



Multidimensional risk in a nonstationary climate: changes in joint probability of extreme conditions in space and time

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August Complex, Ruth Lake, September 27, 2020
(Mike McMillan/US Forest Service)

What are “compound extremes”?

- co-occurrence (or rapid succession) in the same place/region

- co-occurrence (or rapid succession) in different places/regions

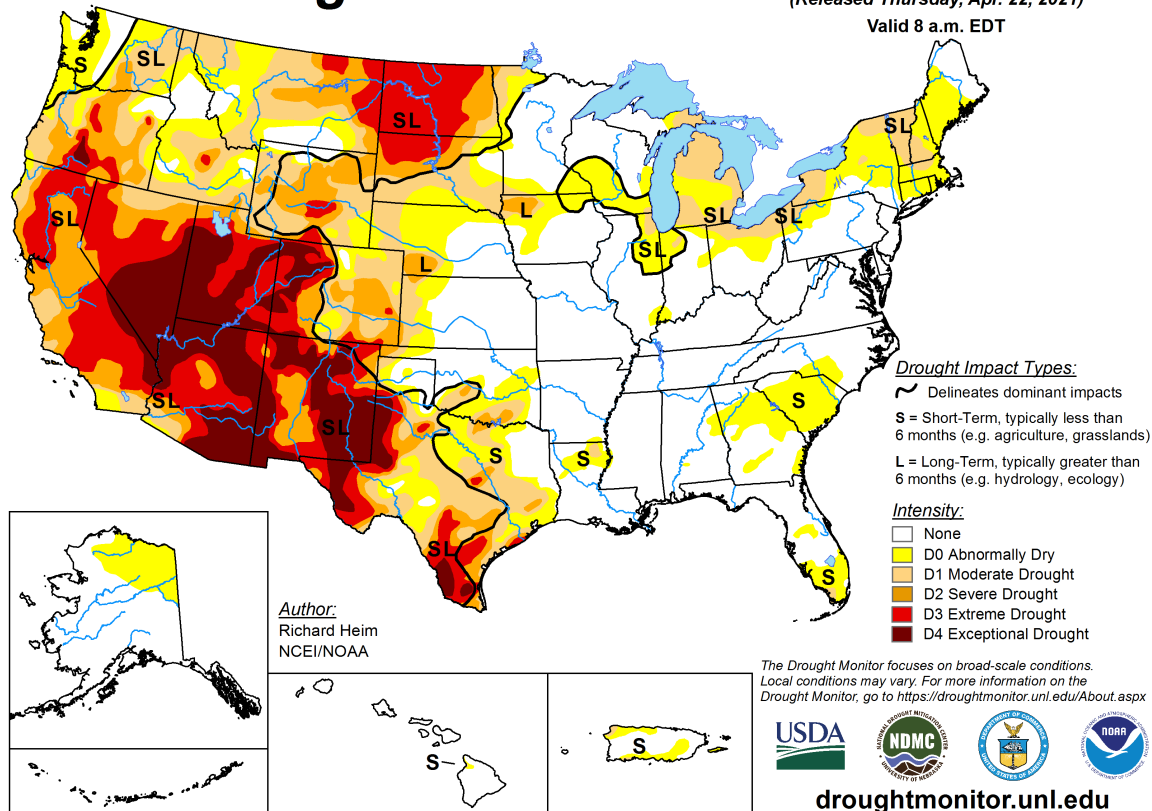
⇒ In some respects, we have been studying “compound extremes” for decades (e.g., drought indicators, wildfire weather indicators)

⇒ ***But non-stationarity is increasingly stressing natural and human systems***

Example of simple analysis: role of temperature in drought

U.S. Drought Monitor

April 20, 2021
(Released Thursday, Apr. 22, 2021)
Valid 8 a.m. EDT



Most of western US currently in drought

(large areas in extreme/exceptional drought)

Many studies of previous droughts in western US and around the world....

