

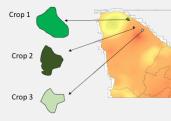
Scoping Meeting Agricultural Risk Assessment

6 - 9 February 2017 - Boulder, Colorado

Data requirements



Historic records Inputs: Station's drought Integrated Precipitation and indicator hazard maps temperature series HAZARD Duration recorded in stations. Severity Intensity **Outputs:** - Future climate series. **Future series** Identify regional - Drought indicator parameters. drought events - Integrated hazard maps. Climate Soil Management Crop Inputs: - Climate series for **VULNERABILITY** drought events - Crop type - Soil type Soil water balance Soil water balance - Modifiers (such as Stress indicator Canopy expansion and irrigation systems) Canopy expansion and senescence senescence **Crop Transpiration Outputs: Crop Transpiration** - Optimum yield Biomass and yield production Biomass and yield production production - Yield production Crop yield response to stress under water stress Crop yield response to water For agricultural droughts: Inputs: - Coordinates, area Cultivated land EXPOSURE



Location Crop type and seasonality Cultivated area Productivity Production cost Loss of profit

- Crop type, production cost per growing stage, yield per unit

Outputs:

- Exposed elements database

RISK

Inputs:

- Hazard (Intensity and frequency)
- Vulnerability (per cultivated land unit)
- Exposed elements database (per cultivated land unit)



Probabilistic risk assessment

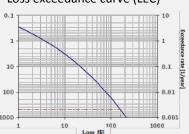
$$\nu(p) = \sum_{i=1}^{N} Pr(P > p|E_i) F_{Ai}$$



Outputs:

Risk metrics

- Loss exceedance curve (LEC)

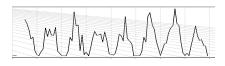


- Average annual loss (AAL)
- Probable maximum loss (PML)
- Risk maps

Inputs

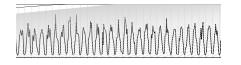
Outputs

Historic records



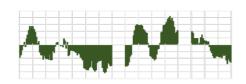
Station or satellite data Downscaling techniques for completion

Future series



Probability distribution fitting

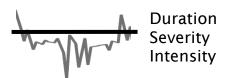
Drought indicator



Reconnaissance Drought Index - RDI

Standardized Precipitation **Evapotranspiration Index - SPEI**

Drought events



Local and regional drought event definition

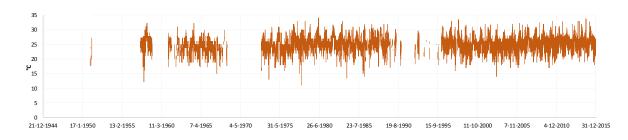
Integrated hazard maps



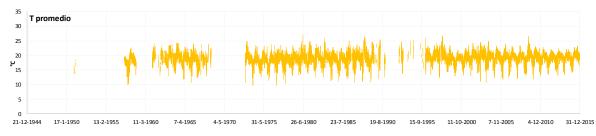
Spatial interpolation

Minimum parameters needed for hazard model

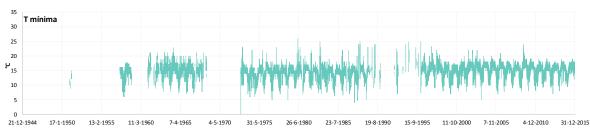
T max [°C]



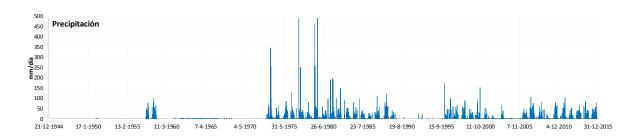
T mean [°C]



T min [°C]



