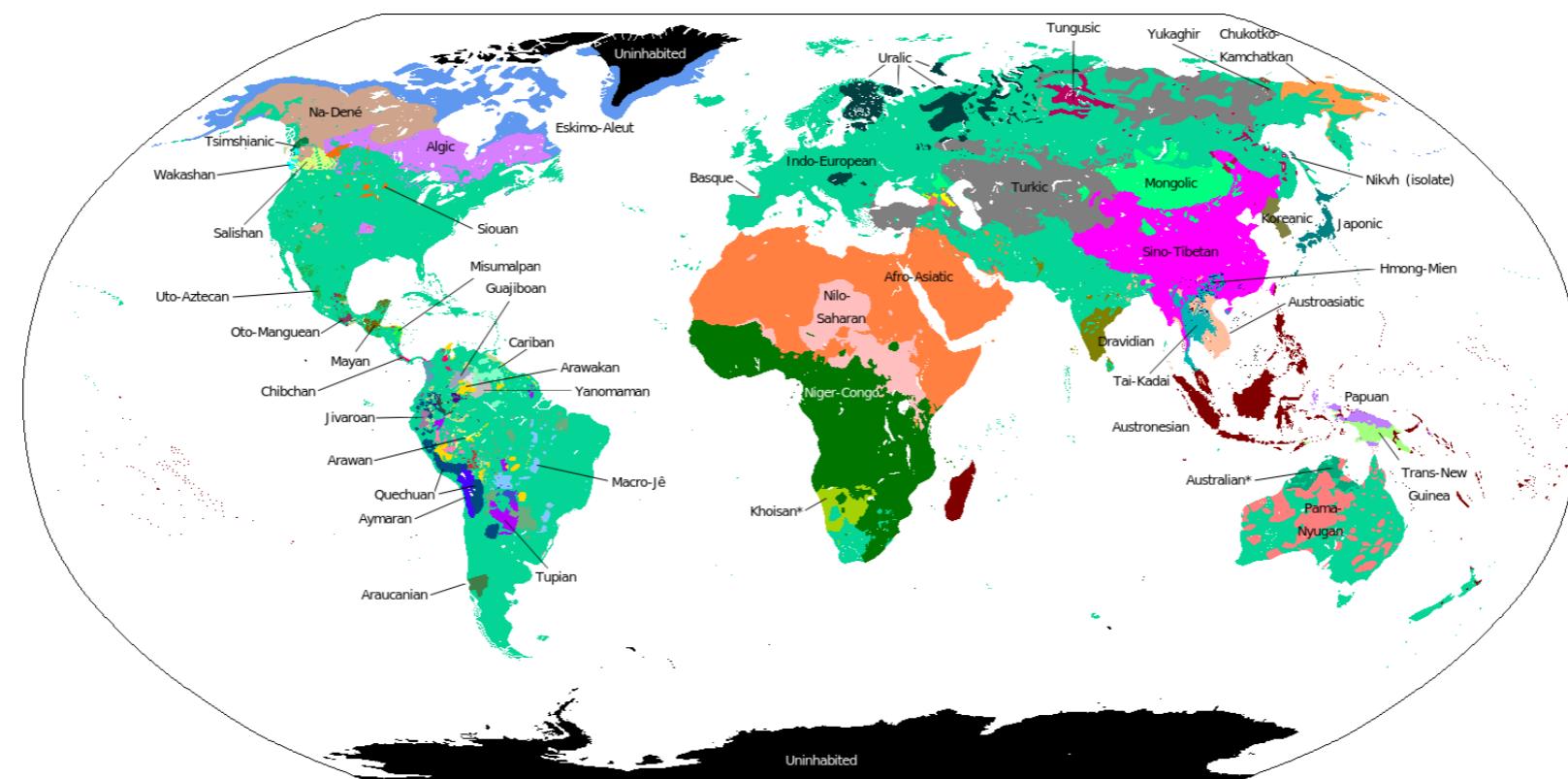


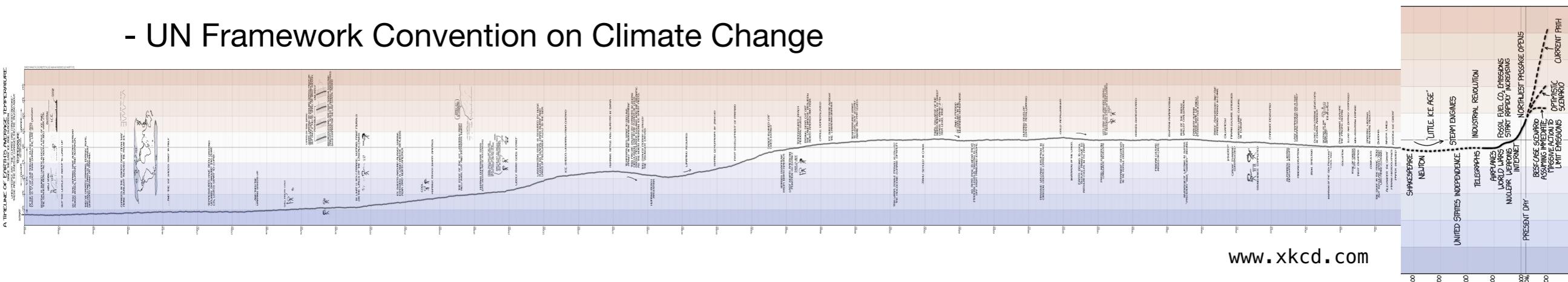
Using Global Hotspots to assess the Effects of Climate Change on Linguistic Diversity



Ethan Gotlieb Wilcox
Harvard University, Department of Linguistics
CPL Lab Meeting
October 2019

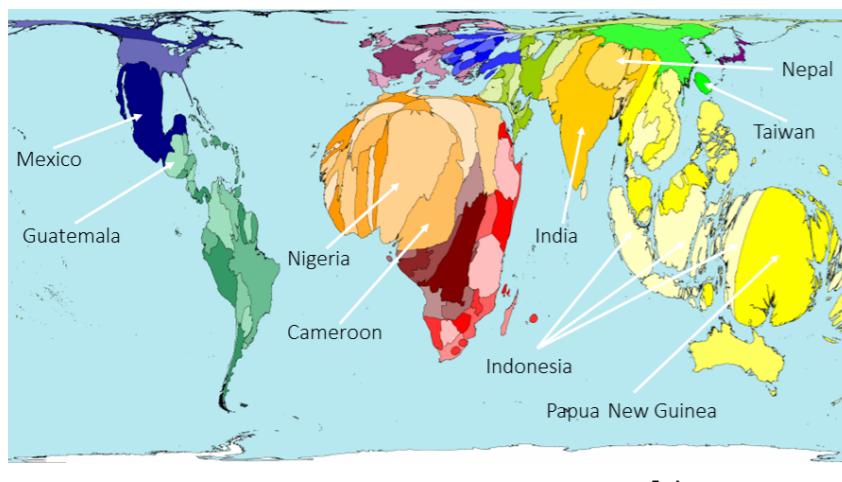
Intro: Language & Climate Change

- Climate Change: “Change of climate that is attributed directly or indirectly to human activity that alters the composition of the global atmosphere”
 - UN Framework Convention on Climate Change



- Impact on Biological Ecosystems & Human Life

World's Languages



- ~6,500 languages
- 148 (+) top-level language families
- Up to 1/2 of languages may go extinct by end of century
- Major threats: economic and cultural globalization, industrialization

How does Climate Change affect this dynamic?

Motivating the Study of Climate Change on Languages

- **Linguists:**
 - Diverse data is the basis of good linguistic theory
 - Models of climate impact can transfer to other subfields, e.g. historical linguistics & typology
- **Policymakers:** Where should we fund documentation and conservation efforts?
- **Everyone:**
 - Understand the scope of the changing climate
 - Impact on linguistic diversity as a window into impact on cultural diversity

[LSA Adopts Statement on Climate Change and Human Language](#)

Tuesday, February 6, 2018 - 3:34pm

The LSA Executive Committee recently approved an official statement on Climate Change and Human Languages and Cultures in an effort to highlight the impact that climate change is having on speakers of endangered languages and dialects. The statement outlines a number of approaches that linguists and language advocates can undertake to address these issues. The full text of the statement is available below. Additional resource materials on this topic are currently in development by the LSA's Committee on Endangered Languages and their Preservation (CELP).

