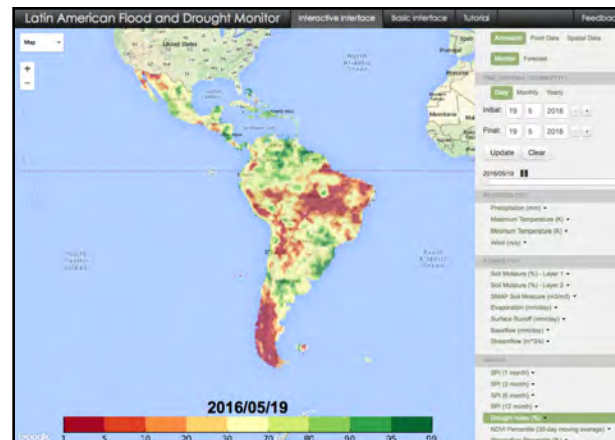


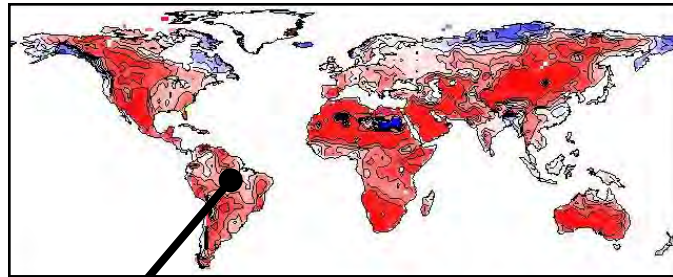
# Overview of the Latin American and Caribbean Flood and Drought Monitor (LACFDM)

Eric F Wood, Colby Fisher, Justin Sheffield, Nate Chaney  
Princeton University

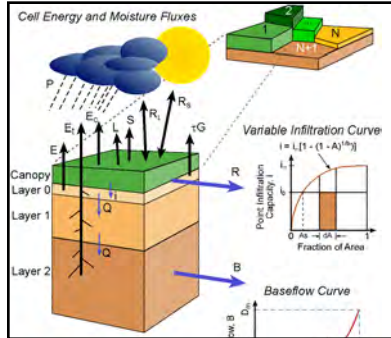
**International Training: ‘Application of Satellite Remote Sensing to Support Water Resources Management in Latin America and the Caribbean’ –  
Foz de Iguazú, Brazil, 13 - 20 July 2016**



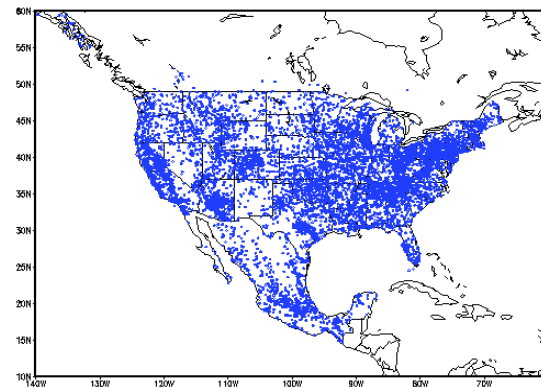
# Data and Tools for Flood/Drought Monitoring and Prediction



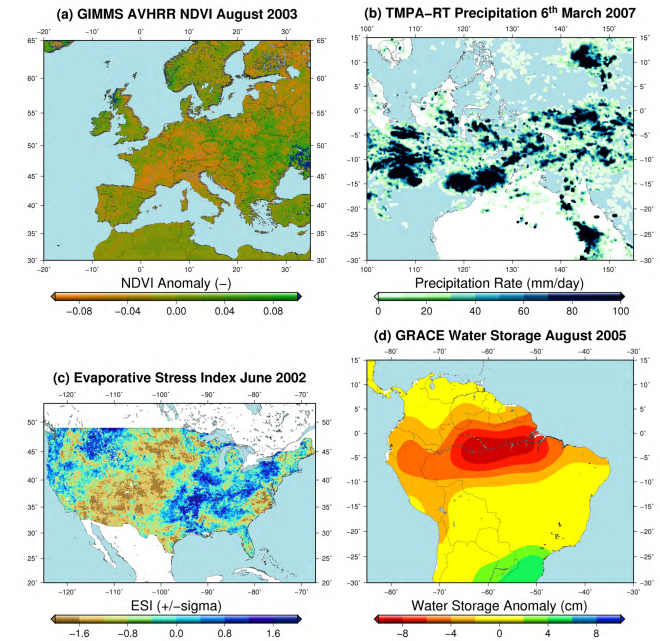
Hydrological Modeling



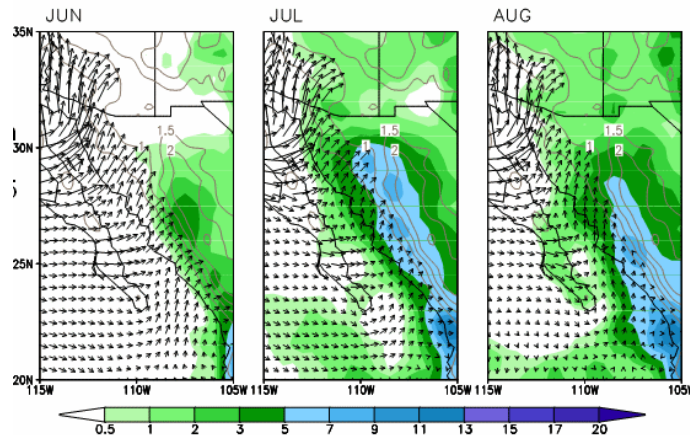
Ground Observations



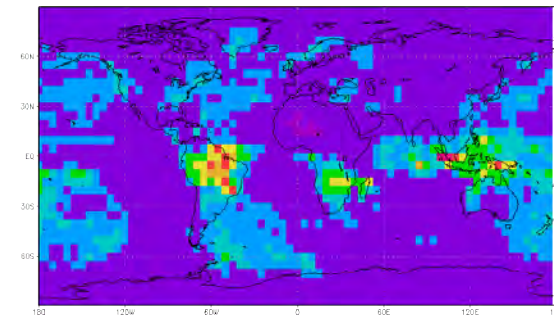
Satellite Remote Sensing



Reanalysis

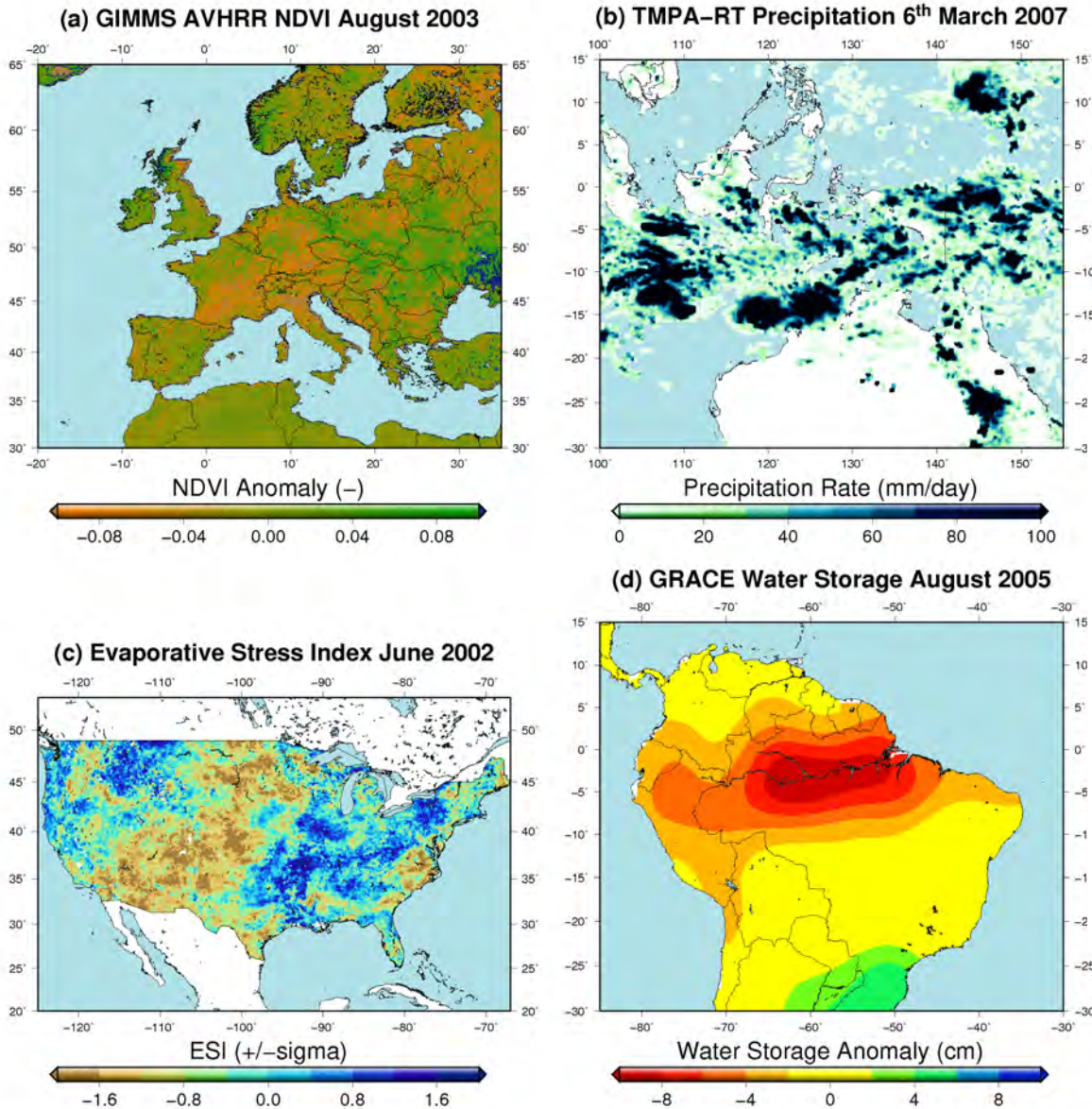


Regional/Global Climate Models,  
Statistical Prediction

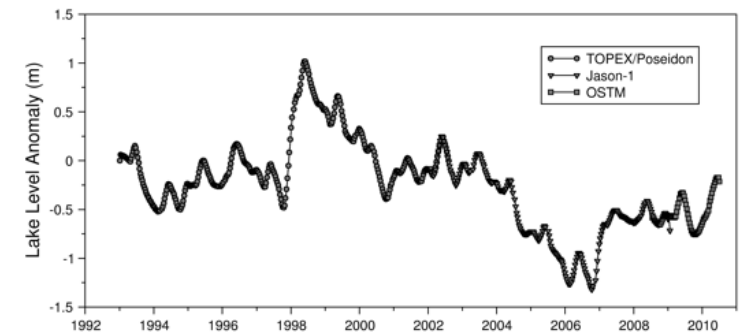




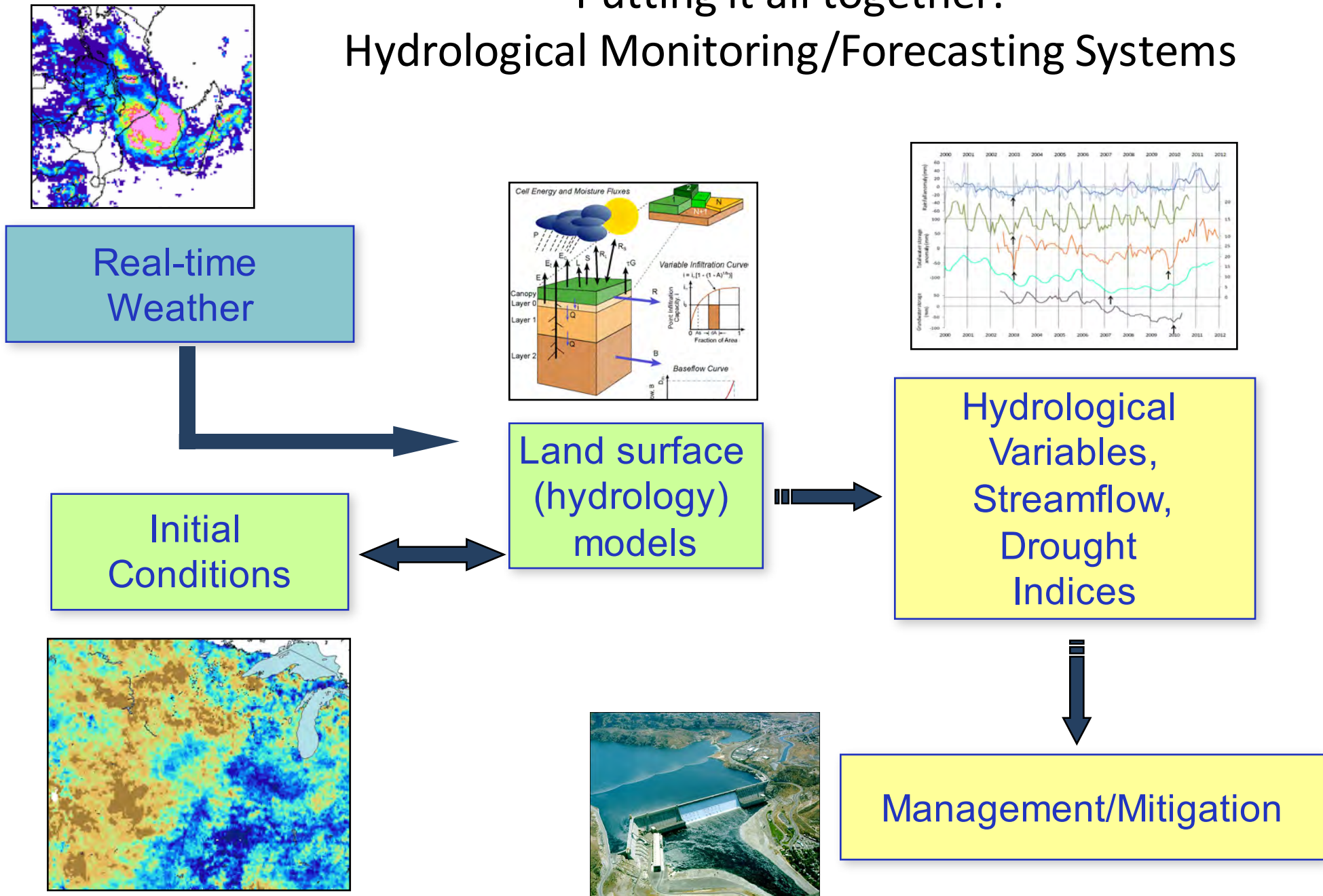
# Observing the Water Cycle: Remote Sensing



