China. The country depends on an agricultural system which has evolved over thousands of years to intensively exploit environmental conditions. The pressures on the resource base are accentuated by the prospect of climate change. This paper synthesizes information from a variety of studies on Chinese agriculture and climate. Historical studies document the impacts of past climate changes and extremes, and the types of adjustments which have occurred, the vulnerability of Chinese agriculture to climate change. Climate change scenarios are assessed relative to the current distribution of agro-climatic regions and farming systems. Notwithstanding the yield enhancing effects of warming and elevated CO<sub>2</sub> levels, expected moisture deficits and uncertain changes in the timing and frequency of critical conditions indicate that there are serious

threats to the stability and adaptability of China's food production system (**B Smit, Y Cai Global Environmental Change, 1996**).

we examine the major predictions made so far regarding the nature of climate change and its impacts on our region in the light of the known errors of the set of models and the observations over this century. The major predictions of the climate models about the impact of increased concentration of greenhouse gases are at variance with the observations over the Indian region during the last century characterized by such increases and global warming. It is important to note that as far as the Indian region is concerned, the impact of year-to-year variation of the monsoon will continue to be dominant over longer period changes even in the presence of global warming. Recent studies have also brought out the uncertainties in the yields simulated by crop models. It is suggested that a deeper understanding of the links between climate and agricultural productivity is essential for generating reliable predictions of impact of climate change. Such an insight is also required for identifying cropping patterns and management practices (**S Gadgil et. al, 1995**).

The unimpeded growth of greenhouse gas emissions is raising the earth's temperature. The consequences include melting glaciers, more precipitation, erratic weather events, and shifting seasons. The accelerating pace of climate change, combined with global population and income growth, threatens food security everywhere. Agriculture is extremely vulnerable to climate change. Population in the developing world, which are already vulnerable and food insecure, are likely to be the most seriously affected. Despite the fact that much remains to be explored in terms of the role and potential of ICTs within the climate change field, the analysis conducted here sheds light on key conceptual foundations that help better understand the complex linkages that exist within vulnerable livelihood systems, and that ultimately determine the role of digital technologies in achieving development outcomes amidst an uncertain climatic future. It may be suggested that, in the event of climate change related shocks or trends within a particular context, the capacity of the system (at the household, community or national level) to respond through adaptation can be understood either as a set of components or as a set of properties, which interact to create the adaptive capacity of the system.

### **2.3 Agricultural activities are affected by climate change**

This paper reviews various articles and documents on relationship between climate change and agriculture. The two-way relationship of climate change and agriculture is of great significance in particular to developing countries due to their large dependence on agricultural practice for

livelihoods and their lack of infrastructure for adaptation when compared to developed countries. Agricultural activities are affected by climate change affects due to their direct dependence on climatic factors. In high latitude areas with low temperature, increased temperature due to climate change could allow for longer growing season. Agriculture affects climate through emissions of greenhouse gases (GHGs) such as carbon dioxide, methane and nitrous oxide. These emissions come directly from use of fossil fuels, tillage practices, fertilized agricultural soils and livestock manure in large proportion. Conversely, agriculture could be a solution for climate change by the widespread adoption of mitigation and adaptation actions. This happens with the help of best management practices such as organic farming, agro forestry practice and manure management etc (H. Yohannes et.al, 2016).

Climate change is a global threat to the food and nutritional security of the world. As greenhouse-gas emissions in the atmosphere are increasing, the temperature is also rising due to the greenhouse effect. The average global temperature is increasing continuously and is predicted to rise by 2 °C until 2100, which would cause substantial economic losses at the global level. The concentration of CO<sub>2</sub>, which accounts for a major proportion of greenhouse gases, is increasing at an alarming rate, and has led to higher growth and plant productivity due to increased photosynthesis, but increased temperature offsets this effect as it leads to increased crop respiration rate and evaporation, transpiration, higher pest infestation, a shift in weed flora, and reduced crop duration. Climate change also affects the microbial population and their enzymatic activities in soil. This paper reviews the information collected through the literature regarding the issue of climate change, its possible causes, its projection in the near future, its impact on the agriculture sector as an influence on physiological and metabolic activities of plants, and its potential and reported implications for growth and plant productivity, pest infestation, and mitigation strategies and their economic impact (GS Malhi et. al, 2021).

## **2.4 Adaptation scenarios to climate change**

Two possible adaptation scenarios to climate change for Sub-Saharan Africa are analyzed under the SRES B2 scenario. The first scenario doubles the irrigated area in Sub-Saharan Africa by 2050, compared to the baseline, but keeps total crop area constant. The second scenario increases both rainfed and irrigated crop yields by 25% for all Sub-Saharan African countries. The two adaptation scenarios are analyzed with IMPACT, a partial equilibrium agricultural sector model combined with a water simulation module, and with GTAP-W, a general equilibrium model



including water resources. The methodology combines the advantages of a partial equilibrium approach, which considers detailed water-agriculture linkages, with a general equilibrium approach, which takes into account linkages between agriculture and nonagricultural sectors and includes a full treatment of factor markets. The efficacy of the two scenarios as adaptation measures to cope with climate change is discussed. Due to the limited initial irrigated area in the region, an increase in agricultural productivity achieves better outcomes than an expansion of irrigated area. Even though Sub-Saharan Africa is not a key contributor to global food production (rainfed, irrigated or total), both scenarios help lower world food prices, stimulating national and international food markets.

A large number of studies have been published examining the implications of climate change for agricultural productivity that, broadly speaking, can be divided into process-based modeling and statistical approaches. Despite a general perception that results from these methods differ substantially, there have been few direct comparisons. Here we use a data-base of yield impact studies compiled for the IPCC Fifth Assessment Report (**Porter et al ,2014**) to systematically compare results from process-based and empirical studies. Controlling for differences in representation of CO<sub>2</sub> fertilization between the two methods, we find little evidence for differences in the yield response to warming. The magnitude of CO<sub>2</sub> fertilization is instead a much larger source of uncertainty. Based on this set of impact results, we find a very limited potential for on-farm adaptation to reduce yield impacts. We use the Global Trade Analysis Project (GTAP) global economic model to estimate welfare consequences of yield changes and find negligible welfare changes for warming of 1 °C–2 °C if CO<sub>2</sub> fertilization is included and large negative effects on welfare without CO<sub>2</sub>. Uncertainty bounds on welfare changes are highly asymmetric, showing substantial probability of large declines in welfare for warming of 2 °C–3 °C even including the CO<sub>2</sub> fertilization effect (**KO Yoro, MO Daramola et. al, 2020**).

Resilience, thus, emerges as an important property to consider in the analysis of livelihood systems that are subject to climate related changes and uncertainty; a property that interacts with assets and other components to shape the trajectory of functioning and adaptation after any acute or chronic disturbance. The value of this approach resides in its contribution to better understand the complex set of relations between livelihood system components, properties and processes, which in turn are characterized by the presence of multiple development stressors. It can serve as

a tool to explore the potential and challenges of ICTs' role within processes of adaptation, while facilitating the identification of strategies that could contribute to the enhancement of adaptive capacities, and ultimately to the achievement of development outcomes in the face of long term climatic uncertainty. Ultimately, the challenge for developing countries resides not only in their capacity to withstand and recover from climatic events, but mostly in their capacity to adjust, change and transform amidst slow changing trends and unpredictable variability; while facing a future where the only certainty is uncertainty itself, and within which, development outcomes will be determined, to a large extent, by their ability to foster 'development epiphanies' and innovate with the support of tools such as ICTs (**P Nema, S Nema, P Roy et. al, 2012**).

Quantitative estimates of the impacts of climate change on economic outcomes are important for public policy. We show that the vast majority of estimates fail to account for well-established uncertainty in future temperature and rainfall changes, leading to potentially misleading projections. We reexamine seven well-cited studies and show that accounting for climate uncertainty leads to a much larger range of projected climate impacts and a greater likelihood of worst-case outcomes, an important policy parameter. Incorporating climate uncertainty into future economic impact assessments will be critical for providing the best possible information on potential impacts (**A Costello et. al, 2009**).

This investigates in the foreground the state of agricultural systems in interdependence with climate change, a condition *synec vanon* of decarbonization of agriculture. The relationship between ecologically responsible agricultural systems places the innovative design of agricultural processes as the first factor in achieving the success of environmental responsibilities in addressing any agricultural processes customized to the area through the symbiosis between production in order to protect the biosphere. Thus, the constraints of reducing the consumption of chemical fertilizers in agriculture have gained new value at the same time as the interest of producers to gradually comply with the new more sustainable environmental requirements by optimizing synergies in the vision of the Common Agricultural Policy (CAP). The paper also identifies the risks of degradation of natural resources as an effect of environmental change, such as phosphorus, a much-needed element in agriculture, a declining global resource. From the empirical analysis of the analyzed sources we followed on the basis of statistical data a calibration

of the risk trends generated by the impact of the adaptability of agriculture to environmental requirements, in achieving an agriculture designed for sustainability (**RL Fischman et. al, 2019**).

# **CHAPTER III**

## **MATERIALS AND METHODS**

## CHAPTER-3

### Materials and Methods

#### 3.1 Methods

The method used in this particular case is k mean clustering algorithm.

##### 3.1.1 Data set

A secondary analysis of the impact of climate change on Rice Production of 13 districts of Odisha was carried out in this study. The data used was provided by the Department of Agriculture And Farmers' Empowerment (Government Of Odisha).

#### YEAR 2000

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	635.67	1700.1	31.6	21.9	71.63
Bolangir	211.5	900.6	31.2	23.2	70.58
Cuttack	564.24	1400.7	32.5	19.8	81.26
Dhenkanal	119.7	1040.7	33.12	21.5	75.12
Ganjam	400.15	1165.4	31.1	23.3	82.94
Kalahandi	373.83	2110.7	32.34	21.56	72.39
Keonjhar	210.37	1100.6	31.09	19.18	72.13
Koraput	537.41	1400.8	29.65	17.56	71.68
Mayurbhanja	389.75	1510.7	32.43	21.34	76.24
Kandhamal	76.17	1600	31.23	18.56	77.18
Puri	474.39	1300.7	31.3	23.5	81.28
Sambalpur	498.97	1709	31.6	20.1	72.41
Sundargarh	121.23	1234.6	33.76	19.2	70.69

#### YEAR 2001

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	733.32	1842.1	31.6	21.9	71.83
Bolangir	536.93	1604.4	31.4	23.3	70.81
Cuttack	764.1	1892.5	32.4	20.5	82.58
Dhenkanal	416.75	1477.6	32.45	21.3	75.62
Ganjam	705.15	1663.4	31.16	22.58	84.25
Kalahandi	499.78	2366.1	32.5	21.2	72.52
Keonjhar	282.38	1389.9	31.08	19.2	71.91
Koraput	627.47	1630.1	29.34	17.65	72.56
Mayurbhanja	538.21	1720.3	32.1	21.16	78.16
Kandhamal	174.93	1965.5	31.66	13.75	76.82
Puri	598.3	1710.9	31	24.4	84.16

Sambalpur	1030.62	1802.7	31.6	23.7	72.1
Sundargarh	241.04	1720	31.2	20.4	71.69

## YEAR 2002

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	401.18	1314.7	31.75	22	71.66
Bolangir	188.31	831	33.01	20.19	72.65
Cuttack	493.58	1042.6	33.75	21.91	78.91
Dhenkanal	96.16	1489.2	33.84	20	74.54
Ganjam	254.2	952.2	30.83	23.41	81.91
Kalahandi	133.4	881.4	32.69	21.4	72.32
Keonjhar	108.42	952.6	31.08	19.08	69.83
Koraput	319.16	1012.5	29.12	17.49	72.65
Mayurbhanja	255.28	1153.7	32.1	21.12	75.39
Kandhamal	71.31	1285.6	31.12	18.29	77.98
Puri	241.65	1056.9	31	24.33	80.83
Sambalpur	607.47	1034.5	32	19.75	71.76
Sundargarh	73.48	1007.8	34.4	18.19	73.12

## YEAR 2003

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	676.28	1774.9	31.58	22.75	27.165
Bolangir	491.74	1669.8	31.6	22.4	27
Cuttack	627.04	1776.9	31.8	20.1	25.95
Dhenkanal	375.68	1127.6	32.56	21.2	26.88
Ganjam	506.55	1396.5	30.66	22.58	26.62
Kalahandi	492.13	2133.1	32.6	20.4	26.5
Keonjhar	341.63	1385.3	31.42	18.54	24.98
Koraput	686.93	1426.9	29.69	18.1	23.895
Mayurbhanja	496.76	1413.4	32.5	20.81	26.655
Kandhamal	214.37	2124.2	30.65	18.45	24.55
Puri	508.46	1466	31.5	22.7	27.1
Sambalpur	1069.33	1680.8	31	21.4	26.2
Sundargarh	246.84	1327.8	33.45	18.76	26.105

## YEAR 2004

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	781.56	1590.5	32	21.6	69.75
Bolangir	455.93	1121.6	31.6	24.1	67.45
Cuttack	842.15	1398.9	32.5	19.8	79
Dhenkanal	316.64	1471.7	33.43	20.13	72.76
Ganjam	446.44	979.4	31.08	22.58	80.5
Kalahandi	381.6	1743.5	33.2	21.11	65.34
Keonjhar	277.19	1093.3	31	18.91	70.45
Koraput	668.72	1401.8	29.58	17.75	75.75
Mayurbhanja	489.72	1294.2	32	21.18	76.51
Kandhamal	173.8	1545.2	30.91	18.41	80.91
Puri	569.58	1044	31.5	24.2	79.89
Sambalpur	889.99	1317.5	34.3	20.1	73.21
Sundargarh	244.17	1147.3	34.12	18.34	72.75