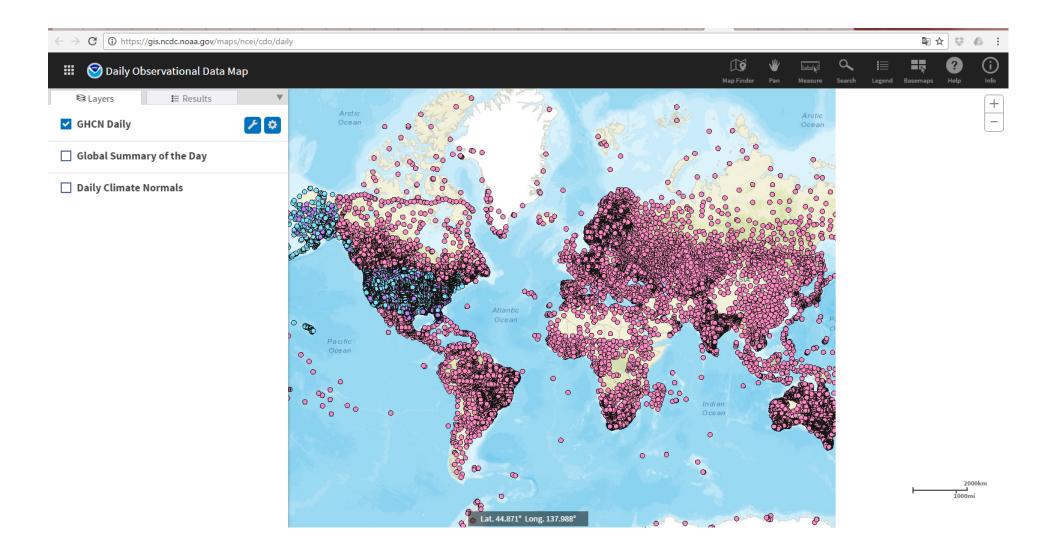
Rainfall [mm/day]



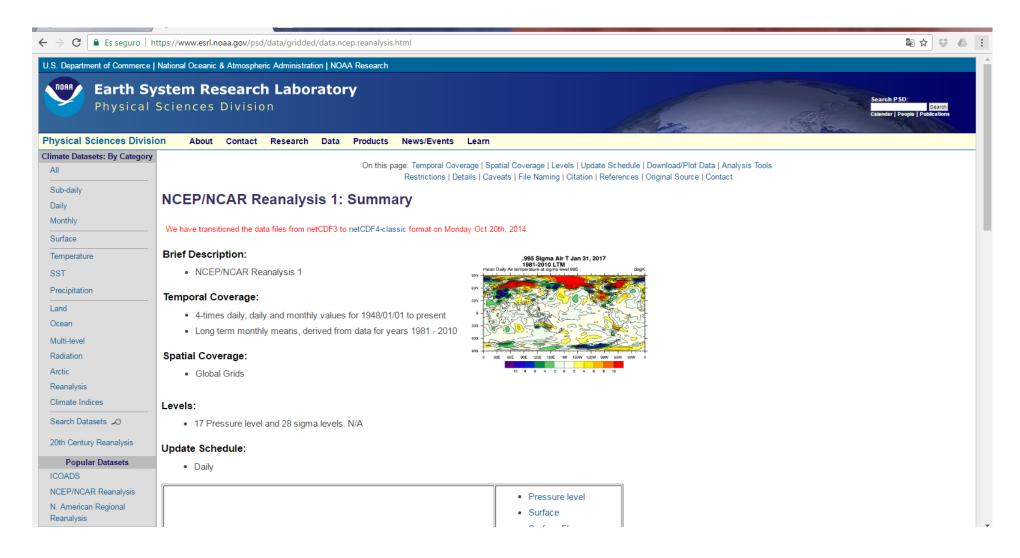
Historic records

	Rainfall	Temperature	
Local	National agencies data		
Global	GHCN-D: Global Historical Climatology Net NOAA	work Daily Temperatures	
	Global (Land) Precipitation And Temperature: University Of Delaware		
	CRU TS3.21 Gridded Precipitation And Other Meteorological Variables Since 1901		
	GPCP (DAILY): Global Precipitation Climatology Project NASA		
	TRMM: Tropical Rainfall Measuring Mission NASA and JAXA		
		NOAA Global Surface Temperature (NOAAGlobalTemp)	