Anthropogenic warming has increased drought risk in California

Noah S. Diffenbaugh^{a,b,1}, Daniel L. Swain^a, and Danielle Touma^a

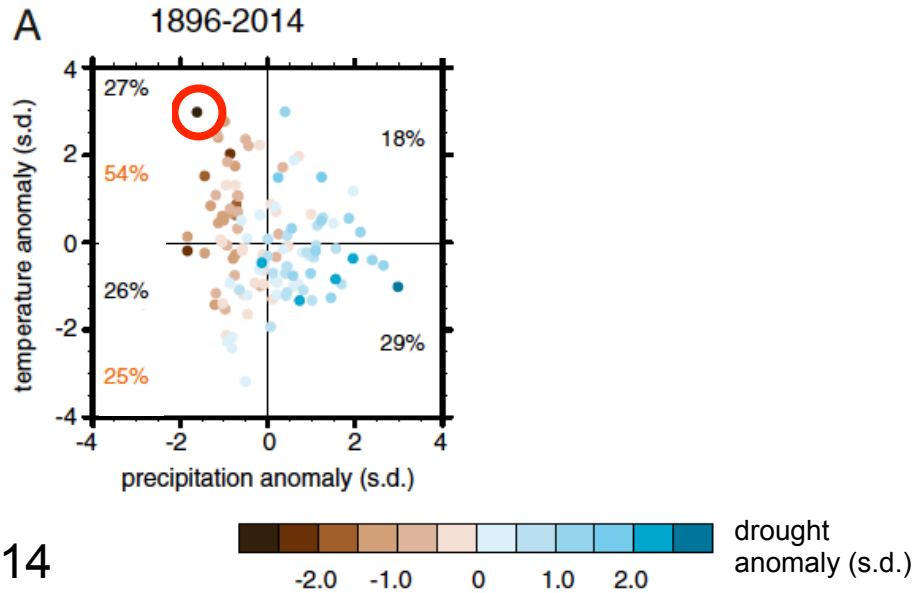
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Edited by Jane Lubchenco, Oregon State University, Corvallis, OR, and approved January 30, 2015 (received for review November 22, 2014)

California is currently in the midst of a record-setting drought. The drought began in 2012 and now includes the lowest calendar-year and 43 mo precipitation, the highest annual temperature, and the which steered Pacific storms away from California over consecutive seasons (8–11). Although the extremely persistent high

Diffenbaugh et al., 2015

Observations

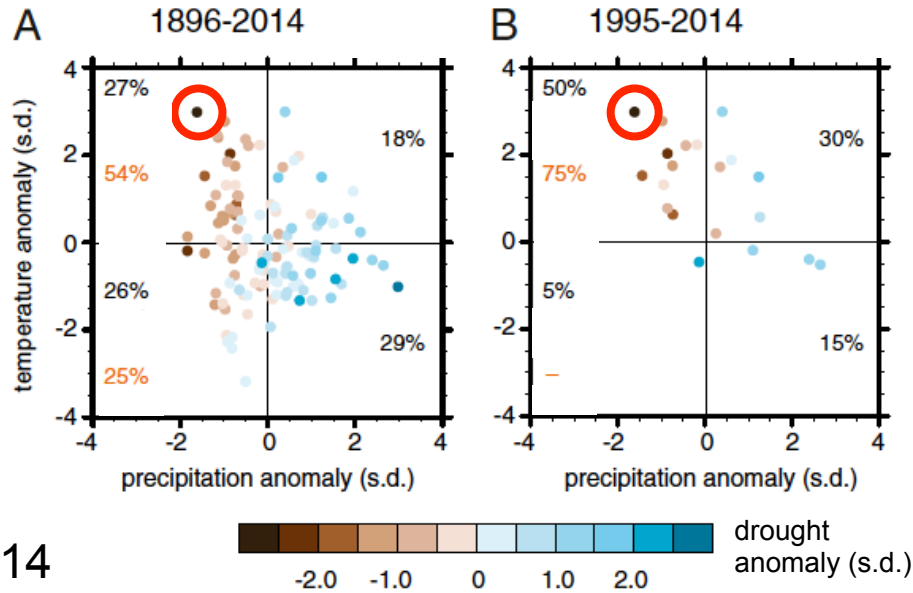


% of years that fall in quadrant

% of low precipitation years that produce drought

Historically, low precipitation years have been >2x as likely to produce drought if they co-occur with warm conditions

Observations



% of years that fall in quadrant

% of low precipitation years that produce drought

In the past two decades, 80% of years have been warm

Probability that =>

1. there is a drought
2. that low precipitation years are also warm
3. that negative precipitation years produce drought

