

# **A web-based tool to examine probability distributions of weather and climate data**

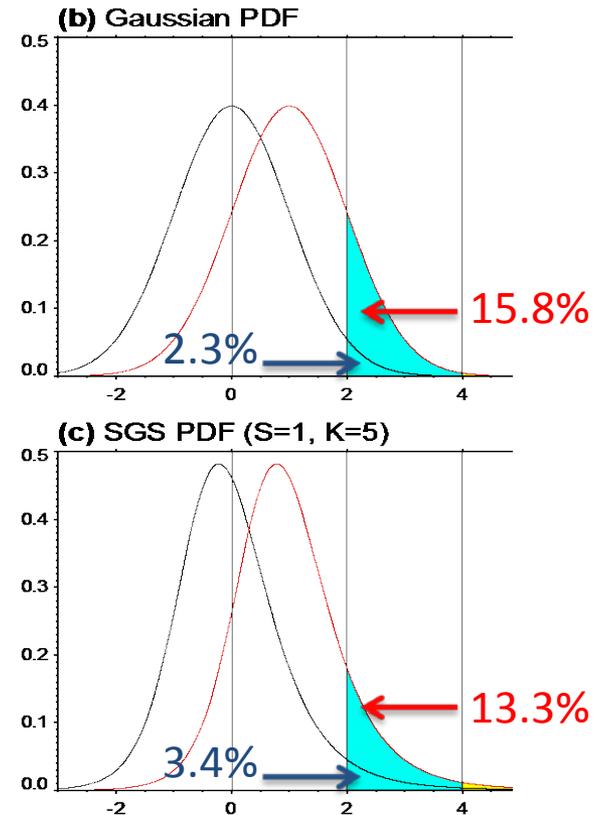
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CIRES/U. of Colorado &  
NOAA/ESRL PSD, Boulder CO

**<http://www.esrl.noaa.gov/psd/data/writ/distributions/>**

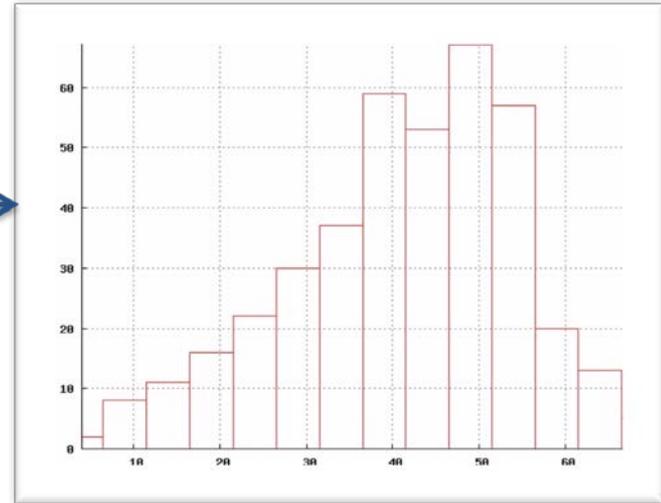
# Importance of distributions

- Climate change
- Extreme Events
- El Niño/ La Niña...
- Model Analysis
- Cutoffs (HDD, Freezes, Speed)
- N/S or E/W switches.