GHCN-D: Global Historical Climatology Network Daily Temperatures NOAA



Historic time series completion using statistical downscaling

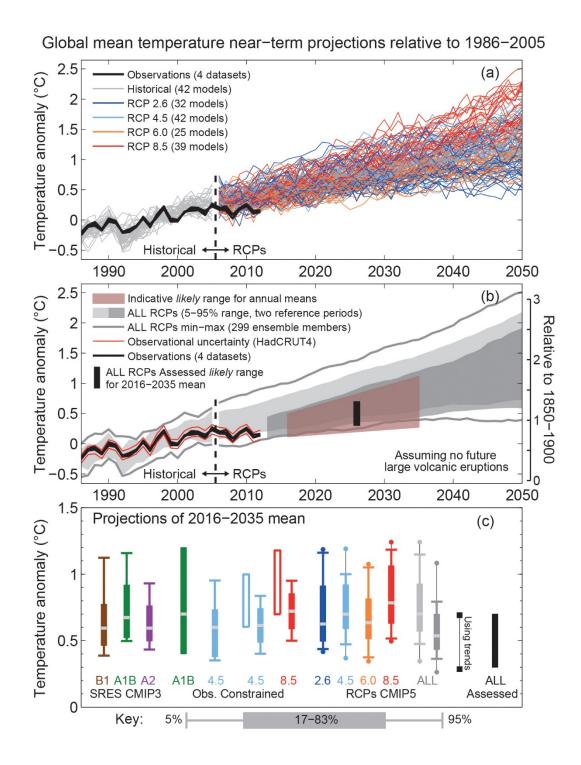


Climate Change Models

IPCC AR5

Datasets Access:

climate.upei.ca

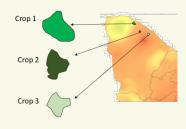


Global Climate Models

ACCESS1	Australian Community Climate and Earth System Simulator	CNRM-CM5	Centre National de Recherches Météorologiques - Coupled Model 5	HadGEM2	Hadley Centre Global Environment Model version 2
BCC-CSM1.1	Beijing Cliamte Center Climate System Model versión 1.1	CSIRO-Mk3-6-0	Organization	INMCM4	Institute for Numerical Mathematics Climate Model 4
BNU-ESM	Beijing Normal University Earth System Model	FGOALS-g2	Flexible Global Ocean- Atmosphere-Land System, Gridpoint version 2	IPSL-CM5	Institut Pierre Simon Laplace Climate Model
CanESM2	Second Generation Canadian Earth System Model	FGOALS-s2	Flexible Global Ocean- Atmosphere-Land System, Spectral version 2	MIROC4h	Model for Interdisciplinary Research on Climate 4
CCSM4	Community Climate System Model	FIO-ESM	First Institute of Oceanography-Earth System Model	MIROC5	Model for Interdisciplinary Research on Climate 5
CESM1-BGC	Community Earth System Model Versión 1 - BioGeoChemical model	GFDL-CM3	Geophysical Fluid Dynamics Laboratory - Climate Model 3	MIROC-ESM	Model for Interdisciplinary Research on Climate Earth System Model
CESM1-CAM5	Community Earth System Model Version 1 - Community Atmospheric Model Version 5	GFDL-ESM2G	Geophysical Fluid Dynamics Laboratory - Earth System Model 2G	MPI-ESM	Max Planck Institut fur Meteorologie Earth System Model
CMCC-CESM	Centro Euro-Mediterráneo sui Cambiamenti Climatici - Carbon Earth System Model	GFDL-ESM2G	Geophysical Fluid Dynamics Laboratory - Earth System Model 2M	MRI-CGCM3	Meteorological Research Institute Global Climate Model 3
CMCC-CM	Centro Euro-Mediterráneo sui Cambiamenti Climatici - Climate Model	GISS-E2	Goddard Institute for Space Studies-E2	NorESM1-M	Norwegian Earth Sustem Model
CMCC-CMS	Centro Euro-Mediterráneo sui Cambiamenti Climatici - Climate Model with a resolved Stratosphere	HadCM3	Hadley Centre Coupled Model Version 3		

Exposure

Historic records Inputs: Station's drought Integrated Precipitation and indicator hazard maps temperature series HAZARD recorded in stations. Intensity **Outputs:** - Future climate series. **Future series** - Drought indicator Identify regional parameters. drought events - Integrated hazard maps. Climate Soil Management Crop Inputs: - Climate series for **VULNERABILITY** drought events - Crop type - Soil type Soil water balance Soil water balance - Modifiers (such as Stress indicator Canopy expansion and irrigation systems) Canopy expansion and senescence senescence **Crop Transpiration Outputs: Crop Transpiration** - Optimum yield Biomass and yield production Biomass and yield production production - Yield production Crop yield response to stress Crop yield response to water under water stress For agricultural droughts:



Cultivated land

Location Crop type and seasonality Cultivated area Productivity Production cost Loss of profit

Inputs:

- Coordinates, area
- Crop type, production cost per growing stage, yield per unit

Outputs:

- Exposed elements database

RISK

Inputs:

- Hazard (Intensity and frequency)
- Vulnerability (per cultivated land unit)
- Exposed elements database (per cultivated land unit)

Probabilistic risk assessment

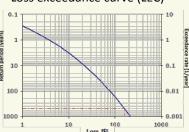
$$\nu(p) = \sum_{i=1}^{N} Pr(P > p | E_i) F_{Ai}$$



Outputs:

