

# Projecting climate change impacts on hydrology: the potential role of daily GCM output

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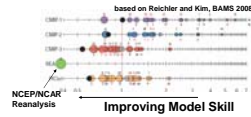
**Our Goal: Improve methods for projecting climate change impacts to watershed scale**  
**Our Focus: Downscaling climate model output to capture changes in hydrology**

## Our Methods:

- 1 — Downscale precipitation and temperature over the Western U.S. using two different techniques
- 2 — Drive a hydrology model with each, and compare their performance
- 3 — Develop an improved method

## What we downscale: NCEP/NCAR Reanalysis

- Reanalysis represents the best possible GCM since obs are assimilated
  - Should show max differentiation in methods
  - T62 (~1.9°) resolution, comparable to GCMs
- Full period daily and monthly data available
- 1950-1976 used to "train" downscaling
- 1977-1999 used to assess, used as a "changed climate" for projections
- Shift in PDO in 1976-77, late 20<sup>th</sup> century warming
- Change in data sources to Reanalysis in 1979
- Warmer, wetter in later period over Western U.S.



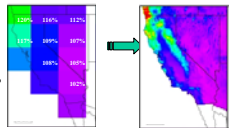
## Downscaling Methods

### Bias Correction/Spatial Downscaling (BCSD)

#### Step 1: Bias-Correction

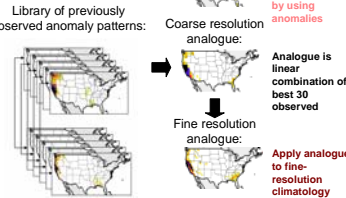
At each grid cell, use quantile mapping to match monthly statistics (at GCM scale)

#### Step 2: Spatial Downscaling



- Calculate anomalies relative to coarse-scale climatology
- Interpolate anomalies to 1/8° grid
- Apply to 1/8° climatology

### Constructed Analogues (CA)



## Common Characteristics of BCSD and CA

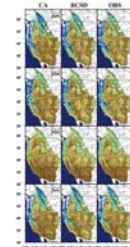
- Both provide spatially continuous (gridded) downscaled fields
- Observed spatial and temporal climate structure maintained
- Automated and efficient: can be used for ensembles of GCMs
- Capable of downscaling long transient GCM runs

## Important Differences Between BCSD and CA

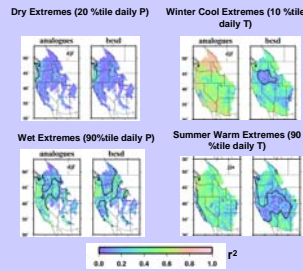
- CA uses **daily** GCM data; BCSD uses **monthly** w/random resampling to produce daily values
- BCSD explicitly corrects for systematic GCM biases based on historic GCM performance
- CA corrects mean bias (using anomalies) but not
  - spatial GCM biases
  - variability biases

## Downscaled Meteorology and Derived Hydrology

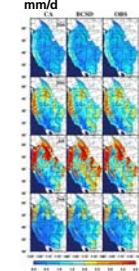
### Precipitation, mm/d



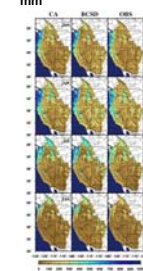
### Daily Statistics – Correlation with Observations



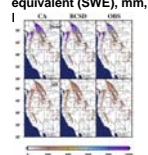
### Evapotranspiration, mm/d



### Active soil moisture, mm



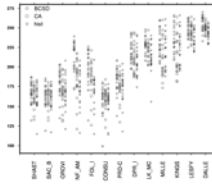
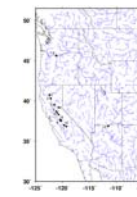
### April 1 snow water equivalent (SWE), mm



- Annual P cycle captured with both methods, CA → higher T daily skills, BCSD → better rainfall intensity
- Mean, seasonal cycles and interannual variability of soil moisture are reasonably reproduced by both BCSD and CA
- End-of-season snow accumulation also appears to be plausibly reproduced by both BCSD and CA
- Where BCSD or CA differ from Observations (e.g., April soil moisture in the Pacific Northwest), they differ in similar ways.
- Hydrologic states appear to be recovered well by either downscaling method.