# Determining “True” Distributions

Create a histogram from the data →

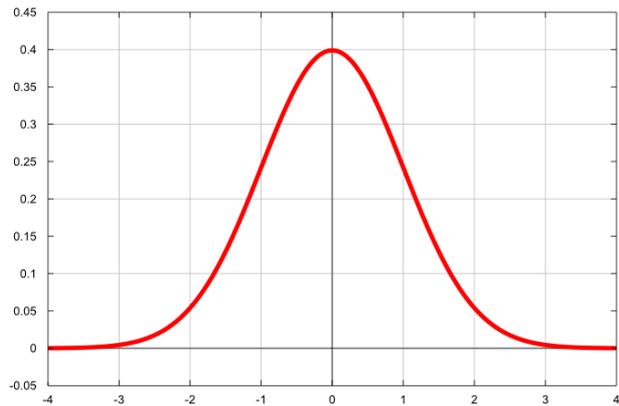


## Problems: Sample Size and Sample Variability

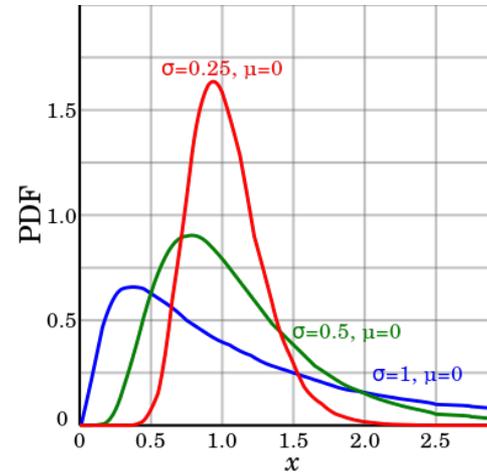
- Some possible extreme value never happened before!
- Error bars are large for probability calculations, especially at the tails.