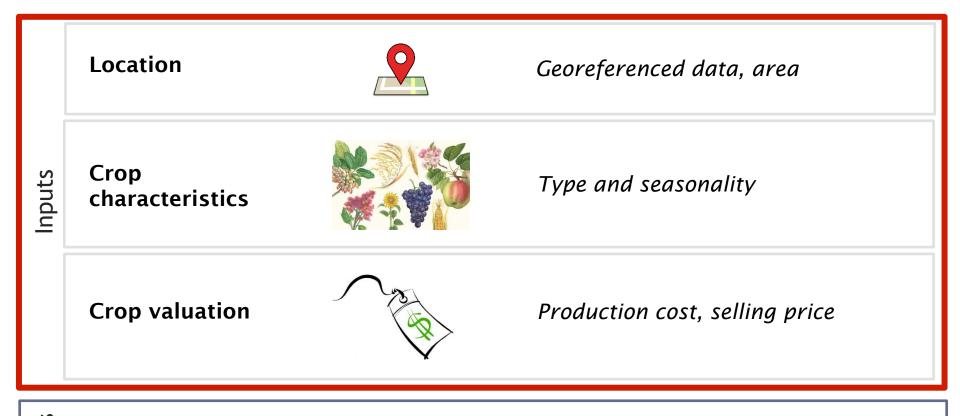
Risk metrics

- Loss exceedance curve (LEC)