## Streamflow Simulations: 22 Years

Number	Org	Name
1	SHAST	Sacramento R. at Shasta Dam
2	SAC_B	Sacramento R. at Bend Bridge
3	OROV1	Feather R. at Oroville
4	NF_AM	North Fork American R. at N.F. Dam
5	FOL_I	American R. at Folsom Dam
6	CONSU	Cosumnes R. at Michigan Bar
7	PRD_C	Mokelumne R. at Paradise
8	DRP_I	Tuolumne R. at New Don Pedro
9	LK_MC	Merced R. at Lake McClure
10	MILLE	San Joaquin R. at Millerton Lake
11	KINGS	Kings R. - Pine Flat Dam
12	LESFY	Colorado R. at Lees Ferry
13	DALLE	Columbia R. at The Dalles



### Center Timing of Annual Hydrograph, day in water year

- Center timing (driven by temperature) shows correspondence with observations for CA at more locations than for BCSD
- This reflects the successful translation of large-scale daily skill in Reanalysis temperatures by CA.

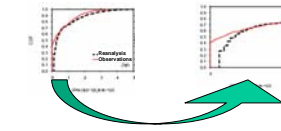
### 3-Day Peak Flow, cfs

- For precipitation-driven daily statistics of low and high flows, BCSD shows correspondence with observations at more locations than CA.

## Combining Downscaling Methods

### Problematic Biases at large scale

Daily precipitation probabilities at reanalysis grid point at 37.1422, -110.625:



Drizzle bias (January shown here)  
 Obs shows 40% of days with zero precip  
 Reanalysis never has zero precip

## Solution: Bias Correct before CA method (BCCA)

Gauge in bold face and highlighted indicates downscaled distribution of 22 values differs from the observed distribution, compared with a Kolmogorov-Smirnov 2-sample test (at p=0.05).

- Step 1 from BCSD applied to daily reanalysis precip
- CA applied (without analogizing)
- New streamflows generated

- Bias correction at large scale solves problems with peak flows and annual volumes
- Problems remain at low flows
- BCCA outperforms both CA and BCSD for most measures

Center Timing	3-Day Peak Flow		5-Day Peak Flow		Annual Peak Flow	
GAUGE	CA	BCCA	CA	BCCA	CA	BCCA
SHAST	SHAST	SHAST	SHAST	SHAST	SHAST	SHAST
SAC_B	SAC_B	SAC_B	SAC_B	SAC_B	SAC_B	SAC_B
OROV1	OROV1	OROV1	OROV1	OROV1	OROV1	OROV1
NF_AM	NF_AM	NF_AM	NF_AM	NF_AM	NF_AM	NF_AM
FOL_I	FOL_I	FOL_I	FOL_I	FOL_I	FOL_I	FOL_I
CONSU	CONSU	CONSU	CONSU	CONSU	CONSU	CONSU
PRD_C	PRD_C	PRD_C	PRD_C	PRD_C	PRD_C	PRD_C
DRP_I	DRP_I	DRP_I	DRP_I	DRP_I	DRP_I	DRP_I
LK_MC	LK_MC	LK_MC	LK_MC	LK_MC	LK_MC	LK_MC
MILLE	MILLE	MILLE	MILLE	MILLE	MILLE	MILLE
KINGS	KINGS	KINGS	KINGS	KINGS	KINGS	KINGS
LESFY	LESFY	LESFY	LESFY	LESFY	LESFY	LESFY
DALLE	DALLE	DALLE	DALLE	DALLE	DALLE	DALLE

- Daily large-scale skill can be successfully downscaled to local scales
- Analogizing is not adequate for coping with large-scale biases
- Explicit bias correction solves many problems, but post-processing needed

### Acknowledgement

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