# Fit a Distribution

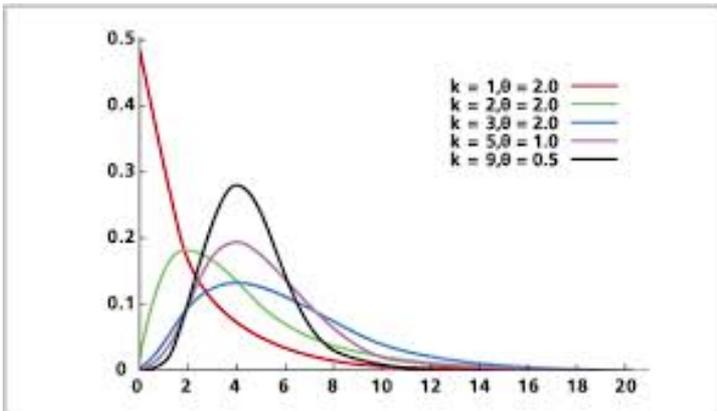
## Gaussian Distribution



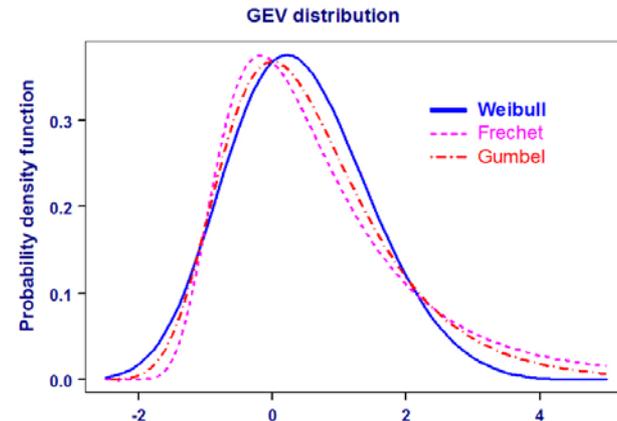
## Log-Normal Distribution



## Gamma Distribution

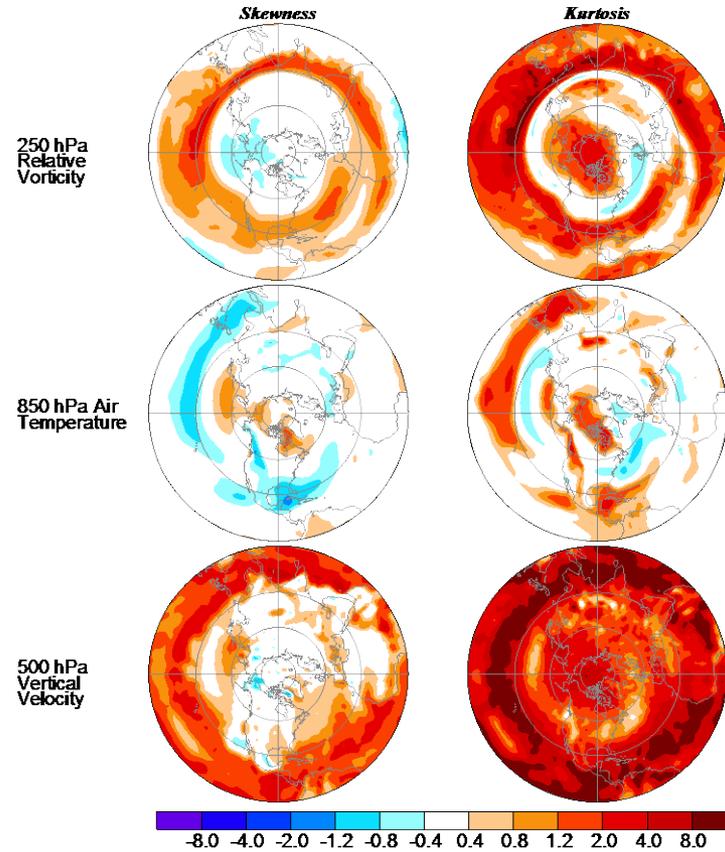


## Generalized extreme value



# Are Daily Atmospheric Variables Gaussian?

Skewness and Excess Kurtosis of Selected Variables (December - February 1871 to 2007)



# Stochastically Generated Skewed Distribution (“SGS”) “Math Page”

Sardeshmukh, P.D., G.P.Compo, and C. Penland, 2015: **Need for caution in interpreting extreme weather statistics.** *J. Climate*, in press,

$$p(x) = \frac{1}{\mathcal{N}} [(Ex + g)^2 + b^2]^{-\left(1 + \frac{1}{E^2}\right)} \exp\left[\frac{2g}{E^2 b} \arctan\left(\frac{Ex + g}{b}\right)\right]$$

$$\mathcal{N}(E, g, b) = \frac{2\pi \nu^{1/2} (2b)^{-(2\nu+1)} \Gamma(2\nu+1)}{\Gamma(\nu+1 - iq/2) \Gamma(\nu+1 + iq/2)}$$

Derived from a stochastically perturbed damped linear Markov process  $x(t)$  whose change  $dx$  in a small time interval  $dt$  is given by :

$$dx = - \left[ \left(1 + \frac{1}{2}E^2\right)x + \frac{1}{2}Eg \right] \lambda dt + [b \eta_1 + (Ex + g)\eta_2] \sqrt{\lambda dt}$$

# Stochastically Generated Skewed Distribution ("SGS")

- The noise is related to the base state so a skewed or kurtosed distribution is possible.
- It is a first order correction to a Gaussian.
- As  $E \rightarrow 0$ , the SGS distribution is a Gaussian.

Use S(Skewness) and  
K(Kurtosis) to calculate E,g,b



$$S = \frac{2E}{(1-E^2)} \frac{g}{\sigma}, \text{ and}$$

$$K = \frac{3}{2} \left[ \frac{1-E^2}{1-(3/2)E^2} \right] S^2 + \left[ \frac{3E^2}{1-(3/2)E^2} \right] > \frac{3}{2} S^2,$$

## **New data distribution web-tool for daily data**

- Plot empirical and fitted distributions of daily atmospheric data
- Fit data to different distributions
- Return requested probabilities of a value
- Return statistics
- Compare distributions
- Return all associated data and statistics in netCDF for users to experiment with

# Web Interface

Variable? 2m Air Temperature ▾

Dataset? 20th Century Reanalysis V2c (1901-2011) ▾

Latitude/Longitude 40 255

Beginning month of season Jan ▾ Ending month Feb ▾

(Optional) Enter a subset range of years 1948 2011

(Optional) Dataset 2? NCEP/NCAR R1 (1948-2014) ▾

Latitude/Longitude 40 255

Beginning month of season Jan ▾ Ending month Feb ▾

(Optional) Enter a subset range of years 1948 2011

(Optional) Return the probability of a value for the selected distribution(s). Raw Value: 270

(Optional) Plot raw empirical distributions for 2 datasets on a single plot:  No  Yes

(Optional) Additionally plot a normal distribution on standardized plot(s):  No  Yes

