Ensuring Water in a Changing World

Integration of Hydrometeorological and Climate Information in Water Resources System Operation and Design

Soroosh Sorooshian

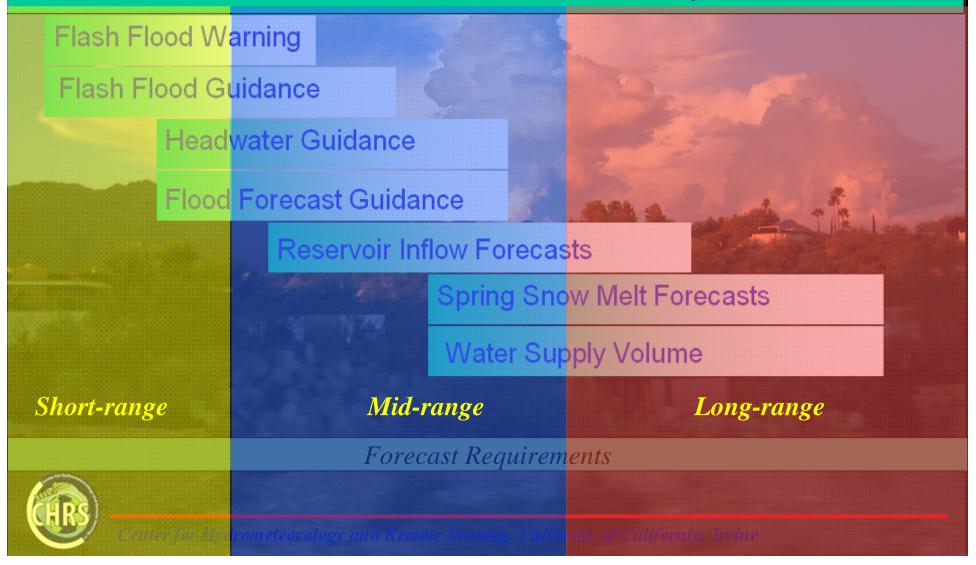
Center for Hydrometeorology and Remote Sensing University of California Irvine



The Abdus Salam ICPT Conference on:Water Resources in Developing Countries: Planning & Management under ClimateChange ScenarioTrieste, Italy: Apr. 27th- May 8th 2009

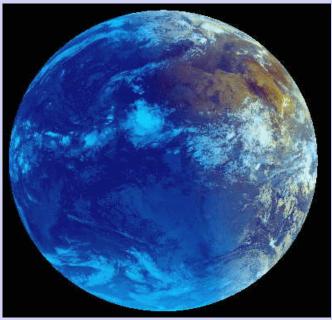
Required Hydrometeorologic Predictions

hours ----> days ----> weeks ---> months --> seasons --> years ----> decades



Climate, Hydrology and Water Resources

- How will Climate effect water Availability?
- Can we predict the future changes which are responsive to "user" needs?







Hydrologically-Relevant Climate Variables

What Do "Instrumental" Records Tell Us?

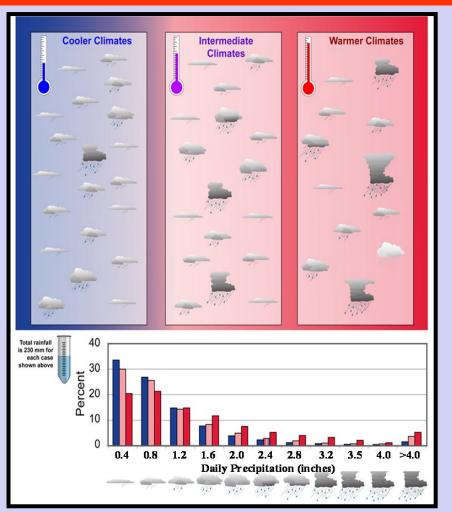


Changes in Precipitation: U.S.A

Facts from Observations

- From 1908-2002:
 - Total annual precipitation across the contiguous U.S. increased 7%
 - Heavy daily Precipitation events have increased by 20%
- Rainfall associated with warmer climates are more due to extreme events compared to colder climates



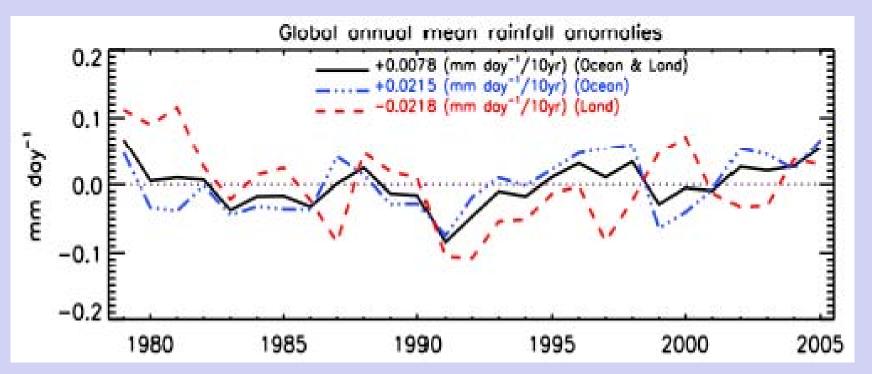




Source: Tom Karl NCDC-NOAA 2007

Global Variations in Precipitation (1979-2005) 90N-90S

Global mean = 2.6 mm/d (Ocean [2.8 mm/d] Land[2.1 mm/d])



- Little or no linear change during period [biggest change is +2% over ocean]
- Ocean and land precipitation tend to compensate

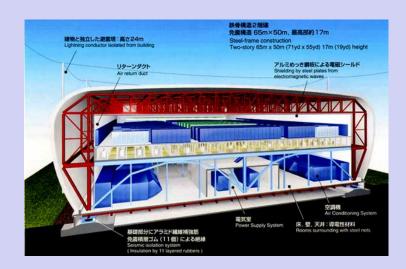


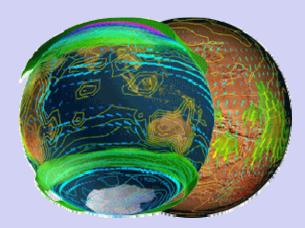
Adler et al. J. Hydromet.

Hydrologically-Relevant Climate Variables

What Do Climate Models Tell Us About the Future which May Be Useful for Water Resources Applications ?

Climate Predictions into the Future!