## YEAR 2005

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	721.74	2071.1	32.08	21.66	62.91
Bolangir	561.45	1146.7	33.15	20.2	63.66
Cuttack	958.1	2011.3	32.91	21.25	83.08
Dhenkanal	407.34	1428.7	32.96	20.92	72.65
Ganjam	392.26	1359.1	30.83	23.44	81.56
Kalahandi	416.15	1398	32.75	21.34	62.75
Keonjhar	286.82	1618.5	30.91	18.91	71.75
Koraput	636.35	1345	29.25	17.12	80.13
Mayurbhanja	472.21	1670.7	32.26	21.45	77.08
Kandhamal	178.96	1948.4	31.5	18.46	78.66
Puri	658.04	1527.4	30.91	22.9	81.08
Sambalpur	1029.07	1698	32.74	19.5	75.25
Sundargarh	244.48	1242	34.5	19.08	70.25

## YEAR 2006

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	666.71	1773.7	32.58	21.75	69.58
Bolangir	599.67	1718.7	33.33	20.08	65.75
Cuttack	680.63	1927.2	33.5	19.75	81.91
Dhenkanal	318.88	1300	34.56	20.23	72.32
Ganjam	648.93	1482.4	31.1	23.21	82.65

Kalahandi	414.19	2244.4	33.49	21.1	62.75
Keonjhar	264.93	1551.3	31.33	19.16	71.75
Koraput	677.73	1952.6	29.1	18.56	80.68
Mayurbhanja	501.43	1821.2	32	21.08	74.5
Kandhamal	191	2369.9	31.16	18.12	80
Puri	598.7	1932.7	31	24.25	82.5
Sambalpur	1088.36	1790.7	32.16	19.25	79.25
Sundargarh	276.95	1213.9	34.66	18	68.16

## YEAR 2007

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	706.65	2185.9	32	21.58	71.16
Bolangir	649.89	1389.6	33.58	20.08	64.14
Cuttack	819.25	1842.2	32.91	20.14	83.66
Dhenkanal	313.26	1384.6	34.2	20.34	72.54
Ganjam	696.05	1320.5	31.5	23.21	81.6
Kalahandi	563.16	1877.3	32.67	21.5	61.66
Keonjhar	341.02	1907.6	31.23	19.34	75.33
Koraput	754.64	1746.3	29.81	18.34	80.19
Mayurbhanja	574.85	2037.7	31.33	21.45	75.58
Kandhamal	182.35	1819	31.6	18.34	78.91
Puri	620.46	1340.2	30.83	24.33	78.41
Sambalpur	1128.08	1733	32.91	20.33	77.58
Sundargarh	305.16	1564.2	33.75	18.66	71.75

## YEAR 2008

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	696.03	1701	31.58	21.58	72.41
Bolangir	558.41	1641	33.83	19.83	68.83
Cuttack	781.47	1853	32.58	22.91	83.75
Dhenkanal	319.43	1741	33.12	20.5	73.45
Ganjam	518.16	1161.9	30.75	23.33	80.45
Kalahandi	500.73	1885.4	33.08	19.58	68.83
Keonjhar	278	1647.8	31	19.66	76.58
Koraput	619.52	1298.8	30	18.58	80.08
Mayurbhanja	542.59	1763	32.2	21.09	77.81
Kandhamal	167.13	1686.2	30.66	18	83.66
Puri	502.43	1419.5	30.5	24.16	80.5
Sambalpur	1131.5	1879	32.33	20.83	77.75
Sundargarh	300.56	1496.2	33.41	19.25	72.16



## YEAR 2009

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	715.25	1579.7	33.08	22.16	70.08
Bolangir	642.93	1442.6	34.41	20.36	64.0
Cuttack	964.19	1806.5	34	23.25	84.58
Dhenkanal	276.38	1046.4	32.87	20.8	72.78
Ganjam	620.4	1217.9	31.66	23.75	81.66
Kalahandi	551.81	1504.4	34.16	20	67.16
Keonjhar	282.17	1321.6	32	20.41	67.83
Koraput	617.83	1038.5	31.75	21.16	80.83
Mayurbhanja	458.72	1213.5	32.91	20.83	72.25
Kandhamal	185.12	1603.7	32.33	22.66	81.5
Puri	615.35	1463.4	31.33	24.75	80.33
Sambalpur	943.8	1294.5	34.91	20.41	71.66
Sundargarh	148.31	1076.6	33.25	19.43	69.41

## YEAR 2010

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	737.06	1264.5	32.75	22.41	71.08
Bolangir	717.03	1144.5	33.75	19	66.66
Cuttack	733.51	1390.5	33.58	23.25	84.5
Dhenkanal	178	1591.6	34.83	20.83	74.75
Ganjam	514.88	1476.8	31	23.75	83.41
Kalahandi	839.62	1542.4	34	21.08	70
Keonjhar	194.97	1213.4	31.75	19.75	72.66
Koraput	873.99	1533.3	29.75	18.41	70
Mayurbhanja	265.38	995.6	32.58	20.08	83.75
Kandhamal	150.21	1533.3	31.75	18.25	84.66
Puri	593.22	1513.1	31.16	24.75	81.33
Sambalpur	993.07	978.4	34.83	20.83	74.5
Sundargarh	140.22	945.6	33.33	20.11	71.83

## YEAR 2011

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	796.09	1487.5	31.74	21.5	81.21
Bolangir	364.9	1144.8	33.54	19.18	78.8
Cuttack	805.35	1502.1	32.46	23.12	86.72
Dhenkanal	274.2	1020.5	31.47	20.73	79.82
Ganjam	193.29	9138	31.42	24	81.35

Kalahandi	285.25	1174.1	34.15	21.18	72.12
Keonjhar	293.73	1910.1	31.89	19.89	76.41
Koraput	400.35	1198.4	30.1	19.05	81.21
Mayurbhanja	563.67	1669.3	32.15	20.65	77
Kandhamal	120.19	1340.7	32.06	19.27	88.43
Puri	434.65	1051.7	31.23	24.6	75.08
Sambalpur	1016.49	1639.4	34.46	21.06	78.8
Sundargarh	346.84	1580.7	33.12	20.4	66.63

## YEAR 2012

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	719.82	1028.8	31.91	22.52	68.91
Bolangir	1193.17	1267.8	34.1	20.1	76.54
Cuttack	1076.68	1634.6	33.69	23.54	85.32
Dhenkanal	402.23	1626.4	32.48	21	78.3
Ganjam	525.84	1220.4	31.45	24.12	82.92
Kalahandi	861.05	1423.4	33.83	21.34	73.87
Keonjhar	283.99	1253.5	31.59	20.3	75.76
Koraput	871.13	1508	29.98	19.4	79.76
Mayurbhanja	495.92	1289.9	32.75	20.07	76.98
Kandhamal	246.92	1552.9	31.79	19.52	86.89
Puri	759.04	1265	31.41	25.62	79.56
Sambalpur	1586.6	1887.2	34.56	21.02	73.96
Sundargarh	474.43	1426.9	33.42	21.11	73.87

## YEAR 2013

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	529.28	2093.9	31.66	21.33	70.16
Bolangir	1071.26	1422.9	33.87	20.45	78.14
Cuttack	630.32	1491.6	32.4	21.7	81.12
Dhenkanal	398.64	1639.8	32.34	20.12	78.52
Ganjam	126.18	1972.3	31.46	23.9	79.6
Kalahandi	830.89	1855.6	34.2	21.06	72.2
Keonjhar	272.65	1651.4	31.1	19.87	74.21
Koraput	1119.39	1831.1	29.91	20.12	79.83
Mayurbhanja	424.21	2246.2	32.32	21.1	75.69
Kandhamal	193.98	1704.9	31.5	20.45	84.5
Puri	364.58	1764.6	31.6	22.87	76.9
Sambalpur	1240.17	1423.9	32.32	21.3	76.8
Sundargarh	411.87	1450.6	32.08	18.14	78.83

## YEAR 2014

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	734.41	1931.2	32.15	20.6	69.91
Bolangir	1073.18	1411.6	33.76	20.83	75.16
Cuttack	910.11	1744.5	32.6	22	84.9
Dhenkanal	550.87	1429.8	30.96	19.45	74.34
Ganjam	772.5	1400.4	32.4	22.62	86.5
Kalahandi	746.19	1740	32.76	20.52	72.33
Keonjhar	412.75	1339.6	30.93	19.14	70.91
Koraput	978.68	1726.8	29.13	17.14	88
Mayurbhanja	687.42	1599.4	31.71	20.5	76.41
Kandhamal	221.6	1648.5	30.96	16.14	85.33
Puri	692.52	1569	31.41	23.5	75.33
Sambalpur	1567.98	1900.6	33.63	19.90	76.66
Sundargarh	496.44	1332.1	32.57	17.04	73.45

## YEAR 2015

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	783.5	1290.3	32.12	21.34	70.12
Bolangir	511.39	1024.4	34.32	21.01	74.33
Cuttack	806.7	1175.8	32.34	21.21	80.31
Dhenkanal	199.94	1021.2	33.11	20.21	75.23
Ganjam	501.53	1169.8	32.1	23.12	81.86
Kalahandi	300.97	1367.2	33.24	19.34	71.56
Keonjhar	206.98	1009.5	31.34	20.33	70.12
Koraput	609.13	1541	29.34	17.9	84.13
Mayurbhanja	312.85	1252	32.21	21.11	74.13
Kandhamal	83.55	1138.2	31.01	17.63	86.33
Puri	493.49	1133.5	31.87	22.34	76.34
Sambalpur	837.19	1351.8	34.1	20.45	76.34
Sundargarh	228.15	1267.2	32.56	18.33	70.34

## YEAR 2016

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	1101.66	1628.4	31.66	21.33	81.21
Bolangir	883.22	1049.9	33.87	20.45	78.8
Cuttack	1254.27	1379.5	32.4	21.7	86.72
Dhenkanal	399.75	1207.7	32.34	20.12	79.82

Ganjam	799.75	1150.8	31.46	23.9	81.35
Kalahandi	667.81	1331.8	34.2	21.06	72.12
Keonjhar	422.25	1211.2	31.1	19.87	76.41
Koraput	1038.55	1713.8	29.91	20.12	81.21
Mayurbhanja	723.12	1390	32.32	21.1	77
Kandhamal	248.61	1226.4	31.5	20.45	88.43
Puri	752.82	1224.3	31.6	22.87	75.08
Sambalpur	1150.15	1187.3	32.32	21.3	78.8
Sundargarh	352.36	1052.116	32.08	18.14	66.63

## YEAR 2017

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	800.97	1550.4	31.1	21.5	71.91
Bolangir	424.44	854	34.5	21.5	74
Cuttack	708.65	1442.1	32.4	21.9	83.43
Dhenkanal	211.31	1133.5	32.43	20.42	76.91
Ganjam	402.84	1362.8	31.6	24	87.83
Kalahandi	489.55	1425.4	35.16	22	71.91
Keonjhar	395.04	1228.4	31.45	19.67	73.08
Koraput	898.1	1520.5	30.2	20	84.08
Mayurbhanja	655.66	1451.8	32.5	21.23	78.91
Kandhamal	155.67	1231.6	31.69	21.76	83.46
Puri	433.1	1510.9	31.2	23.7	77.5
Sambalpur	626.07	1260.5	32.5	21.1	73.33
Sundargarh	349.97	1288.1	33.4	17.3	75.69

## YEAR 2018

DISTRICT	RICE PRODUCTION	RAIN FALL	MIN. TEMP	MAX.TEMP	HUMIDITY
Balasore	1812	1838.6	32.15	20.6	71.33
Bolangir	750.8	1128.1	33.76	20.83	75.75
Cuttack	1230.6	1841.5	32.6	22	80.12
Dhenkanal	395.9	1620.1	30.96	19.45	78.54
Ganjam	405.3	1373.1	32.4	22.62	85.12
Kalahandi	689.9	1996.5	32.76	20.52	70.75
Keonjhar	476.8	1666	30.93	19.14	71.16
Koraput	890.2	1794	29.13	17.14	84.41
Mayurbhanja	712.9	1654.3	31.71	20.5	76.81
Kandhamal	140.4	1826.4	30.96	16.14	86.25
Puri	856.2	1936	31.41	23.5	75.33
Sambalpur	1030.7	1660.4	33.63	19.90	75.75
Sundargarh	320.7	1312.3	32.57	17.04	72.69

### 3.1.3 Study participants

The data is particularly corresponds to 13 districts of Odisha.

### 3.1.4 Study variables

The variables that are used for this study rice production, rain fall, maximum temperature, minimum temperature and humidity.

## 3.2 Statistical Analysis

K-means clustering is a method used for clustering analysis, especially in data mining and statistics. It aims to partition a set of observations into a number of clusters (k), resulting in the partitioning of the data into Voronoi cells. It can be considered a method of finding out which group a certain object really belongs to. It is used mainly in statistics and can be applied to almost any branch of study. For example, in marketing, it can be used to group different demographics of people into simple groups that make it easier for marketers to target. Astronomers use it to sift through huge amounts of astronomical data; since they cannot analyze each object one by one, they need a way to statistically find points of interest for observation and investigation.

The algorithm:

1. K points are placed into the object data space representing the initial group of centroids.
2. Each object or data point is assigned into the closest k.
3. After all objects are assigned, the positions of the k centroids are recalculated.
4. Steps 2 and 3 are repeated until the positions of the centroids no longer move.