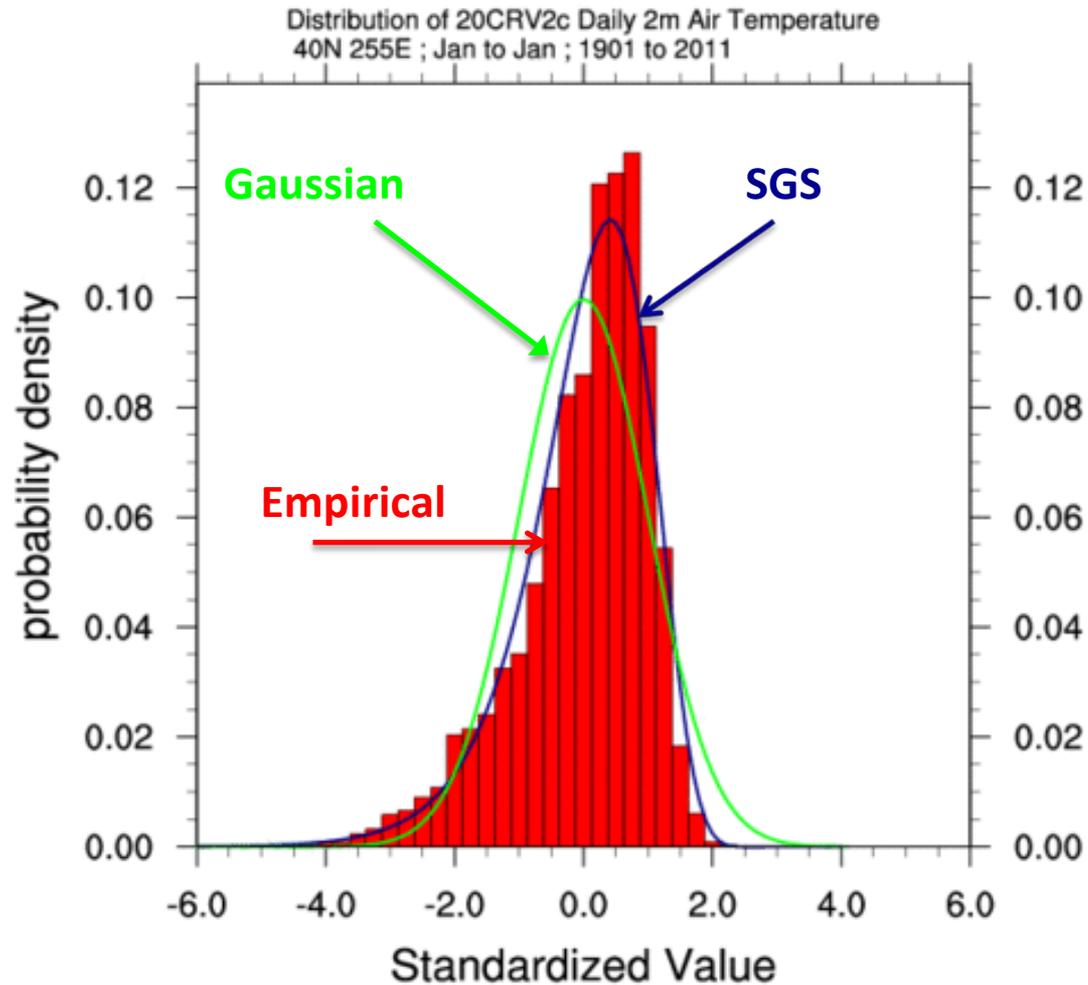
Create Plot

Reset Options



(Report Bugs)