## Satellite Altimetry of Large Water Bodies

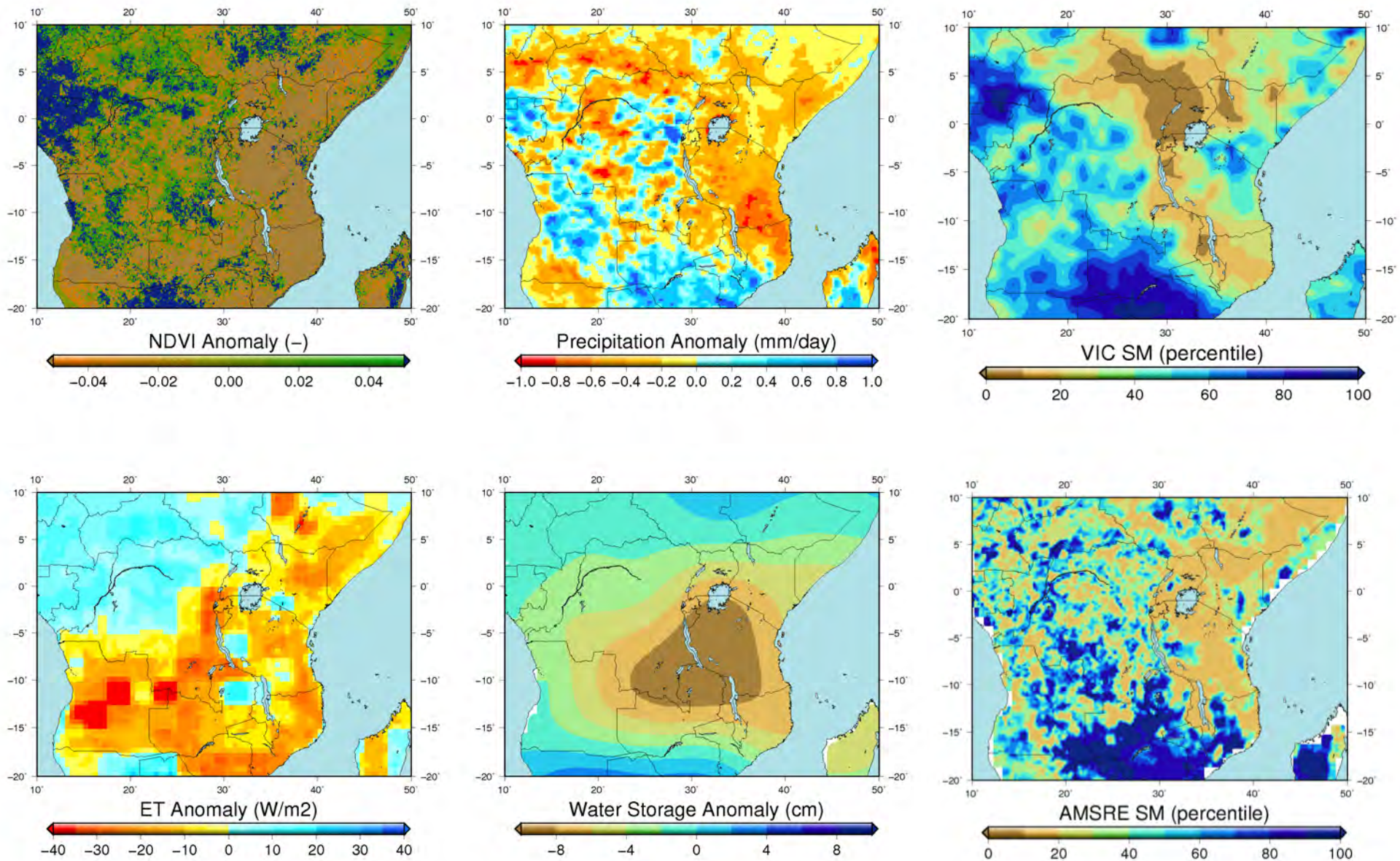


# Putting it all together: Hydrological Monitoring/Forecasting Systems

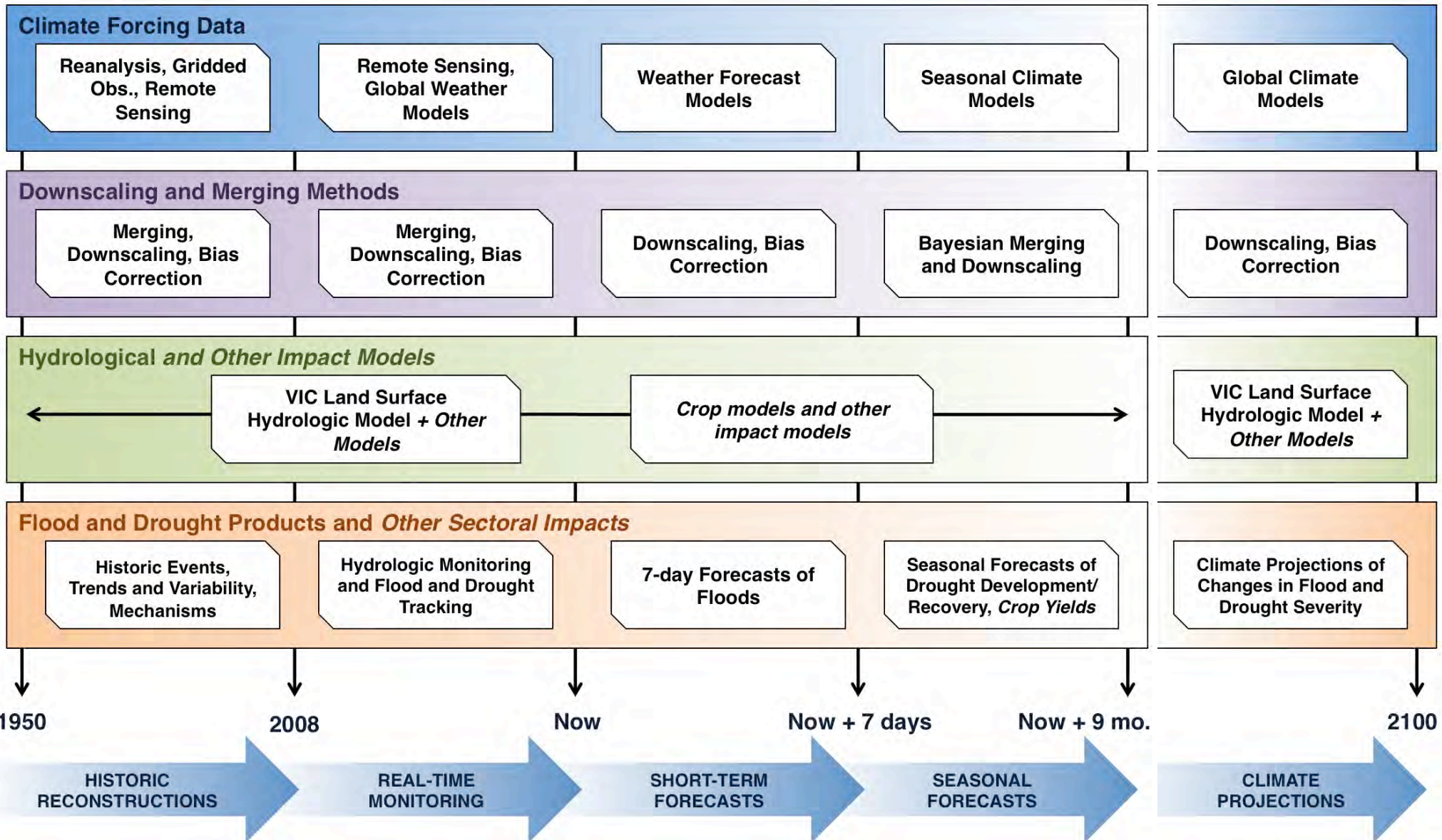




# Multi-Sensor View of Single Drought Event







Sheffield, J., et al., 2014; A drought monitoring and forecasting system for sub-Saharan African water resources and food security. *Bull. Am. Met. Soc.*, June

# Development of a global monitoring capability

US Drought Monitor - 2006

CONUS 4km Monitor - 2016

Eastern Europe - 2016?

Southern Asia - 2016/17?

African Flood/Drought Monitor - 2010 - 16

LAC Flood/Drought Monitor - 2014 - 17

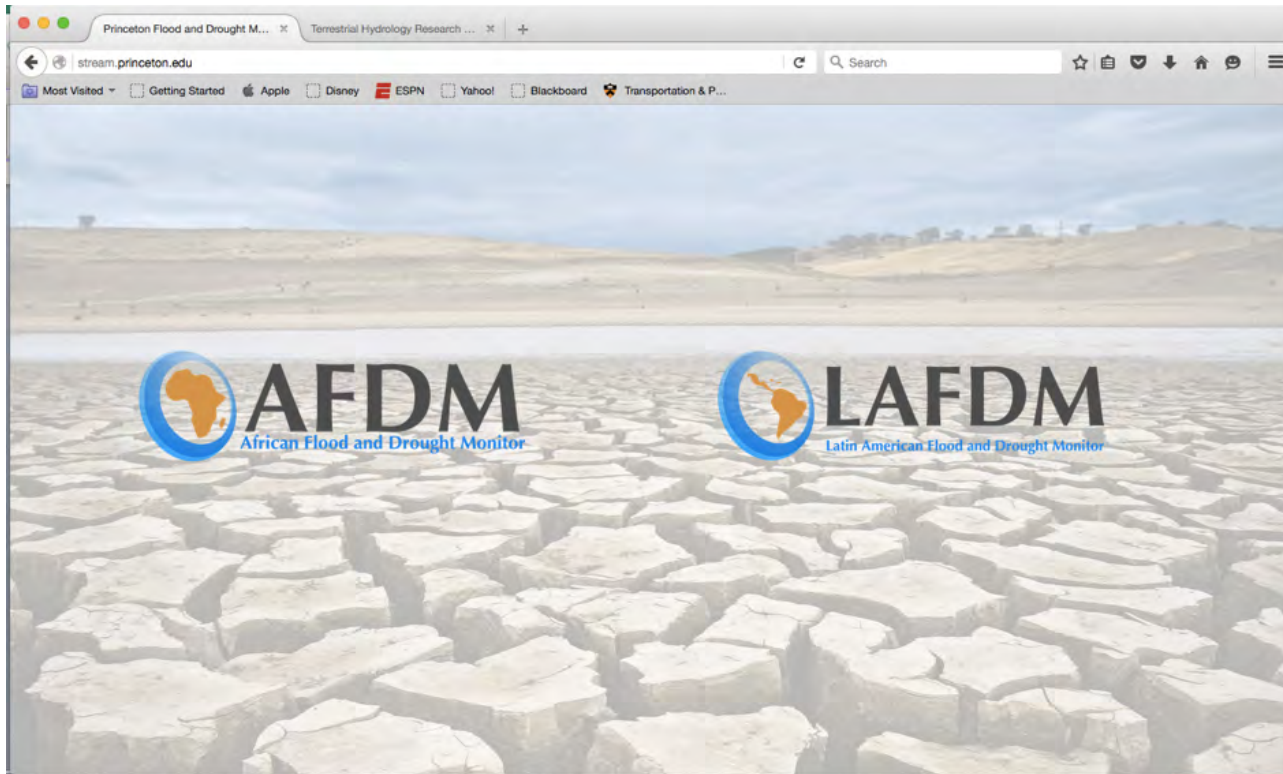


# The Flood and Drought Monitor: Web Interface



# Main Portal for Flood and Drought Monitors

<http://stream.princeton.edu>



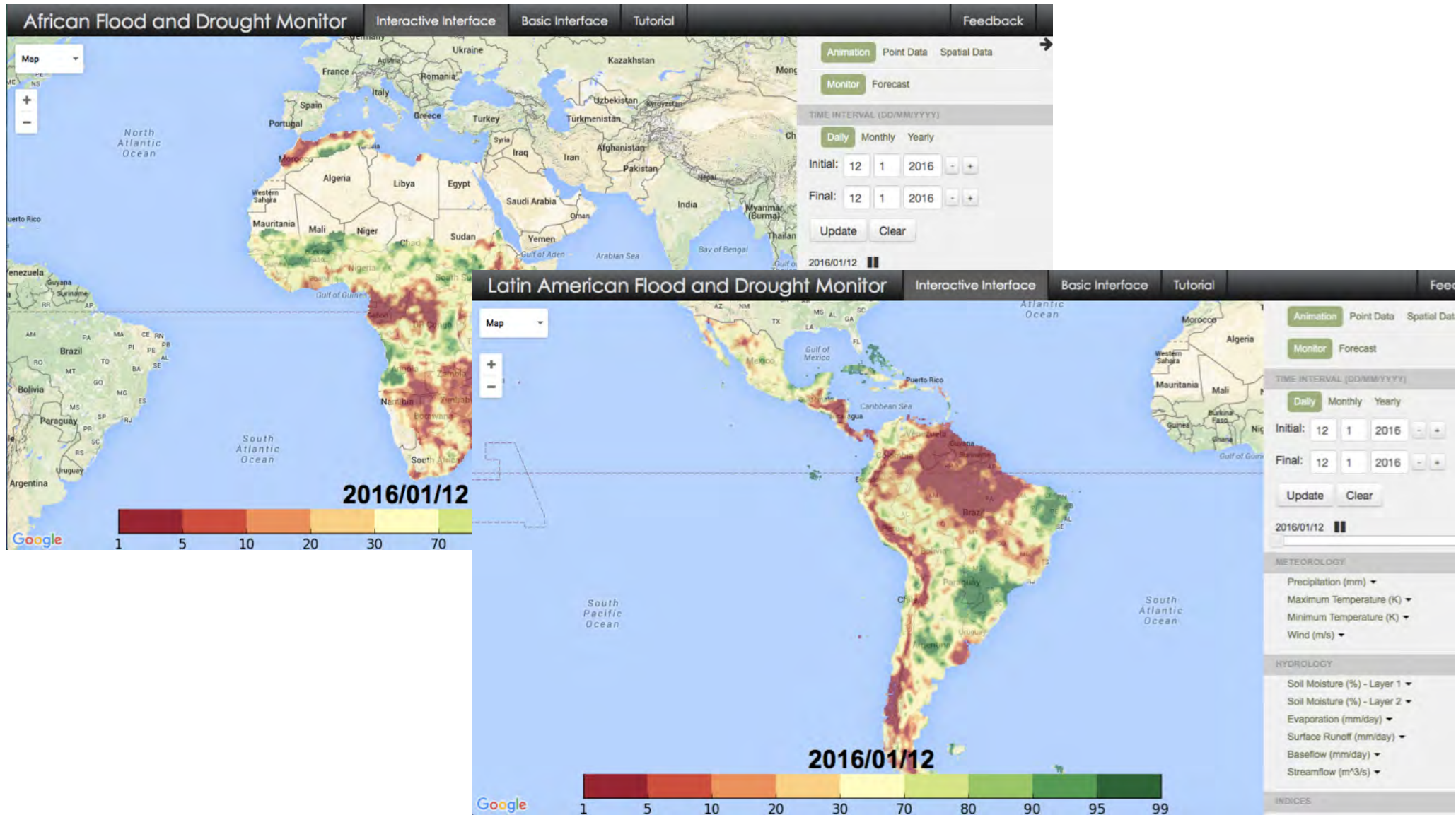
Available in English, French, Spanish, Arabic, Mandarin, and Portuguese (only for LAFDM)

# Main Portal for the Latin American Monitor

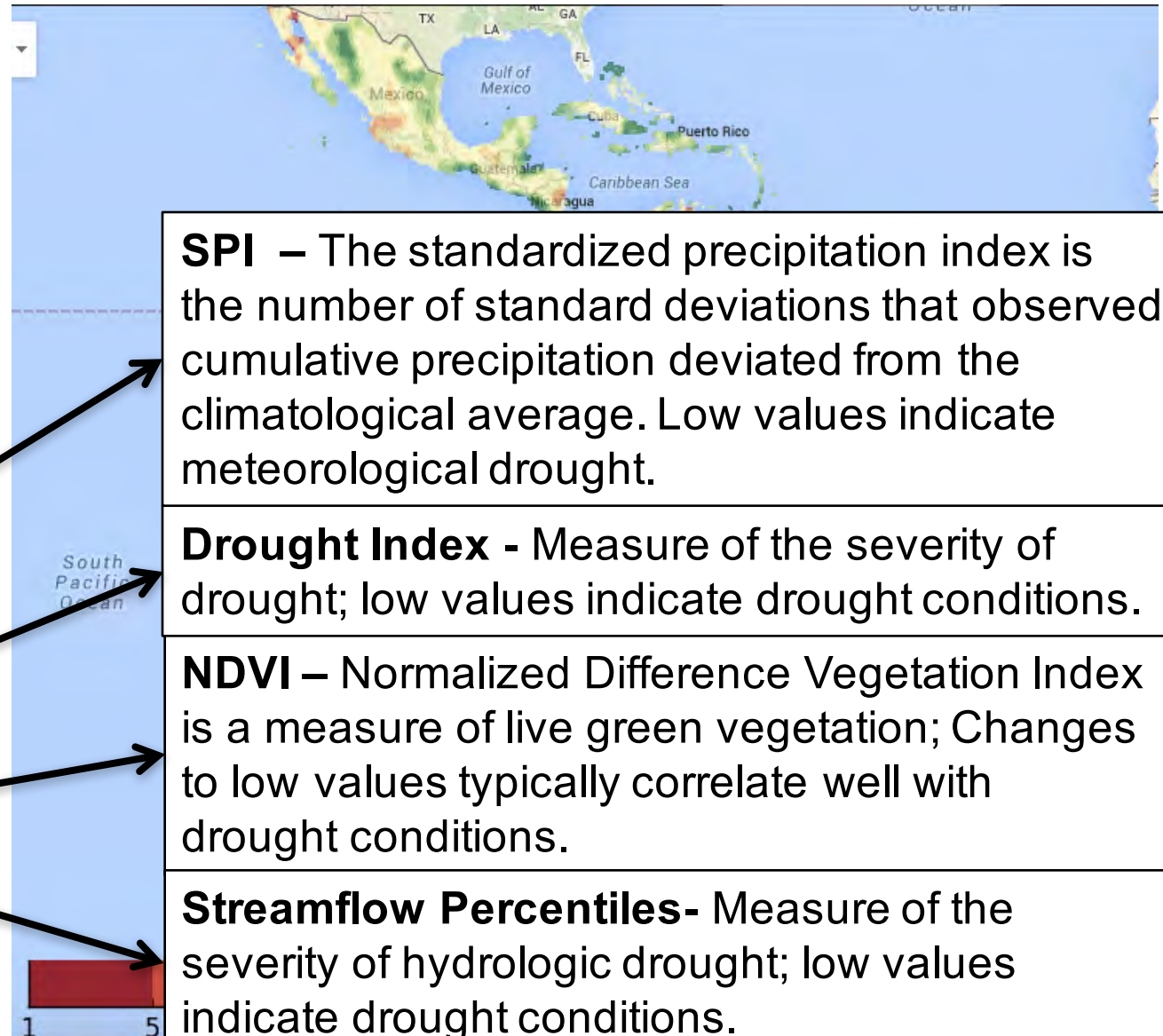
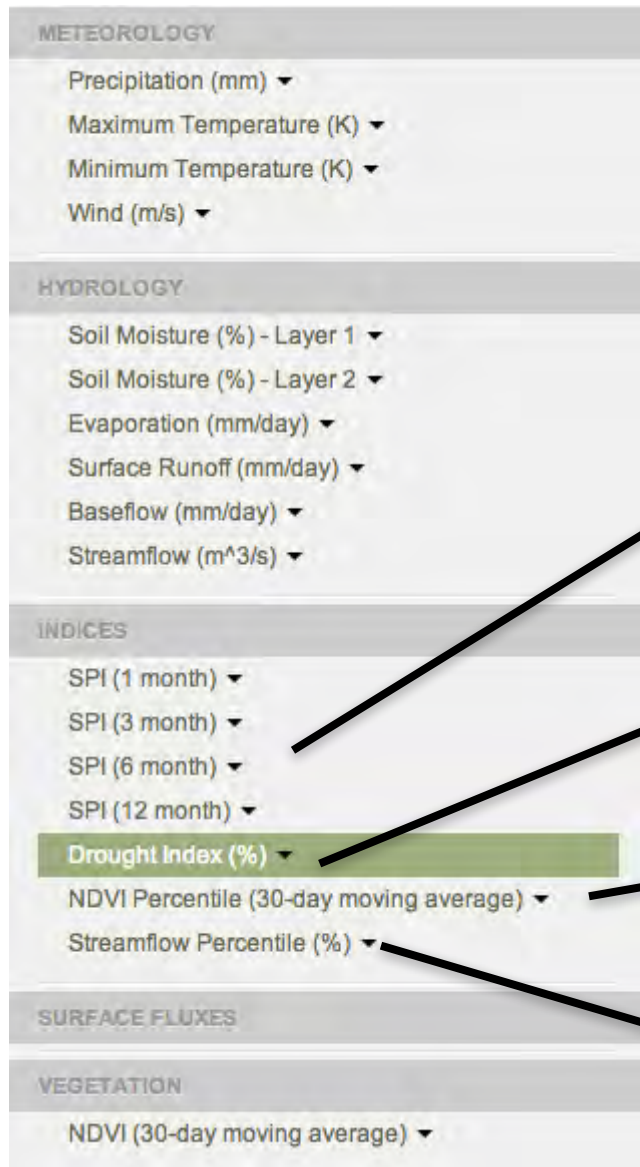




# Web Interfaces



# Water Cycle Products and Indices



**SPI** – The standardized precipitation index is the number of standard deviations that observed cumulative precipitation deviated from the climatological average. Low values indicate meteorological drought.