- Average annual loss (AAL)
- Probable maximum loss (PML)
- Risk maps

Exposure



Outputs

Exposed elements database

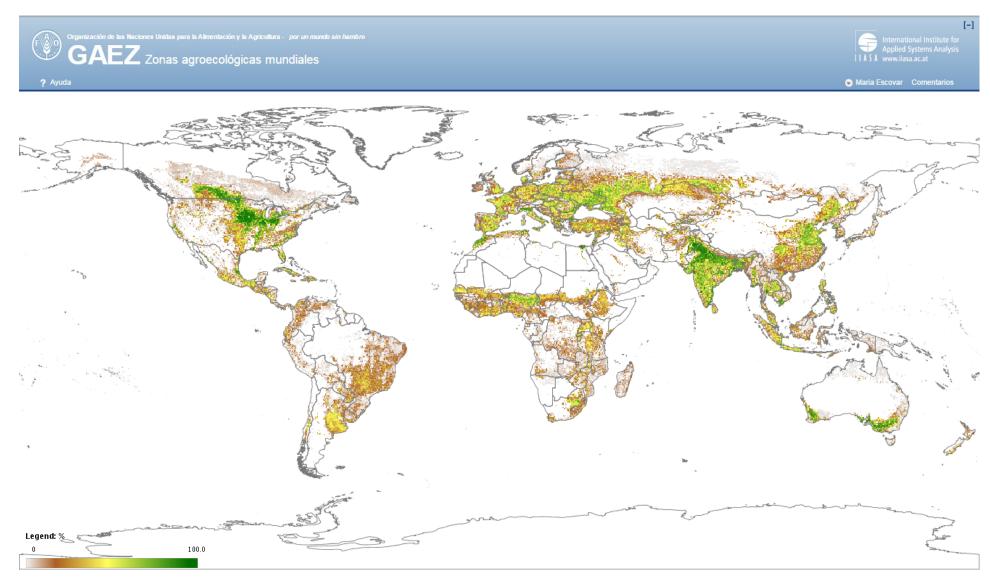


- Optimum yield production
- Yield production under water stress

Exposure

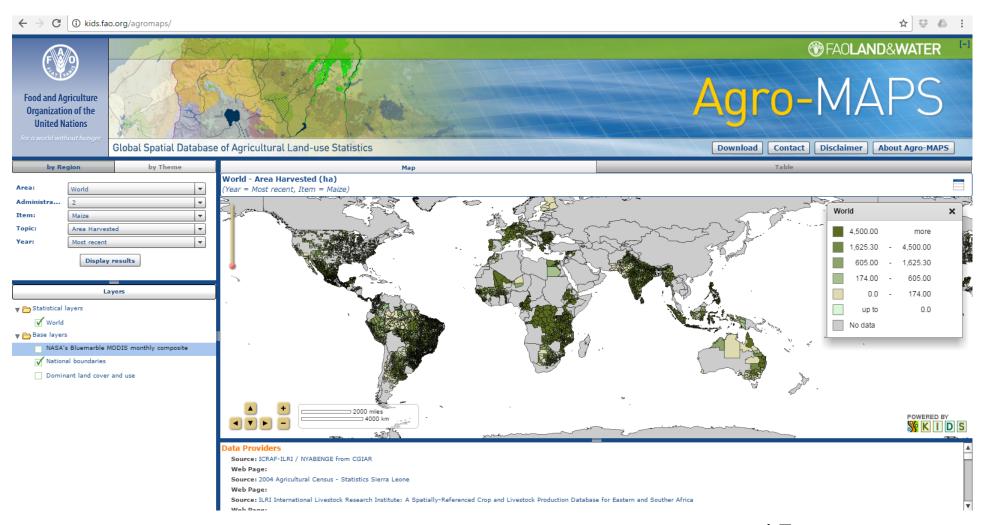
Location

Global Scale GAEZ - Land Resources/Land Cover/Cultivated Land



Crop exposure

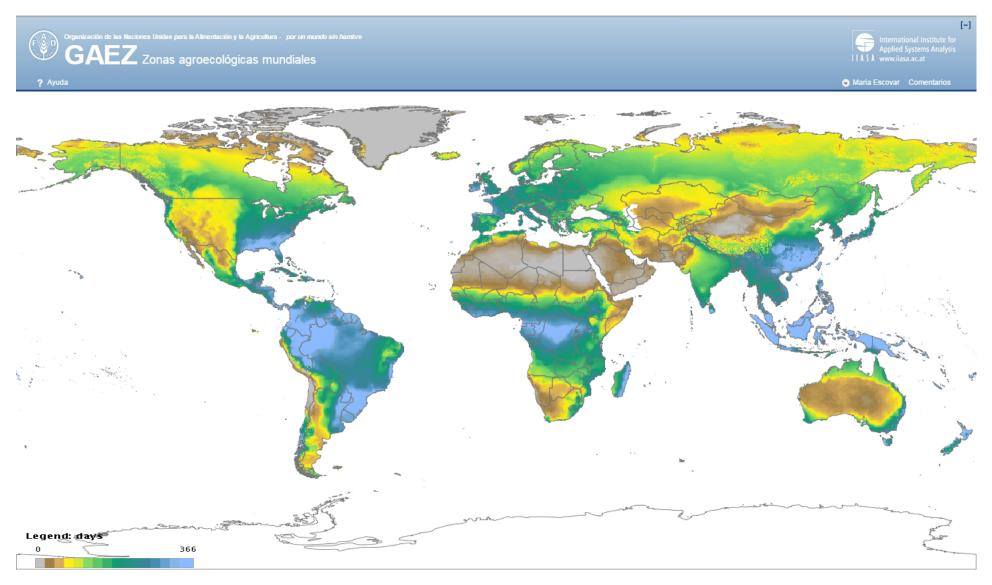
Location



Exposure

Global Scale

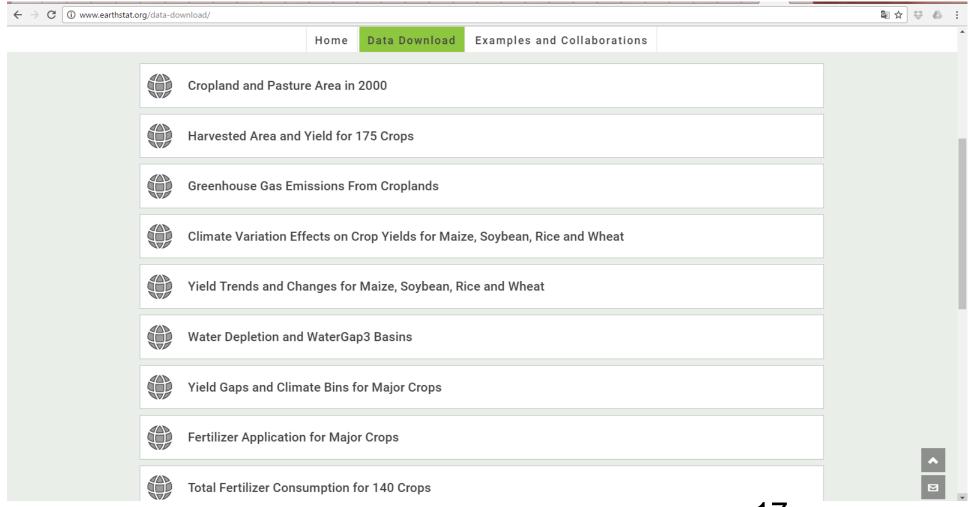
GAEZ - Siutability and Potential Yield/Crop Calendar/