=> have all doubled

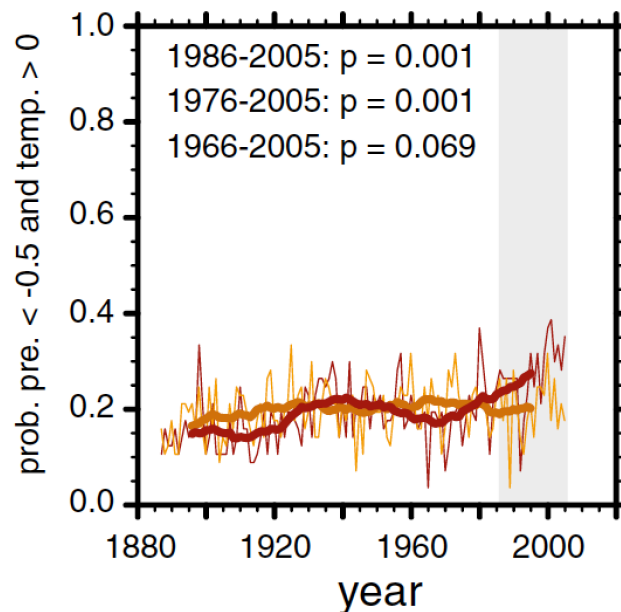
How do we test cause and effect?

=> global climate models

There is very high statistical confidence that human emissions of greenhouse gases have caused:

- The observed long-term warming of California
- The observed increase in the percentage of low precipitation years that are also warm

CMIP5 ensemble

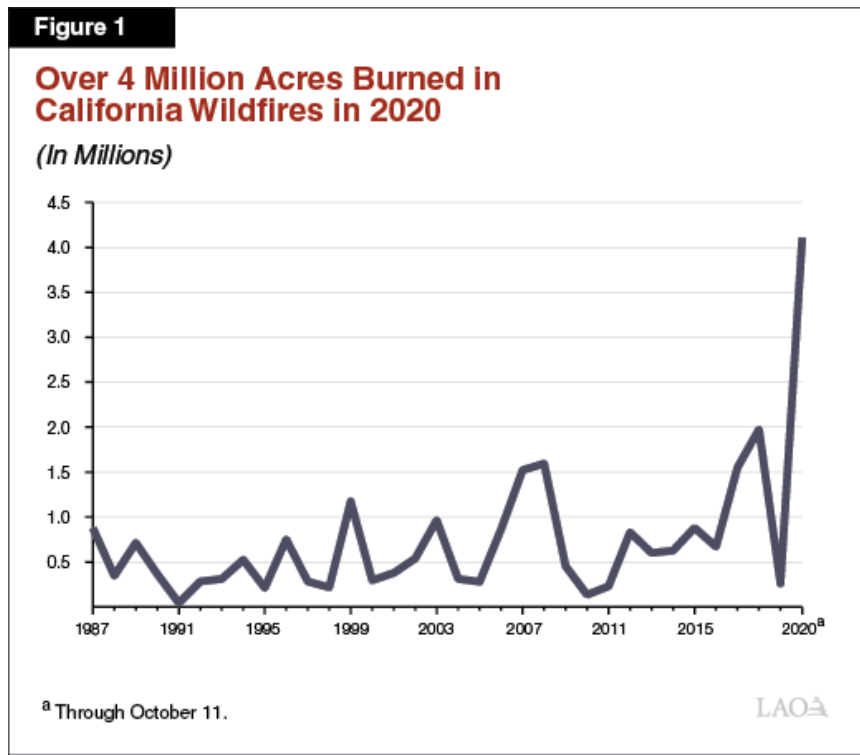


Historical — Natural —

Example of less simple analysis: recent California wildfires



2020 was most severe year in California's recorded history



2020 in historical context:

Largest area burned

Largest fire

5 of top 6 largest








6 of top 20 largest

=> Arose from confluence of multiple climatic and non-climatic conditions

Environmental Research Letters

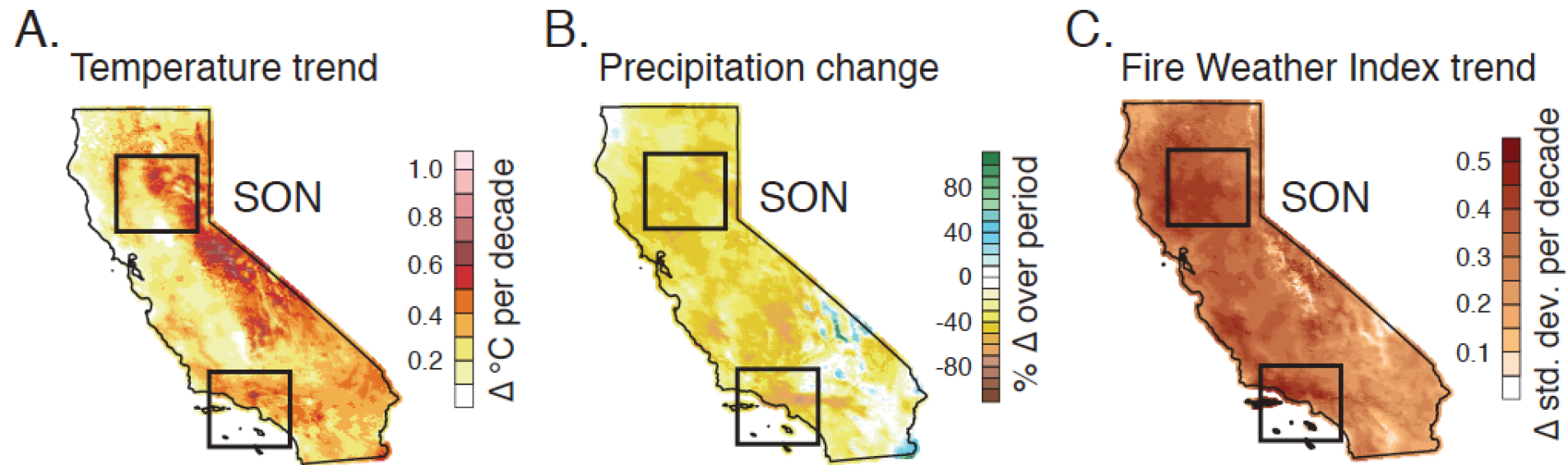
LETTER

Climate change is increasing the likelihood of extreme autumn wildfire conditions across California

Michael Goss^{1,10} , Daniel L Swain^{2,3,4} , John T Abatzoglou^{5,6} , Ali Sarhadi¹ , Crystal A Kolden^{5,7} ,
A Park Williams⁸  and Noah S Diffenbaugh^{1,9} 

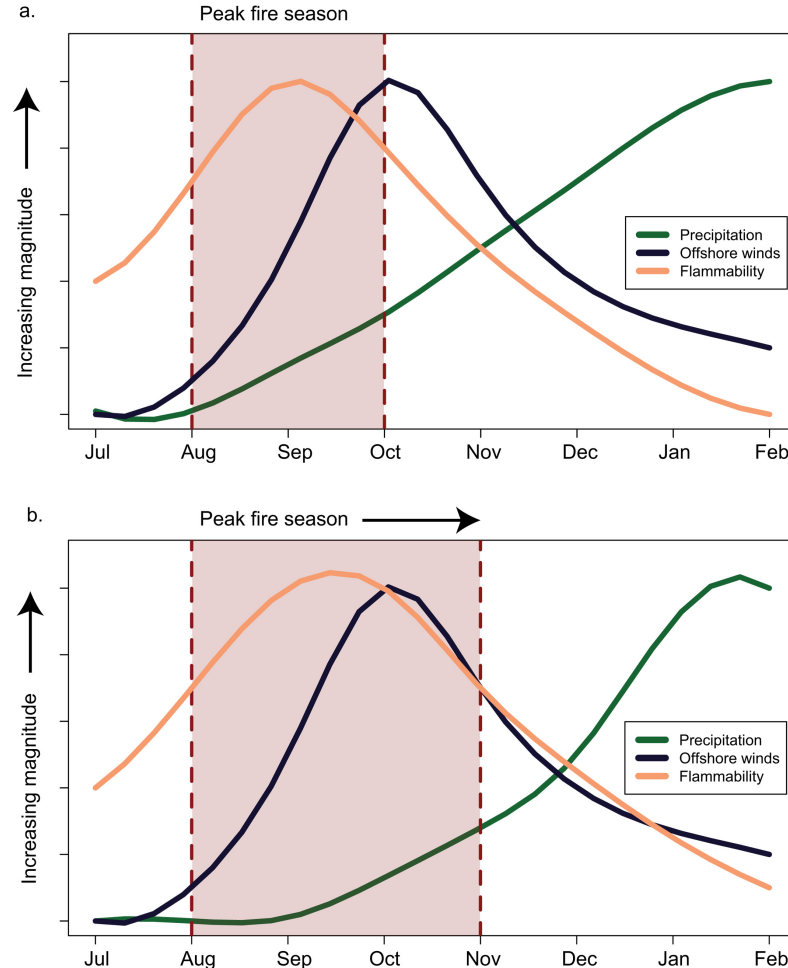
Historical trends in climate variables

California Autumn Trends



(Even) with no change in winds, (i) warming of late-summer and autumn and (ii) delayed onset of rainy season will each increase occurrence of weather conditions conducive to large, destructive wildfires