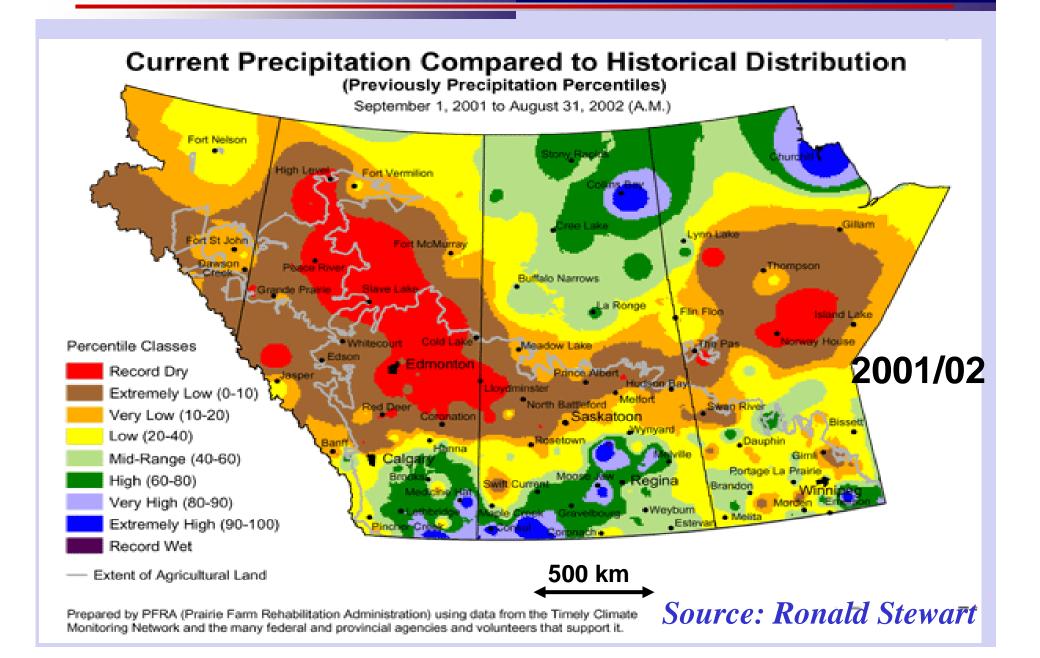




Seasonal and Inter-Annual Time-Scales

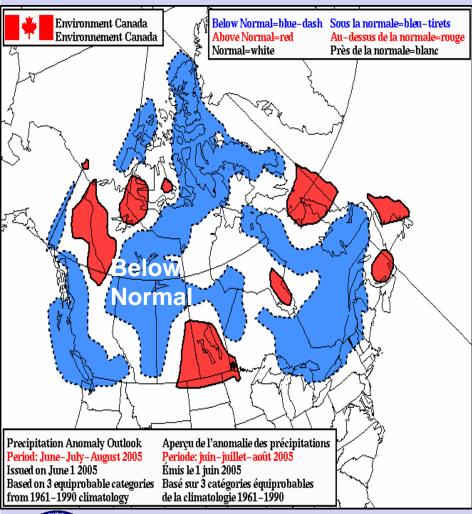


Canadian Prairie drought 1999-2005



SEASONAL PREDICTIONS: Summer of 2005 - Canada

PREDICTION





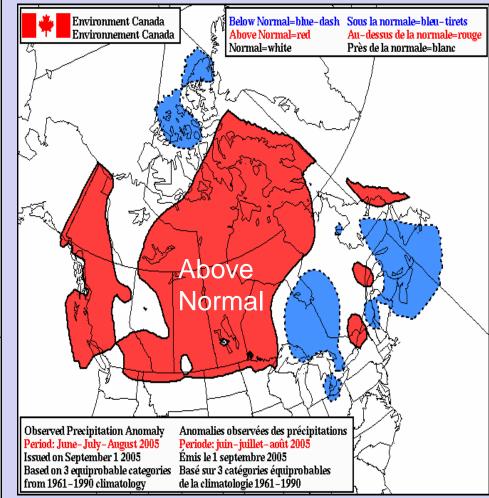
Source: Ronald Stewart

SEASONAL PREDICTIONS: Summer of 2005 - Canada

Environment Canada Below Normal=blue-dash Sous la normale=bleu-tirets Environnement Canada Above Normal=red Au-dessus de la normale=rouge Normal=white Près de la normale=blanc Below lorma Precipitation Anomaly Outlook Aperçu de l'anomalie des précipitations Periode: juin-juillet-août 2005 Period: June-July-August 2005 Émis le 1 juin 2005 Issued on June 1 2005 Based on 3 equiprobable categories Basé sur 3 catégories équiprobables from 1961-1990 climatology de la climatologie 1961-1990

PREDICTION

OBSERVATION



Source: Ronald Stewart



(flooding at the end of the drought)

St. Jean de Baptiste, Manitoba July 2005

total united

Source: Ronald Stewart

Recent Assessment of Seasonal Climate Forecasts

Quoting from Science, Vol. 321, 15th August 2008

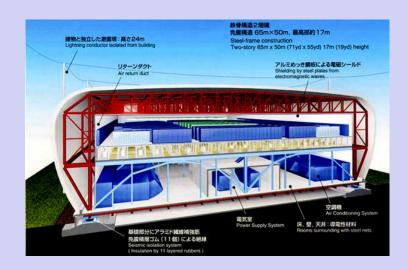


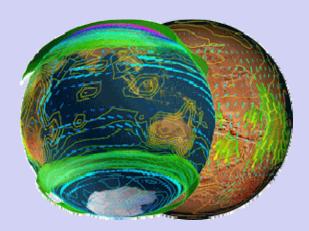
•" of the dozens of forecast techniques proffered by government, academic, private-sector climatologists, all but two are virtually useless, according to a new study" Livezey & Timofeyeva - BAMS, June 2008.

• "About the only time forecasts had any success predicting precipitation was for winters with an El Nino or a La Nina"



Climate Predictions into the Future!

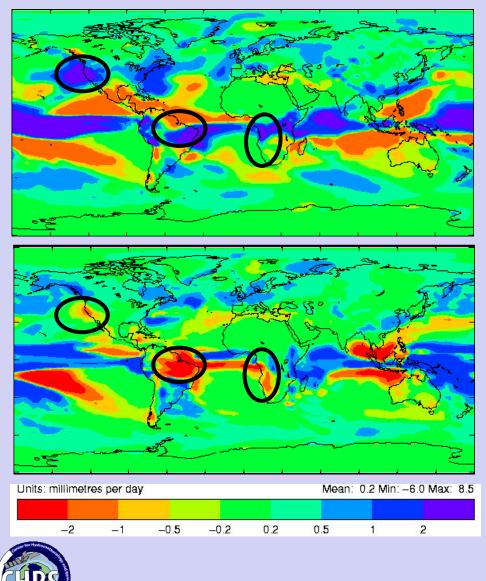




Some Results from Long Time-Scales



Climate model Predictions about the future? \rightarrow globally



DJF Precipitation Changes CM2 - Old model

CM3 - Updated model

Significant differences in regional outcomes!

Source: Hadley Center (Climate Change Projections)

A Dryer Future for Southwest US?