Crop exposure

Crop characteristics





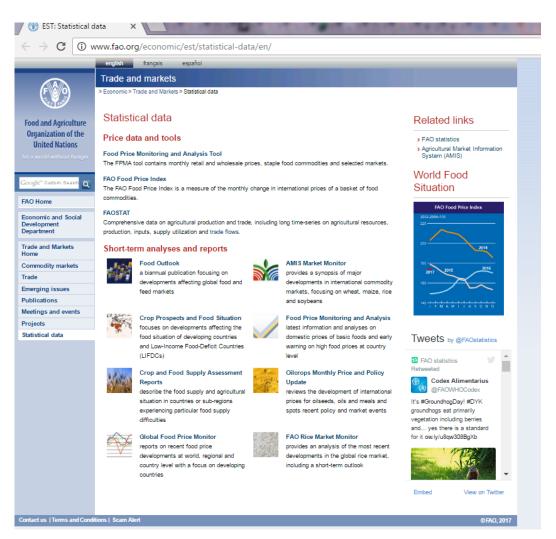
Crop exposure

Crop valuation

Global Scale

FAO - Statistical data

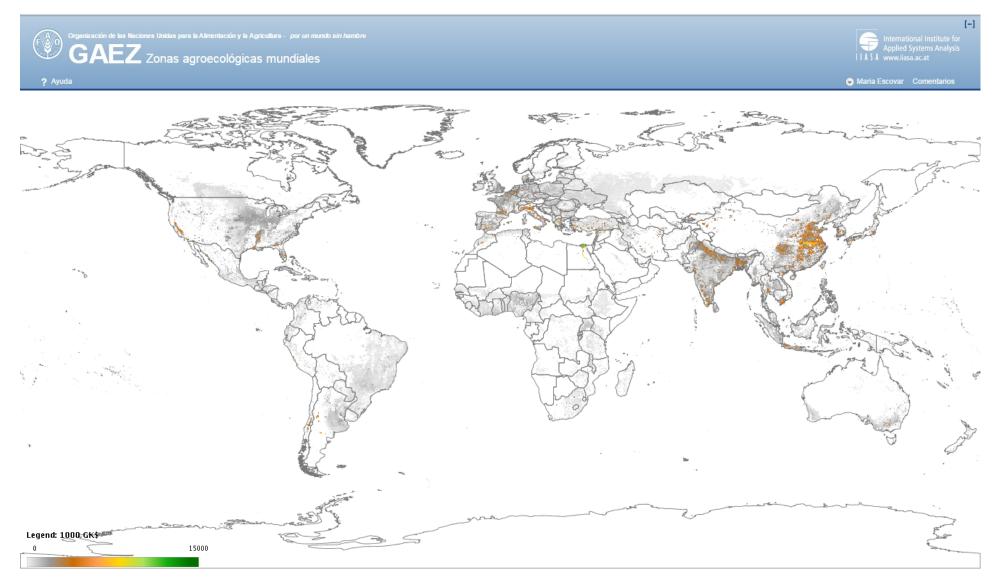
- Food Outlook
- AMIS Market Monitor
- Crop Prospects and Food Situation
- Food Price Monitoring and Analysis
- Crop and Food Supply Assessment Reports
- Oilcrops Monthly Price and Policy Update
- Global Food Price Monitor
- FAO Rice Market Monitor



Exposure

Global Scale Crop Valuation

GAEZ - Actual Yield and Production/Crop production value/



Crop exposed elements

Additional data sources



Provides geographic data sets with the purpose of solving the grand challenge of feeding a growing global population while reducing agriculture's impact on the environment.



GEOGLAM is the Group on Earth Observations Global Agricultural Monitoring Initiative. Its objective is to provide AMIS with an international and transparent multi-source, consensus assessment of crop growing conditions and status, and agro-climatic conditions, likely to impact global production.



Statistics including production, supply, utilization, trade and closing stocks. Limited to AMIS countries (G20).

Vulnerability

Historic records Station's drought Integrated indicator hazard maps HAZARD Severity Intensity **Future series** Identify regional drought events Climate Soil Management Crop VULNERABILITY Soil water balance Soil water balance Stress indicator Canopy expansion and Canopy expansion and senescence senescence **Crop Transpiration Crop Transpiration** Biomass and yield production Biomass and yield

Inputs:

Precipitation and temperature series recorded in stations.

Outputs:

- Future climate series.
- Drought indicator parameters.
- Integrated hazard maps.