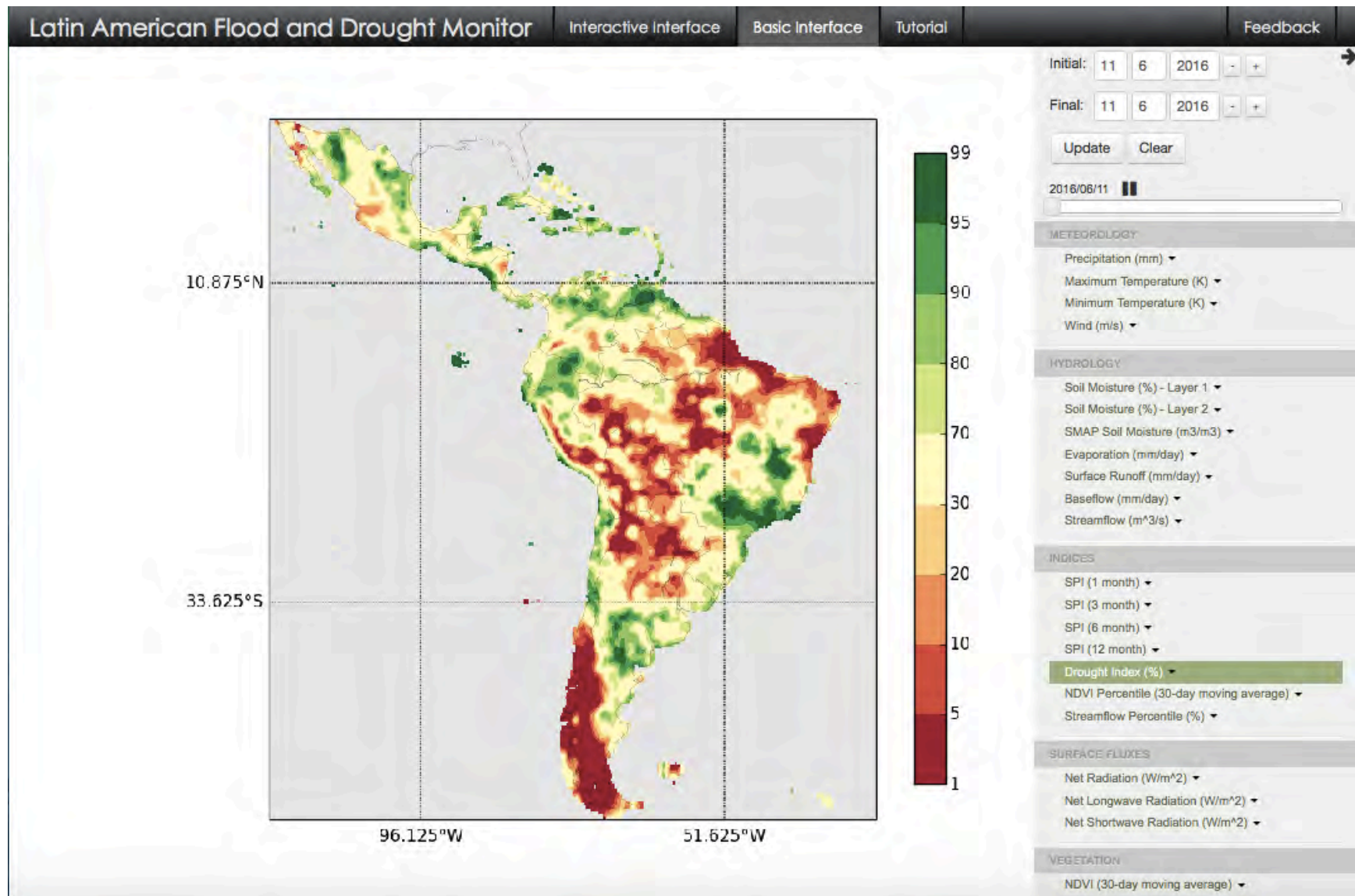
**Drought Index** - Measure of the severity of drought; low values indicate drought conditions.

**NDVI** – Normalized Difference Vegetation Index is a measure of live green vegetation; Changes to low values typically correlate well with drought conditions.

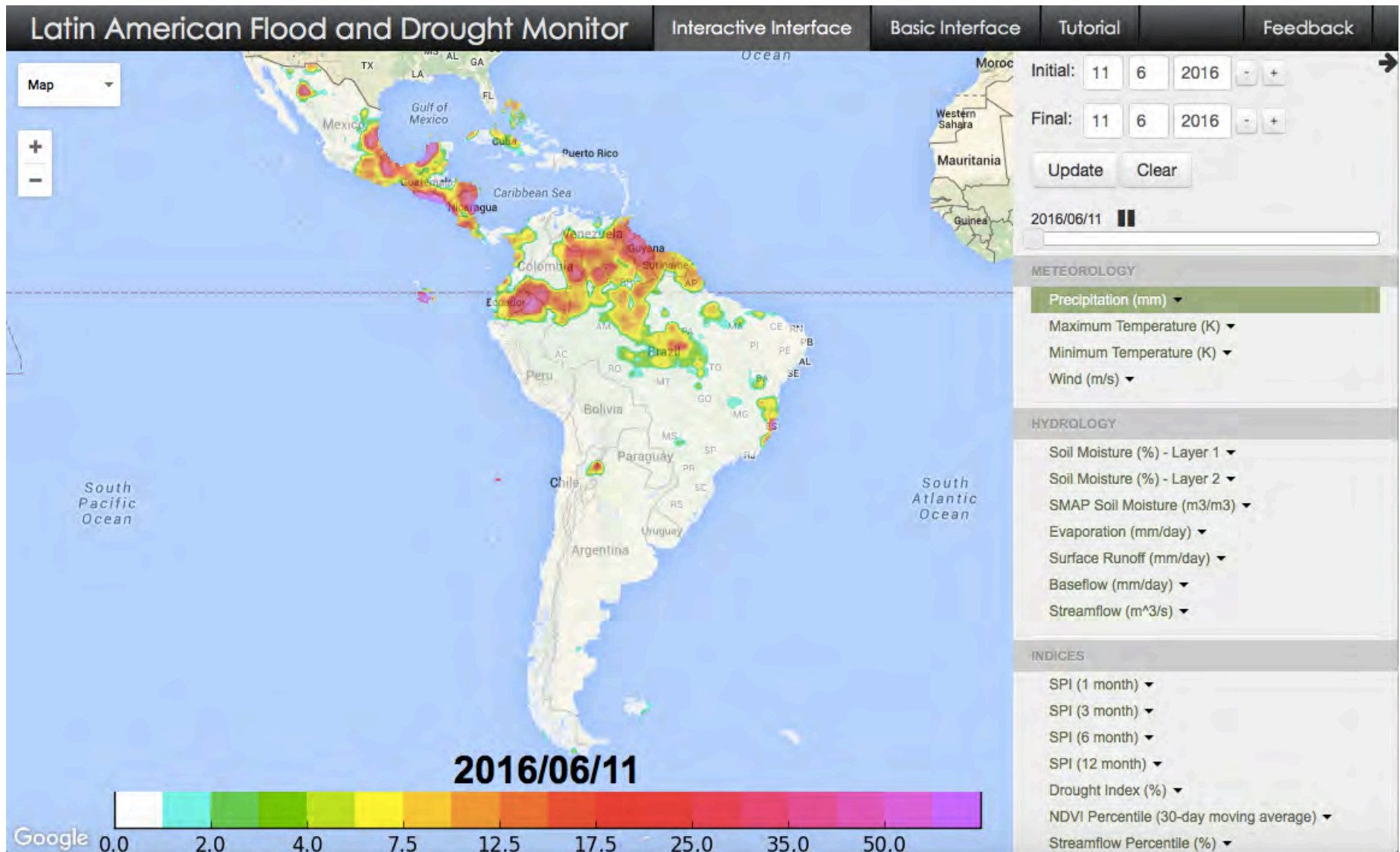
**Streamflow Percentiles**- Measure of the severity of hydrologic drought; low values indicate drought conditions.