# Distribution of Boulder, CO January 2m Air Temperature from 20CRV2c: 1901-2011



# Statistics of Boulder, CO

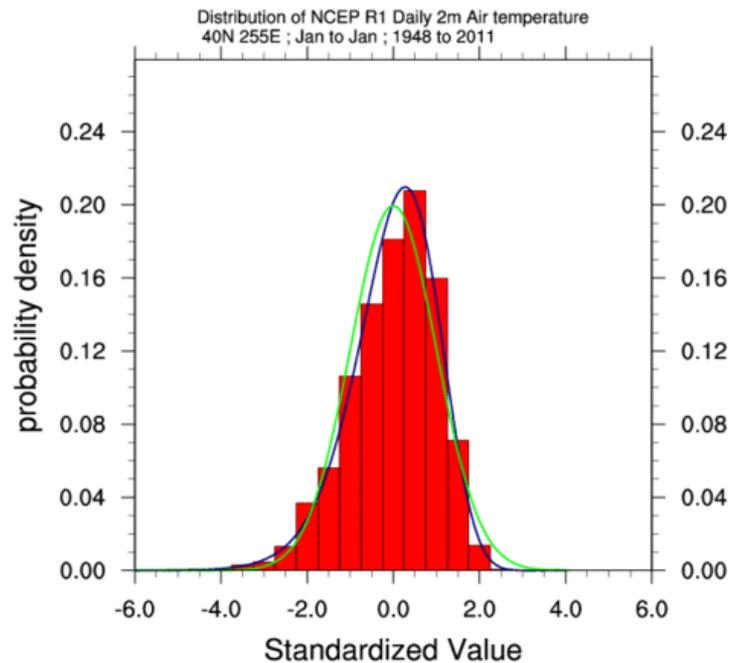
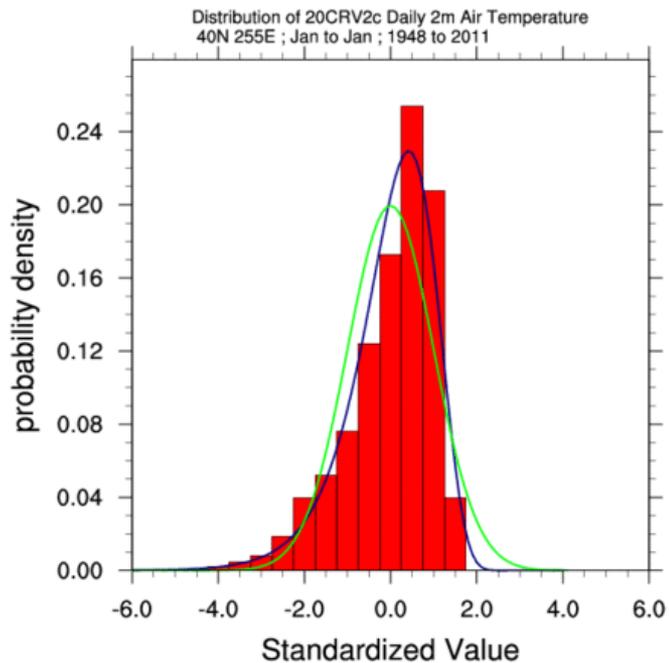
## January 2m Air Temperature: 1901-2011

Time Series Statistics: 20th Century Reanalysis V2c 2m Air Temperature

Statistic	20CRV2c	SGS Statistic	20CRV2c
<b>N</b>	3441	<b>E</b>	0.342
<b>Mean</b>	269.47	<b>g</b>	-1.361
<b>STD</b>	4.44	<b>b</b>	0.175
<b>Skewness</b>	-1.053		
<b>Kurtosis</b>	1.137		
<b>Minimum</b>	247.48		
<b>Lower Decile</b>	263.09		
<b>Median</b>	270.47		
<b>Upper Decile</b>	274.16		
<b>Maximum</b>	279.64		

# Distributions Boulder, CO 20CRV2c vs. NCEP R1

## January 2m Air Temperature: 1948-2011



# Statistics of 20CRV2c vs. NCEP R1

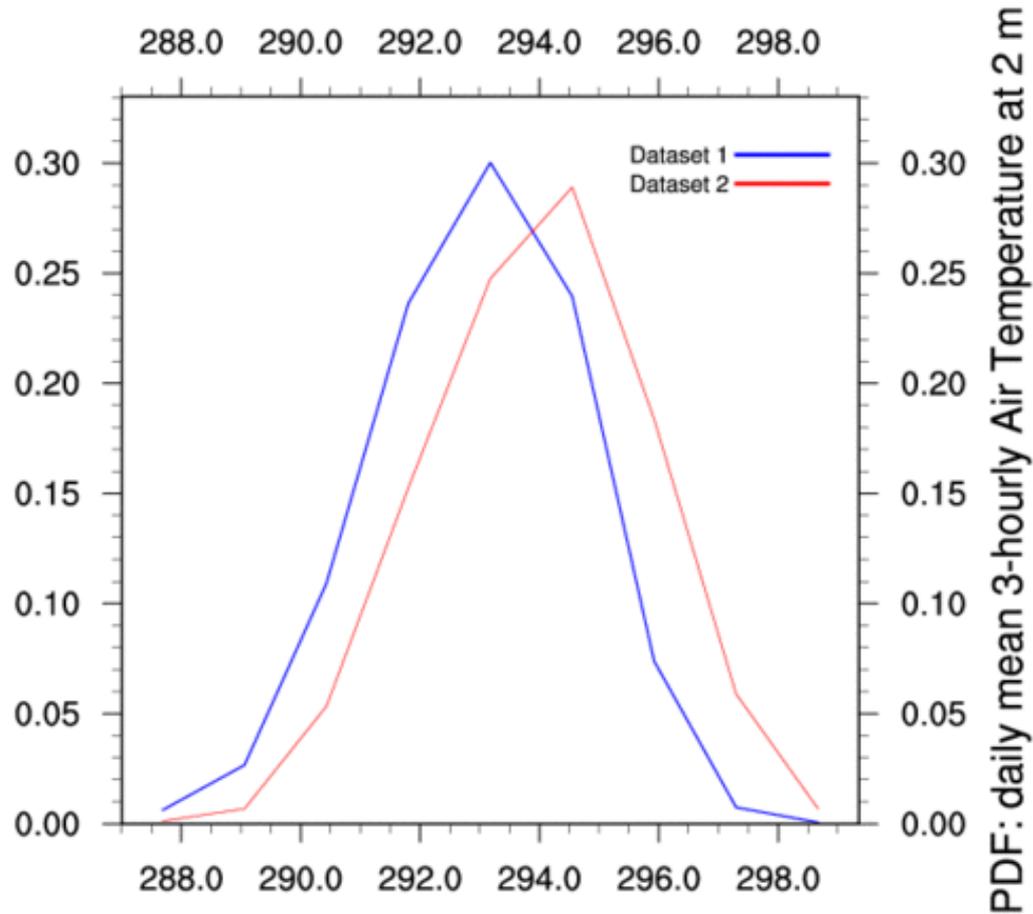
## January 2m Air Temperature: 1948-2011