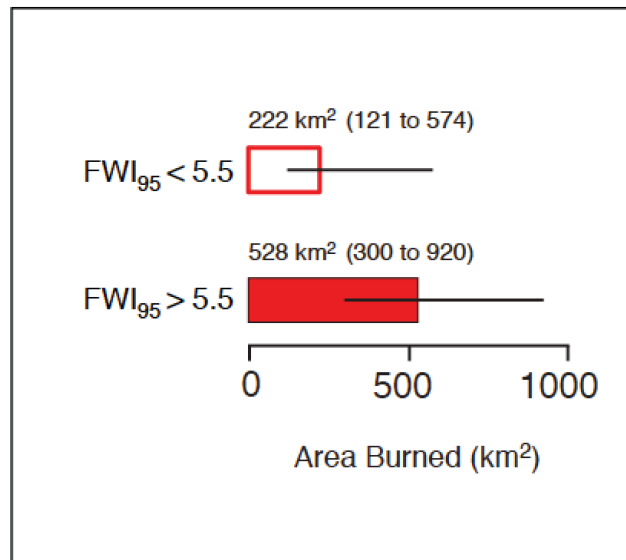
=> What are implications of rising “compound” risk?



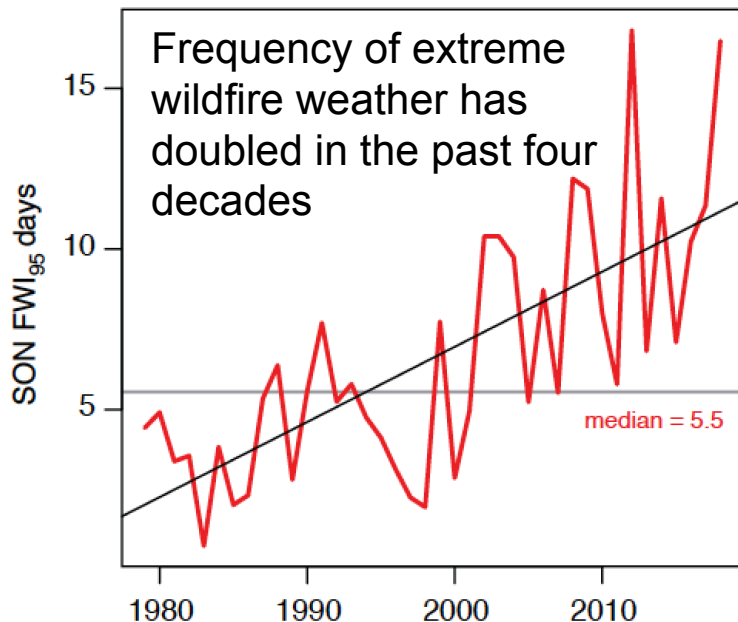
Swain, 2021

Influence of extreme wildfire weather on wildfire risk

Mean Autumn Area Burned (1984-2018)
for SONs with FWI₉₅ days above/below median



California Frequency of Autumn Days
with mean FWI exceeding 95th percentile (FWI₉₅)