# Basic Interface

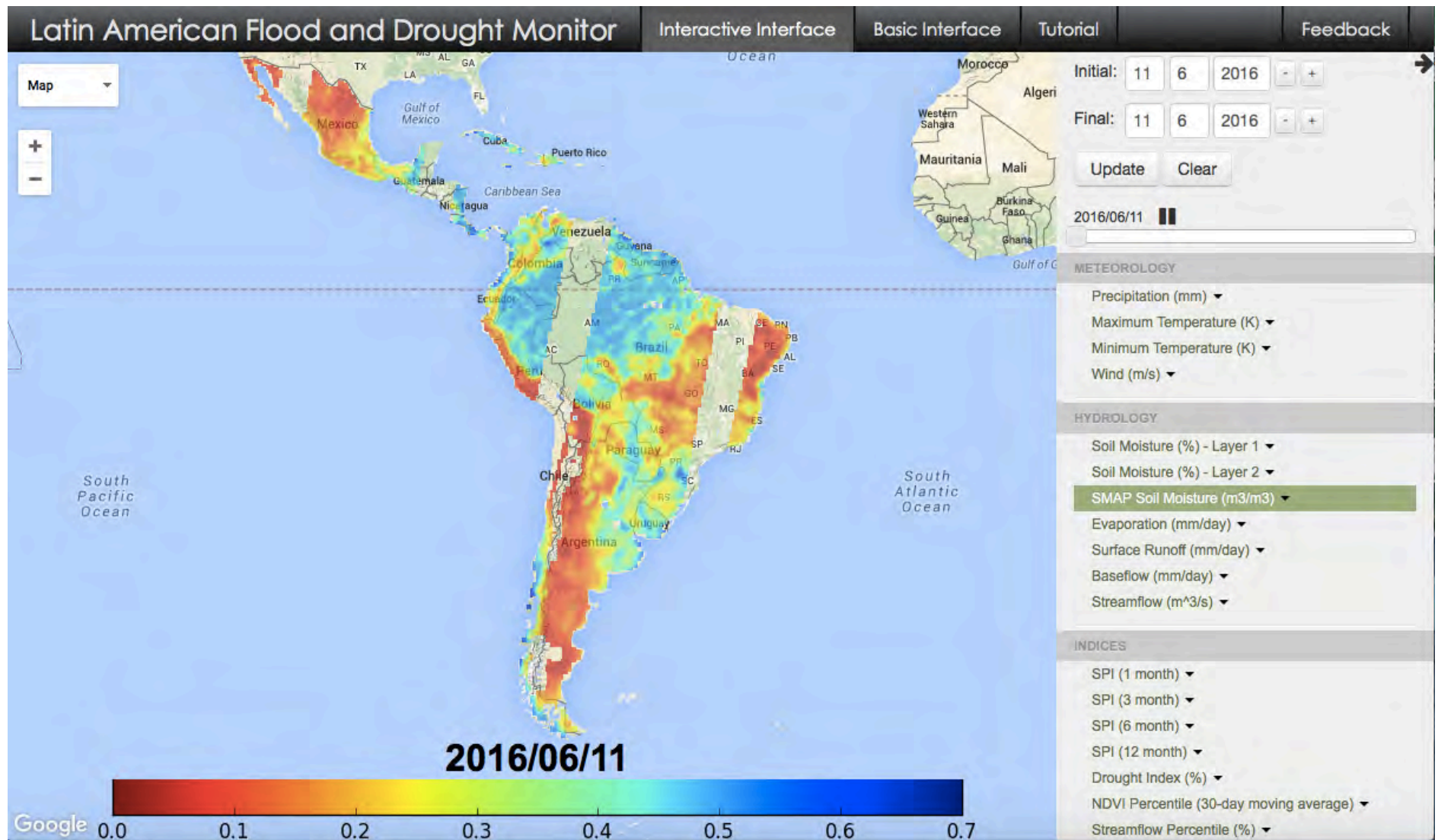


# Interface: Precipitation

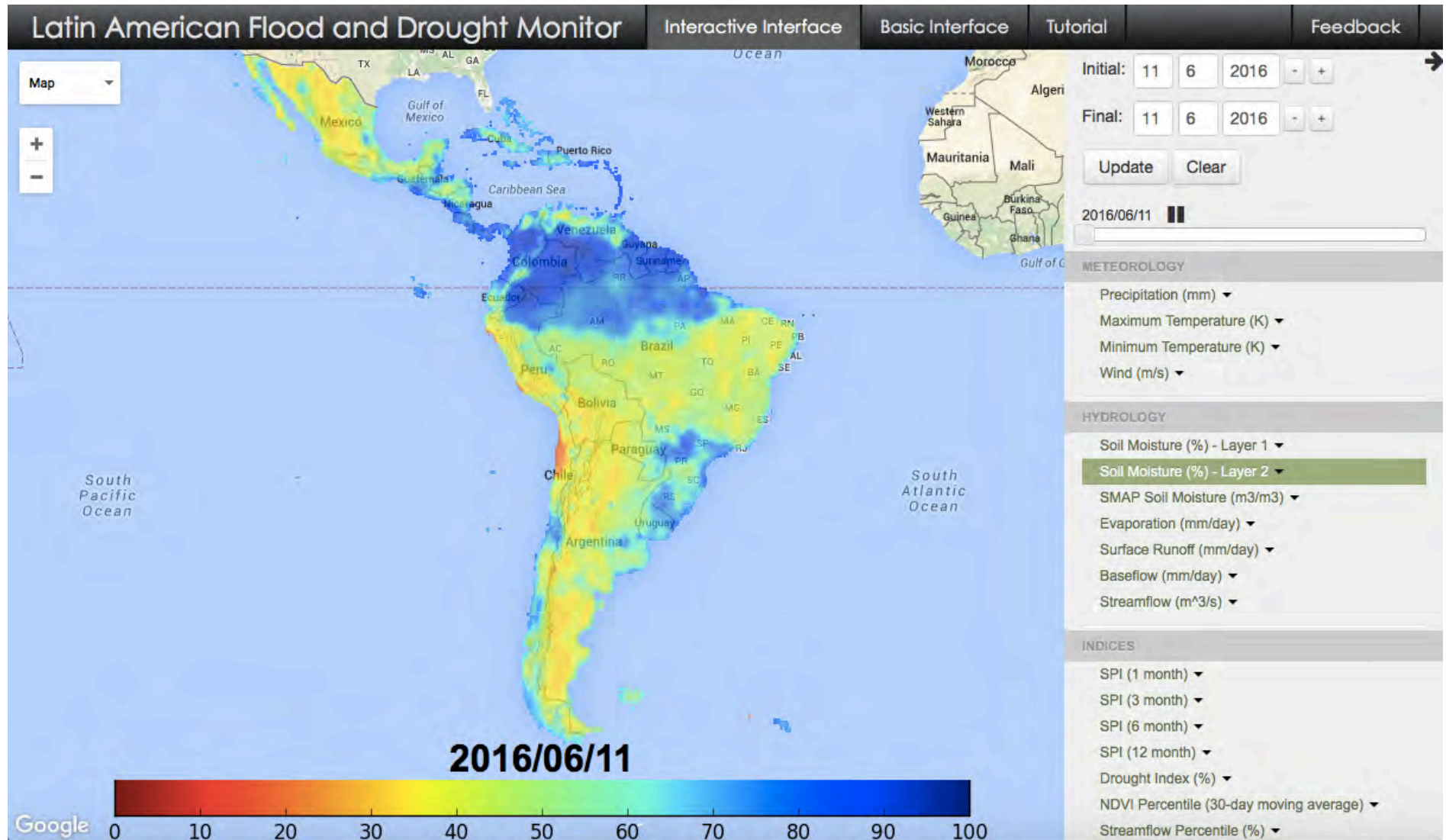




# Interface: Soil Moisture (Remote Sensing)

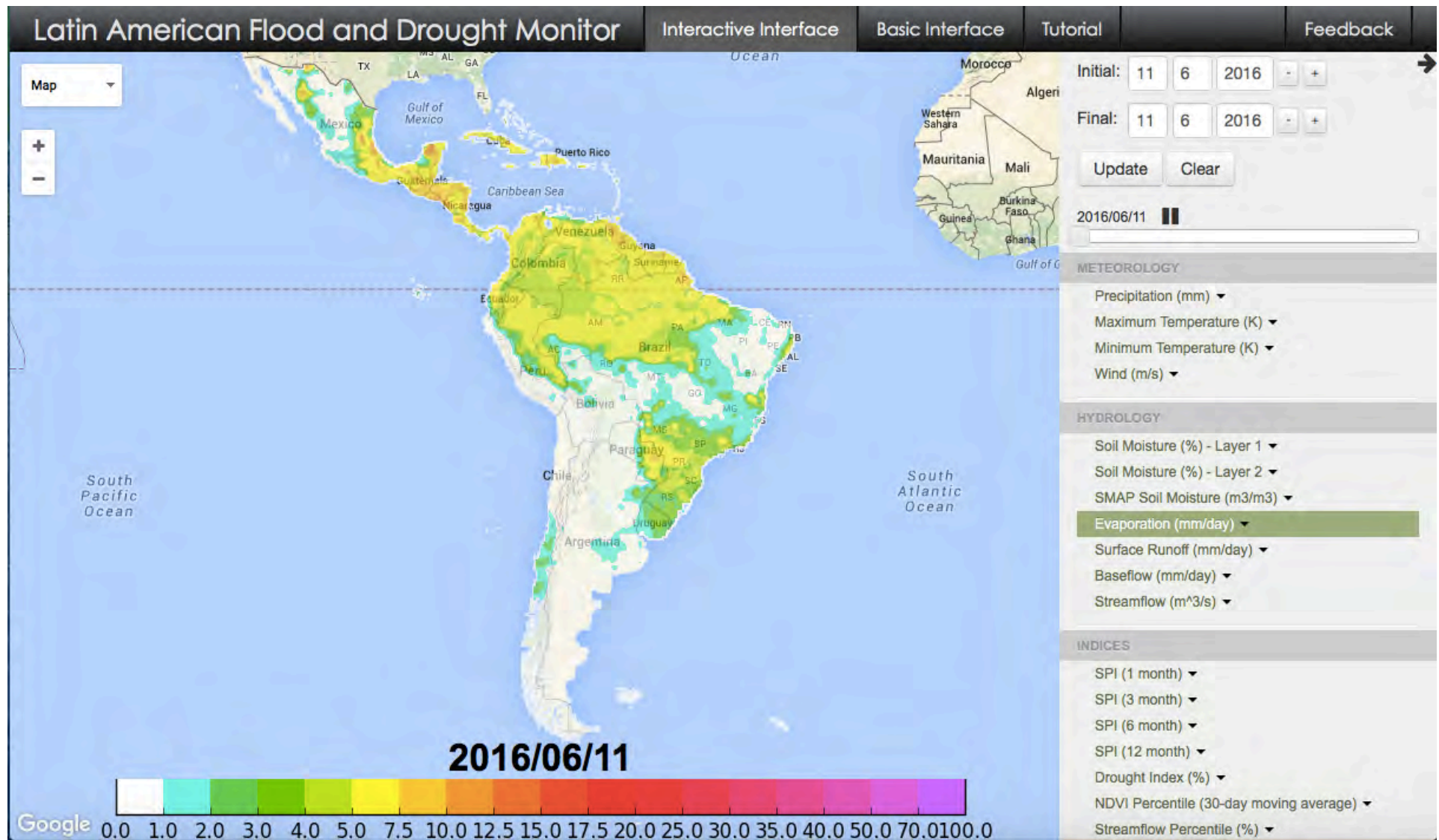


# Interface: Soil Moisture (modeled)





# Interface: Evapotranspiration



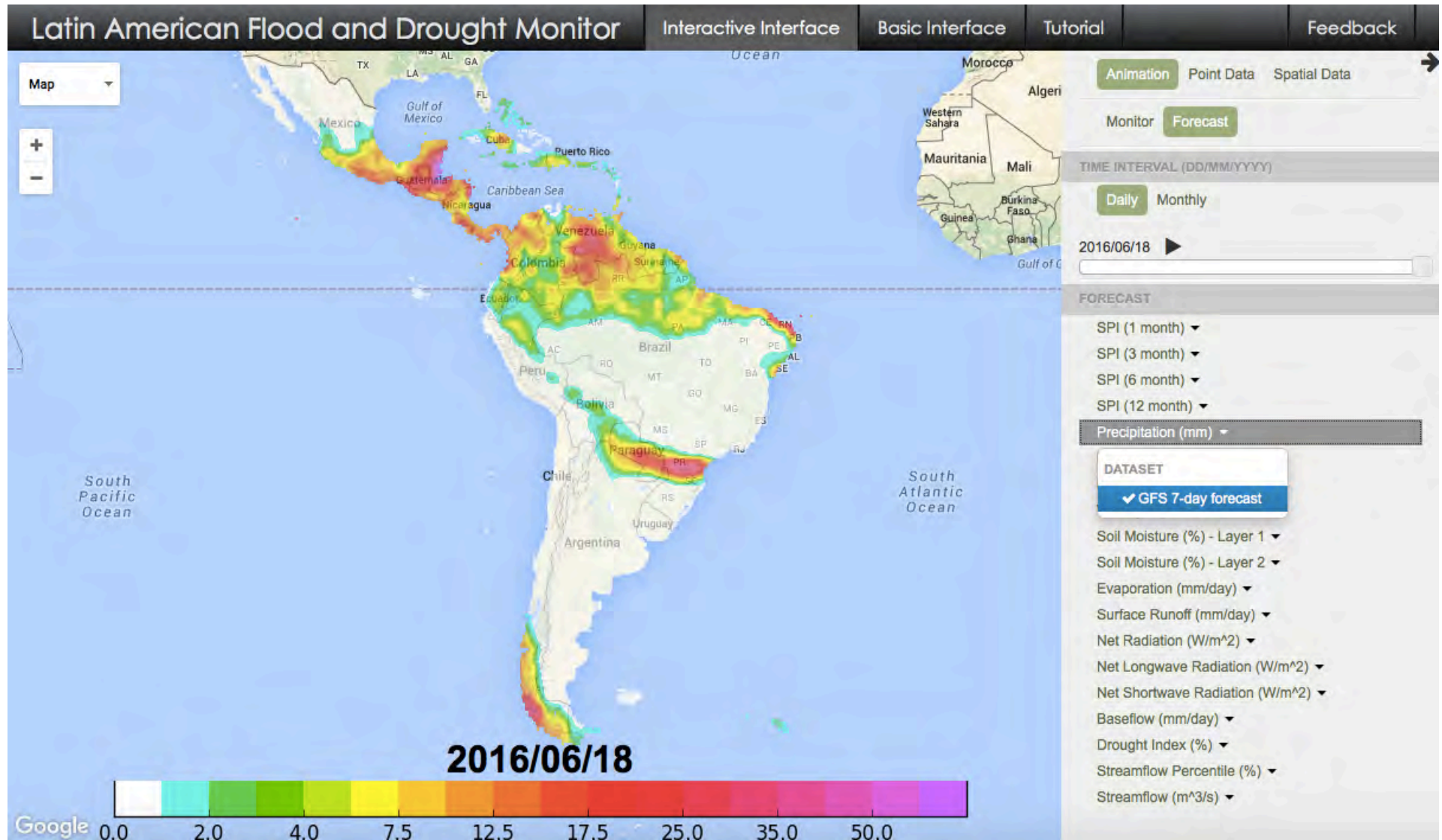
# Interface: NDVI (Remote Sensing)



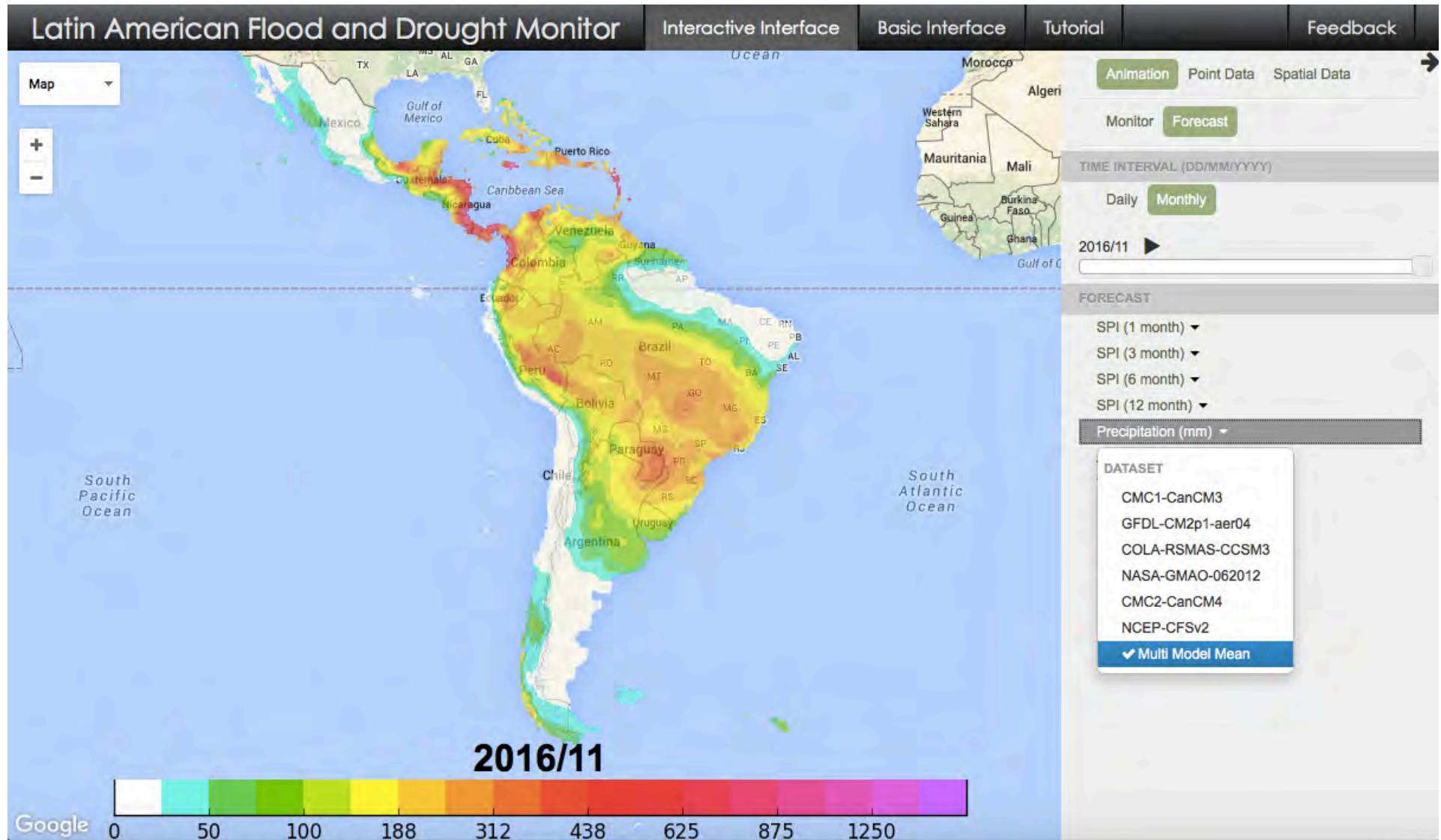
**NDVI** – Normalized Difference Vegetation Index is a measure of live green vegetation; Changes to low values typically correlate well with drought conditions.