Model Projections of an Imminent Transition to a More Arid Climate in Southwestern North America

Richard Seager, 1* Mingfang Ting, 1 Isaac Held, 2,3 Yochanan Kushnir, 1 Jian Lu, 4 Gabriel Vecchi,² Huei-Ping Huang,¹ Nili Harnik,⁵ Ants Leetmaa,² Ngar-Cheung Lau,^{2,3} Cuihua Li,¹ Jennifer Velez,¹ Naomi Naik¹

How anthropogenic climate change will affect hydroclimate in the arid regions of southwestern North America has implications for the allocation of water resources and the course of regional development. Here we show that there is a broad consensus among climate models that this region will dry in the 21st century and that the transition to a more arid climate should already be under way. If these models are correct, the levels of aridity of the recent multiyear drought or the Dust Bowl and the 1950s droughts will become the new climatology of the American Southwest within a time frame of years to decades.

governmental Panel on Climate Change (IPCC) reported that the average of all the participating models showed a general decrease in 2050 and decrease modestly thereafter, leading to although there was also considerable dis- 2100. We also analyzed the simulations by these in the models participating in the second Coupled Model Intercomparison Project (2). We examined future subtropical drying by analyzing the time (with some variation among the models). These history of precipitation in 19 climate models participating in the Fourth Assessment Report 21st-century climate projections. For each model,

The Third Assessment Report of the Inter- (AR4) of the IPCC (3). The future climate projections followed the A1B emissions scenario (4), in which CO₂ emissions increase until about rainfall in the subtropics during the 21st century, a CO2 concentration of 720 parts per million in agreement among the models (1). Subtropical models for the 1860-2000 period, in which the drying accompanying rising CO₂ was also found models were forced by the known history of trace gases and estimated changes in solar irradiance. volcanic and anthropogenic aerosols, and land use simulations provided initial conditions for the

precipitation minus the evaporation (P-E), averaged over this region for the period common to all of the models (1900-2098). The median, 25th, and 75th percentiles of the model P - E distribution and the median of P and E are shown. For cases in which there were multiple simulations with a single model, data from these simulations were averaged together before computing the distribution. P - E equals the moisture convergence by the atmospheric flow and (over land) the amount of water that goes into runoff.

In the multimodel ensemble mean, there is a transition to a sustained drier climate that begins in the late 20th and early 21st centuries. In the ensemble mean, both P and E decrease, but the former decreases by a larger amount. P - E is primarily reduced in winter, when P decreases and E is unchanged or modestly increased, whereas in summer, both P and E decrease. The annual mean reduction in P for this region, calculated from rain gauge data within the Global Historical Climatology Network, was 0.09 mm/day between 1932 and 1939 (the Dust Bowl drought) and 0.13 mm/day between 1948 and 1957 (the 1950s Southwest drought). The ensemble median reduction in P that drives the reduction in P-E reaches 0.1 mm/day in midcentury, and one quarter of the models reach this amount in the early part of the current century. The annual mean P - E difference between

20-year periods in the 21st century and the 1950-2000 climatology for the 19 models are shown in Fig. 2. Almost all models have a drying trend in the American Southwest, and they con-

If these models are correct,





Observed changes: Drought

Drought activity during the 20th and early 21st Century

Moderate to Extreme Drought

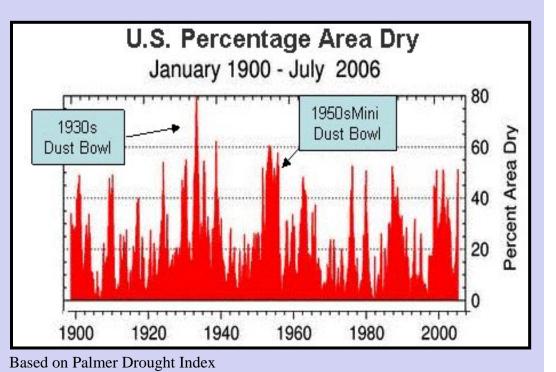
 U.S. droughts show pronounced multi-year to multi-decadal variability, but no convincing evidence for long-term trends toward more or fewer events.

10

Confidence

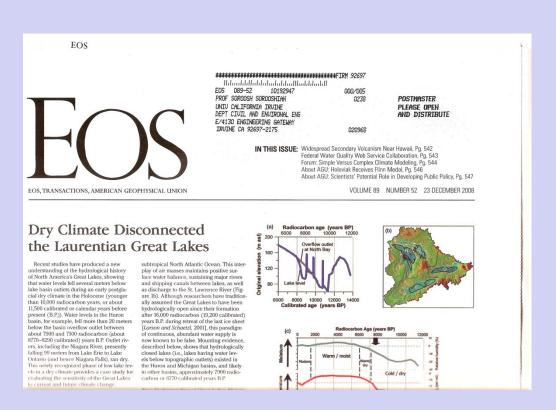
Index

Source: Tom Karl NCDC-NOAA 2007





Recent Articles About the efficacy of climate models





Recent Articles About the efficacy of climate models

FORUM

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Simple Versus Complex Climate Modeling

This Forum is based on my own personal experience with the climate and paleoclimate community during the past several years. This experience includes having read numerous articles and having witnessed numerous interdisciplinary discussions at various conferences. A theme I have frequently encountered is the sense that the resolution of modern state-of the-art global climate models is so high that—when compared with simple models—their results represent the "absolute truth." It seems that through genuine efforts to improve aspects of numerical modeling, the point that they are still models and not observational data is occasionally forgotten.

The main message of this Forum is to point out that regardless of how high the resolution of numerical climate models is, and regard Still worse, some global numerical climate modelers hold the view that their models' results are always correct unless the process in question is a subgrid process. Because subgrid processes, such as mixing, govern the entire flow field and get integrated over many grid points, there are counterexamples where the model dynamics are totally wrong even when it is "merely" the subgrid processes that are wrong [see, e.g., Nof et al., 2007].

For instance, regarding the Atlantic Meridional Overturning Cell, it is very probable that the only aspect that the global numerical models resolve adequately is the largescale pressure gradient. Convection, overflows, eddies, and topography are all parts of subgrid atmospheric processes that Global and Planetary Change 62 (2008) 187-194



Contents lists available at ScienceDirect Global and Planetary Change

journal homepage: www.elsevier.com/locate/gloplacha

Climatic and anthropogenic factors affecting river discharge to the global ocean, 1951–2000

J.D. Milliman ^{a,*}, K.L. Farnsworth ^{b,1}, P.D. Jones ^c, K.H. Xu ^a, L.C. Smith ^d

* School of Marine Science, College of William and Mary, Glaucester Point, VA 23062, USA

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 Candat Research Unit, School of Environmental Sciences, University of East Anglia, Nervich, NNA 717, UK
 Paparment of Congruphy. 1253 Enable Hauth Hall, University of California-to Anglies, CA 90005, USA

ABSTRACT

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Article history: Received 24 January 2008 Accepted 10 March 2008 Available online 25 March 2008

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Keywords: global river discharge precipitation irrigation Arctic evapotranspiration During the last half of the 20th century, cumulative annual discharge from 137 representative rivers (watershed areas ranging from 0.3 to 6300×10³ km³) to the global ocean remained constant, although annual discharge from about one-third of these rivers changed by more than 30%. Discharge trends for many rivers reflected mostly changes in precipitation, primarily in response to short- and longer-term atmosphericoccanic signals, with the notable exception of the Parana, Mississiph, Niger and cunnen rivers, Few of these "normal" rivers experienced significant changes in either discharge or precipitation. Cunnel rivers, few of these "normal" rivers experienced significant changes in either discharge or precipitation. The short discharge from many mich-latitude rivers in contrast, decreased by 80%, reflecting in large part impacts due to damming, irrigation and interbasin water transfers. A number of high-latitude and high-altitude rivers experienced increased discharge despite generally declining precipitation. Poorly constrained meteorological and hydrological data do not seem to explain fully these "excess" rivers: changed seasonality in discharge, decreased storage and/or decreased proton also may play important roles.