Value is 253: Standardized value is -3.530 for Distribution 1  
 0.003047 : Empirical Probability of <= 253 for Distribution 1\*  
 0.005402 : SGS Probability of <= 253 for Distribution 1  
 0.000192 : Gaussian Probability of <= 253 for Distribution 1  
 Value is 253: Standardized value is -2.681 for Distribution 2  
 0.009577 : Empirical Probability of <= 253 for Distribution 2  
 0.012273 : SGS Probability of <= 253 for Distribution 2  
 0.004011 : Gaussian Probability of <= 253 for Distribution 2\*  
 Empirical probability, is ranked value, scaled. If not an exact match

### Time Series Statistics: 2m Air Temperature Jan to Jan 40;2

Statistic	20th Century Reanalysis V2c	NCEP/NCAR R1
<b>N</b>	1984	1984
<b>Mean</b>	269.31	266.48
<b>STD</b>	4.62	5.03
<b>Skewness</b>	-1.074	-0.599
<b>Kurtosis</b>	1.028	0.303
<b>Minimum</b>	247.48	244.40
<b>Lower Decile</b>	262.45	259.61
<b>Median</b>	270.48	267.13
<b>Upper Decile</b>	274.07	272.36
<b>Maximum</b>	277.27	278.85
<b>E</b>	0.347	0.210
<b>g</b>	-1.362	-1.364
<b>b</b>	0.160	0.308

# Distributions of Early and Late 20<sup>th</sup> Century NYC, NY Daily Summer Air Temperatures from 20CRV2c



# Statistics of Early vs. Late 20<sup>th</sup> Century NYC, NY Daily Summer Air Temperatures from 20CRV2c

0.970844 : Empirical Probability of  $\leq 296$  for Distribution 1  
 0.968458 : SGS Probability of  $\leq 296$  for Distribution 1  
 0.960004 : Gaussian Probability of  $\leq 296$  for Distribution 1  
 0.863524 : Empirical Probability of  $\leq 296$  for Distribution 2  
 0.877500 : SGS Probability of  $\leq 296$  for Distribution 2  
 0.875027 : Gaussian Probability of  $\leq 296$  for Distribution 2

## Time Series Statistics: 2m Air Temperature Jul to Aug 40.7;286.1

Statistic	1901-1926	1986-2011
N	1612	1612
Mean	292.97	293.98
STD	1.71	1.80
Skewness	-0.263	-0.165
Kurtosis	-0.094	-0.149
Minimum	287.00	287.17
Lower Decile	290.67	291.55
Median	293.12	294.04
Upper Decile	295.04	296.29
Maximum	298.16	299.36
E	0.102	0.081
g	-1.282	-1.008
b	0.589	0.989