# Interface: 7-day Forecast

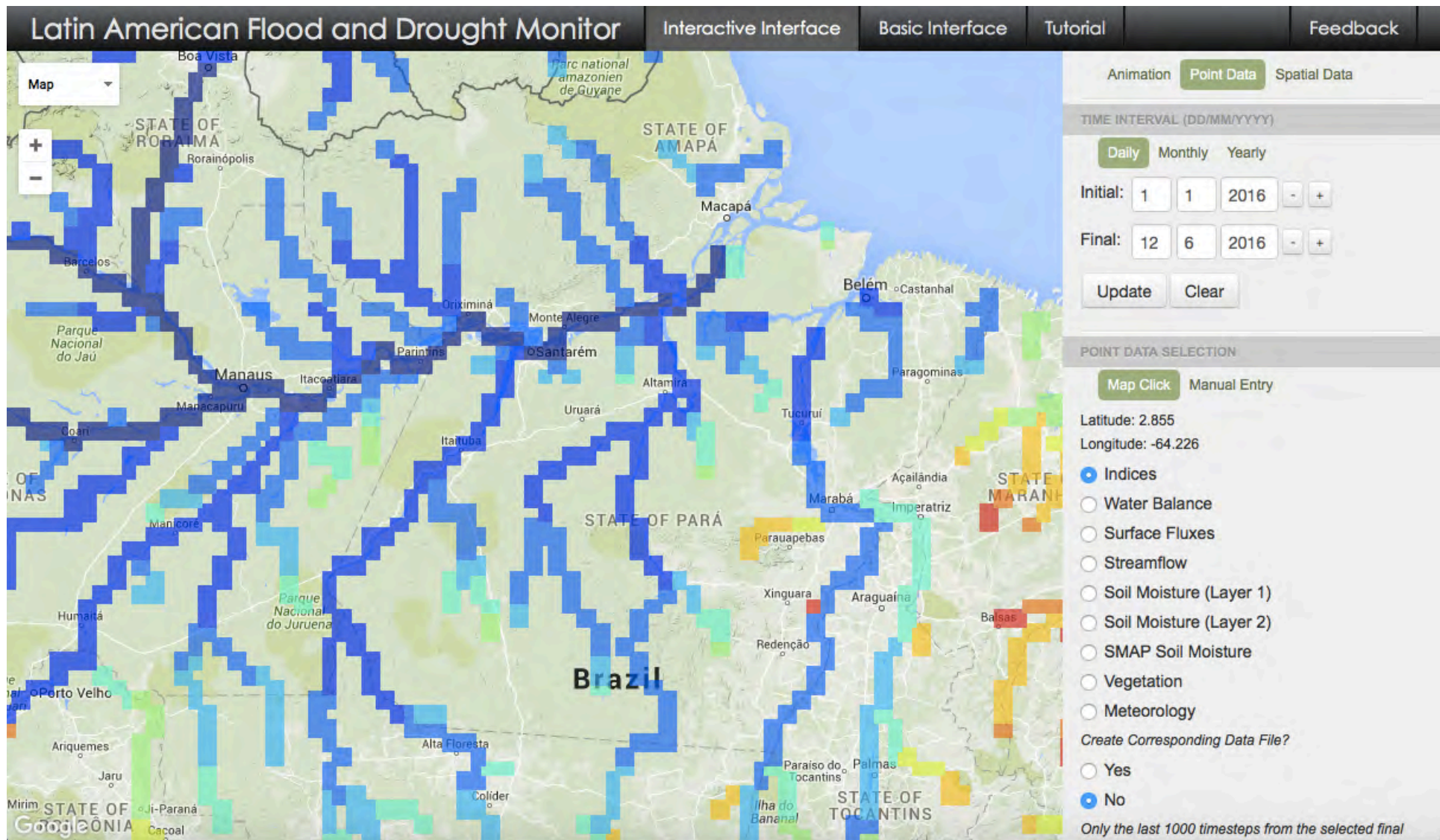


# Interface: Seasonal Forecast

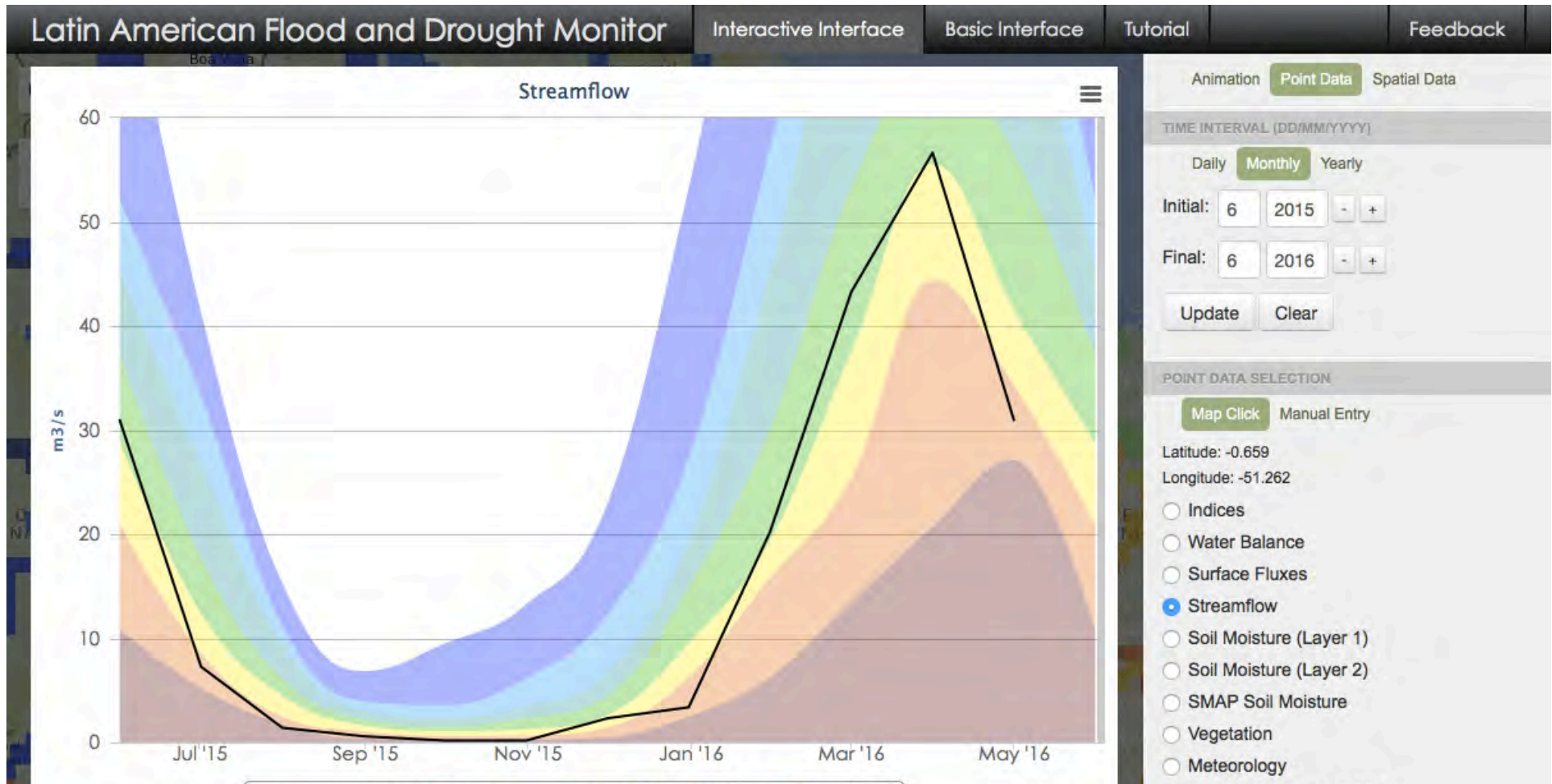




# Point Data: Map Selection



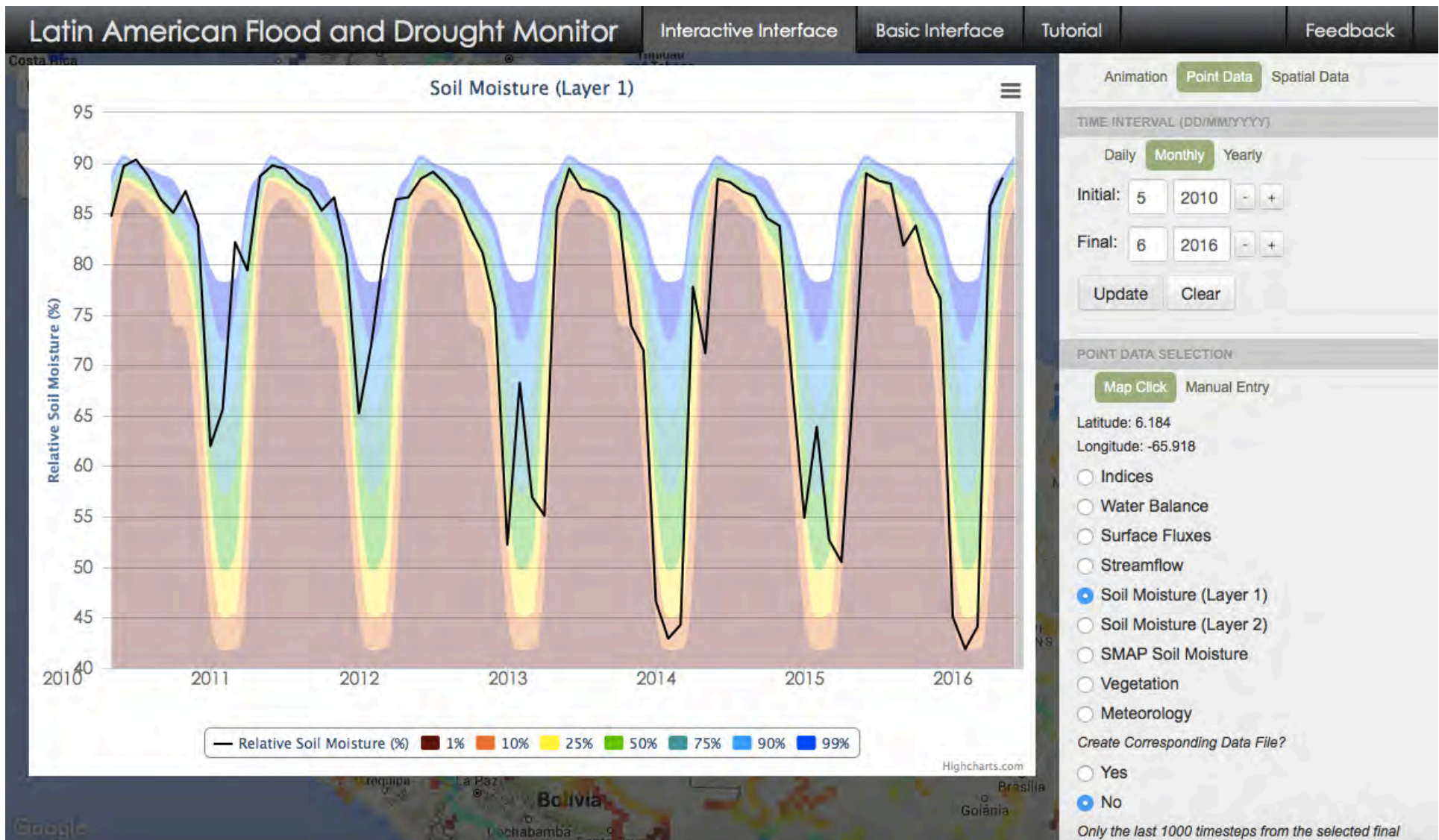
# Point Data: Streamflow (Amazon River)



**Streamflow Percentiles-** Measure of the severity of hydrologic drought; low values indicate drought conditions.



# Point Data: Soil Moisture (Venezuela)



# Point Data: Download

Latin American Floods

Indices\_1951\_2014\_-4.625\_-54.875.txt

Search in Sheet

Home Layout Tables Charts SmartArt Formulas Data Review

Font: Calibri (Body) 12

Alignment: General

Number: 0.00

Format: Normal

Cells: Insert Delete Format Themes

fx year

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S
1	year	SPI (3 month	SPI (12 mese	SPI (1 mes)	SPI (6 month	Anomalia (C)	Indice del ca	Indice de veg	Indice de la humedad del suelo (%)										
2	1951	-0.492	-0.854	-0.393	-0.856	-999	42.043	-999	42.605										
3	1952	-0.25	-0.815	-0.067	-0.395	-999	43.668	-999	41.584										
4	1953	-0.11	-0.436	-0.034	-0.237	-999	45.87	-999	41.082										
5	1954	-0.021	-0.042	0.054	-0.06	-999	49.678	-999	52.572										
6	1955	0.494	0.584	0.28	0.595	-999	54.743	-999	57.608										
7	1956	0.548	0.733	0.381	0.664	-999	57.609	-999	59.628										
8	1957	-0.651	0.434	-0.564	-0.414	-999	42.285	-999	38.691										
9	1958	-0.714	-1.087	-0.343	-0.801	-999	44.127	-999	37.901										
10	1959	0.897	0.32	0.537	0.802	-999	58.375	-999	56.906										
11	1960	-0.879	-0.817	-0.546	-1.064	-999	32.59	-999	26.857										
12	1961	0.552	1.003	0.149	0.865	-999	61.429	-999	51.095										
13	1962	-0.18	-0.595	0.047	-0.386	-999	52.049	-999	49.801										
14	1963	-0.121	0.183	-0.215	-0.064	-999	44.332	-999	39.811										
15	1964	-0.35	-0.19	-0.213	-0.219	-999	53.979	-999	51.398										
16	1965	-0.54	-0.78	-0.288	-0.754	-999	45.508	-999	43.474										
17	1966	-0.282	-1.369	-0.099	-0.465	-999	43.775	-999	39.606										
18	1967	-0.238	0.287	-0.19	-0.061	-999	48.41	-999	42.786										
19	1968	0.118	-0.204	0.209	0.049	-999	51.184	-999	54.524										
20	1969	-0.652	-0.241	-0.546	-0.524	-999	42.646	-999	42.432										
21	1970	-0.383	-1.644	-0.084	-0.994	-999	42.091	-999	36.29										
22	1971	0.173	0.213	0.128	0.252	-999	55.126	-999	53.509										
23	1972	-0.43	0.108	-0.273	-0.361	-999	50.802	-999	47.974										
24	1973	0.53	-0.512	0.48	0.11	-999	57.834	-999	63.293										
25	1974	0.727	1.1	0.466	0.912	-999	52.21	-999	60.882										
26	1975	1.106	2.853	0.579	2.066	-999	71.675	-999	72.592										
27	1976	-0.65	-0.141	-0.392	-0.673	-999	46.673	-999	44.431										
28	1977	0.096	-0.845	0.069	-0.238	-999	54.895	-999	52.751										
29	1978	-0.027	0.148	0.018	-0.023	-999	47.593	-999	56.796										
30	1979	-0.035	-0.142	-0.119	-0.04	-999	49.731	-999	47.595										
31	1980	-0.977	-1.197	-0.567	-1.138	-999	32.561	-999	32.888										
32	1981	-1.497	-2.373	-0.906	-2.095	-999	31.942	-999	25.732										
33	1982	-0.447	0.049	-0.283	-0.301	-999	46.935	-999	41.121										
34	1983	-1.32	-2.896	-0.86	-1.989	-999	29.18	-999	27.745										
35	1984	1.534	0.413	0.978	1.631	-999	60.213	-999	62.992										
36	1985	0.131	1.343	0.177	0.268	-999	48.941	-999	50.171										
37	1986	0.523	1.514	0.137	1.07	-999	51.099	-999	56.688										
38	1987	-0.175	-0.297	-0.315	-0.185	-999	47.083	-999	42.983										
39	1988	0.471	-0.156	0.526	0.26	-999	56.705	-999	62.1										
40	1989	1.345	1.758	0.944	1.456	-999	69.78	-999	78.9										
41	1990	-0.458	0.276	-0.453	-0.412	-999	36.636	-999	45.414										
42	1991	0.087	-0.039	0.03	0.126	-999	55.968	-999	56.63										
43	1992	-0.524	-1.048	-0.283	-0.818	-999	40.456	-999	41.031										
44	1993	-0.704	-0.317	-0.054	-0.711	-999	48.685	-999	48.763										

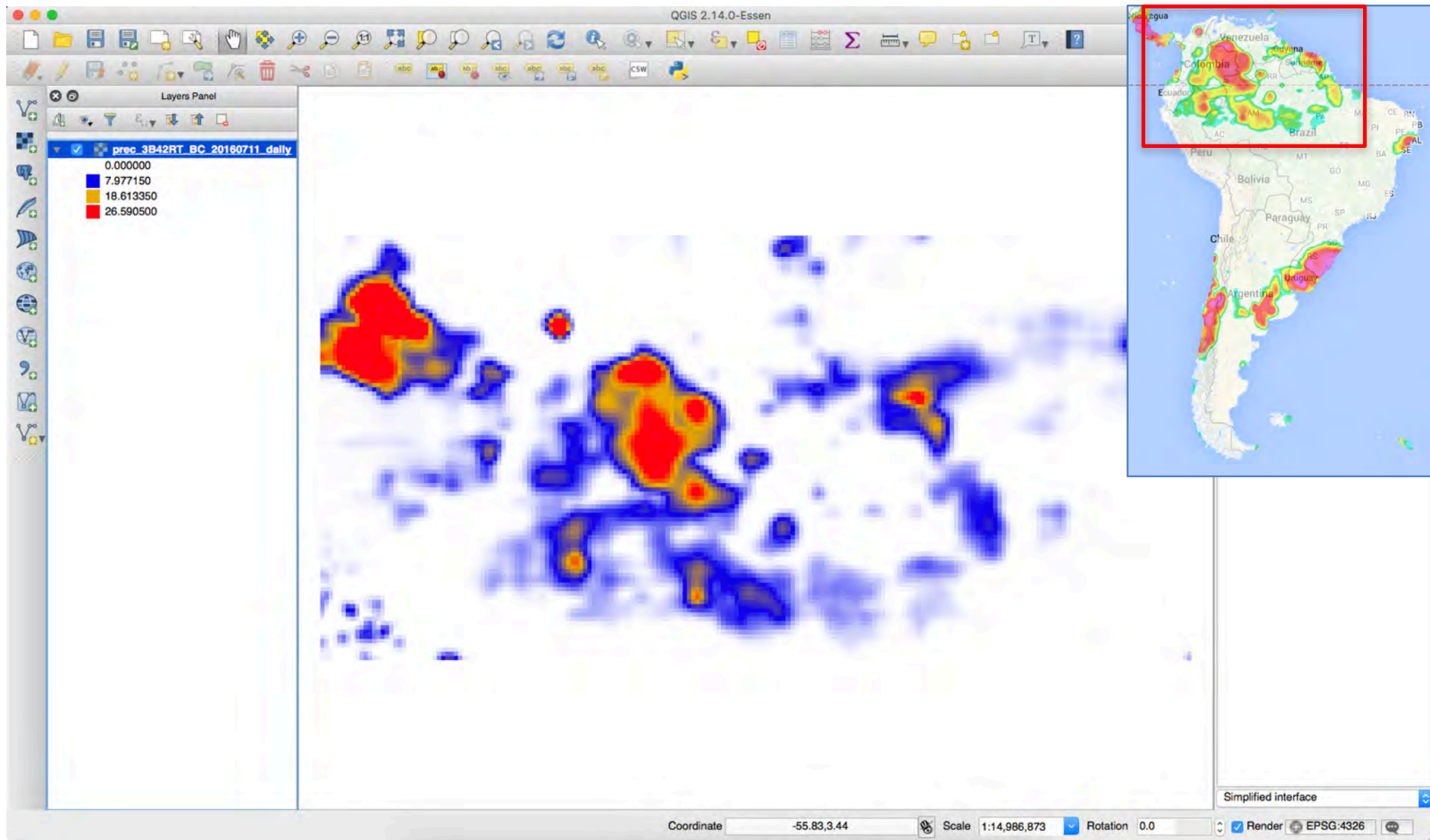
Indices\_1951\_2014\_-4.625\_-54.87

Normal View Ready

Sum=0



# Spatial Data: Selection, Download, and GIS



# Interface: Feedback

Latin American Flood and Drought Monitor

Interfaz interactiva Interfaz basica Tutorial Sugerencias

Map

Managua

Costa Rica

Panama

Barranquilla

Aruba

Curacao

Grenada

Barbados

Medellin

Calli

Quito

Ecuador

Guayaquilo

Peru

Lima

STATE OF ACRE

STATE OF RONDONIA

STATE OF MATO GROSSO

STATE OF TOCANTINS

STATE OF GOIAS

Nuestra Señora de La Paz

Bolivia

Google

Map data ©2014 Google, INEGI, Inav

**Contactenos**

Nombre

Correo electronico

Mensaje

1500 caracteres restantes.