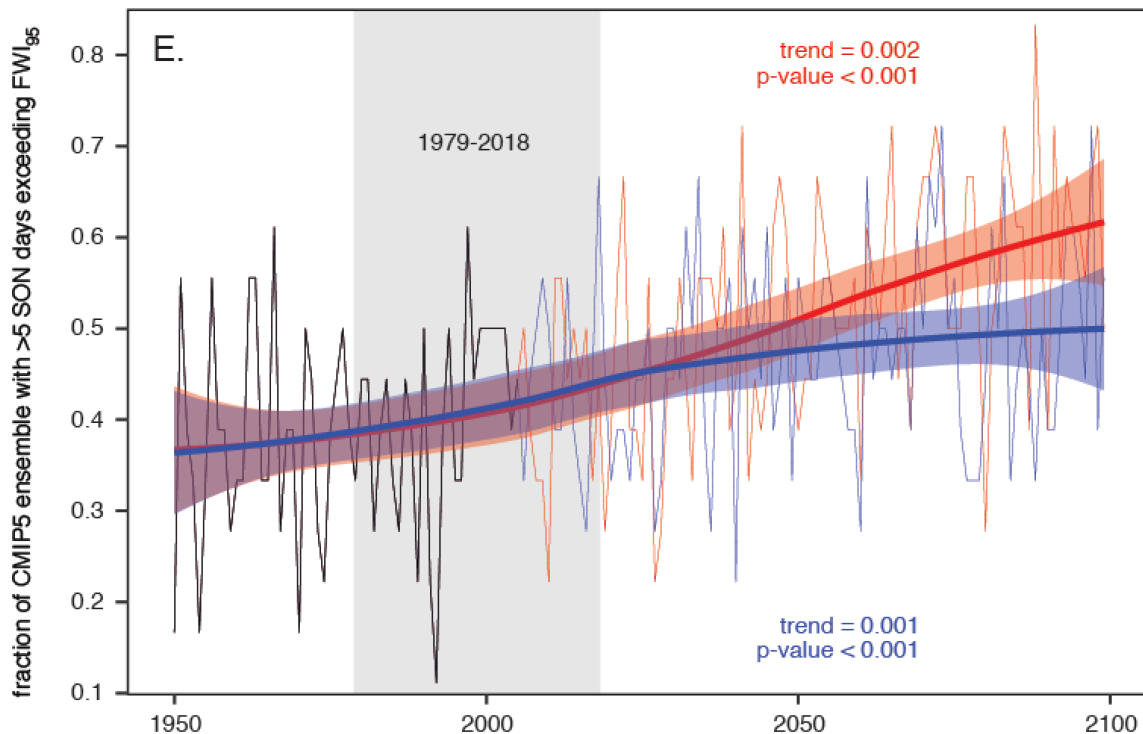


What are risks now and in the future?

=> Spatial co-occurrence is critical for wildfire response resources

What are risks now and in the future?

Northern Sierra (Paradise) and South Coast (Malibu) Same Season



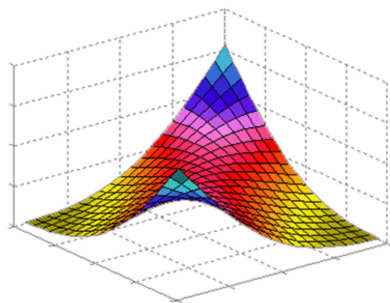
RCP8.5

RCP4.5

Changes in the spatial co-occurrence of extreme conditions is critical for a number of climate-sensitive concerns, including:

- agricultural markets
- food security
- poverty vulnerability
- supply chains
- weather-related insurance and reinsurance
- disaster preparedness and recovery

Is there a way to more rigorously quantify probability of spatial co-occurrence in non-stationary climate?