Recent Articles About the efficacy of climate models

Hydrological Sciences-Journal-des Sciences Hydrologiques, 53(4) August 2008

RAPID COMMUNICATION

On the credibility of climate predictions

D. KOUTSOYIANNIS, A. EFSTRATIADIS, N. MAMASSIS & A. CHRISTOFIDES

Department of Water Resources, Faculty of Civil Engineering, National Technical University of Athens, Heroon Polytechneiou 5, GR-157 80 Zographou, Greece dk@itia.ntua.gr

Abstract Geographically distributed predictions of future climate, obtained through climate models, are widely used in hydrology and many other disciplines, typically without assessing their reliability. Here we compare the output of various models to temperature and precipitation observations from eight stations with long (over 100 years) records from around the globe. The results show that models perform poorly, even at a climatic (30-year) scale. Thus local model projections cannot be credible, whereas a common argument that models can perform better at larger spatial scales is unsupported.

Key words climate models; general circulation models; falsifiability; climate change; Hurst-Kolmogorov climate

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NEWS OF THE WEEK

CLIMATE PREDICTION

Seasonal-Climate Forecasts Improving Ever So Slowly

the coming winter will be like. If a strong son up to a year ahead, At NWS's Climate Pre- rates for different seasons, regions, and periods El Niño were brewing in the tropical Pacific, at diction Center (CPC) in Camp Springs, Maryleast some of them would be in luck. The offi- land, where Livezey oversaw seasonal fore- or absent. cial United States winter forecast could warn casting in the late 1990s, the trick has generally them, with considerable reliability, that the been to identify some element of recent or cur- success predicting precipitation was for win-Southeast and the Gulf Coast will be cooler rent climate-say, the presence of El Niño- ters with an El Niño or a La Niña, Livezey and wetter than normal. But without an El Niño that can influence future climate. If they couldn't and Timofeyeva found, Using a scale in or its counterpart, La Niña, next winter's find one, researchers could fashion a forecast weather is pretty much anybody's guess.

Service (NWS). But even many people in the ticular region. field "don't appreciate how little there is to work with. There is really no evidence here though increasing skill-at CPC, Livezey and that there are any other silver bullets" waiting to be found.

Since 1946, NWS-forecasters have been issue of the Bulletin of the Ameritrying to forecast the average temperature and

Of the dozens of forecasting techniques ods when the climate system resembled the proffered by government, academic, and current situation-that when tested on past 85%-along the southern tier states and up private-sector climatologists, all but two are seasons gave some inkling of future seasons. the West Coast about half a year into the virtually worthless, according to a new study. They would then subjectively choose which future. Even so, the overall skill score for pre-There are seasons, places, and situations in techniques to combine and how to combine cipitation was just 3%. which skill is very, very good," says climatol- them in order to predict whether temperature ogist and study co-author Robert Livezey, and precipitation would be above, near, or overall skill score of 13%, up from a score of recently retired from the National Weather below normal in some 3-month period in a par-

The CPC approach has shown very modestclimatologist Marina Timofeyeva of NWS in But CPC also had substantial success predicting temperature out to a year in the American Silver Spring, Maryland, report in the June

can Meteorological Society. They

Farmers, ski-resort operators, and heating-oil __precipitation across the lower 48 states a / worked up a scorecard for CPC forecasts made suppliers would very much like to know what month ahead, and more recently season by sea- from 1994 to 2004, comparing the success when a strong El Niño or La Niña was present

> About the only time forecasters had any which mere chance is 0% and perfection is "tool"-such as a collection of past time peri- 100%, in those winters they estimate "unprecedented" skill-50% to more than

Temperature forecasts fared better, with an 8% for the previous decade. El Niño and La Niña helped out again during winter, raising skill to more than 85% across much of the eastern United States out to more than 8 months.

Recent Assessment of Climate Models

How Accurate Are Global Climate Models?

Climate Models An Assessment of Strengths and Limitations

U.S. Climate Change Science Program Synthesis and Assessment Product 3.1

July 2008

• "Regional trends in extreme events are not always captured by current models, but it is difficult to assess the significance of these discrepancies and to distinguish between model deficiencies and natural variability."

What is the Message?

•Presently, the accuracy of regional-scale climate model predictions fall short of meeting the requirements of water resources planning.

• Hardly used for operational Purposes and unwise to push their use while highly uncertain.

Therefore, Factoring in Resiliency in water resources systems design and planning is still the safest approach!

Back to Operational and Design Practices in Water Resources Planning

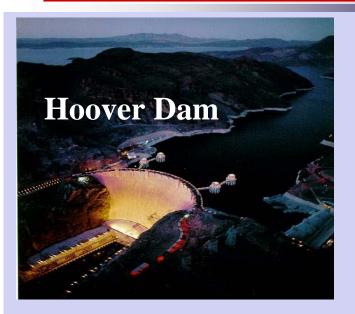


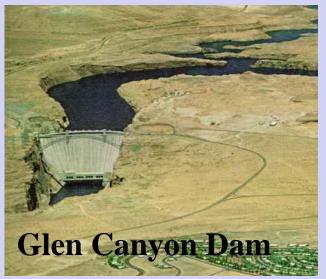
Factoring in Climate

Engineering Approach: Build and operate infrastructures to Control, Store & Deliver water for Multi-Purpose Uses



A Century of Water Resources Development: Engineering success!