Animacion

Datos Espaciales

INTERVALO DE TIEMPO (DIA/MES/AÑO)

Diario Mensual ☒ Anual

Inicio:  -

Final:  -

SELECCIÓN DE DATOS POR COORDENADAS

Latitud: 12.983

Longitud: -45.747

☒ Indices

☐ Balance de agua

☐ Flujos de materia y energia

☐ Caudal

☐ Humedad del suelo (Primera Capa)

☐ Humedad del suelo (Segunda Capa)

☐ Vegetacion

☐ Meteorologia

Desea crear el archivo?

☒ Si

☐ No

Download Data Solo se enseñaran los datos mas recientes a la ultima fecha que eligió



# Summary of Monitors' Capabilities

- Multiple Languages
- Short-Term Forecast (7 days)
- Seasonal Forecast (6 months)
- Standard Precipitation Index (SPI) and Drought Index
- Vegetation Monitoring (NDVI)
- Download point data
- Download spatial data
- Provide feedback

<http://stream.princeton.edu>

# DATA SCIENCE AND HYDROLOGY BEHIND THE FLOOD AND DROUGHT MONITORS

Sources of precipitation data in the LACFDM  
Validation of satellite precipitation  
Merging *in-situ* and satellite data



# Historical Meteorological Dataset

## Reanalysis

High temporal/low  
spatial resolution

**MANY BIASES and  
SPURIOUS TRENDS**

## Observations

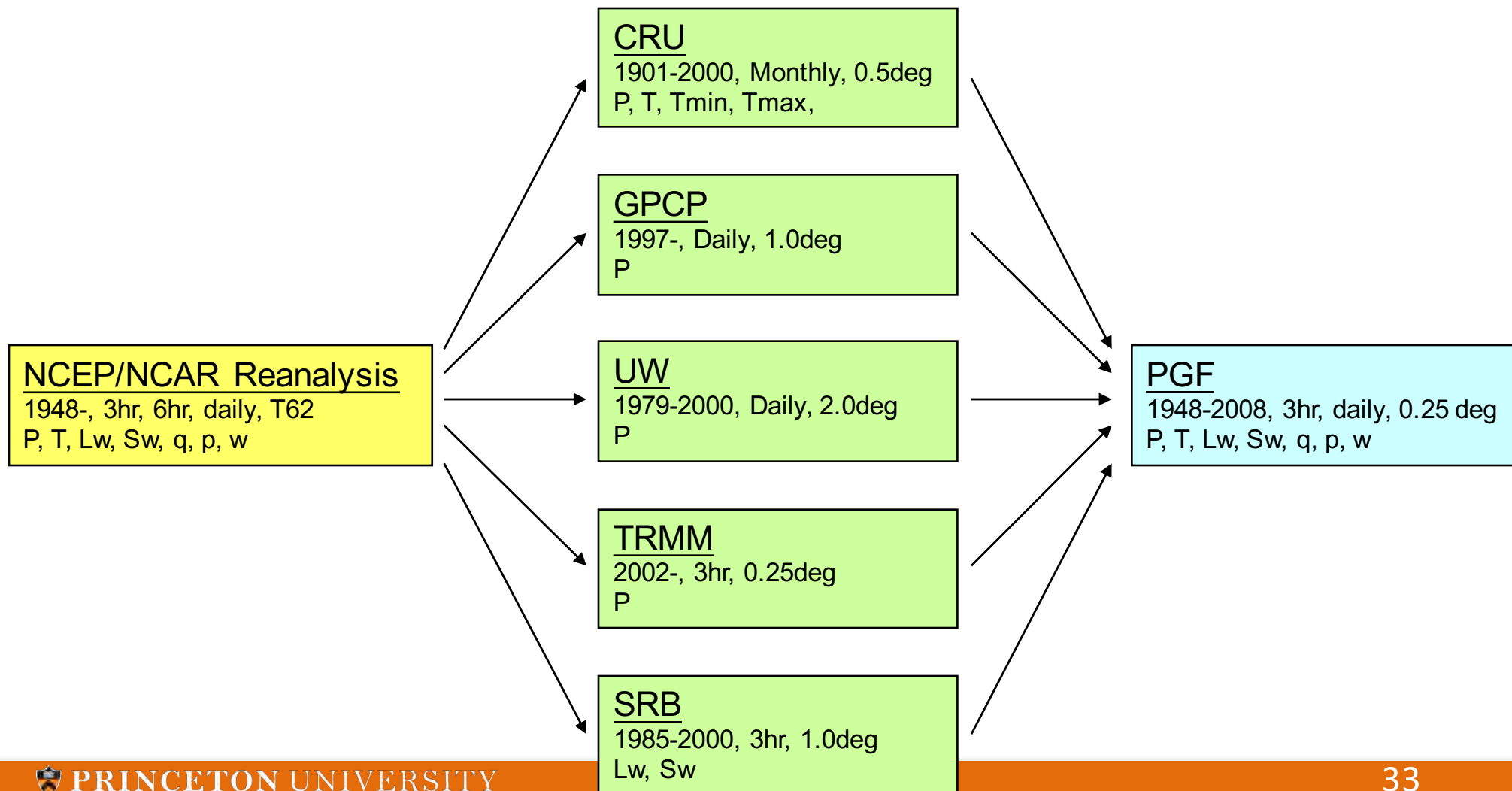
Generally low temporal/high  
spatial resolution

**BEST ESTIMATE of  
individual variables**

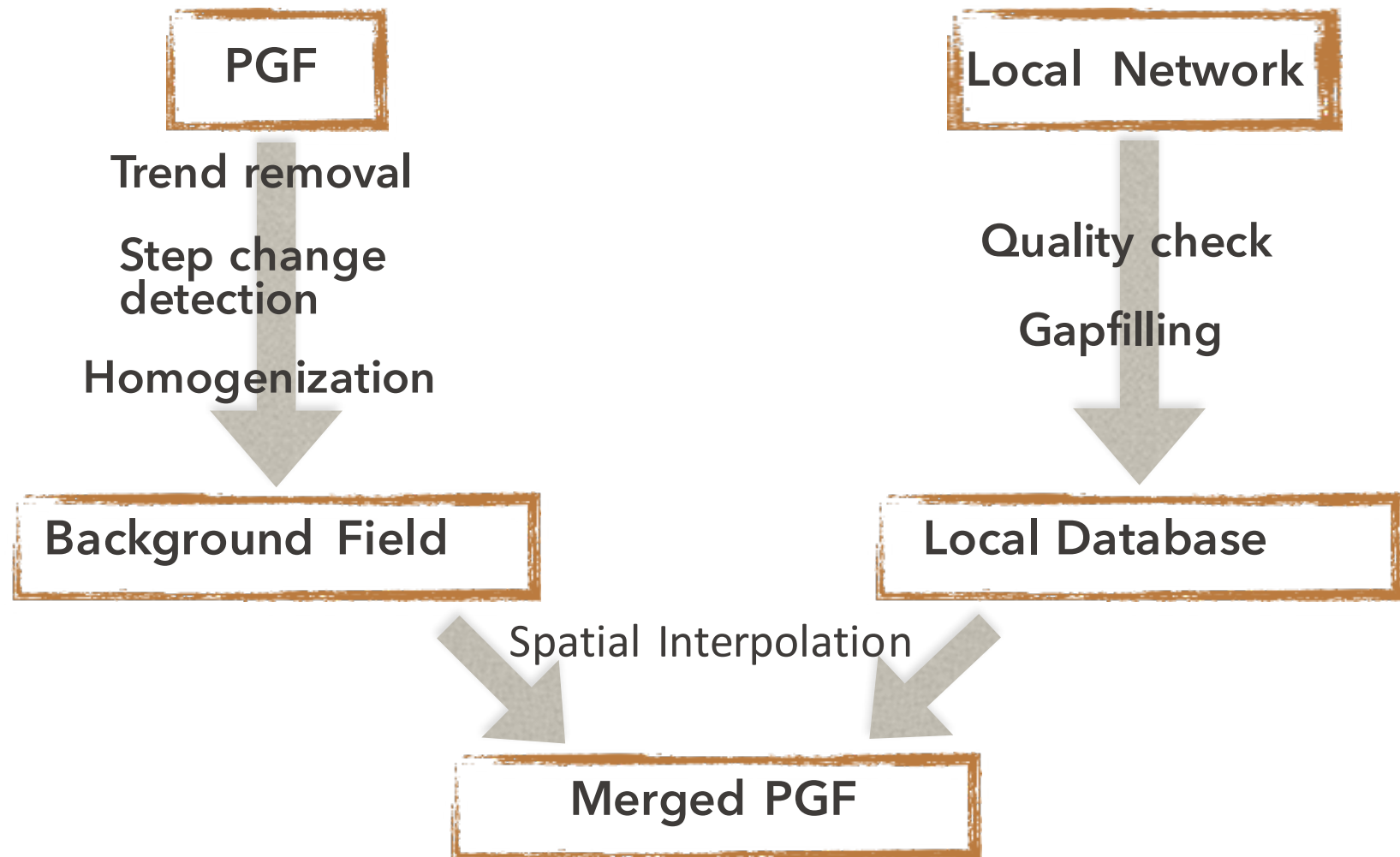
## Forcing Dataset

High temporal/high  
spatial resolution:

**CORRECTED, CONSISTENT**



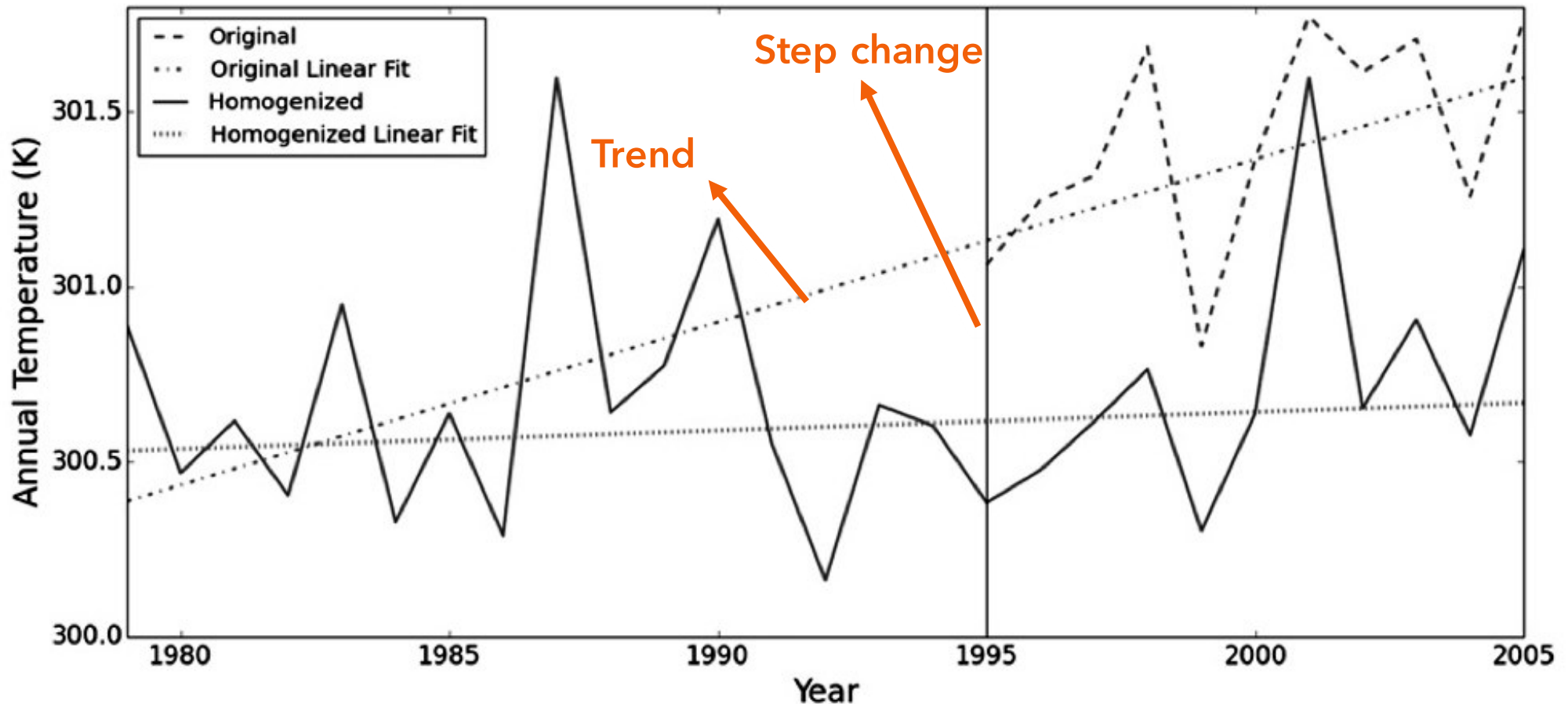
# Sources of Meteorological Data





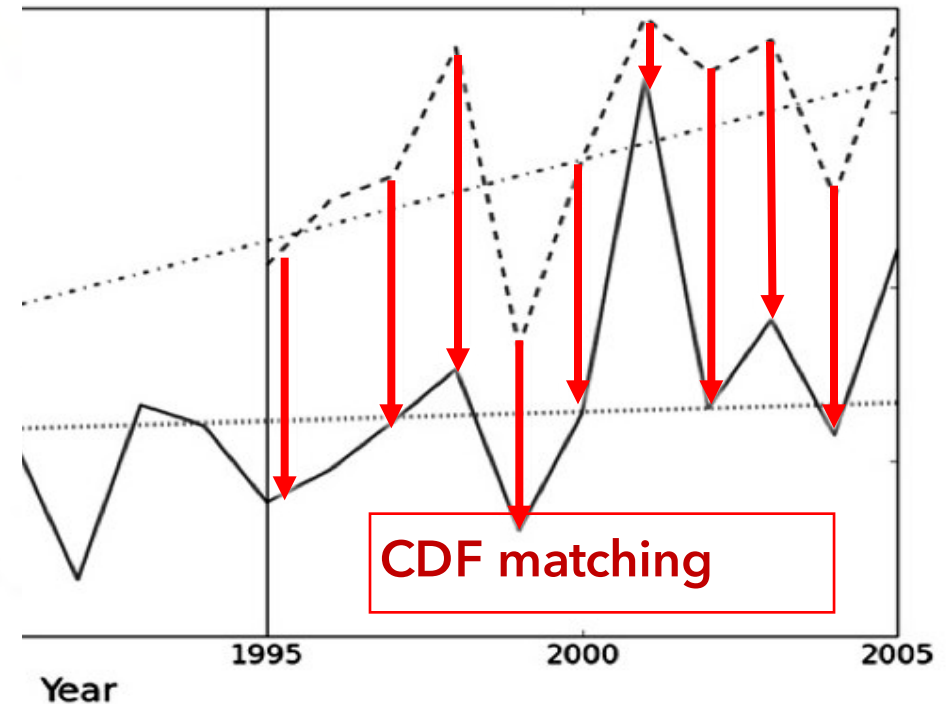
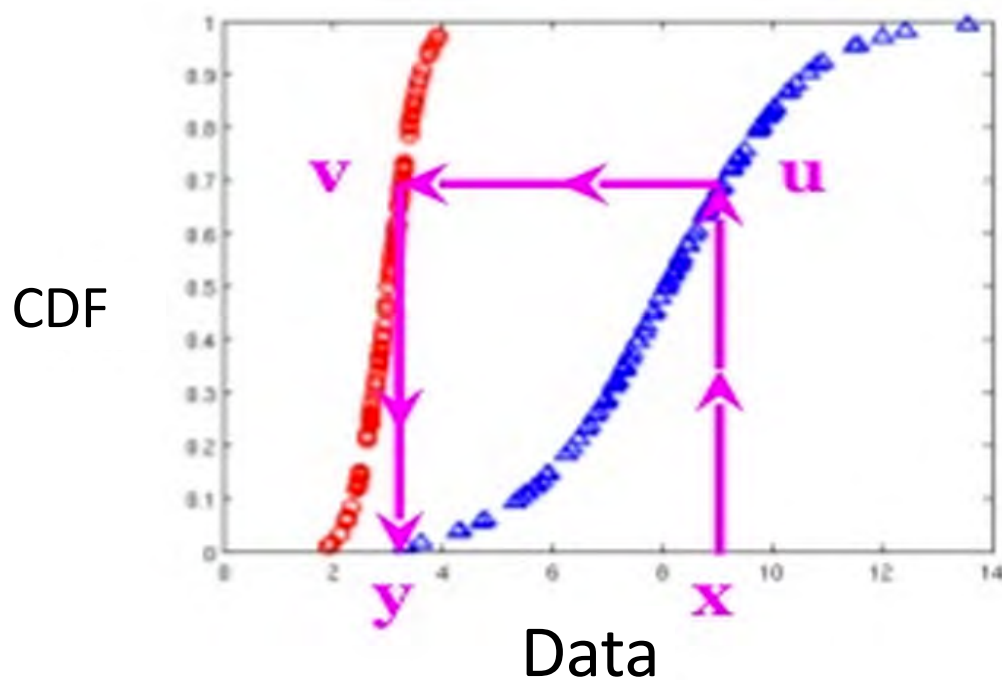
# Detection and correction of temporal inhomogeneties