## 3.3 Results

### Input:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
```

```

from google.colab import files
uploaded = files.upload()
import pandas as pd
import io
df = pd.read_csv(io.BytesIO(uploaded['head.csv']))
print(df)
np.random.seed(200)
k=3
centroids = {}
for i in range(k):
    centroids[i+1] = [np.random.randint(150,900), np.random.randint(800,1600)]
fig=plt.figure(figsize=(6,6))
plt.scatter(df['Rice production'],df['Rain Fall'],color='k',s = 60)
colmap={1:'r',2:'g',3:'b'}
for i in centroids.keys():
    plt.scatter(*centroids[i],color=colmap[i])
plt.xlim(0,1000)
plt.ylim(1000,1600)
plt.show
def assignment (df, centroids):
    for i in centroids.keys():
        #sqrt((x1 - x2)^2-(y1 - y2)^2)
        df['distance_from_{}'.format(i)] = (
            np.sqrt(
                (df['Rice production'] - centroids[i][0]) ** 2

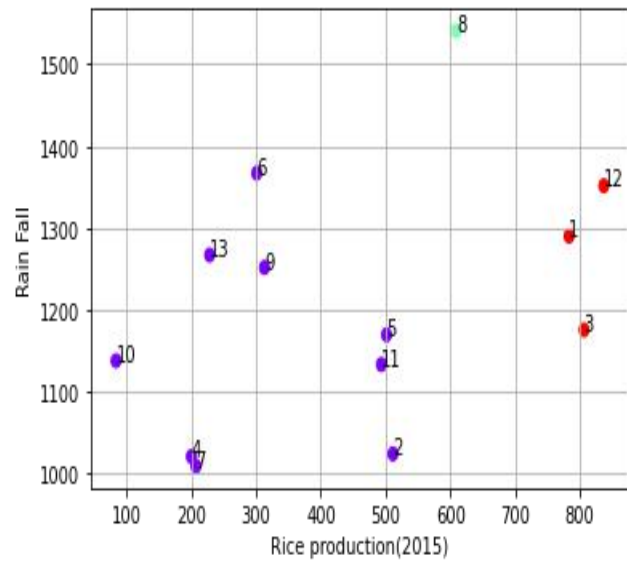
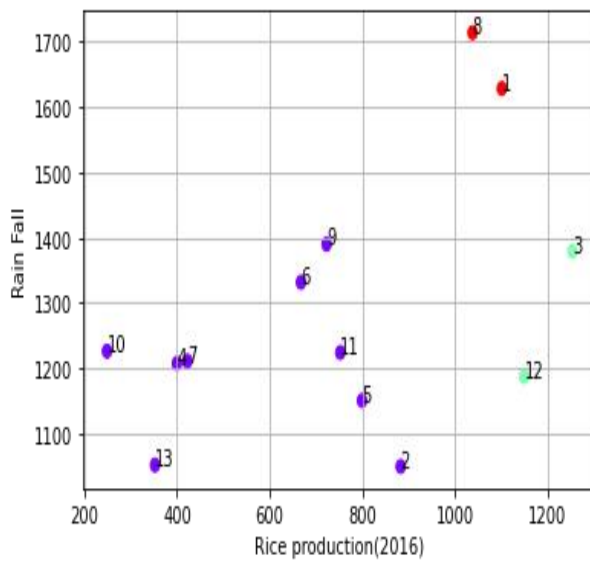
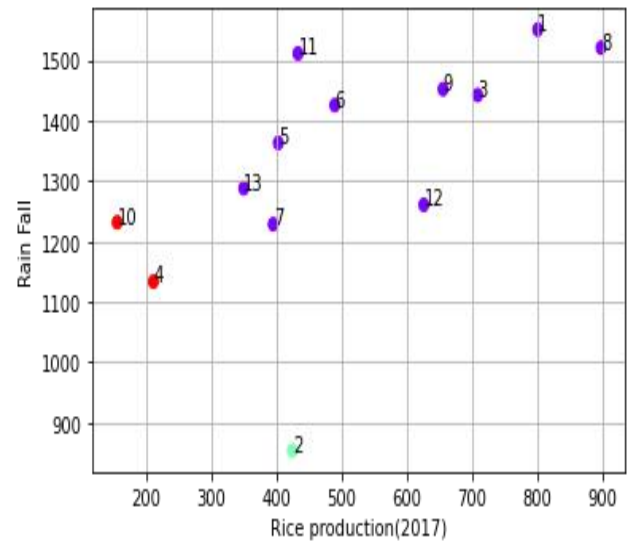
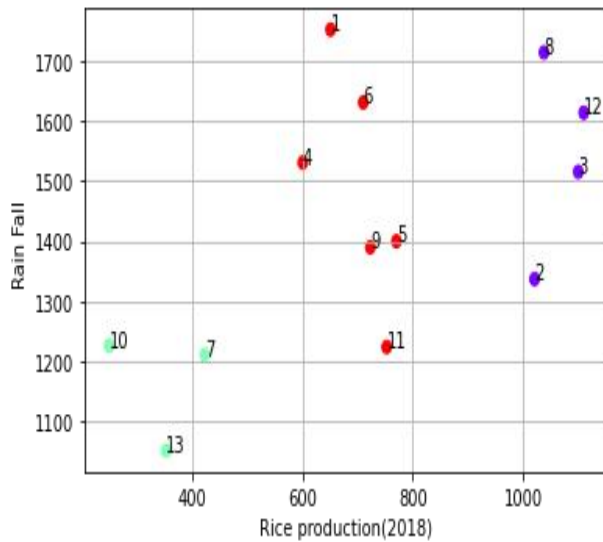
```

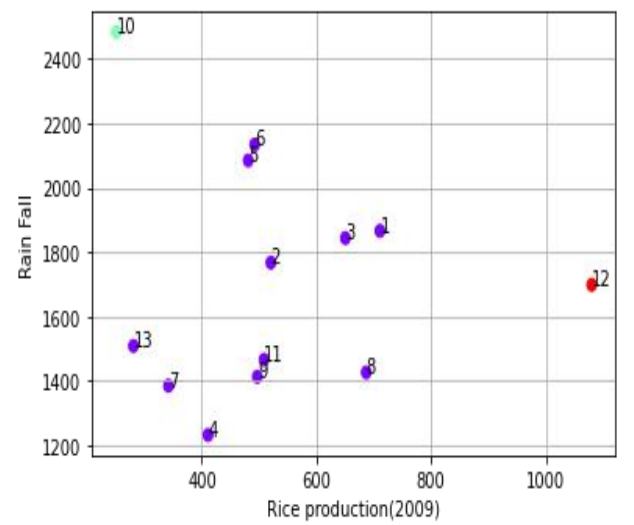
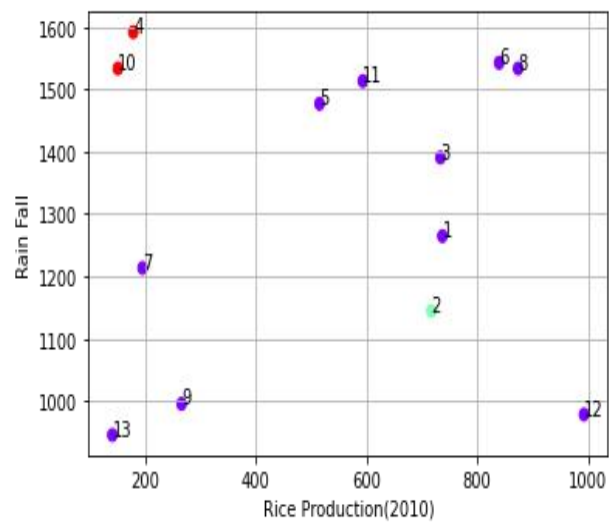
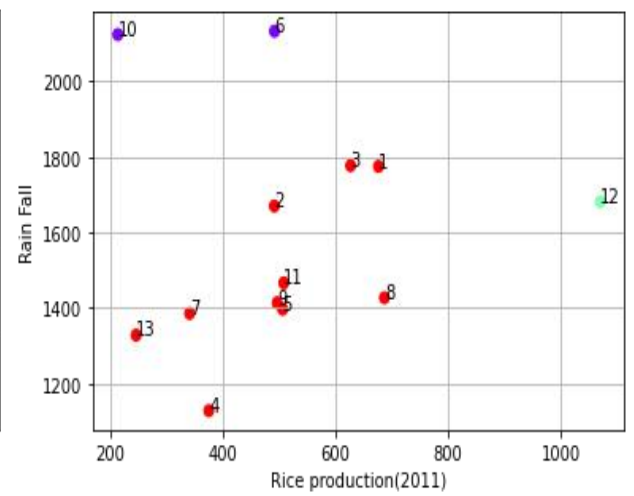
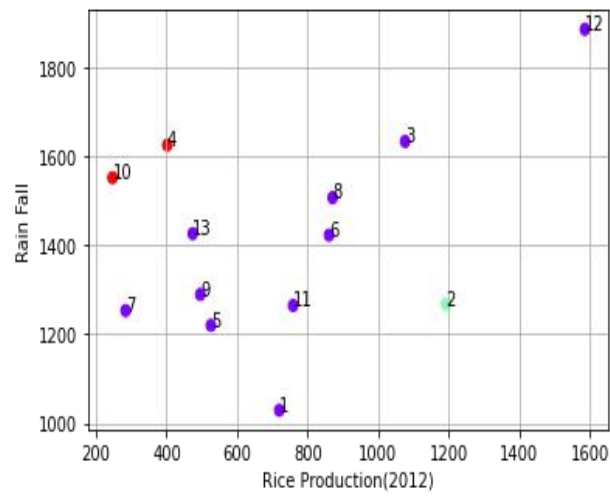
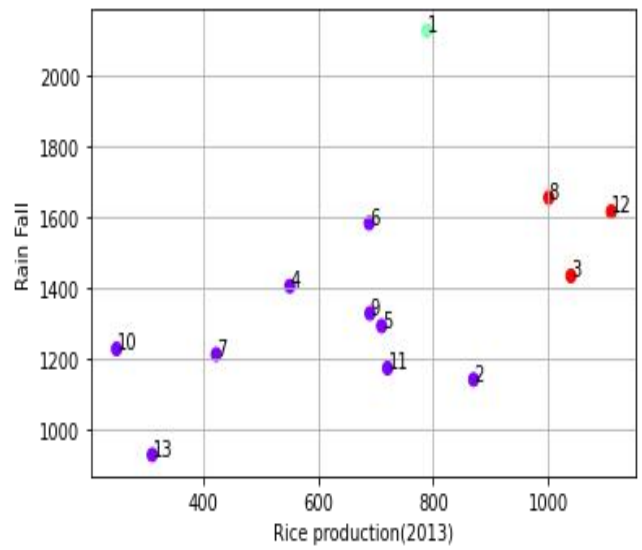
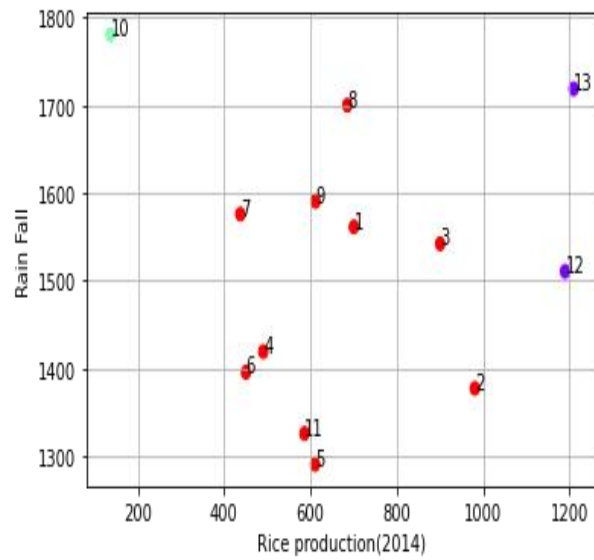
```

+ (df['Rain Fall'] - centroids[i][1]) ** 2
)