COPULAS FOR HYDROLOGY AND CLIMATE

UNIVERSITY OF CALIFORNIA IRVINE, JUL 28 - AUG 1, 2014

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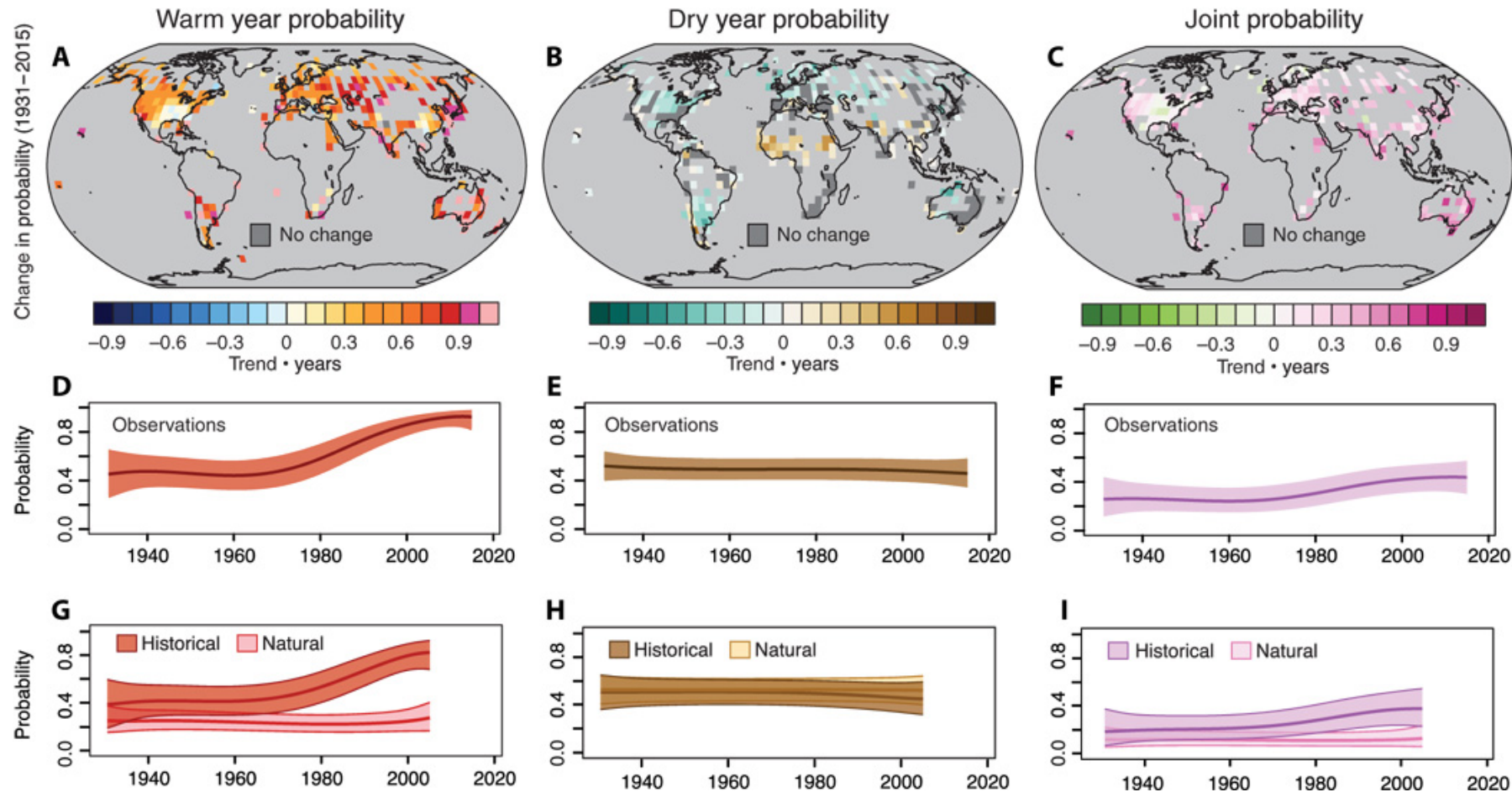
Multidimensional risk in a nonstationary climate: Joint probability of increasingly severe warm and dry conditions

Ali Sarhadi^{1,2*}, María Concepción Ausín^{3,4}, Michael P. Wiper³,
Danielle Touma¹, Noah S. Diffenbaugh^{1,2}

Sarhadi et al., 2018

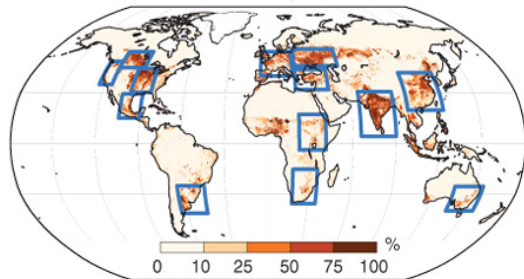
Historical trend in probability of warm, dry, and warm+dry conditions

NOAA observations (1931–2015)