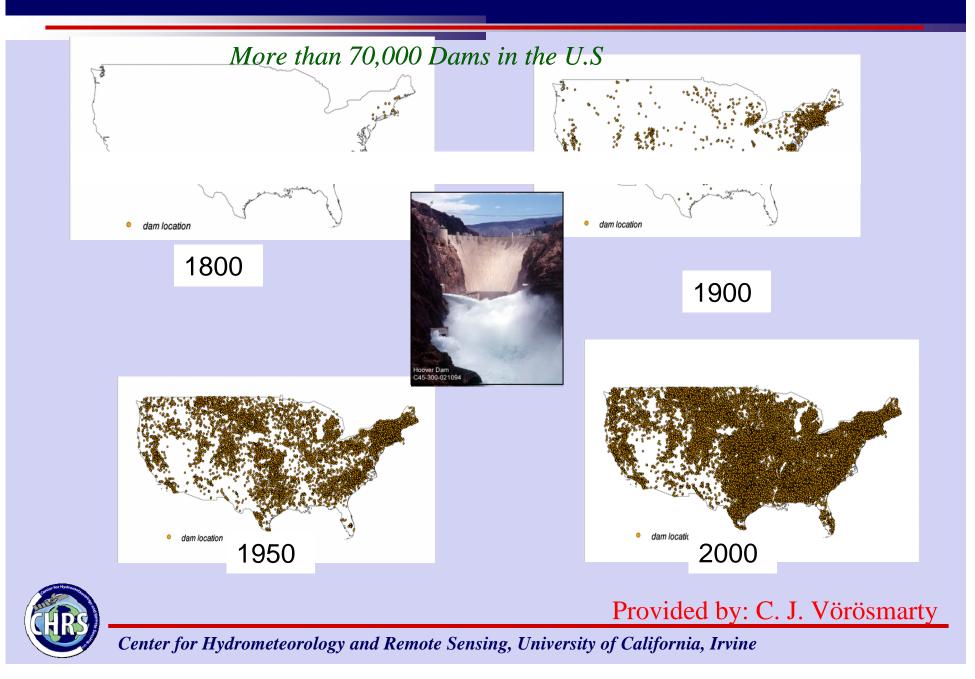


Central Arizona Project Aqueduct





Impact of Dam & Reservoir Construction



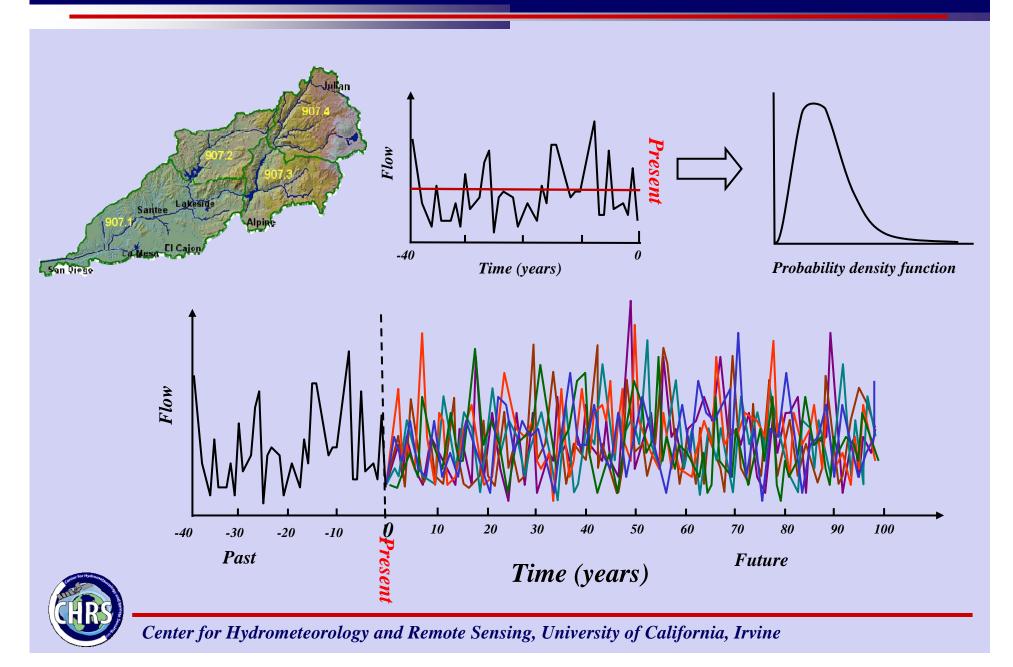


Addressing "Climate Extremes" in Water Resources Planning:

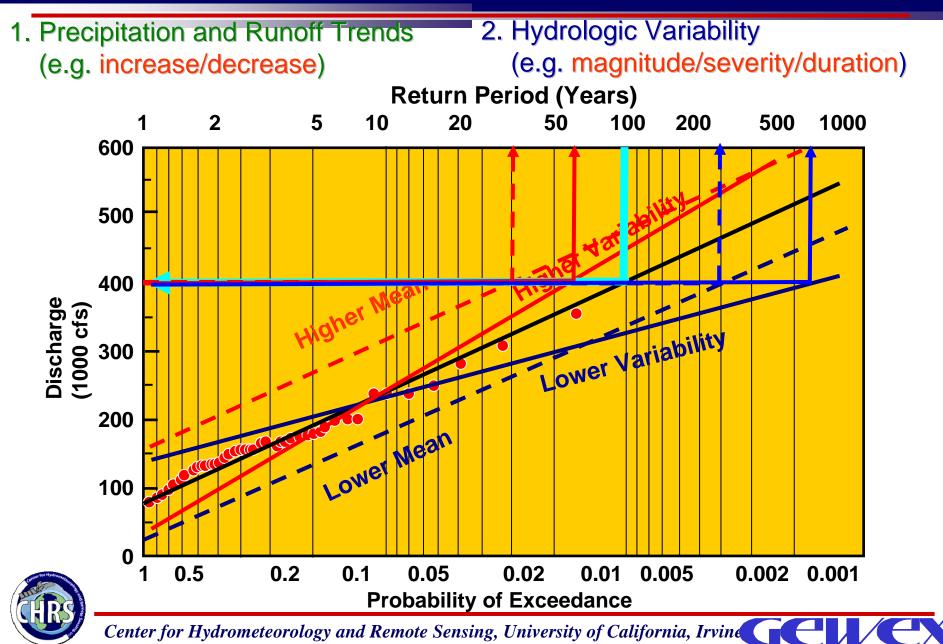
Stochastic Hydrology



Statistical Hydrology: "synthetic" streamflow Generation



Potential Hydrologic Scenarios



Impact of Nonstationarity on Water Resources

POLICYFORUM

CLIMATE CHANGE

Stationarity Is Dead: Whither Water Management?

P. C. D. Milly,^{1*} Julio Betancourt,² Malin Falkenmark,³ Robert M. Hirsch,⁴ Zbigniew W. Kundzewicz,⁵ Dennis P. Lettenmaier,⁶ Ronald J. Stouffer

vstems for management of water throughout the developed world have been designed and operated under the assumption of stationarity. Stationarity-the idea that natural systems fluctuate within an unchanging envelope of variability-is a foundational concept that permeates training and practice in water-resource engineering. It implies that any variable (e.g., annual streamflow or annual flood peak) has a time-invariant (or 1-year-periodic) probability density function (pdf), whose properties can be estimated from the instrument record. Under stationarity, pdf estimation errors are acknowledged, but have been assumed to be reducible by additional observations, more efficient estimators, or regional or paleohydrologic data. The pdfs, in turn, are used to evaluate and manage risks to water supplies, waterworks, and floodplains; annual global investment in water infrastructure exceeds U.S.\$500 billion (1).

The stationarity assumption has long been compromised by human disturbances in river basins. Flood risk, water supply, and water quality are affected by water infrastructure, channel modifications, drainage works, and land-cover and land-use change. Two other (sometimes indistinguishable) challenges to stationarity have been externally forced, natural climate changes and low-frequency, internal variability (e.g., the Atlantic multidecadal oscillation) enhanced by the slow dynamics of the oceans and ice sheets (2, 3). Planners have tools to adjust their analyses for known human disturbances within river basins, and justifiably or not, they generally have considered natural change and variability to be sufficiently small to allow stationarity-based design.

¹U.S. Geological Survey (USGS), c/o National Oceanic and Atmospheric Administration (NOAA) Geophysical Fluid Dynamics Laboratory, Princeton, NJ 08540, USA. ²USG5, Tucson, AZ 85745, USA, 3Stockholm International Wate Institute, SE 11151 Stockholm, Sweden. ⁴USGS, Reston, VA 20192, USA. ⁵Research Centre for Agriculture and Forest Environment, Polish Academy of Sciences, Poznaň, Poland, and Potsdam Institute for Climate Impact Research, Potsdam, Germany, ⁶University of Washington Seattle, WA 98195, USA. ⁷NOAA Geophysical Fluid Dynamics Laboratory, Princeton, NJ 08540, USA.