Inputs:

- Climate series for drought events
- Crop type
- Soil type
- Modifiers (such as irrigation systems)

Outputs:

- Optimum yield production
- Yield production under water stress

- Coordinates, area

production cost per

growing stage, yield

RISK

Inputs:

- Hazard (Intensity and frequency)
- Vulnerability (per cultivated land unit)
- Exposed elements database (per cultivated land unit)

Probabilistic risk assessment

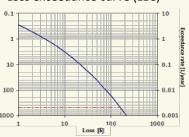
$$\nu(p) = \sum\nolimits_{i=1}^{N} Pr(P > p|E_i) F_{Ai}$$



Outputs:

Risk metrics

- Loss exceedance curve (LEC)

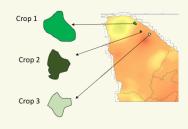


- Average annual loss (AAL)
- Probable maximum loss (PML)
- Risk maps

For agricultural droughts:

EXPOSURE

Crop yield response to water



Cultivated land

Location

Crop type and seasonality

production

Crop yield response to stress

Cultivated area

Productivity

Production cost Loss of profit

Outputs:

per unit

Inputs:

- Crop type,

- Exposed elements database

Vulnerability

5-steps process

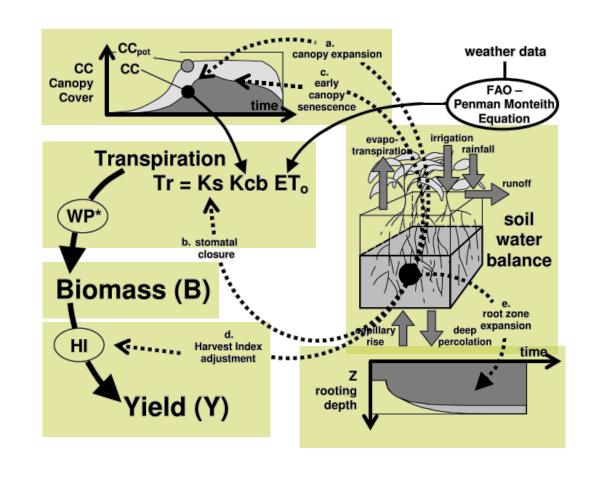
Soil water balance

Crop development

Crop transpiration

Biomass production

Yield (Y) from biomass (B)



Climate



Data from hazard modelling: Air temperature, rainfall, ETo, CO₂

Crop characteristics



Phenology, canopy development, root deepening, production, seasonality

Soil profile



Soil horizons, soil surface, restrictive layers, capillary rise

Management



Modifiers: irrigation and fertilizers

Outputs

Inputs

Yield



- Optimum yield production
- Yield production under water stress

Climate parameters

Climate



Data from hazard modelling: Air temperature, rainfall, ETo, CO₂

Parameters	Definition	Comments	
T_{x}	Maximum air temperature	Influences crop phenology with effects on WP	
T_n	Minimum air temperature	and HI.	
Р	Rainfall	Determinants of water balance of the soil roozone and water stress.	
ET _o	Reference evapotranspiration		
[CO ₂]	Carbon dioxide concentration	Affects WP, canopy expansion, stomatal conductance.	