# Coming Attractions

## Soon:

- Subsets of Years (e.g El Niño/La Niña)
- KS measure of similarity of distributions
- More datasets: ERA-Interim, US station data
- Different output plot types
- More Variables

## Planned:

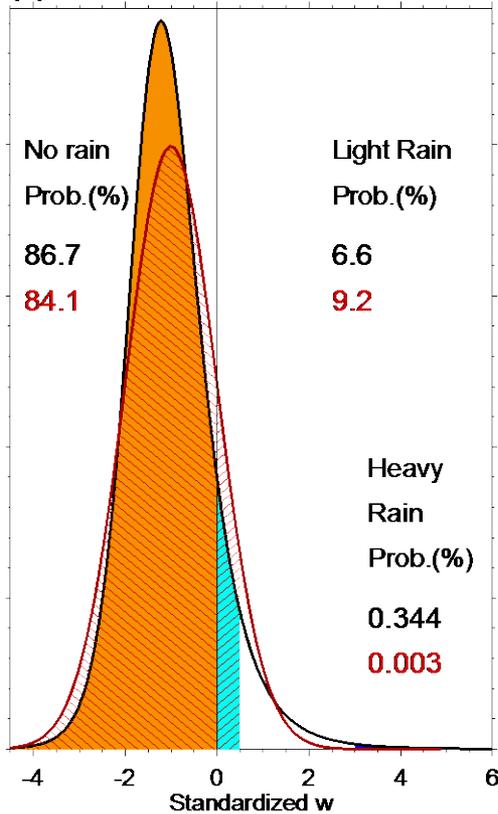
- Improved Interface
- Error bars on SGS and Gaussian distributions
- Error bars on probabilities
- Area averages (e.g. global)
- Land/Ocean areas
- More statistics: Autocorrelation, trends...

## More Coming Attractions...

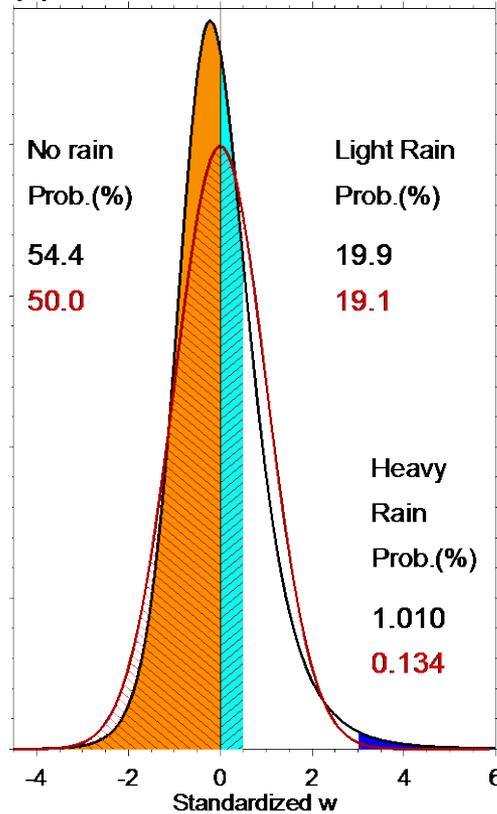
- Precipitation
  - Gamma and other distributions are used “because they work” for precipitation
  - But, omega can be fitted by an SGS distribution. And, the precipitation distribution corresponds to the omega distribution as in the next plot