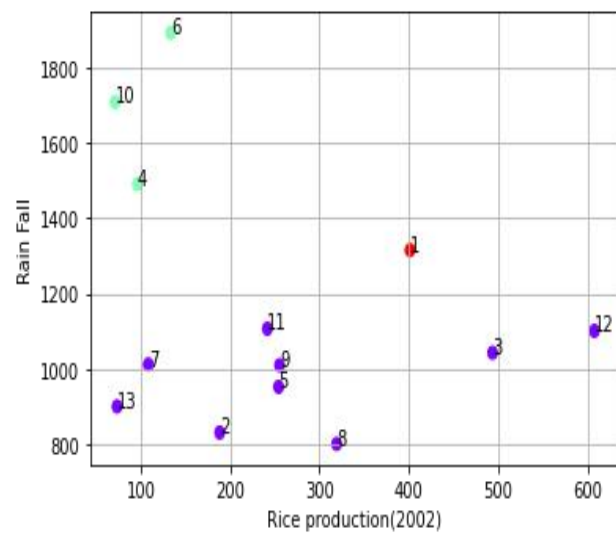
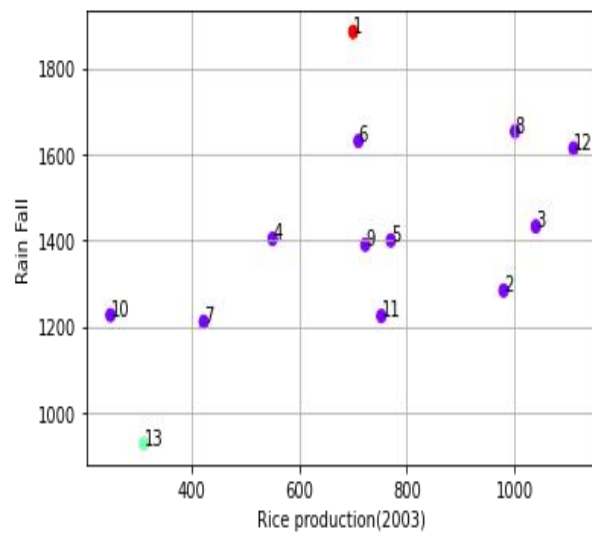
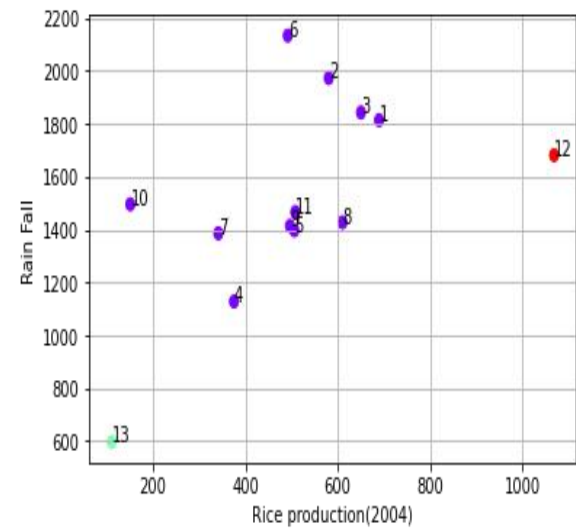
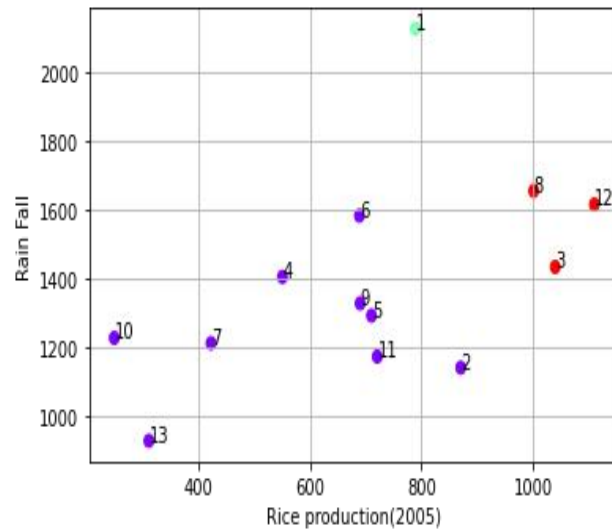
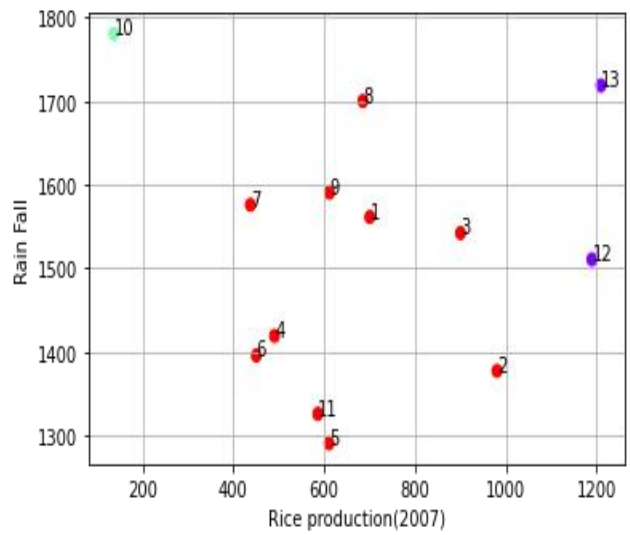
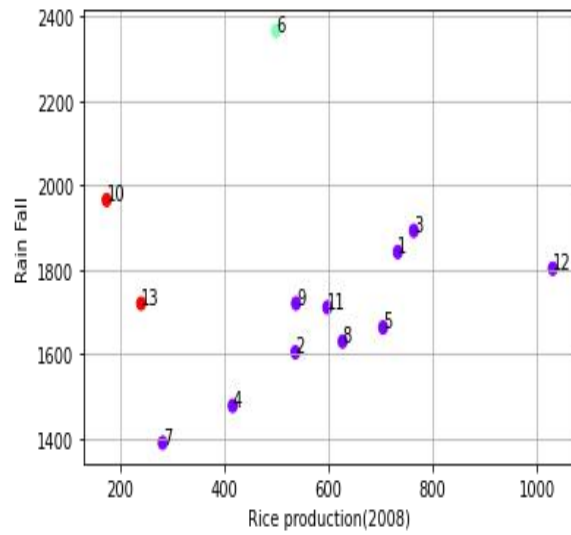
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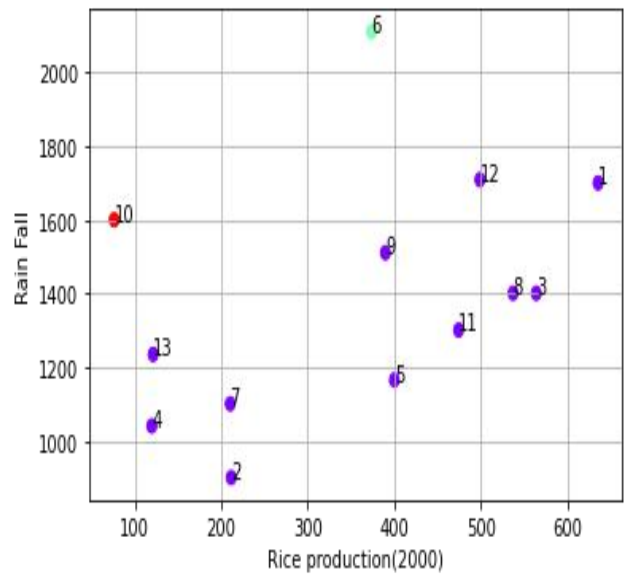
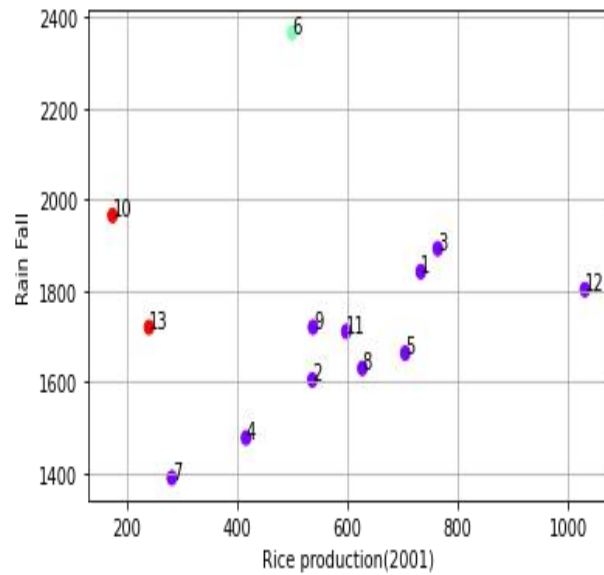
## Output:











## **Input:**

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
from google.colab import files
uploaded = files.upload()
import pandas as pd
import io
df = pd.read_csv(io.BytesIO(uploaded['head.csv']))
print(df)
np.random.seed(200)
k=3
centroids = {i+1:[np.random.randint(150,900),np.random.randint(800,1600)]
              for i in range(k)}
fig=plt.figure(figsize=(6,6))
```

```

plt.scatter(df['Rice production'],df['Rain Fall'],color='k',s = 60)

colmap={1:'r',2:'g',3:'b'}

for i in centroids.keys():

    plt.scatter(*centroids[i],color=colmap[i])

plt.xlim(0,1000)

plt.ylim(1000,1600)

plt.show

def assignment (df, centroids):

    for i in centroids.keys():

        #sqrt((x1 - x2)^2-(y1 - y2)^2)

        df['distance_from_{}'.format(i)] = (

            np.sqrt(

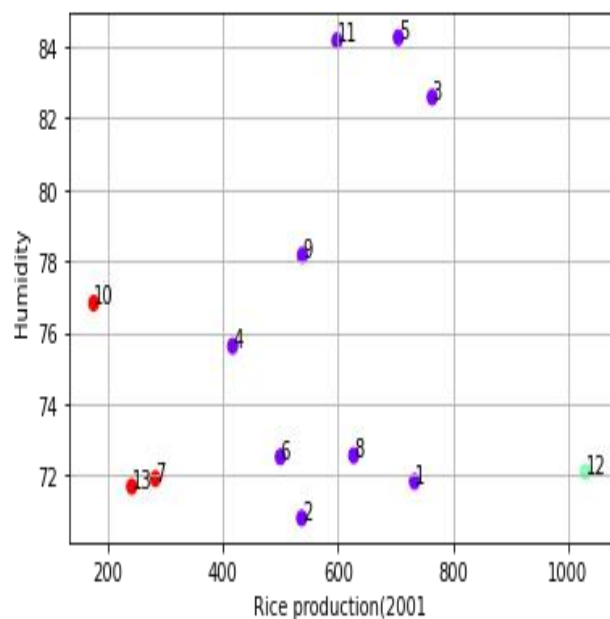
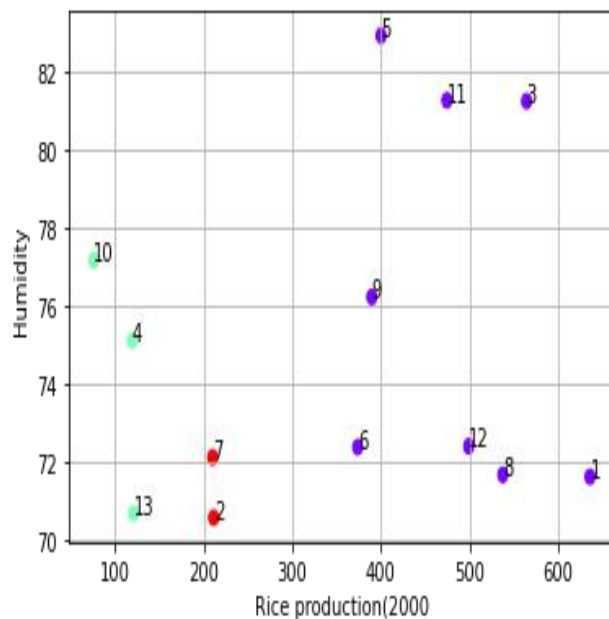
                (df['Rice production'] - centroids[i][0]) ** 2

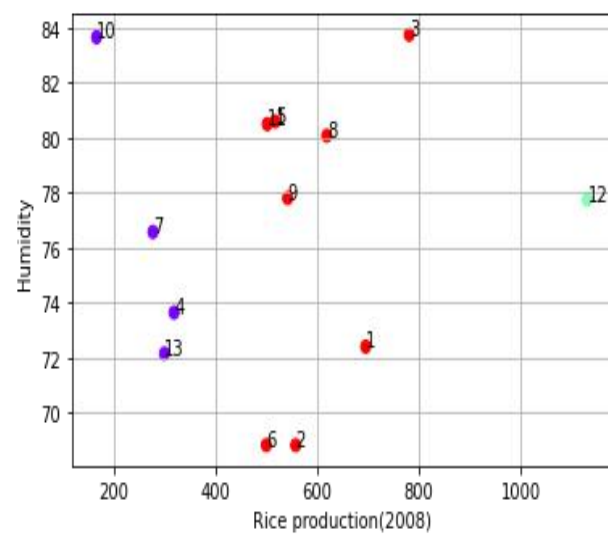
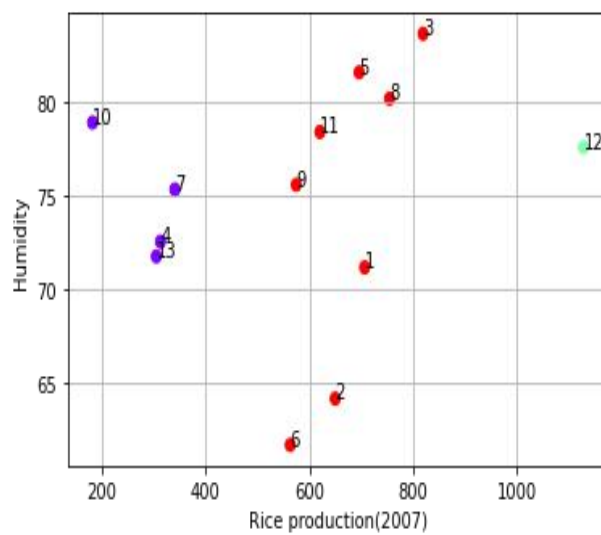
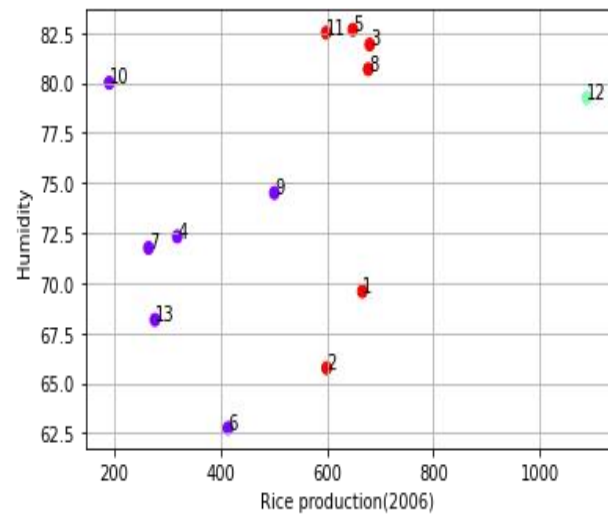
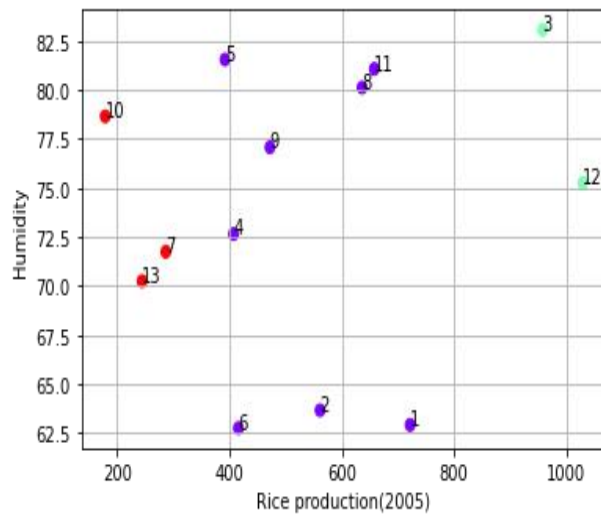
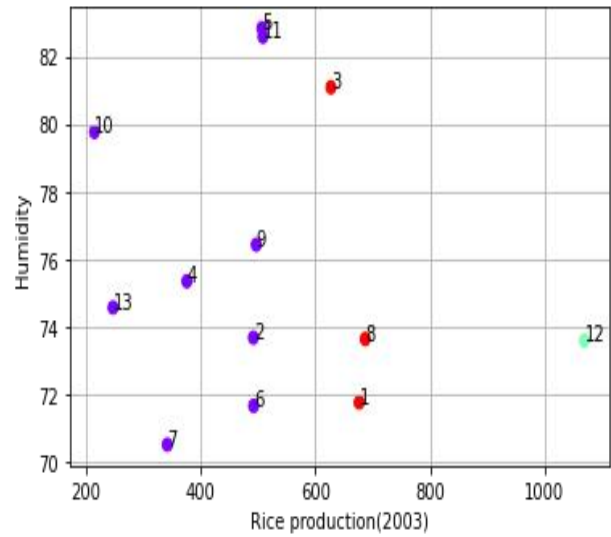
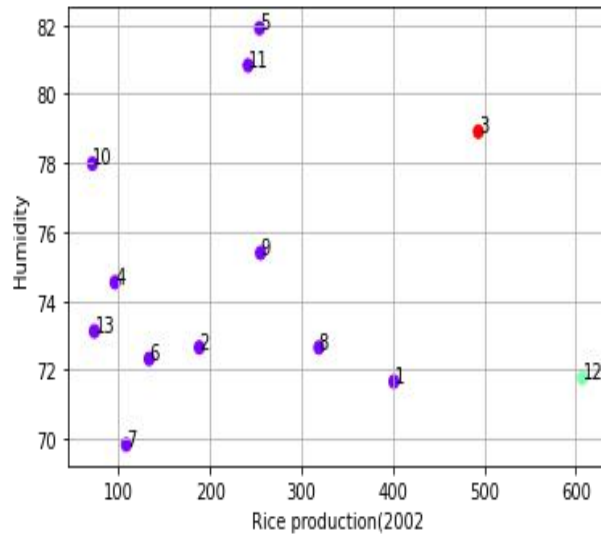
                + (df['Rain Fall'] - centroids[i][1]) ** 2