e.g. trends and step changes



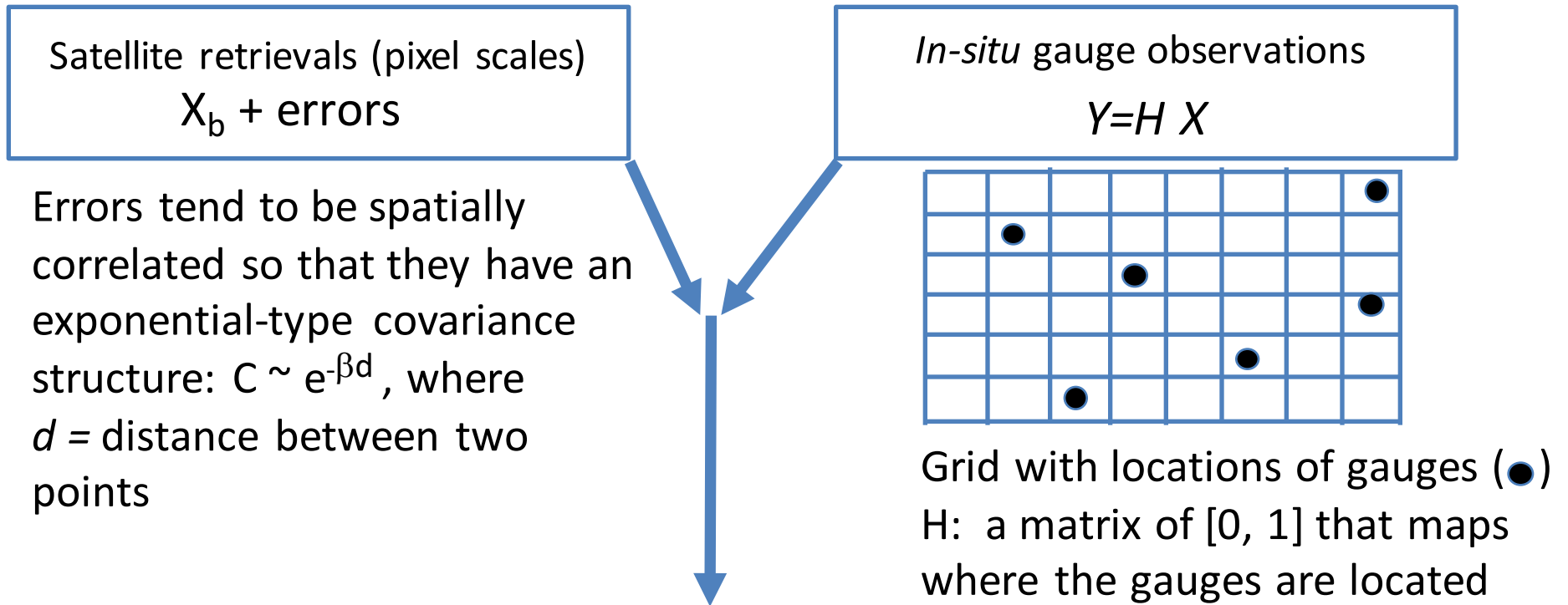
# Detection and correction of temporal inhomogeneties

homogenization: cumulative distribution matching



# Methodology behind the statistical merging

$X$ : 'correct' precipitation value;  $X_b$ : satellite background estimates;  
 $X_a$ : the best estimate of the precipitation.



**Merge the estimate  $X_b$  with observations  $Y$**

Best statistical estimate will be  $X_a$

$$X_a = X_b + K (Y - H X_b)$$

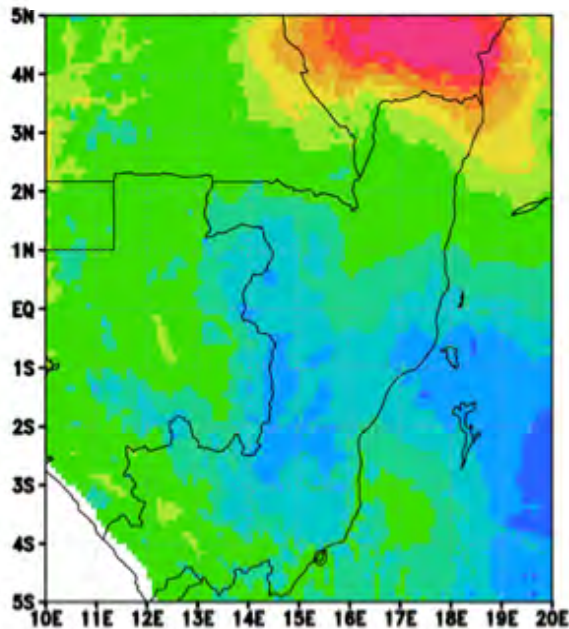
with the weights:  $K = CH^T(HCH^T)^{-1}$



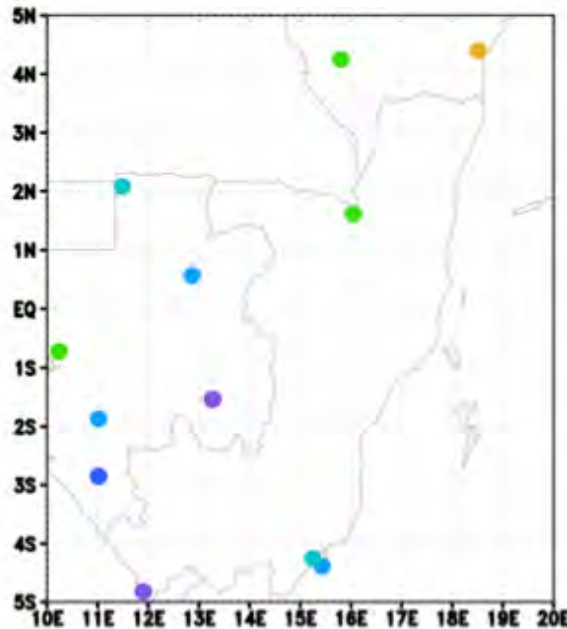
## Sub-Saharan Africa (Chaney et al., 2014)

- Merging station data:  
Daily maximum temperature correction in the Gabon region  
in Central Africa on Feb 01 2000

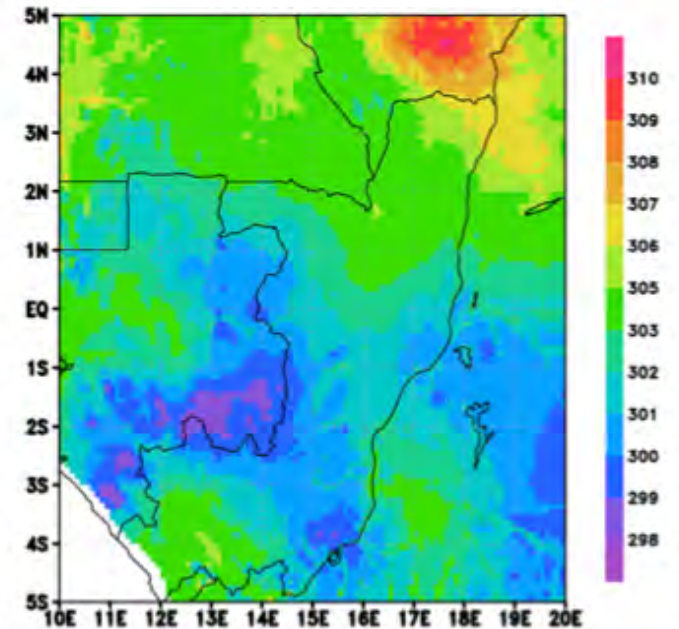
**Background field**



**Observation**

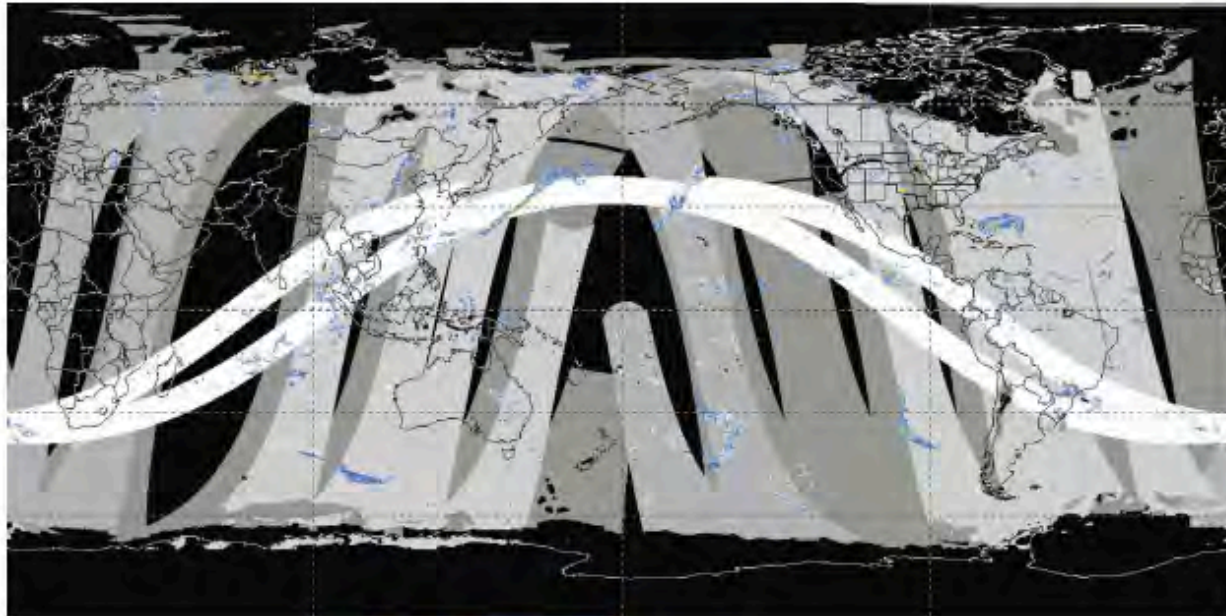


**Corrected field**



# Realtime Satellite Precipitation - TMPA (Example)

## TMPA – TRMM Multi-Satellite Precipitation Analysis



3-hour period centered at 0000 UTC 25 May 2004

- Different Sources:

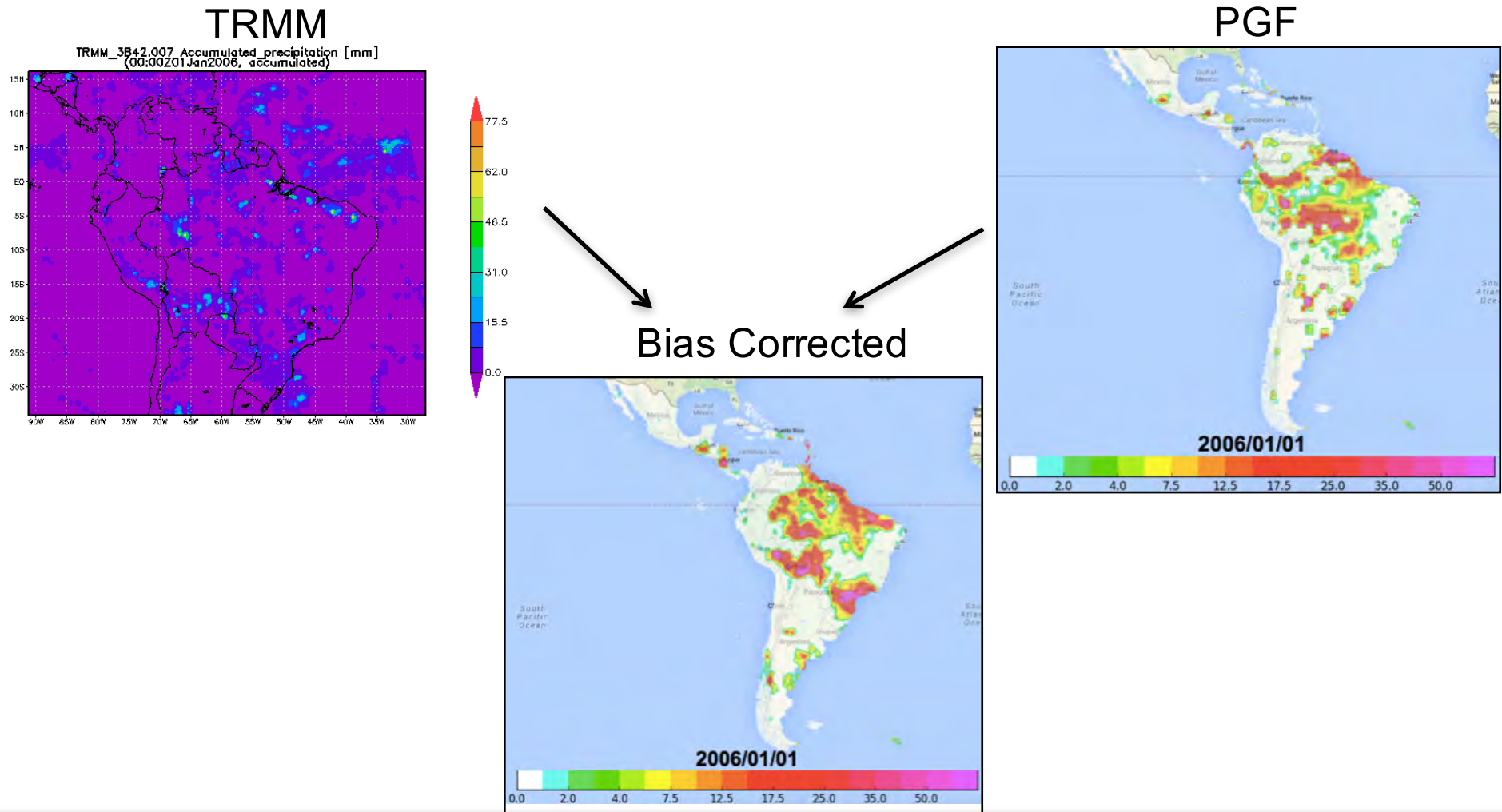
- TMI (white)
- SSM/I (light gray)
- AMSR-E (medium gray)
- AMSU-B (dark grey)

A diverse, growing set of input precipitation estimates – various

- periods of record
- regions of coverage
- sensor-specific strengths and limitations

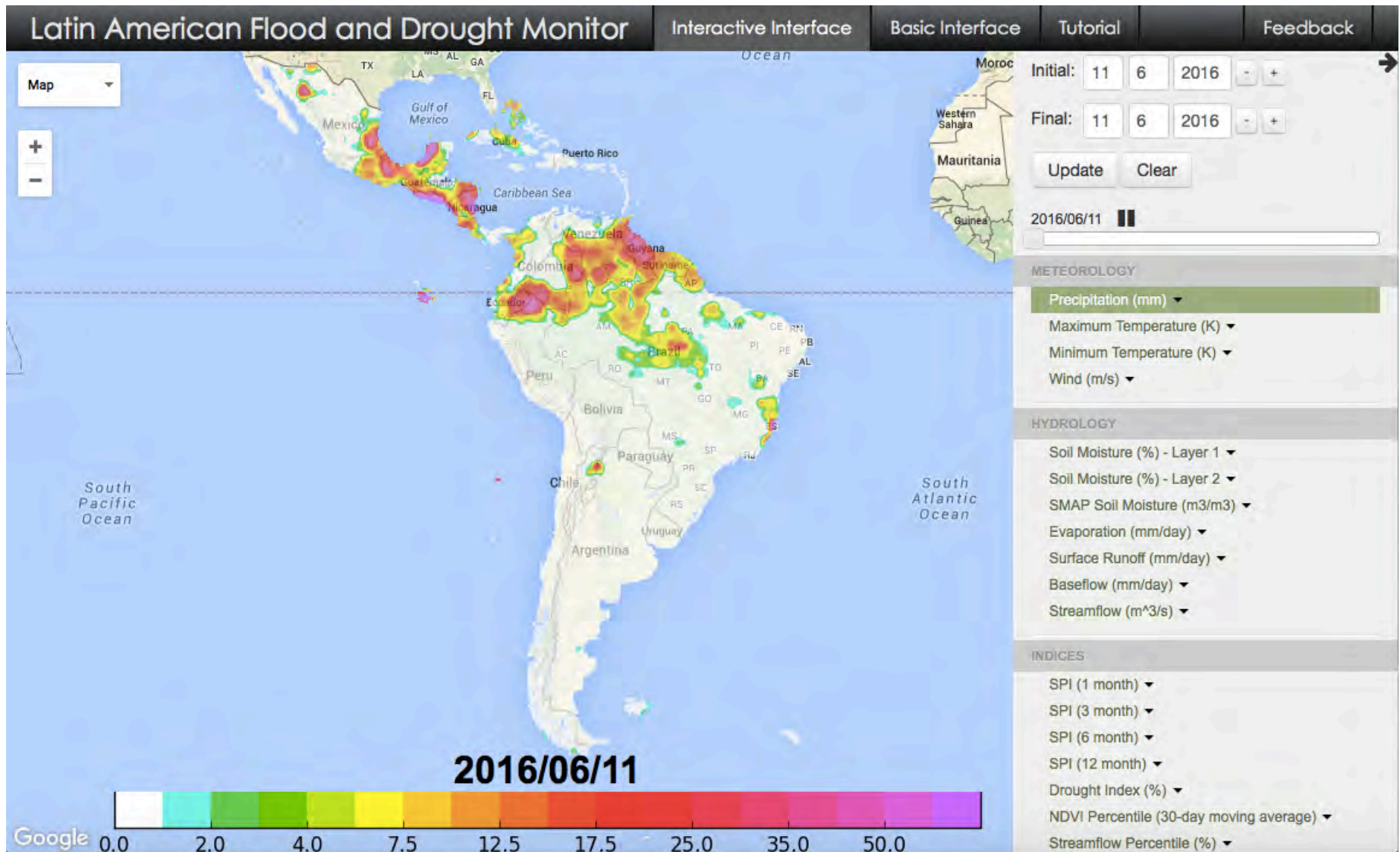
# Real-Time Meteorological Data: Satellite Precipitation