Crop characteristics

Crop characteristics

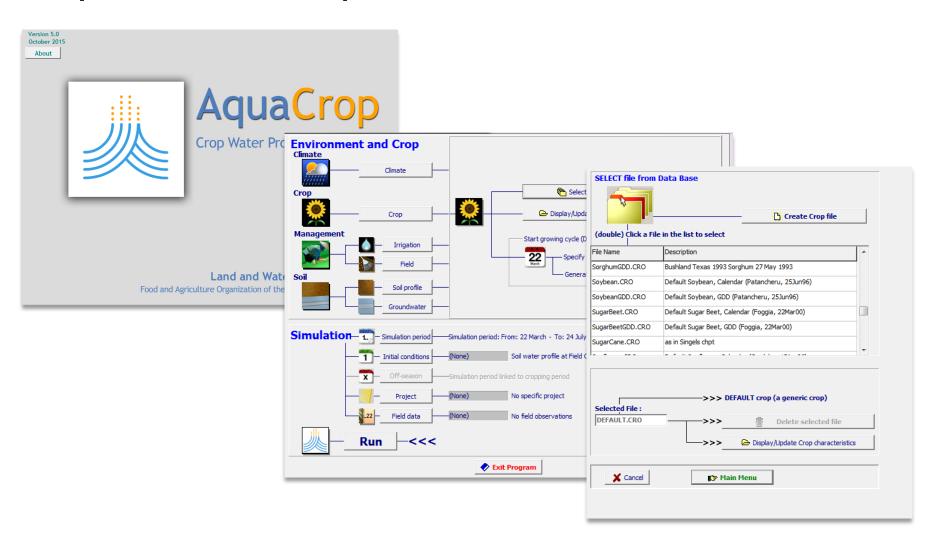


Phenology, canopy development, root deepening, production, seasonality

Parameters	Definition	
Phenology	Growing Degree Days	
Canopy development	Initial and maximum canopy cover, canopy growth and decline coefficients	
Rooting Depth	Minimum and maximum rooting depth	
Crop transpiration	Transpiration and ageing coefficient	
Biomass production	Water productivity	
Harvestable yield	Reference harvest index	

AquaCrop

Crop Water Productivity Model



AquaCrop

Crop Water Productivity Model

Herbaceous Crops

Fruit Trees and Vines

Wheat

Rice

Maize

Soybean

Sorghum

Cotton

Sunflower

Sugarcane

Potato

Tomato

Sugar Beet

Alfalfa

Bambara Groundnut

Quinoa

Tef



Olive

Citrus

Apple

Plum

Almond

Pear

Peach

Walnut

Pistachio

Apricot

Avocado

Sweet cherry

Grapevine

Kiwifruit

Soil type

Soil profile

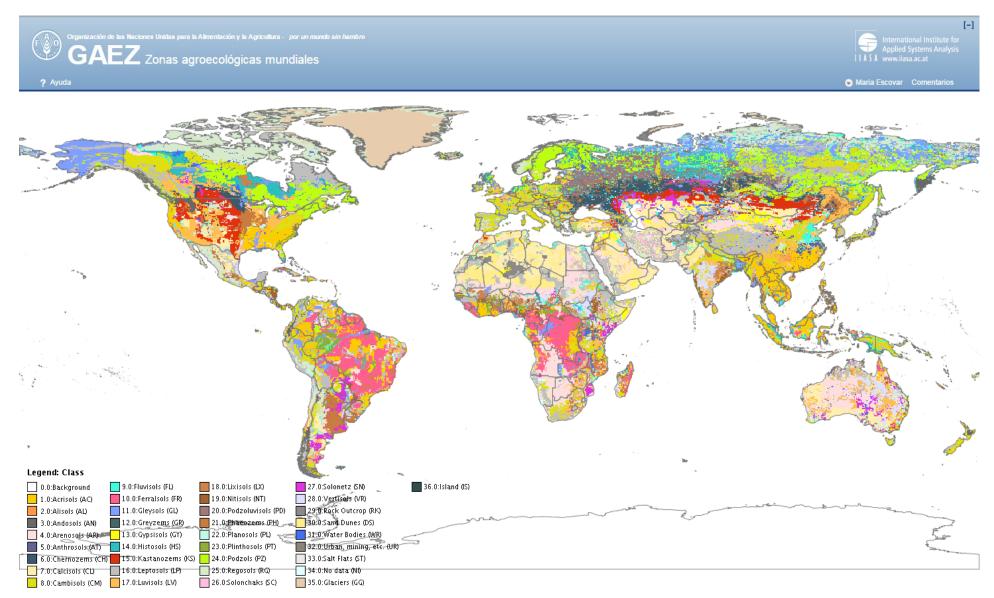


Soil horizons, soil surface, restrictive layers, capillary rise

Parameters	Definition	Comments
SAT	Soil water content at saturation	Related to the porosity of the type of soil
FC	Field capacity	Upper limit of water content under gravity
PWP	Permanent wilting point	Lower limit of water content
Ksat	Hydraulic conductivity at saturation	Is the capacity of the soil to transmit water under a hydraulic gradient.
GWT	Groundwater table	Depth below the surface.
ECGWT	Salinity of groundwater	

Soil type

Global Scale GAEZ - Soil resources/



Soil type

Global Scale

GAEZ - Soil resources/

- Dominant soil
- Nutrient availability
- Nutrient retention capacity
- Rooting conditions
- Oxygen availability
- Excess salts
- Toxicities
- Workability

Management options

Management



Modifiers: irrigation and fertilizers

Parameters	Definition
Irrigation method	Water application methods include sprinkler, surface, or drip either surface or underground
Fertility	Native or fertilization
Mulching	Cover soil surface to reduce soil evaporation
Soil bunds	Small dykes to pond water or control surface runoff