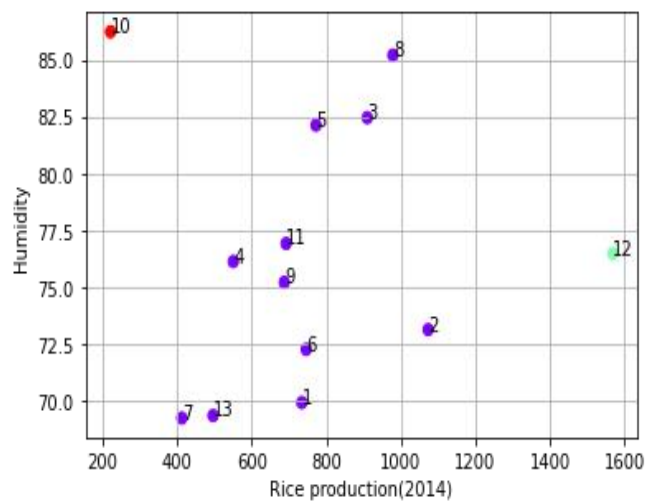
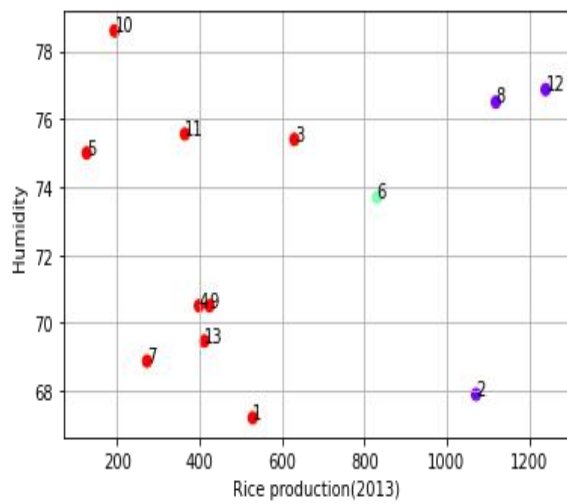
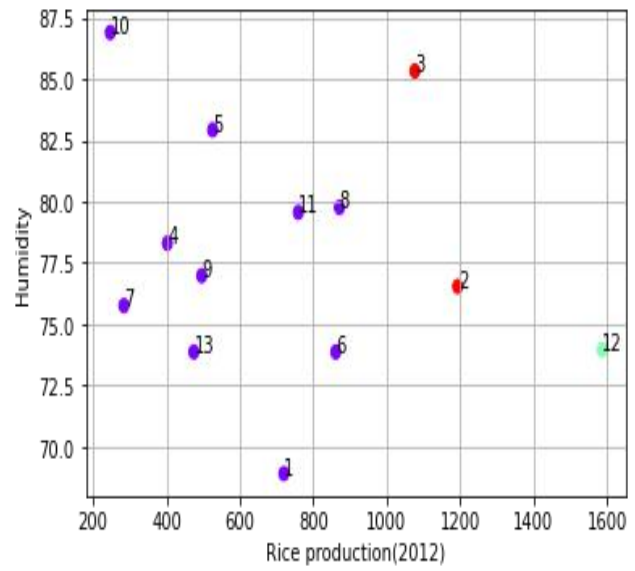
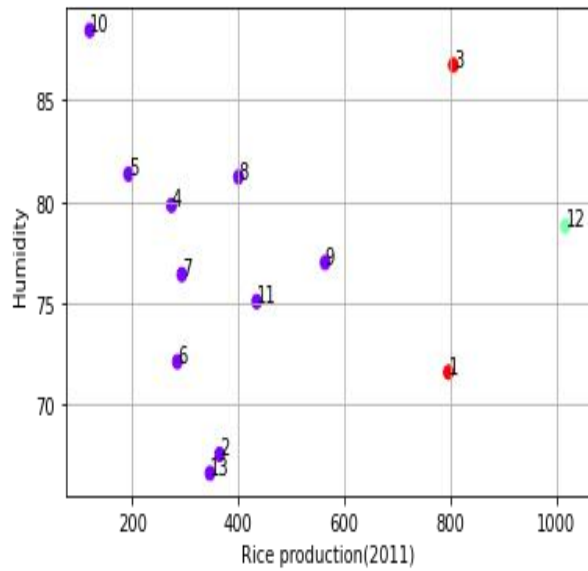
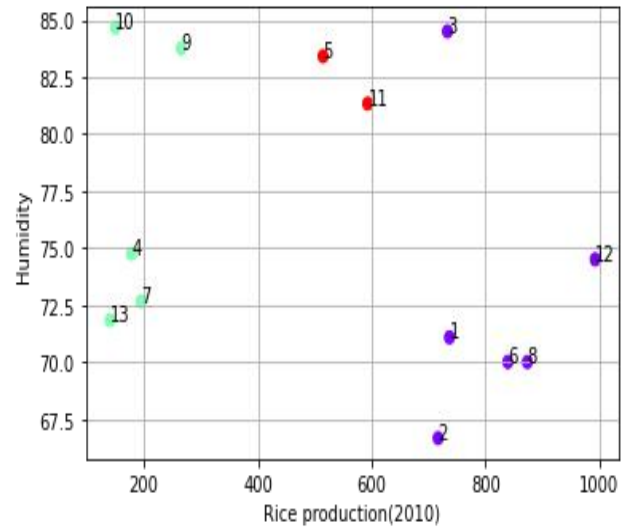
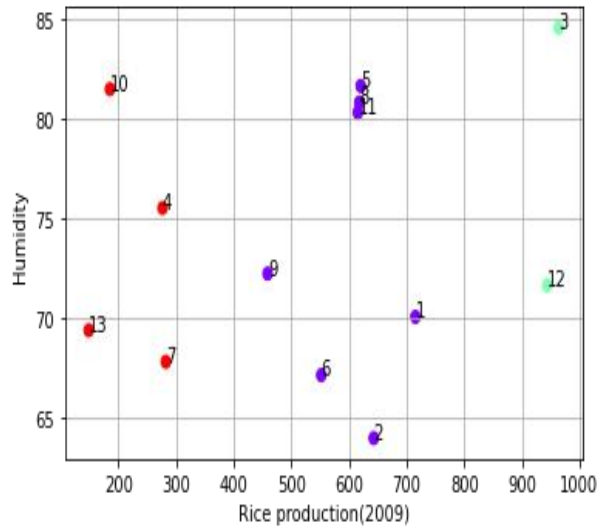
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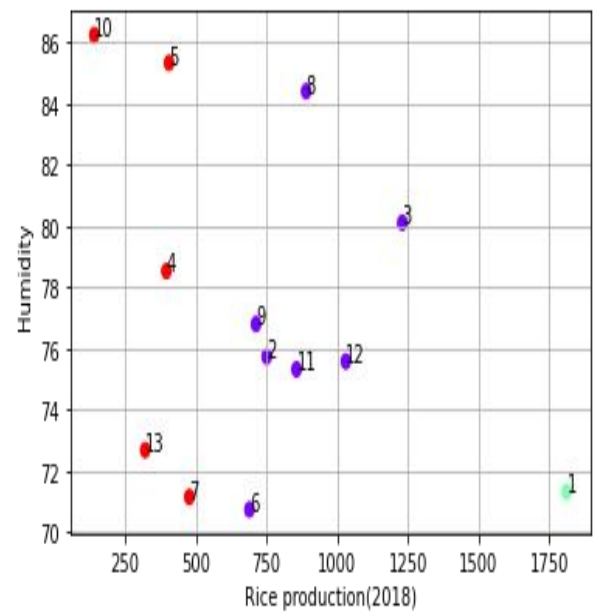
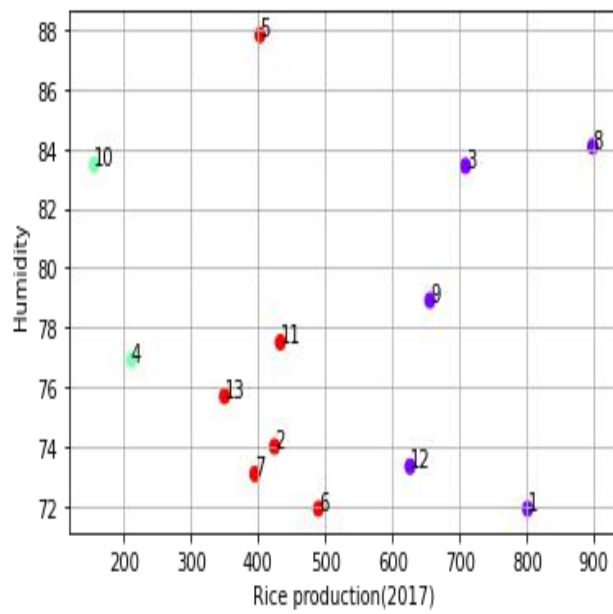
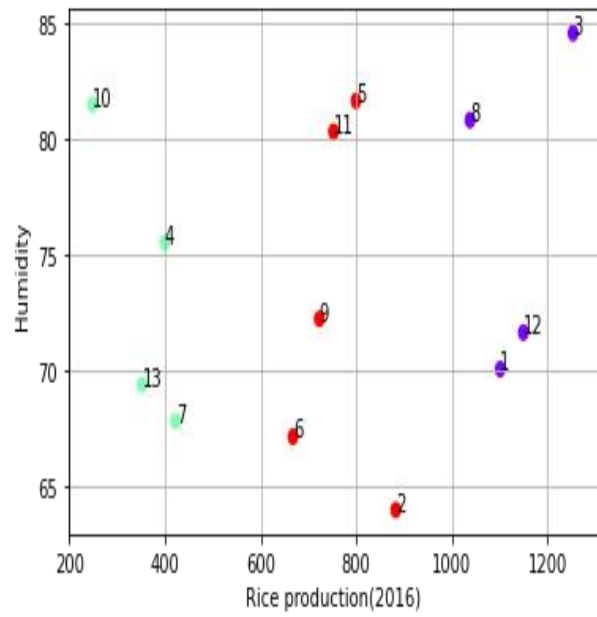
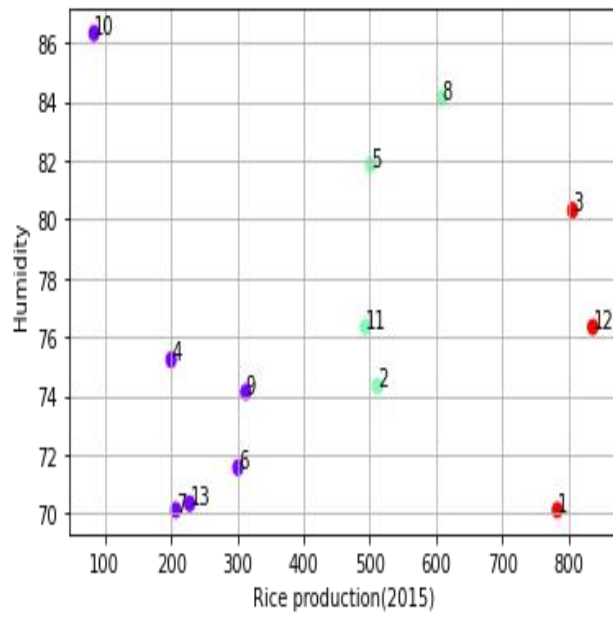
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## Output :