Monitor uses TRMM 3B42v7 daily precipitation estimates, bias corrected against the historical climatology



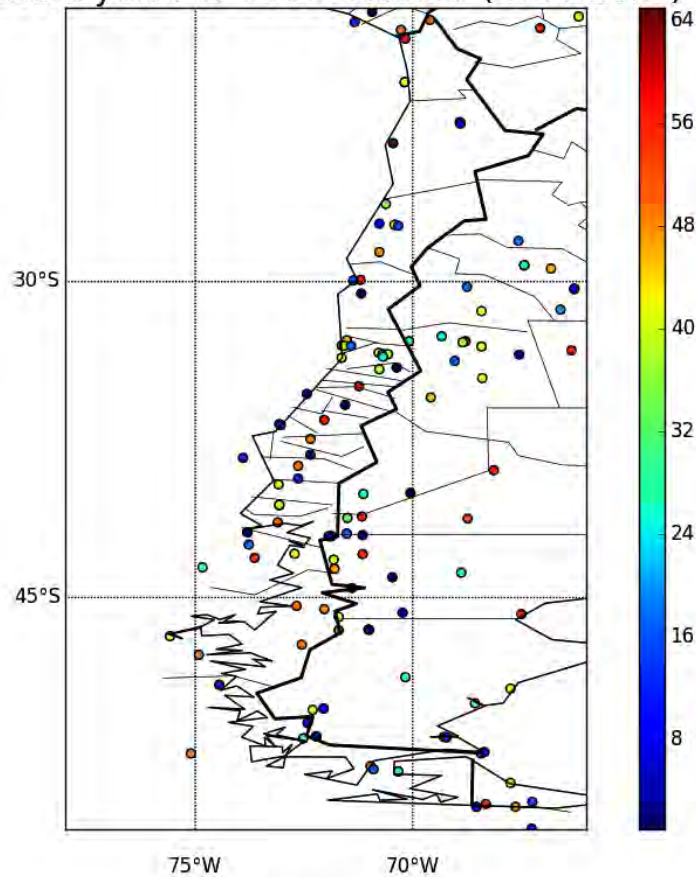


# Bias corrected precipitation



# Create a merged station database: GSOD and DGA (Chile)

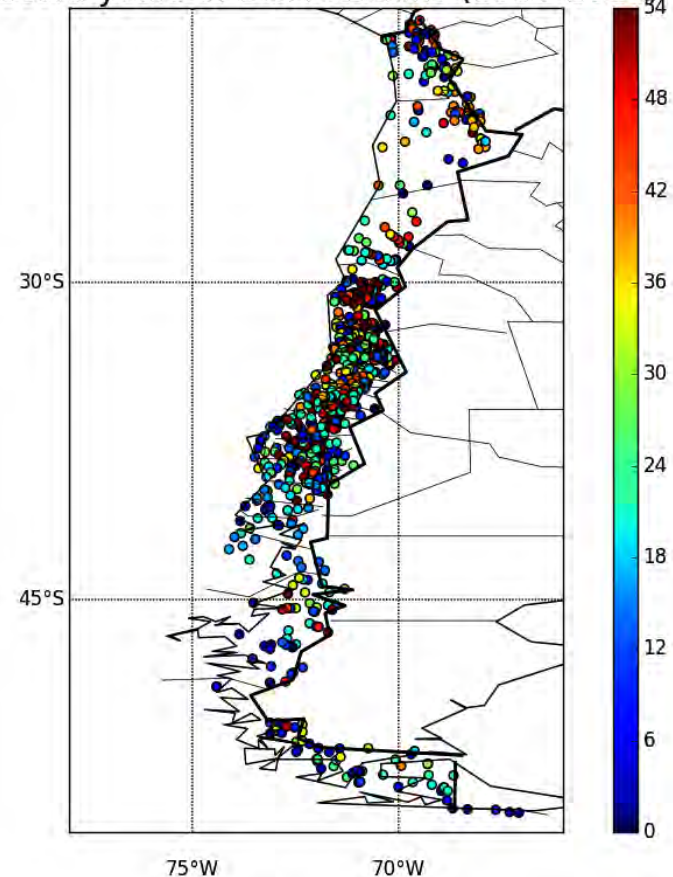
Record years of GSOD stations (1950-2012)



Number of records (year)

128 stations within the domain

Record years of DGA stations (1960-2014)



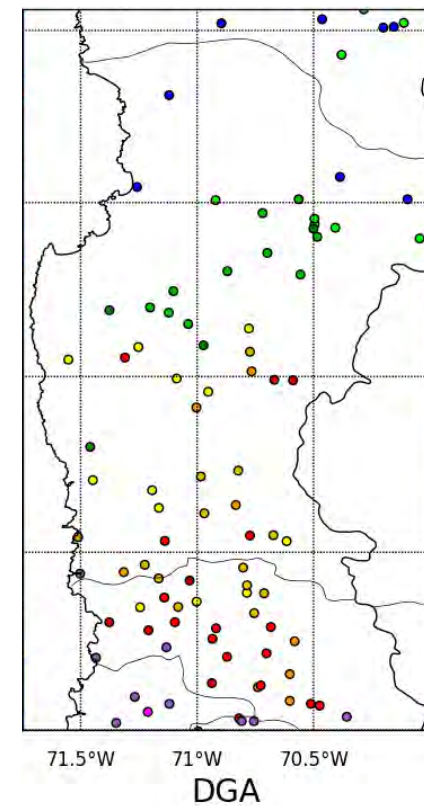
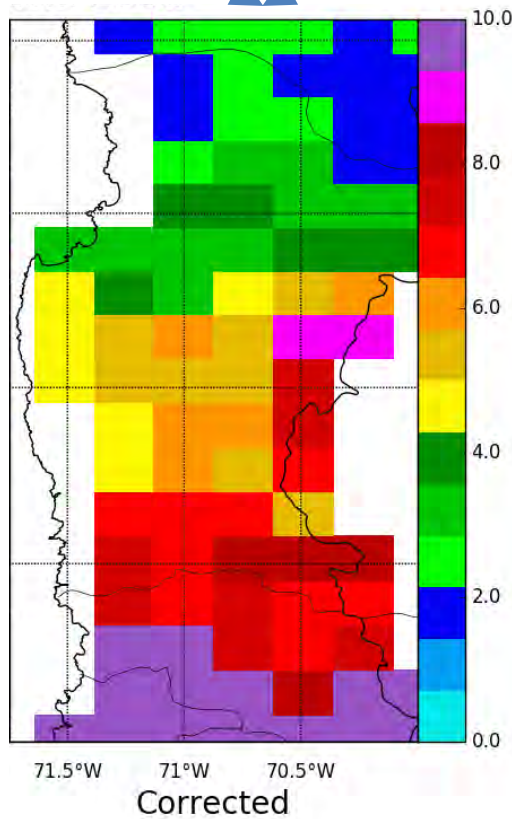
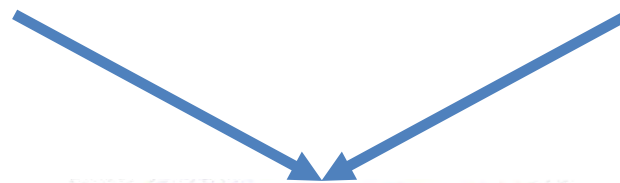
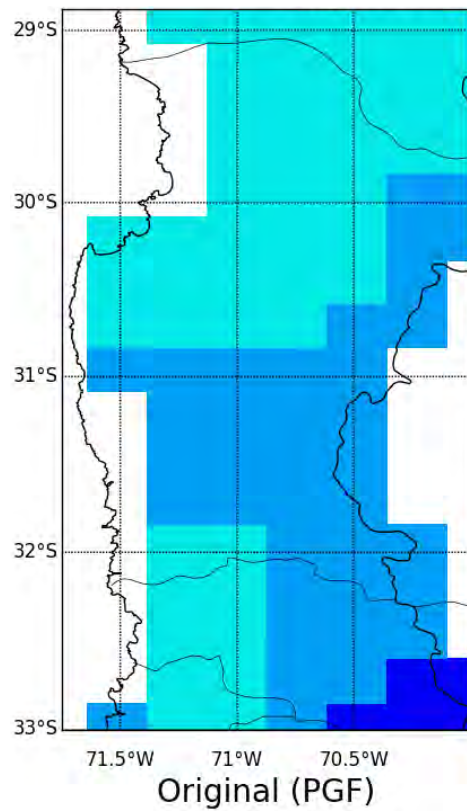
Number of records (year)

723 stations



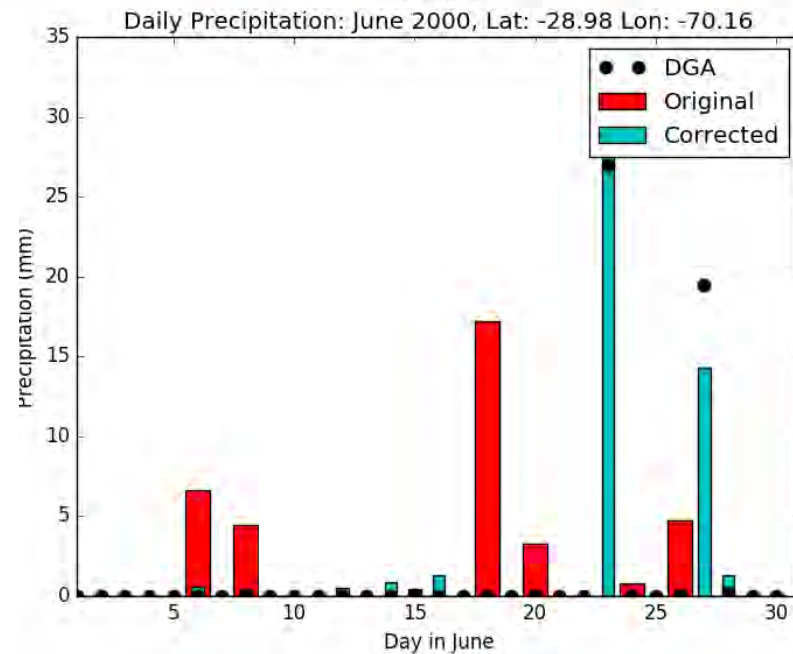
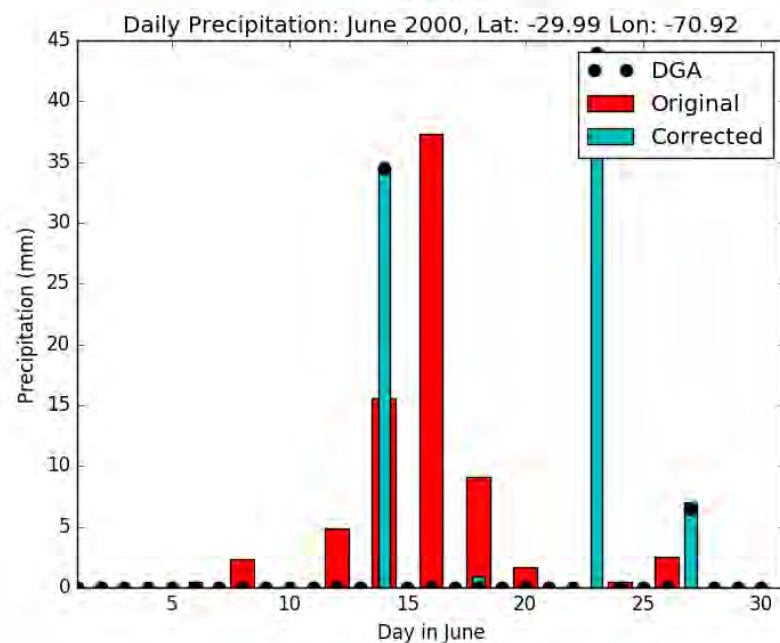
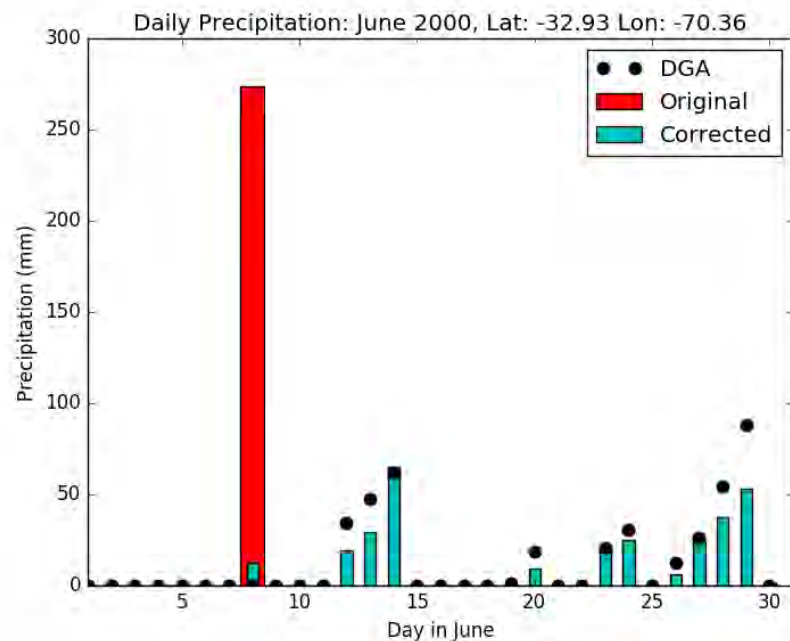
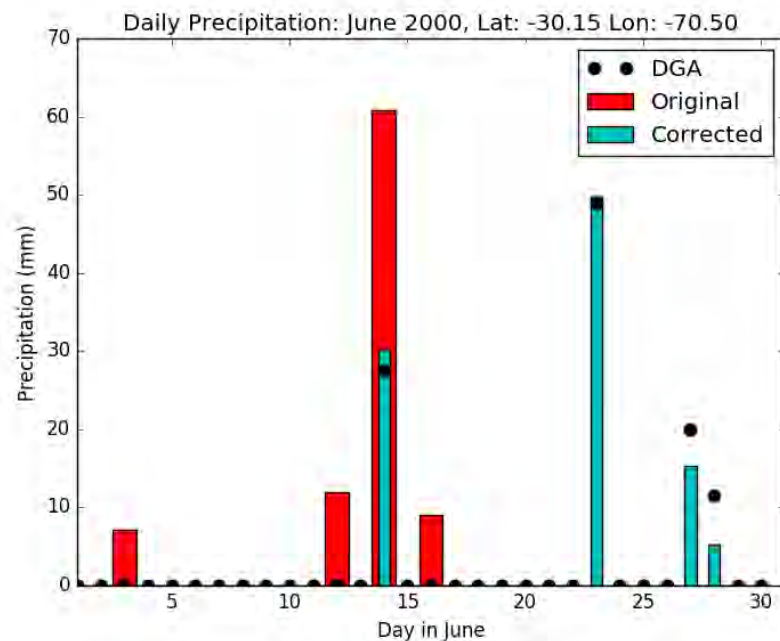
# Merging Station Data:

## Daily precipitation in Central Chile on Jun 1 2000





## Merging Station Data: Timeseries



## Validation and Merging Example

- Download Station Data from:

[http://www.cazalac.org/mwar\\_lac/index.php?id=129](http://www.cazalac.org/mwar_lac/index.php?id=129)

- Use LAFDM to download data for one station
- Compare time series:
  - 2008 – PGF
  - 2009 – TMPA v7 3B42RT
- Consider the bias, number of rain days
- Download and compare other sites
- Example of merging all stations with gridded dataset

Thank you for your attention!  
Questions or comments?