Problem Description: Sustainability of the human race in different parts of the world is challenged by the shortage of food. The world population has grown six hundred percentage - from one billion to about six billion - in the last two hundred years. According to the Population Institute, roughly, 230 thousand more babies are born every day. The World Food Programme estimates that about 795 million people do not have adequate food to lead a healthy life. About 3.1 million children die every year because of poor nutrition. On the other hand, land used for farming has been decreasing which makes the burden of food shortage acute. Regardless, simply attempting to increase the land available for farming is unlikely to sustain the needed food supply. To address this great problem, this project expects you to develop an analytics framework to aid soybean farmers select up to a given number of varieties of soybeans from a large set of available varieties to maximize the yield at a target farm.

Every year soybean farmers make decisions about the varieties to be grown at their farm. While making this decision, they consider uncertainty due to weather, soil conditions, and yield studies of different varieties. They could choose just one variety or a mix of few varieties to hedge against uncertainties. You are expected to utilize the dataset provided to propose a framework which integrates descriptive, predictive, and prescriptive analytics to optimally select up to five varieties of soybeans.

Deliverables:

- 1. Perform exploratory data analytics to unearth patterns in the given data and utilize those patterns in making predictions and prescriptions.
- 2. Construct one or more prediction models to predict yield of different experimental varieties.
- 3. Optimize the portfolio of (experimental) varieties to be grown at the target farm. The optimal portfolio can have at most 5 varieties of soybean. It is not necessary but you are welcome to use the methods you learn in prescriptive analytics class to construct the optimal portfolio.

Data Sets:

- 1. Training Data for Ag Project
- 2. Evaluation Dataset for Ag Project

Key:

GrowingSeason	Year	Date
Location	trial location code	Id number
Genetics	breeding group	Group ID
Experiment	Experiment number	Experiment ID
Latitude	Latitude	Decimal degrees
Longitude	Longitude	Decimal degrees
Variety	Variety code	Variety ID
Variety_Yield	Variety yield	Bushels per acre adjusted by
		moisture
Commercial_Yield	Commercial yield for the trial	Bushels per acre adjusted by
		moisture
Yield_Difference	yield difference between	Bushels per acre adjusted by
	experiment and commercial	moisture
	varieties in a trial	
Location_Yield	Average site yield (approximately,	Bushels per acre adjusted by
	checks across experiments)	moisture
RelativeMaturity	Relative Maturity Interval	Relative maturity interval
		(region) based on the location
Weather1	Climate type based on	Climate class
	temperature, precipitation and	
	solar radiation	
Weather2	Season type	Season class
Probability	Probability of growing soybean	Probability of growing
		soybeans in the nearby area of
		the site

RelativeMaturity25	Probability of growing soybean of	Probability of growing
	RM 2.5 to 3	soybeans in the nearby area of
		the site
Prob_IRR	Probability of irrigation	Probability of field
		irrgation nearby the area of the
		site
Soil_Type	Soil type based on texture,	Soil Class
	available water holding capacity,	
	and soil drainage	
TEMP_03	Sum of the temperatures for the	Daily degree Celsius sum
	season 2003	between April 1st and October
		31st
TEMP_04	Sum of the temperatures for the	Daily degree Celsius sum
	season 2004	between April 1st and October
		31st
TEMP_05	Sum of the temperatures for the	Daily degree Celsius sum
	season 2005	between April 1st and October
		31st
TEMP_06	Sum of the temperatures for the	Daily degree Celsius sum
	season 2006	between April 1st and October
		31st
TEMP_07	Sum of the temperatures for the	Daily degree Celsius sum
	season 2007	between April 1st and October
		31st
TEMP_08	Sum of the temperatures for the	Daily degree Celsius sum
	season 2008	between April 1st and October
		31st
TEMP_09	Sum of the temperatures for the	Daily degree Celsius sum
	season 2009	between April 1st and October
		31st

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season 2003 radiation sum between April 1	st
and October 31st	
RAD_04 Sum of the solar radiation for the Daily Watts per sq. meter solar	ar
season 2004 radiation sum between April 1	st
and October 31st	-
RAD_05 Sum of the solar radiation for the Daily Watts per sq. meter solar	
season 2005 radiation sum between April 1	
and October 31st	ar

RAD_06	Sum of the solar radiation for the	Daily Watts per sq. meter solar
	season 2006	radiation sum between April 1st
		and October 31st
RAD_07	Sum of the solar radiation for the	Daily Watts per sq. meter solar
	season 2007	radiation sum between April 1st
		and October 31st
RAD_08	Sum of the solar radiation for the	Daily Watts per sq. meter solar
	season 2008	radiation sum between April 1st
		and October 31st
RAD_09	Sum of the solar radiation for the	Daily Watts per sq. meter solar
	season 2009	radiation sum between April 1st
		and October 31st
RAD_MED	Median Sum of solar radiation for	Daily Watts per sq. meter solar
	season between 1994 and 2007	radiation sum between April 1st
		and October 31st
PH1	Topsoil (10 to 20 cm depth) pH	pH units
AWC1	Topsoil (10 to 20 cm depth)	cm
	Available water capacity in 150 cm	
	soil profile	
Clay1	Topsoil clay content (10 to 20 cm	Percentage
	depth)	
Silt1	Topsoil silt content (10 to 20 cm	Percentage
	depth)	
Sand1	Topsoil sand content (10 to 20 cm	Percentage
	depth)	
Sand2	Soil sand content from another soil	Percentage (5-30 cm)
	source	
Silt2	Soil silt content from another soil	Percentage (5-30 cm)
	source	

Clay2	Soil clay content from another soil	Percentage (5-30 cm)
	source	
PH2	Soil ph from another soil source	pH (5-30 cm)
CEC	Soil cation exchange from another	cmol per kilo (5-30 cm)
	soil source	
CE	Soil cation exchange from another	cmol per kilo (5-30 cm)
	soil source	