## **Input:**

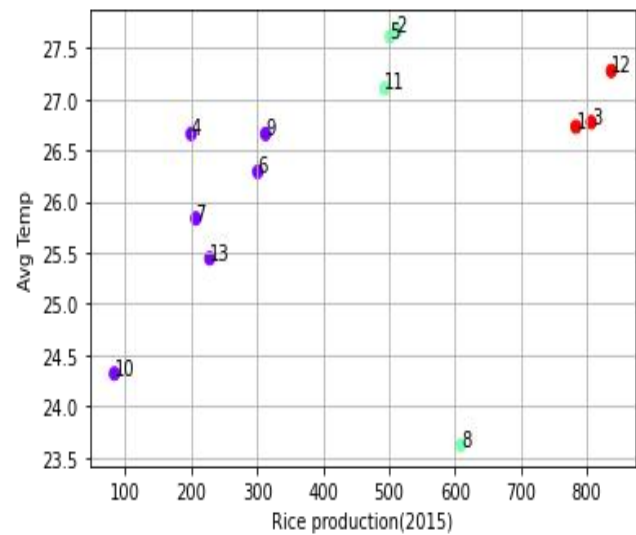
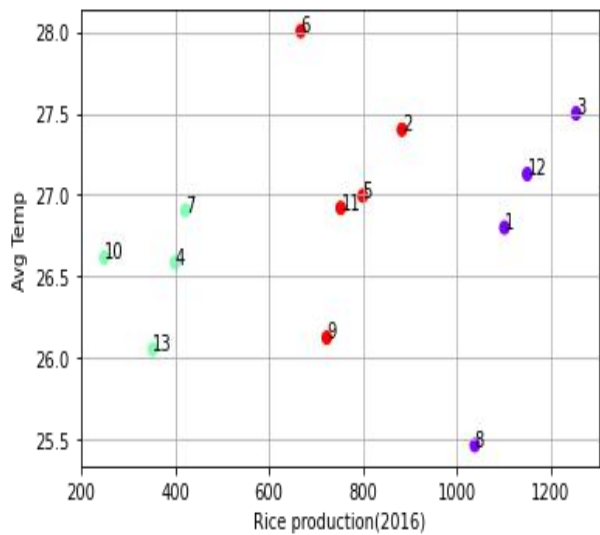
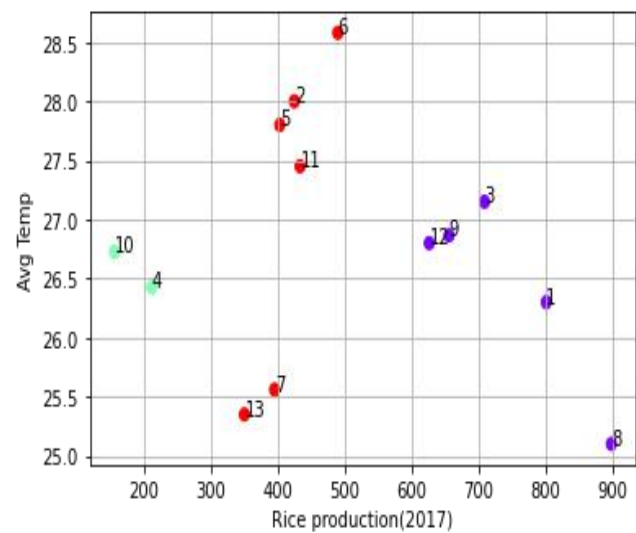
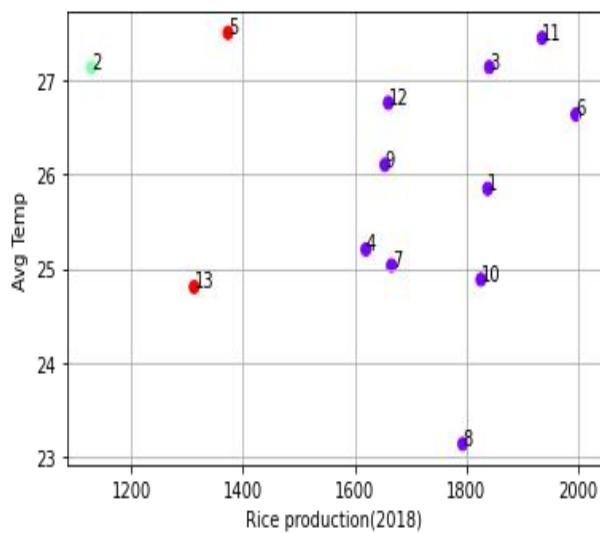
```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
from google.colab import files
uploaded = files.upload()
import pandas as pd
import io
df = pd.read_csv(io.BytesIO(uploaded['head.csv']))
print(df)
np.random.seed(200)
k=3
centroids = {i+1:[np.random.randint(150,900),np.random.randint(800,1600)]
              for i in range(k)
              }
fig=plt.figure(figsize=(6,6))
plt.scatter(df['Rice production'],df['Rain Fall'],color='k',s = 60)
colmap={1:'r',2:'g',3:'b'}
for i in centroids.keys():
    plt.scatter(*centroids[i],color=colmap[i])
plt.xlim(0,1000)
plt.ylim(1000,1600)
plt.show
def assignment (df, centroids):
    for i in centroids.keys():
        #sqrt((x1 - x2)^2-(y1 - y2)^2)
        df['distance_from_{}'.format(i)] = (
```

```

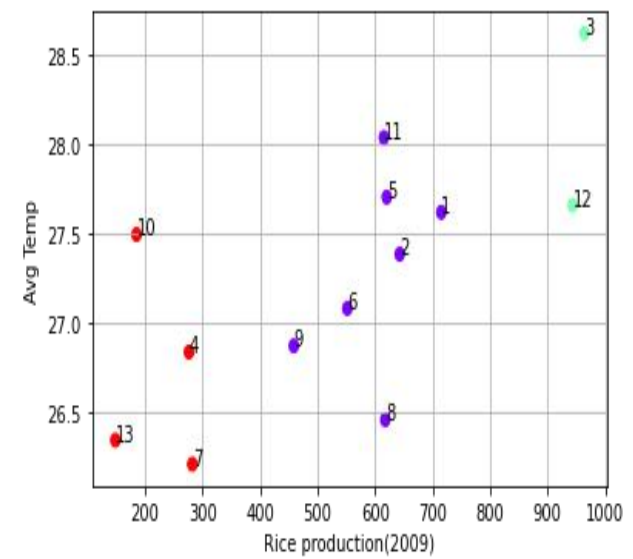
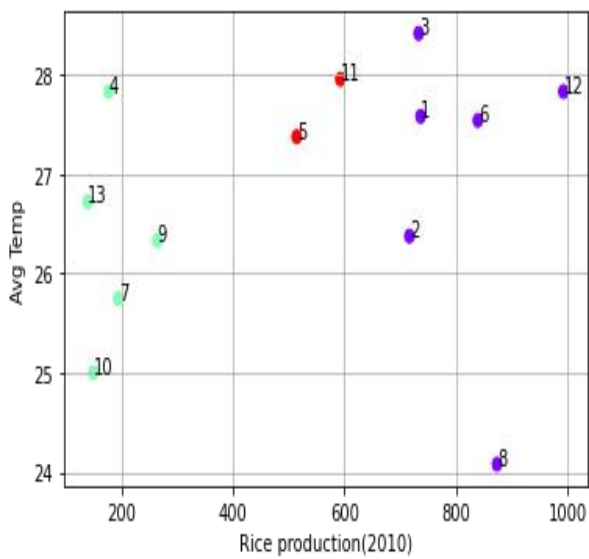
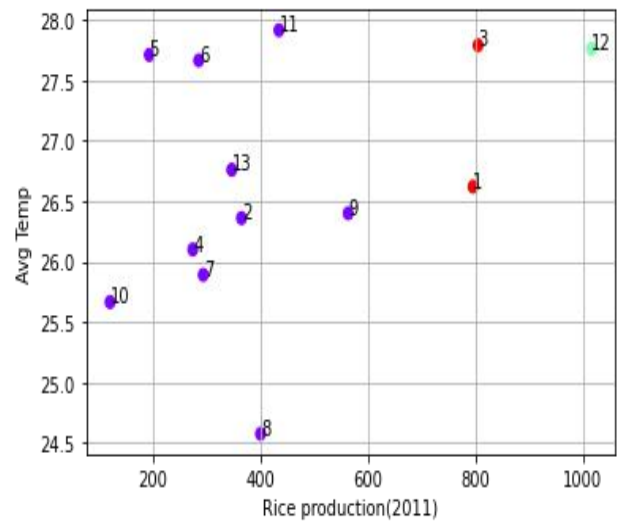
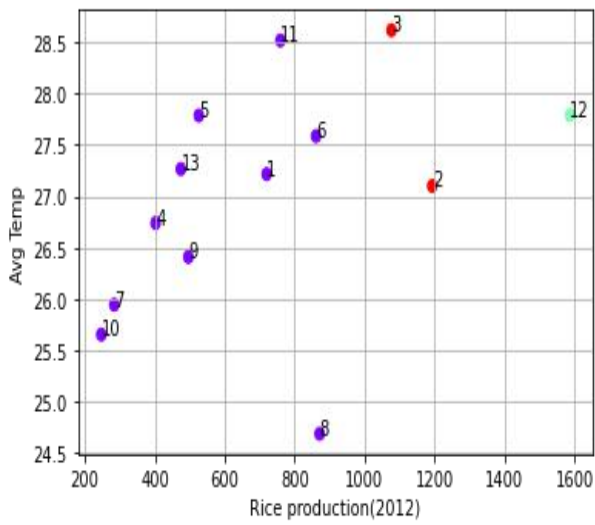
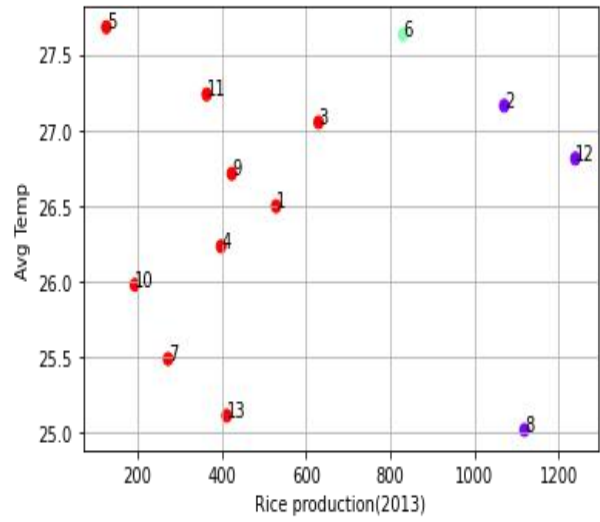
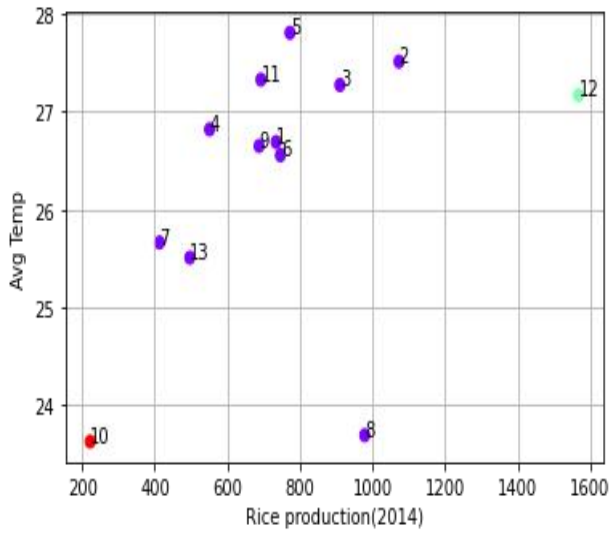
np.sqrt(
    (df['Rice production'] - centroids[i][0]) ** 2
    + (df['Rain Fall'] - centroids[i][1]) ** 2
)

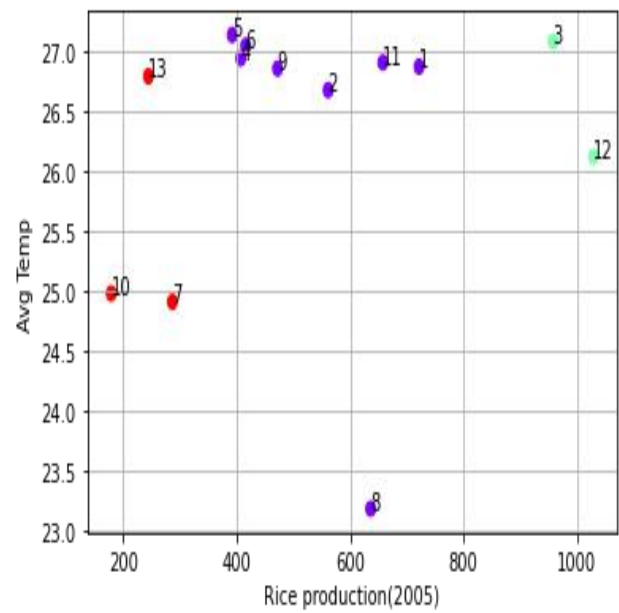
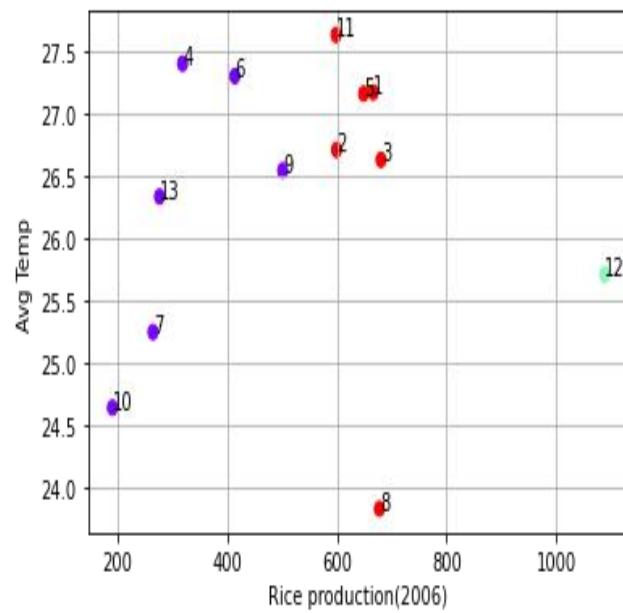
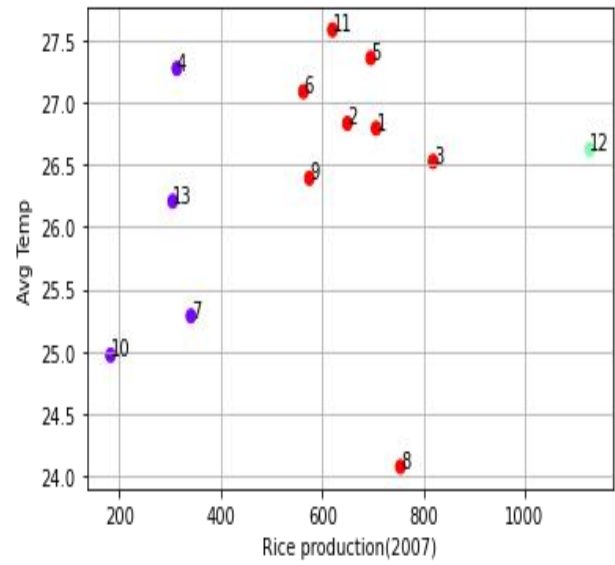
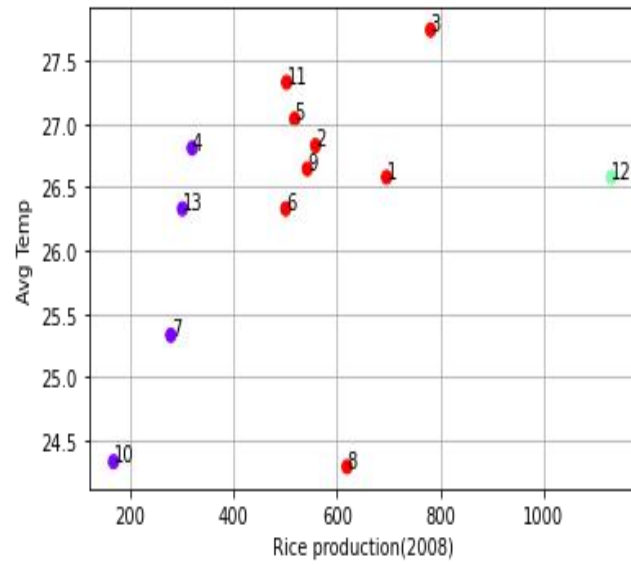
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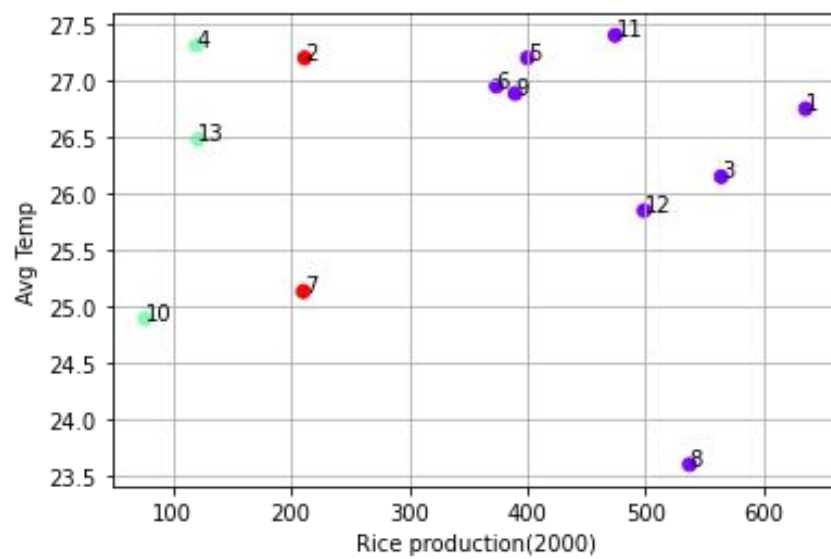
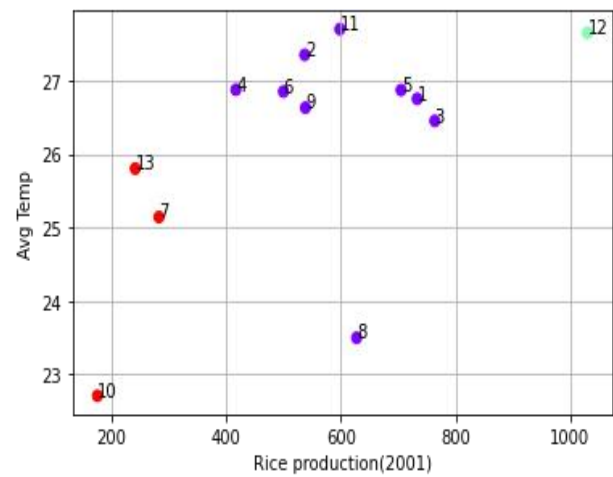
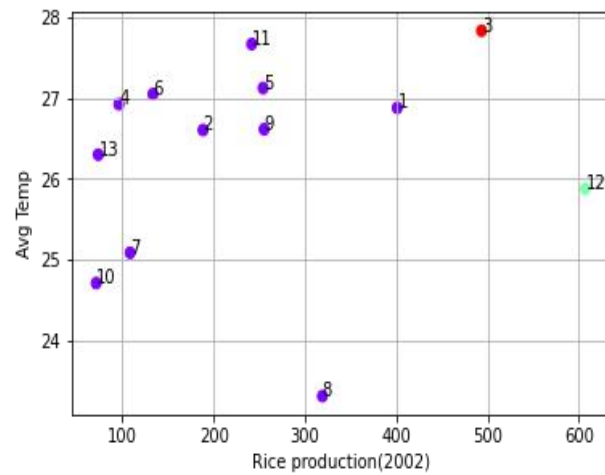
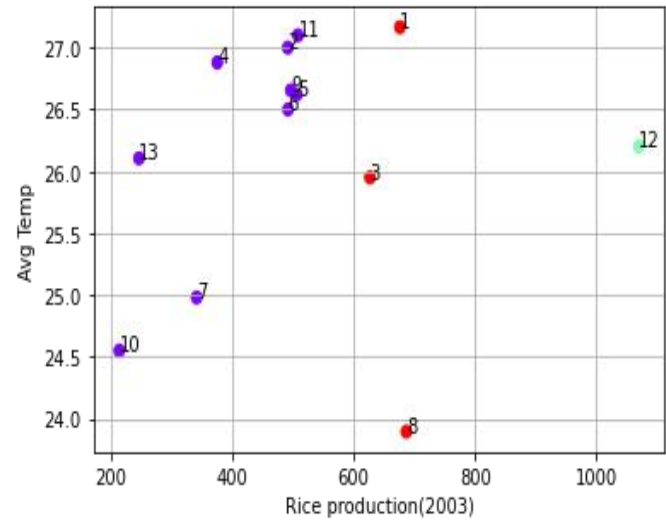
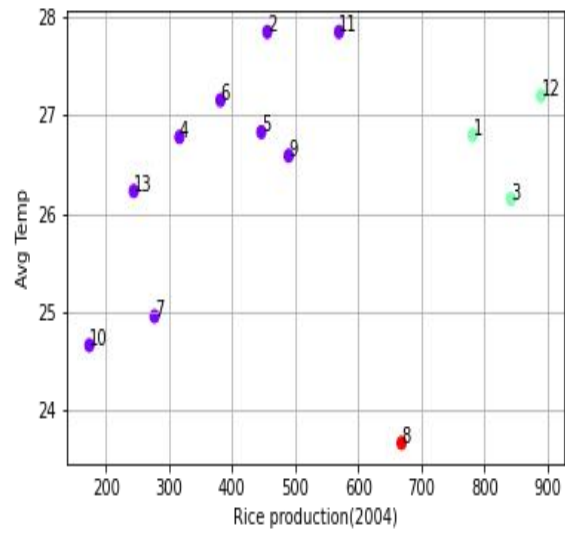
## Output:











# CHAPTER IV

## DISCUSSION AND CONCLUSION

## Chapter IV

### DISCUSSION AND CONCLUSION

#### 4.1 Discussion

##### 4.1.1 Favorable condition for rice production:

Rice crop needs a hot and humid climate. It is best suited to regions which have high humidity, prolonged sunshine and an assured supply of water. The average temperature required throughout the life period of the crop ranges from 21 to 37° C. Maximum temp which the crop can tolerate 40°C to 42°C. Relative humidity plays a major role in altering the days to first flowering. The minimum relative humidity required for flowering of rice was 40 percent; the optimum being 70-80 per cent. If the RH is below 40 per cent, flowering is inhibited. According to **Wang et al. (1992)**, duration of lemma closing in rice decreased with increase in relative humidity from 60 to 100 per cent. Relative humidity influences the rate of transpiration. The increased transpiration may influence the physiological process affecting the yield. Paddy requires more water than any other crop. As a result, paddy cultivation is done only in those areas where minimum rainfall is 115 cm. Although the regions are having average annual rainfall between 1750—3000 cm are the most suitable.



I have taken 13 Districts of Odisha where the rice grown. The region of the respective districts has been given below according to the map of Odisha.

**Table-1: Reference region of the 13 districts**

Sl.no.	District Name	Region
1	Balasore	North
2	Bolangir	Central
3	Cuttack	Central
4	Dhenkanal	Central
5	Ganjam	West
6	Kalahandi	Central
7	Keonjhar	North
8	Koraput	Central
9	Mayurbhanja	North
10	Kandhamal	Central
11	Puri	West
12	Sambalpur	Central
13	Sundargarh	North-east

**Table-2: Rice production and Rainfall**

YEAR	RICE PRODUCTION	RAINFALL	DISTRICT	AREA
2000	150	1300	Bolangir, Dhenkanal, Keonjhar, Kandhamal, Sundargarh	Central, northeast
	600	1500	Balasore, Cuttack, Ganjam, Koraput, Mayurbhanja, Puri, Sambalpur	North, west, central
	350	2000	Kalahandi	Central
2001	200	1700	Dhenkanal, Keonjhar, Kandhamal, Sundargarh	North-east, central
	575	2050	Balasore, Bolangir, Cuttack, Ganjam, Koraput, Mayurbhanja, Puri, Sambalpur	North, west, central
	1100	1800	Kalahandi	Central
2002	200	1000	Balangir, Ganjam, Keonjhar, Koraput, Mayurbhanja, Puri, Sundargarh	Central, northeast, west
	150	1700	Dhenkanal, Kalahandi, Kandhamal	Central

	500	1200	Balasore, Cuttack, Sambalpur	Central, north
2003	300	1100	Keonjhar, Kandhamal, Sundargarh	Central, northeast
	900	1450	Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Sambalpur, Puri	North, west, central
	900	2000	Balasore	North
2004	200	600	Sundargarh	North-east
	350	1300	Dhenkanal, Ganjam, Kandhamal, Keonjhar, Koraput, Mayurbhanja, Puri	North, west, central
	850	1850	Bolangir, Balasore, Cuttack, Kalahandi, Sambalpur	Central
2005	300	600	Keonjhar, Kandhamal, Sundargarh	North, Northeast, central
	950	1450	Bolangir, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, central
	800	2200	Balasore, Cuttack, Koraput, Sambalpur	Central
2006	300	1100	Kandhamal, Sundargarh	North-east, central
	700	1400	Balasore, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Mayurbhanja, Puri	North, west, central
	1100	1650	Koraput, Sambalpur	Central
2007	100	750	Kandhamal	Central
	700	1475	Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Puri	North, west, central
	1200	1600	Sambalpur, Sundargarh	North-east, central
2008	200	1700	Keonjhar, Kandhamal, Sundargarh	North, Northeast, central
	550	2050	Bolangir, Balasore, Cuttack, Dhenkanal, Ganjam, Kalahandi, Koraput, Mayurbhanja, Puri	North, west, central
	1100	1800	Sambalpur	Central

2009	200	1400	Keonjhar, Sundargarh	North-east, North
	900	1700	Bolangir, Balasore, Cuttack, Dhenkanal, Ganjam, Kalahandi, Koraput, Puri, Sambalpur	North, west, central
	100	2500	Kandhamal	Central
2010	100	1550	Dhenkanal, Kandhamal	Central
	250	1100	Keonjhar, Mayurbhanja, Sundargarh	North-east, North
	800	1400	Balasore, Bolangir, Cuttack, Ganjam, Kalahandi, Koraput, Puri, Sambalpur	North, west, central
2011	300	1300	Dhenkanal, Keonjhar, Sundargarh	North, Northeast, central
	500	2150	Balasore, Bolangir, Cuttack, Ganjam, Kalahandi, Kandhamal, Koraput, Puri	North, west, central
	1100	1700	Sambalpur	Central
2012	400	1400	Dhenkanal, Ganjam, Keonjhar, Mayurbhanja, Kandhamal, Sundargarh	North, Northeast, central
	950	1350	Balasore, Bolangir, Cuttack, Kalahandi, Koraput, Puri,	North, west, central
	1600	1900	Sambalpur	Central
2013	300	1100	Keonjhar, Kandhamal, Sundargarh	North, Northeast, central
	700	1400	Bolangir, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, west, central
	950	1900	Balasore, Cuttack, Koraput, Sambalpur	Central, North