A

Global crop lands



Historical change in joint probability of warm+dry conditions

NOAA observations; CMIP5 Historical and Natural simulations

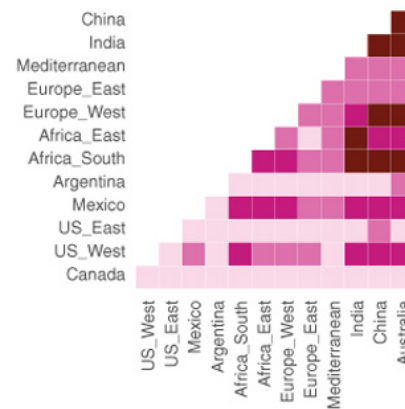
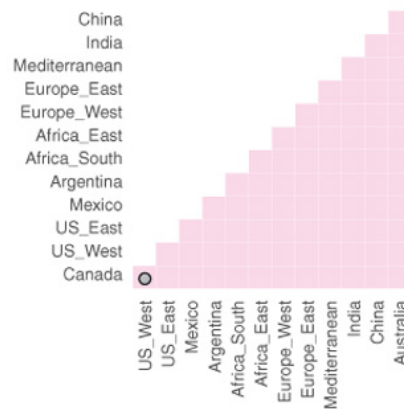
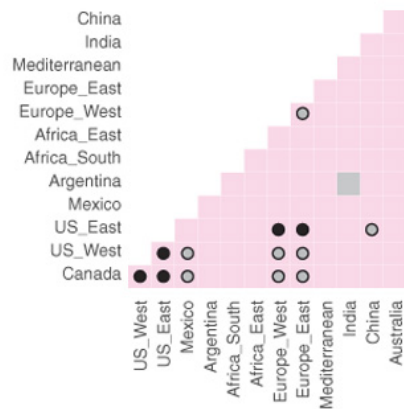
A

$T > 2$ SDs and $P < \text{base}$

1931–1950

1961–1980

1996–2015



Joint probability: 0 0.1 0.2

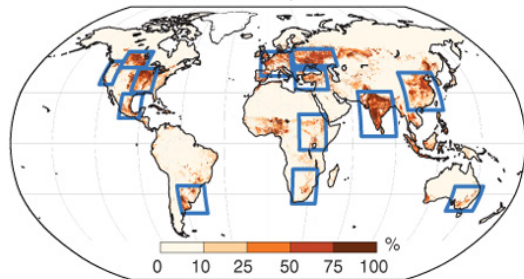
Historical/Natural P value: <0.01 0.01–0.05 >0.05

=> For example, probability that China and India experience below-mean precipitation and >2 -SD temperature in same year has grown from <0.05 to >0.15

Sarhadi et al., 2018

A

Global crop lands

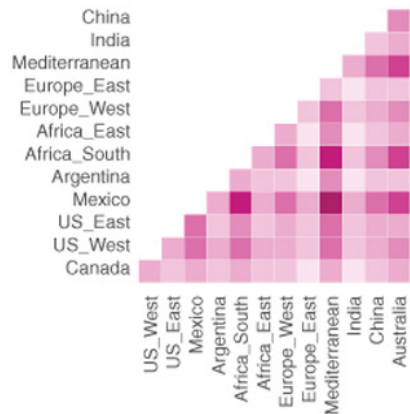


RCP8.5 change in probability

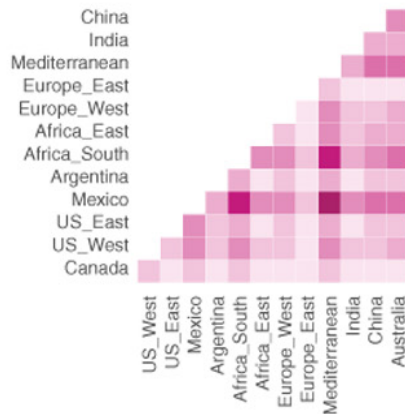
2020–2050 RCP8.5 minus 1986–2005 historical

C

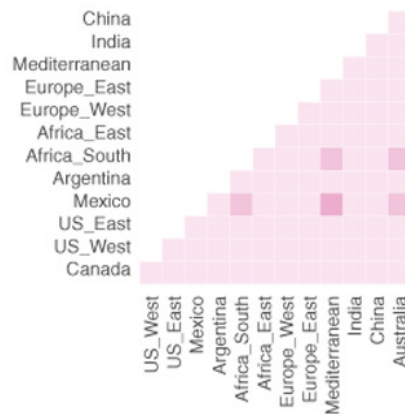
$T > 2$ SDs and $P < \text{base}$



$T > 4$ SDs and $P < \text{base}$



$T > 4$ SDs and $P < 1$ SD



=> And these changes in joint probability of extreme warm+dry conditions are very likely to intensify in response to further global-scale warming

Quantifying probability of spatial co-occurrence of extreme conditions in non-stationary climate

⇒ Can use this type of approach to quantify joint probability of co-occurring extremes to specific impact metrics:

- extreme wildfire weather
- agricultural yields
- extreme events in multiple climate variables
- etc...

Thank you!