*Author for correspondence, E-mail: cmilly@usgs.gov.



An uncertain future challenges water planners.

In view of the magnitude and ubiquity of the hydroclimatic change apparently now under way, however, we assert that stationarity is dead and should no longer serve as a central, default assumption in water-resource risk assessment and planning. Finding a suitable successor is crucial for human adaptation to changing climate.

How did stationarity die? Stationarity is dead because substantial anthropogenic change of Earth's climate is altering the means and extremes of precipitation, evapotranspiration, and rates of discharge of rivers (4, 5) (see figure, above). Warming augments atmospheric humidity and water transport. This increases precipitation, and possibly flood risk, where prevailing atmospheric water-vapor fluxes converge (6). Rising sea level induces gradually heightened risk of contamination of coastal freshwater supplies. Glacial meltwater temporarily enhances water availability, but glacier and snow-pack losses diminish natural seasonal and interannual storage (7).

Anthropogenic climate warming appears to be driving a poleward expansion of the subtropical dry zone (8), thereby reducing runoff in some regions. Together, circulatory and thermodynamic responses largely explain the picture of regional gainers and losers of sustainable freshwater availability

www.sciencemag.org SCIENCE VOL 319 1 FEBRUARY 2008 Published by AAAS

Climate change undermines a basic assumption that historically has facilitated management of water supplies, demands, and risks.

that has emerged from climate models (see figure, p. 574).

Why now? That anthropogenic climate change affects the water cycle (9) and water supply (10) is not a new finding. Nevertheless, sensible objections to discarding stationarity have been raised. For a time, hydroclimate had not demonstrably exited the envelope of natural variability and/or the effective range of optimally operated infrastructure (11, 12). Accounting for the substantial uncertainties of climatic parameters estimated from short records (13) effectively hedged against small climate changes. Additionally, climate projections were not considered credible (12, 14).

Recent developments have led us to the opinion that the time has come to move beyond the wait-and-see approach. Projections of runoff changes are bolstered by the recently demonstrated retrodictive skill of climate models. The global pattern of observed annual streamflow trends is unlikely to have arisen from unforced variability and is consistent with modeled response to climate forcing (15). Paleohydrologic studies suggest that small changes in mean climate might produce large changes in extremes (16), although attempts to detect a recent change in global flood frequency have been equivocal (17, 18). Projected changes in runoff during the multidecade lifetime of major water infrastructure projects begun now are large enough to push hydroclimate beyond the range of historical behaviors (19). Some regions have little infrastructure to buffer the impacts of change.

Stationarity cannot be revived. Even with aggressive mitigation, continued warming is very likely, given the residence time of atmospheric CO, and the thermal inertia of the Earth system (4, 20).

A successor. We need to find ways to identify nonstationary probabilistic models of relevant environmental variables and to use those models to optimize water systems. The challenge is daunting. Patterns of change are complex; uncertainties are large; and the knowledge base changes rapidly. Under the rational planning framework

advanced by the Harvard Water Program (21, 22), the assumption of stationarity was

573

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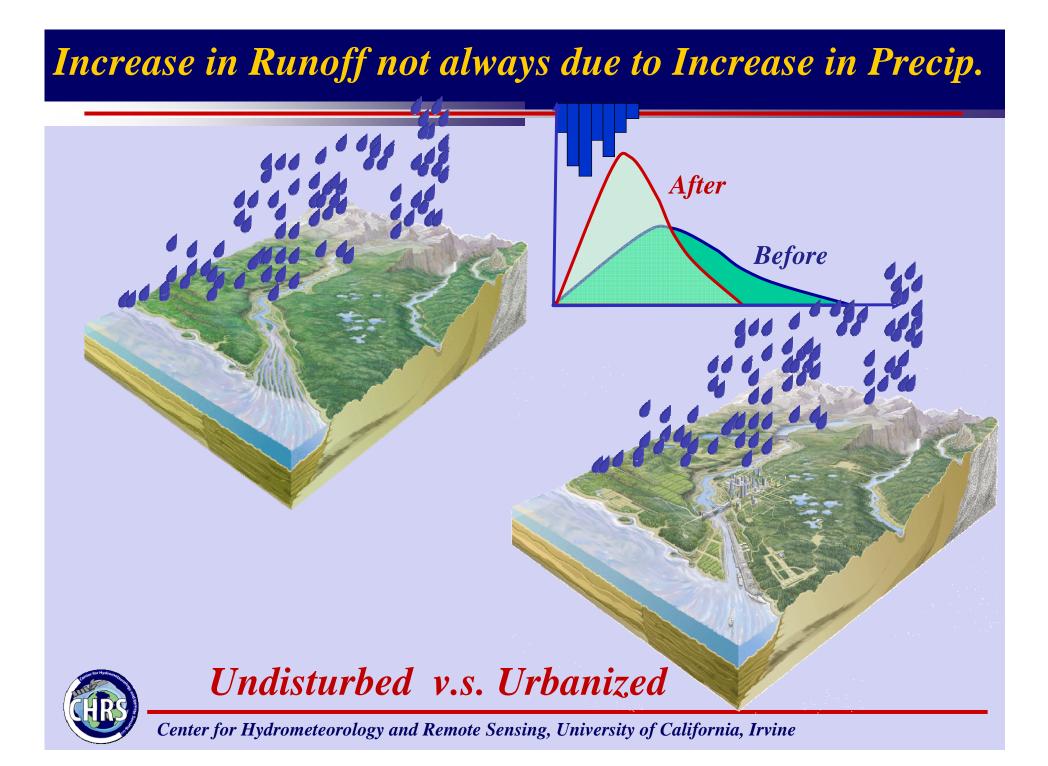
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What is the Big Deal About Characterizing the Long-Term Uncertainties in Hydro-Climate Variables?



Flood Plain Mapping and Zoning



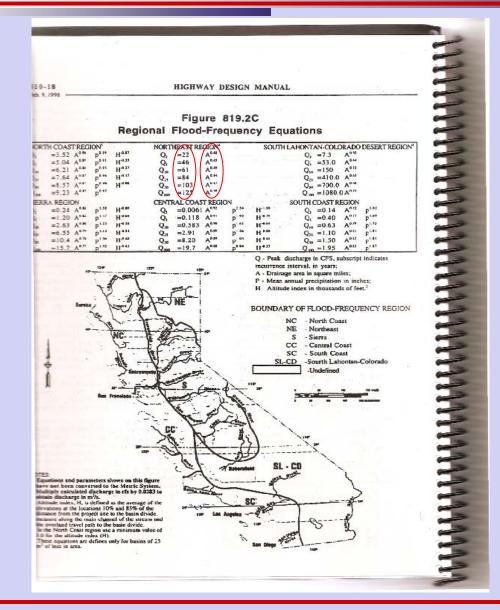
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Highway Culvert Design





A Page From the CalTran Highway Design Manual





How About Drought Frequency Analysis Methods?





Not to my Knowledge. No comprehensive program until recently.