2014	800	1550	Bolangir, Dhenkanal, Ganjam, Kalahandi, Puri, Balasore, Cuttack, Keonjhar, Koraput, Mayurbhanja	North, west, North-east, central
	100	1750	Kandhamal	Central
	1200	1600	Sambalpur, Sundargarh	North-east, central
2015	150	1100	Dhenkanal, Keonjhar, Kandhamal	Central, North
	600	1250	Bolangir, Balasore, Cuttack, Ganjam, Kalahandi, Puri, Mayurbhanja, Puri	North, west, North-east, central
	600	1600	Koraput	Central



2016	300	1200	Dhenkanal, Keonjhar, Kandhamal, Sundargarh	North, North-east
	800	1200	Bolangir, Ganjam, Kalahandi, Mayurbhanja, Puri	North, West, Central
	1150	1500	Balasore, Cuttack, Koraput, Sambalpur	Central
2017	200	1200	Dhenkanal, Kandhamal	Central
	400	800	Bolangir	Central
	650	1450	Balasore, Cuttack, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Sambalpur, Sundargarh	North, West, Central, Northeast
2018	300	1100	Keonjhar, Kandhamal, Sundargarh	Central, Northeast
	700	1500	Balasore, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	Central, North, West
	1100	1600	Bolangir, Cuttack, Koraput, Sambalpur	Central

- 1.Low Rice production with respect to low Rain fall movement starting point i.e; 2000 is in the Central and the North- Eastern region and when time flows it changes to Northern, North-Eastern and Central region and stays there upto 2018.
- 2.Medium Rice production occuring in the Northern, Western, Central region of Odisha for maximum number of years for a medium amount of Rain fall. Hence the movement of region is not affected by the medium amount of Rain fall.
- 3.Due to heavy Rain fall a high amount of Rice production had been seen in the Central region of the Odisha.

**Table-3: Rice Production and Humidity**

YEAR	RICE PRODUCTION	HUMIDITY	DISTRICT	AREA
2000	200	74	Bolangir, Dhenkanal, Keonjhar, Kandhamal, Sundargarh	North, North-East, Central
	500	73	Balasore, Kalahandi, Koraput, Mayurbhanja, Sambalpur	North, Central
	500	82	Cuttack, Ganjam, Sambalpur	West, Central

2001	450	7 4	Balasore, Bolangir, Dhenkanal, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri	North, West, Central
	110 0	7 2	Sambalpur	Central
	700	8 3	Cuttack, Ganjam, Sundargarh	Central, West, North- East
2002	100	7 5	Bolangir, Dhenkanal, Kalahandi, Keonjhar, Sundargarh	North, North-East, Central
	350	77	Baleswar, Ganjam, Koraput, Mayurbhanja, Puri	North, West, Central
	550	76	Cuttack, Sambalpur	Central
2003	500	73	Balasore, Bolangir, Dhenkanal, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Sundargarh	North, North-East, Central
	400	82	Kandhamal, Cuttack, Ganjam, Puri	Central, West
	1100	74	Sambalpur	Central
2004	300	74	Bolangir, Dhenkanal, Kalahandi, Keonjhar, Sundargarh, Kandhamal	North, North-East, Central
	600	78	Ganjam, Koraput, Mayurbhanja, Puri	North, Central, West
	850	74	Baleswar, Cuttack, Sambalpur	North, Central
2005	450	76.2 5	Dhenkanal, Ganjam, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri, Sundargarh	North, North-East, Central
	600	62.5	Baleswar, Bolangir, Kalahandi	North, Central
	1000	80	Cuttack, Samabalpur	Central
2006	400	71.2 5	Baleswae, Bolangir, Dhenkanal, Keonjhar, Mayurbhanja, Kandhamal, Sundargarah	North, North-East, Central
	600	81.5	Cuttack, Ganjam, Koraput, Puri	Central, West
	1100	80.0	Sambalpur	Central
	600	63	Bolangir, Kalahandi	Central

2007	700	80	Baleswar, Cuttack, Dhenkanal, Ganjam, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri, Sundargarah	North-East, North, Central, West
	1200	78	Sambalpur	Central
2008	200	78	Dhenkanal, Keonjhar, Kandhamal, Sundargarah	North, North-East, Central
	650	76	Baleswar, Bolangir, Cuttack, Ganjam, Kalahandi, Koraput, Mayurbhanja, Puri	North, West, Central
	1200	78	Sambalpur	Central
2009	200	76	Dhenkanal, Keonjhar, Kandhamal, Sundargarah,	North, North-East, Central
	650	72	Baleswar, Bolangir, Kalahandi, Mayurbhanja, Puri, Ganjam	North, West, Central
	1100	80	Cuttack, Sambalpur	Central
2010	100	72.5	Dhenkanal, Keonjhar, Sundargarah	North, North-East, Central
	500	82.5	Cuttack, Ganjam, Mayurbhanja, Kandhamal, Puri	North, West, Central
	900	70.0	Baleswar, Bolangir, Kalahandi, Koraput, Sambalpur	North, Central
2011	400	77	Baleswar, Bolangir, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri, Sundargarah	North, West, Central, North-East
	800	80	Bolangir, Cuttack	Central
	1000	78	Sambalpur	Central
2012	500	80	Bolangir, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri, Sundargarah	North, West, Central, North-East
	1100	82	Baleswar, Cuttack	North, Central
	1600	73	Sambalpur	Central

2013	400	70	Baleswar, Dhenkanal, Keonjhar, Mayurbhanja, Sundargarah	North, North-East, Central
	300	76	Cuttack, Ganjam, Kalahandi, Puri	Central, West
	1100	78	Bolangir, Koraput, Sambalpur	Central
2014	200	87	Kandhamal	Central
	800	77.5	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Keonjhar, Koraput, Mayurbhanja, Kandhamal, Puri, Sundargarah	Central, North-East, North, West
	1600	75	Sambalpur	Central
2015	250	72	Dhenkanal, Kalahandi, Keonjhar, Mayurbhanja, Sundargarh	North, North-East, Central
	600	80	Bolangir, Ganjam, Koraput, Puri	Central, West
	800	74	Baleswar, Cuttack, Sambalpur	North, Central
2016	300	75	Dhenkanal, Keonjhar, Kandhamal, Sundargarh	North, North-East, Central
	800	75	Bolangir, Ganjam, Mayurbhanja, Puri	North, West, Central
	1200	80	Baleswar, Cuttack, Koraput, Sambalpur	North, Central
2017	300	86	Ganjam, Kandhamal	West, Central
	600	74	Baleswar, Bolangir, Dhekanal, Kalahandi, Keonjhar, Puri, Sambalpur, Sundargarh	North, North-East, Central
	900	84	Cuttack, Koraput	Central
2018	500	83	Ganjam, Koraput, Kandhamal	West, Central
	750	74	Bolangir, Cuttack, Kalahandi, Keonjhar, Mayurbhanja, Puri, Sambalpur, Sundargarh	West, North-East, Central, North
	1800	71	Baleswar	North

1. There was a low Rice production in the North, North- East and Central region of the Odisha due to the percentage of the humidity lies between 70 to 87%. The region is constant throughout the 12 years and at the end of the 5 years Western region has come into the picture.
2. Whereas medium amount of Rice production occurred in the Western, Northern and Central region of Odisha for the humidity lies between 72 to 83. So the movement of cluster of medium Rice production was started from Central and Northern region of Odisha to Western,

Northern, Central and the North-Eastern part of the Odisha in the given 18 years.

3. Finally most of the time there is no movement in clusters of high Rice production due to humidity. The region of high Rice production occurred in the Western and Central part.