# Omega and Precipitation Distributions

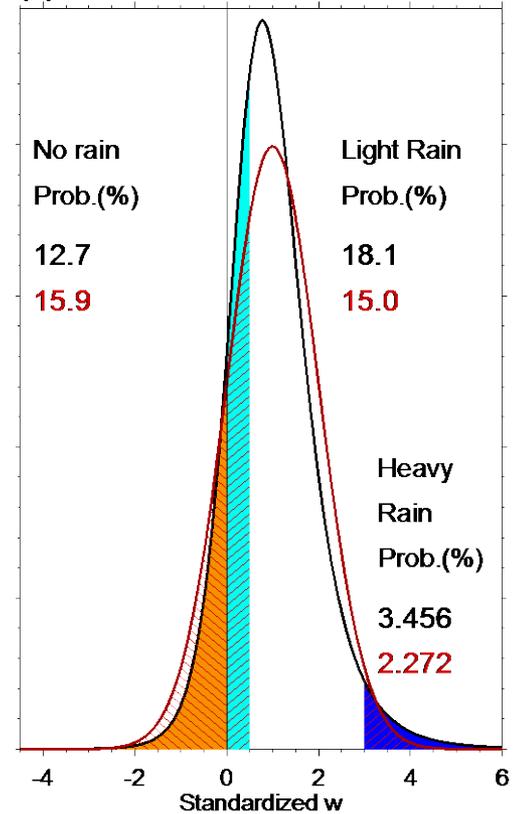
(a) Mean Descent



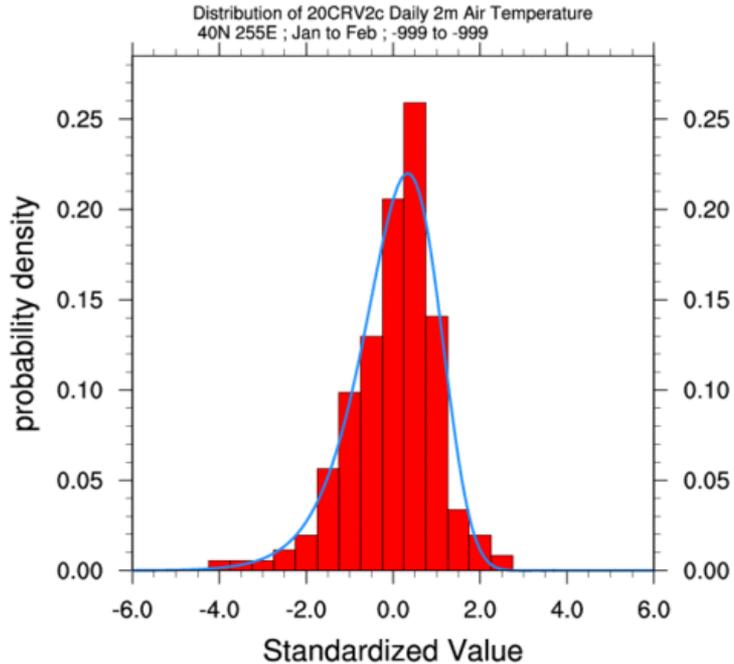
(b)



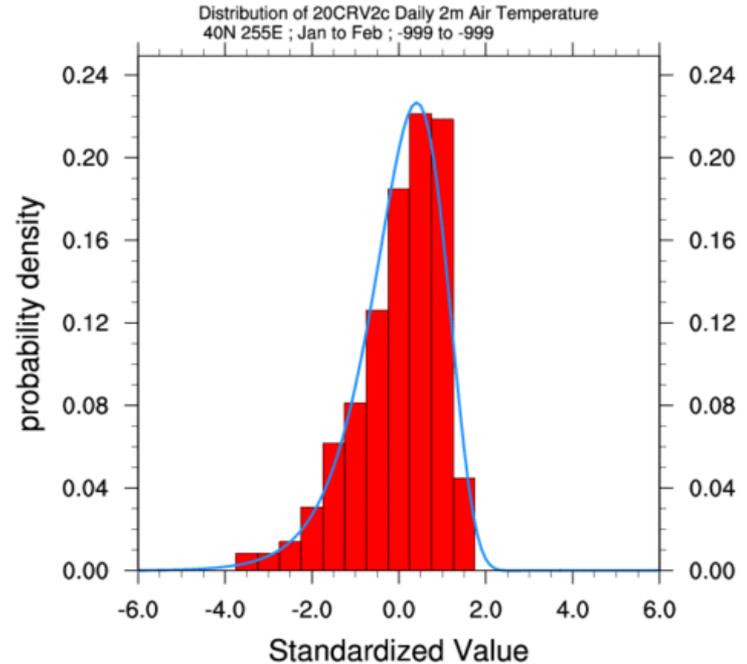
(c) Mean Ascent



# More Coming Attractions



Boulder, CO JF El Niño 2m T



Boulder, CO JF La Niña 2m T

Mean:	271.98	vs.	269.52
STD:	3.03	vs.	4.87
Skew:	-.80	vs.	-1.02
Kurtosis:	1.50	vs.	.83
Minimum:	260.0	vs.	251.6
Maximum:	279.6	vs.	277.1

- And that concludes my talk and the 40<sup>th</sup> CDW