Implications of Hydrologic Variability (Extremes) and Ecological changes



2 Precipitation Scenarios with different Temporal properties



Monthly Total

100 mm

Frequency 6.7% Intensity 50.0 mm



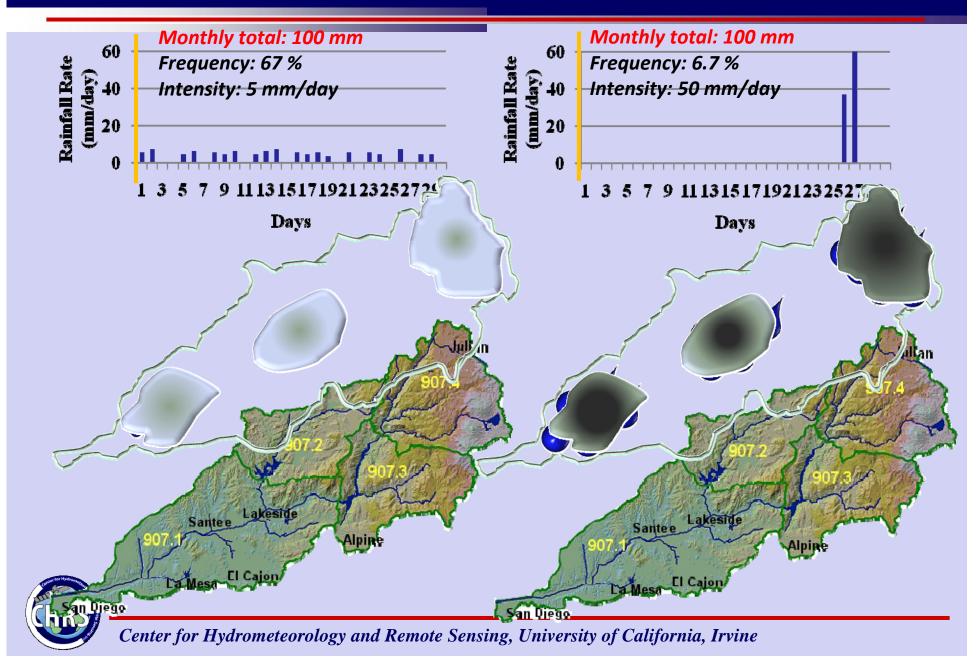
100 mm

Frequency 67% Intensity 5.0 mm

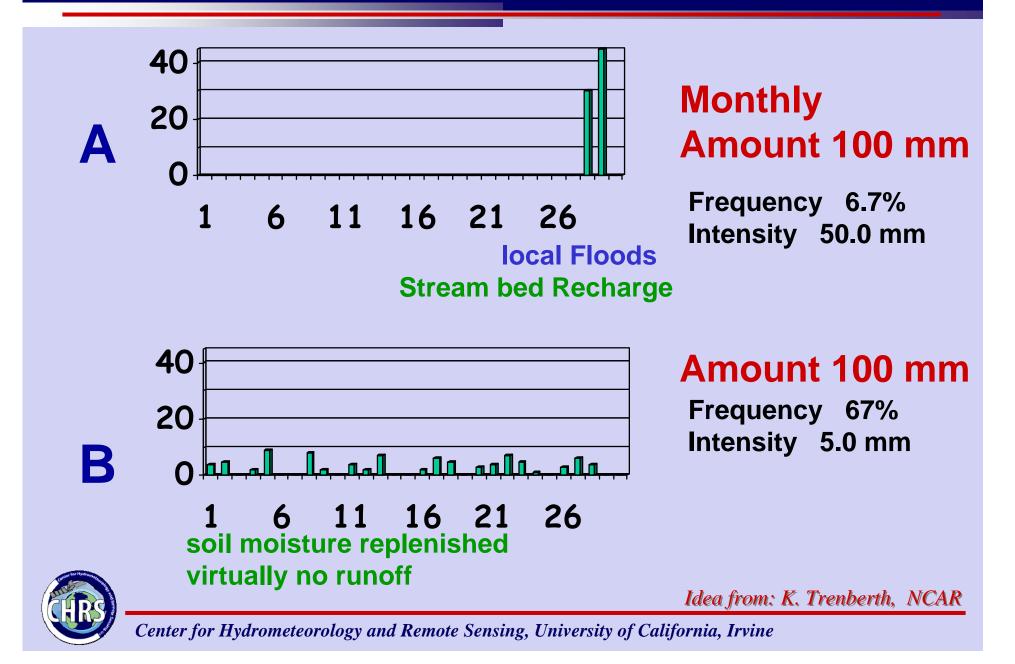


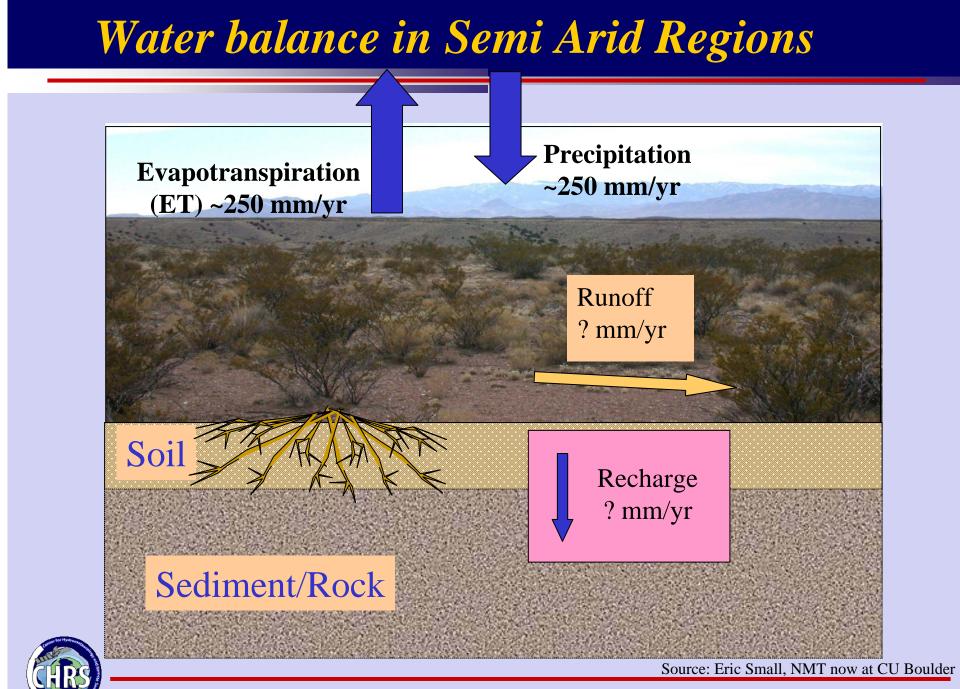
Idea from: K. Trenberth, NCAR

Importance of Temporal Scale : Daily Precip. at 2 stations

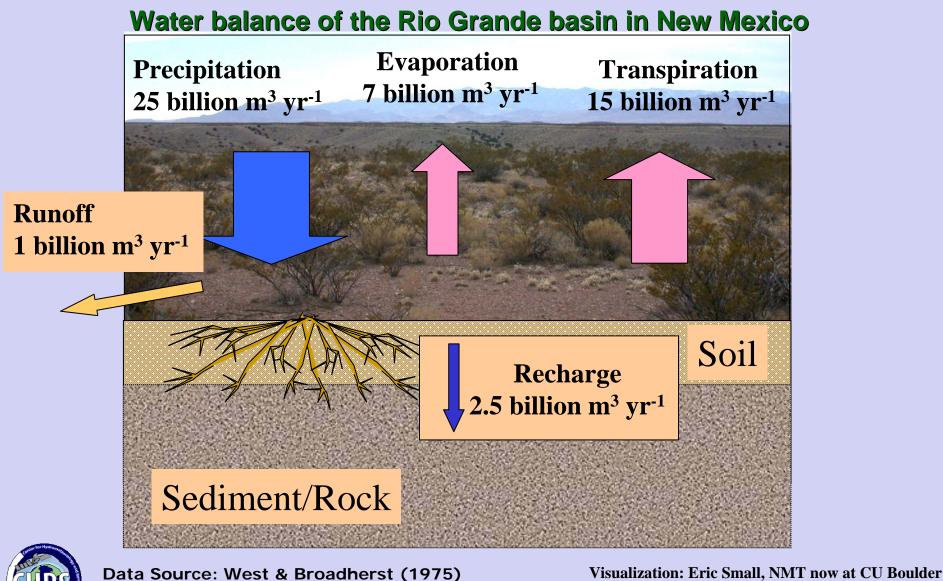


Importance of Temporal Scale : Daily Precip. at 2 stations





Where are the critical gaps in understanding?





Vegetation change in the Southwestern US:



Semi-arid grasslands in New Mexico and Arizona



are being replaced by deep rooted shrubs.



Recharge through semiarid soils

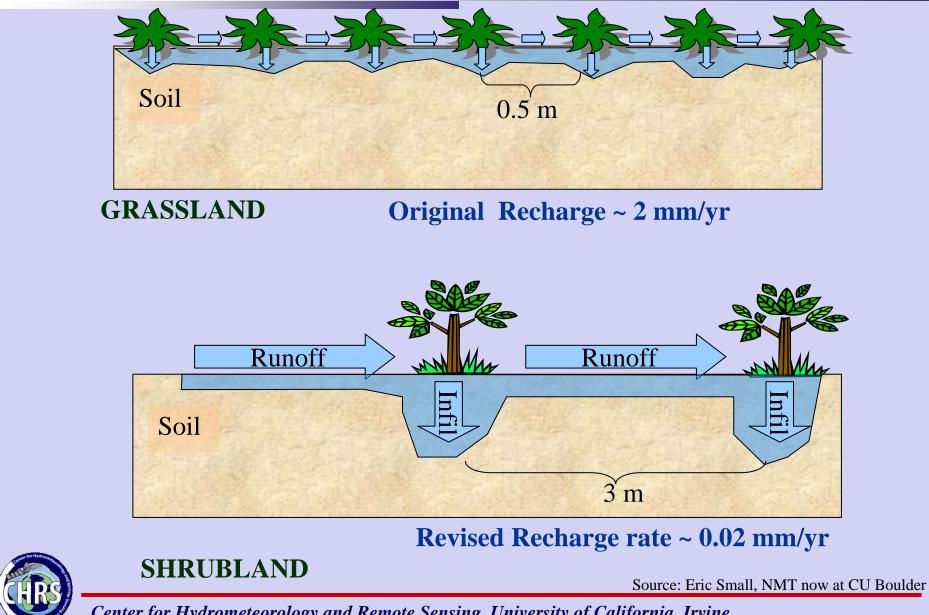
Groundwater recharge through semiarid soils is measured in *mm per year*.

Site	Mean annual precipitation	Potential evapo- transpiration	Soil	- Recharge mm/yr	Reference
mm/yr		n/yr	50 - 19 - 19 - 19 - 19 - 19 - 19 - 19 - 1	T star i star i	
1. Socorro, NM 2. Socorro, NM	190 190	1780 1780	Sandy alluvium Sandy alluvium	4.0-9.0 7.0-37	Stephens et al. (19 Sephens and (Knowiton (1986)
3. Socorro, NM 4. Sunland Park, NM	190 200	1780 1780	Sandy loam Medium sandy alluvium	2-2.6	Plillips et al. (1980) Stephens & Associa (1992, unpublish
				0.05-1.9	data)
 Las Cruces, NM Hudspeth County, TX Curry Co., NM 	230 280 444	1780 1960 1156	Sandy loam Gravel/clay loam Clayey and very fine		Philips et al. (1988 Scanlon et al. (199 Stone (1986)
8. Curry Co., NM	444	1156	sand (playa) Fine to very fine sand (pasture)	1.5-9.5 0.01-1	Stone (1986)