**Table-4: Rice Production and Temperature**

YEAR	RICE PRODUCTION	TEMPERATURE	DISTRICT	AREA
	130	26.5	Bolangir, Dhenkanal, Keonjhar, Kandhamal, Sundargarh	Central, North, North-East
2000	550	23.3	Koraput	South
	500	27.3	Baleswar, Cuttack, Ganjam, Kalahandi, Koraput, Mayurbhaja, Puri, Sambalpur	Central, West, North
2001	200	25	Keonjhar, Kandhamal, Sundargarh	Central, North, North- East
	500	27	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Koraput, Mayurbhanja, Puri	North, Central, West
	1100	28	Sambalpur	Central
2002	550	27	Baleswar, Cuttack, Sambalpur	North, Central
	200	26	Bolangir, Dhenkanal, Ganjam, Kalahandi	Central, West, North, North-East
	300	23	Koraput	South
2003	200	25.5	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.5	Koraput	South
	1100	27	Sambalpur	Central
	500	26.5	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, West, Central
2004	200	25.3	Keonjhar, Kalahandi, Sundargarh	North, Central, North-East

	650	233	Koraput	Central
	400	27	Bolangir, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West
	400	27	Baleswar, Cuttack, Sambalpur	North, North-Central
2005	200	26	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.3	Koraput	Central
	1000	26.5	Cuttack, Sambalpur	Central
	600	27	Baleswar, Bolangir, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	Central
2006	200	26	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.3	Koraput	Central
	1100	23.3	Sambalpur	Central
	450	27	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West
2007	200	26	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.3	Koraput	Central
	1100	23.3	Sambalpur	Central
	450	27	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West
2008	200	26	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.3	Koraput	South
	1100	23.3	Sambalpur	Central

	450	27	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West
2009	200	27	Dhenkanal, keonjhar, kandhamal, sundargarh	North, Central, West
	700	27.5	Balasore, bolangir, ganjam, kalahandi, koraput, mayurbhanja, puri	Central
	100	28	Cuttack, Sambalpur	Central
2010	200	26	Dhenkanal, keonjhar, mayurbhanja, kandhamal, sundargarh	North, Central, West
	850	24	Koraput	North, Central, West, North-East
	700	28	Balasore, bolangir, cuttack, ganjam, kalahandi, puri	Central
2011	400	27	Bolangir, dhenkanal, ganjam, kalahandi, keonjhar, mayurbhanja, puri, kandhamal, sundargarh	Central
	400	24.5	Koraput	North, Central, West, North-East
	900	27	Balasore, cuttack, sambalpur	Central
2012	400	27.5	Dhenkanal, keonjhar, mayurbhanja, balasore, ganjam, kandhamal, kalahandi, puri, sambalpur	Central
	900	24.5	Koraput	South
	1400	28	Bolangir, cuttack, sambalpur	Central
2013	400	26.5	Balasore, Cuttack, dhenkanal, kalahandi, keonjhar, mayurbhanja, puri, kandhamal, sundargarh	North, Central, West, North-East
	1100	25	Koraput	South
	1100	27.5	Bolangir, Ganjam, Sambalpur	Central
2014	200	24	Kandhamal	Central
	700	27	Balasore, bolangir, cuttack, Dhenkanal, ganjam, ganjam, kalahandi, keonjhar, mayurbhanja, puri, sundargarh	North, Central, West, North-East
	1000	23.5	Koraput	South
	1600	27	Sambalpur	Central
2015	200	26	Dhenkanal, keonjhar, mayurbhanja, Kandhamal	Central, West
	500	27	Bolangir, Ganjam, Puri	North, Central, North-East
	600	23.5	Koraput	South
	800	27	Balasore, cuttack, sambalpur	North, Central

2016	300	26.5	Dhenkanal, Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	800	27	Bolangir, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West
	1000	25	Koraput	South
	1200	27	Baleswar, Cuttack, Sambalpur	Central, North
2017	200	26.5	Dhenkanal, Kandhamal	Central
	400	27	Bolangir, Ganjam, Kalahandi, Keonjhar	North, Central, West, North-East
	900	25	Koraput	South
	700	26.5	Baleswar, Cuttack, Mayurbhanja, Sambalpur	Central, North
2018	200	26	Keonjhar, Kandhamal, Sundargarh	North, Central, North-East
	650	23.3	Koraput	South
	1100	23.3	Sambalpur	Central
	450	27	Baleswar, Bolangir, Cuttack, Dhenkanal, Ganjam, Kalahandi, Mayurbhanja, Puri	North, Central, West

1. In interval of Temperature of our dataset is lies between 22 to 29. For the low Rice production in Central, Northern and North-Eastern part of the Odisha the Temperature lies between 25 to 27.
2. In the Southern region which is Koraput is a district where the Temperature is always lies between 22 to 25, still it's get medium amount of Rice production. And also in the Sambalpur district which is comes into the Central region where the Temperature was always lying between 25 to 29 where the high amount of Rice production had been seen in throughout the 18 year's.
3. As the favourable Temperature of the Rice production lies between 21 to 37 degree Celsius, Odisha has a good climate for the production of rice which we can see in the Central, western and Northern region with more than medium amount of Rice production. So throughout the



18 years there is no movement of clusters due to Temperature as all the districts has the favorable climatic temperature for the Rice production.

## **4.2 Conclusion**

Odisha satisfies all the weather conditions that are required for the Rice production that's why it is always among the top in the list of Rice production in India. When the Rain fall is greater than 1500 mm a good Rice production occurred all over the Odisha, this implies low production means low rainfall and high Rice production means high amount of rainfall and vice versa i.e Rice production is directly proportion to rainfall. The favourable condition of humidity is 72 to 80% and humidity of Odisha lies between 70 to 85% most of the time. Hence we can say that Odisha has good climate for Rice production, so when the humidity levels increases there is a movement of cluster in Rice production in different region of Odisha. Otherwise the cluster for Rice production with respect to humidity is constant.

The favourable Temperature for the Rice production is 21 to 37° Celcius and the Central region of Odisha have a favorable Climate with respect to Temperature for Rice production. So, there is a high Rice production in Central region of Odisha as compare to Coastal region of Odisha. So from this study we conclude that the favourable climate for the Rice production in Odisha with respect to rainfall lies between 1500 mm to 2300 mm, with respect to humidity it is lies between 72 to 82.5% and with respect to average temperature 23 to 28° Celcius.

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