9. Curry Co., NM	444	1156	Fine sand and caliche (dunes)	2.8	Storie (1986)
0. Hanford, WA 1. Beatty, NV 2. South Australia	160 74 300	1400	(dunes) Loamy sand, sand Sand and gravel Dune sand	0.2	Gee et al. (1989) Nichols et al. (1987 Allison et al. (1985
3. Saudi Arabia 4. Eastern Botswana	70 447 390	2400 1220 1450	Dune sand Sand, sandstone Fine sand		Dincer et al. (1974) Carlsson et al. (198 Kitching et al. (198
15. Southern Cyprus 16. Central Sudan 17. Northeast Sudan	225 220	No report No report	Sandstone Sandstone	1.2	Darling et al. (1992) Darling et al. (1992)
(Stephens, 1994)				- 0100 0.036	1
			0101	14	
Only	mm	per ve	ear?!?!	20 0.5–6	/
		-		10-94	
Do	es it	really	matter?	0.2-1.3	

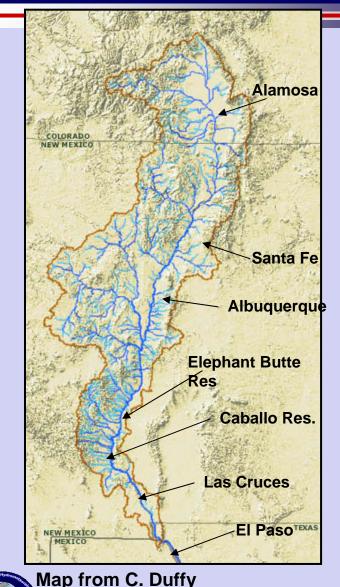


Phillips - NMT

Vegetation cover changes Impacts Infiltration



Upper Rio Grande Basin – CO and NM



(HR)

Slide contents from Walvoor Center for Hydrometeorology and Remote Sensing, University of California, Irvine

Basin Area: 60,000 km²

Population: 1,200,000

Recharge ~ 2 mm/yr

Ground Water for 1.6 Million People

Recharge ~0.02 mm/yr

Ground Water for only 16,000 people

Slide contents from Walvoord & Phillips - NMT

What is the Message?

• Despite advances to date, predicting the future Hydro-Climate variables will remain a major challenge:

• While investment in model development is fully justified, we must also improve the "engineering approaches" currently used in practice for operational and planning purposes.

• Long-term and sustained observation programs are critical, especially for model verification. Without some degree of verifiability, hard to expect their use

Thank You For Listening

The Rio Grande River, NM Photo: J. Sorooshian 2005