[Statement on Climate Change and Human Languages and Cultures](#)

The Linguistic Society of America (LSA) supports efforts to mitigate or curtail language loss resulting from climate change and global warming. LSA is especially concerned about the effects of accelerating climate change on the survival and distribution of endangered languages and dialects. Approximately 37 percent of the world's nearly 7000 languages are endangered, and many more will become endangered or extinct without



Motivating Intuition: Climate & Linguistic Diversity

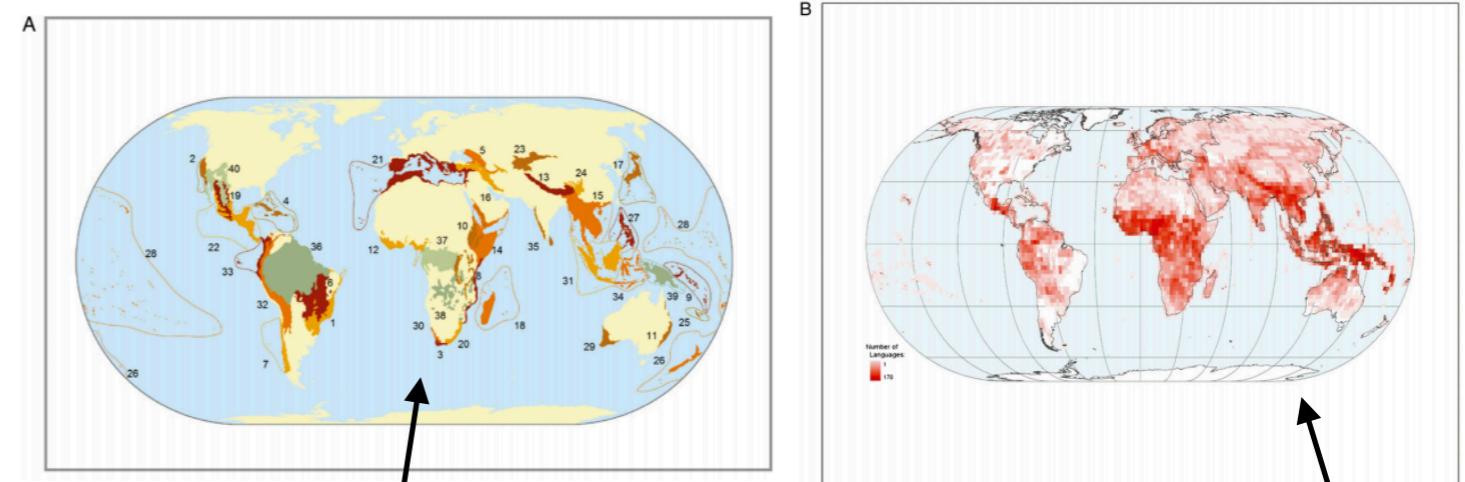
- **Intuition:** Climate change will impact linguistic diversity by putting areas of high linguistic diversity under outsized environmental stress

Importance of Islands

Table 1. The number of species and languages in each category and their threat status.				
	Insular	Continental	Total	Percentage insular
Area (in 1000 square kilometers)	7821	141,118	140,939	5.3
Total diversity	48,331	241,669	290,000	17
Magnoliophyta				
Aves	1947	8117	10,064	19
Rodentia	665	2047	2202	17
Languages	2551	6885	9436	27
Extinct diversity				
Plantae	71	43	114	62.3
Animalia total	461	296	757	60.9
Actinopterygii	4	99	103	3.9
Amphibian	21	18	39	53.8
Arthropoda	38	31	69	55.1
Aves	127	10	137	95.3
Mammalia	42	36	78	53.8
Mollusca	212	97	309	68.6
Platyhelminthes	0	1	1	0
Reptilia	17	4	21	81.0
Languages	43	336	379	11.4
Critically endangered diversity				
Plantae	794	781	1575	50.4
Animalia total	641	1100	1741	36.8
Actinopterygii	49	240	289	16.9
Amphibian	102	382	484	21.1
Arthropoda	94	85	179	52.5
Aves	113	79	192	58.8
Chondrichthyes	0	25	25	0
Mammalia	85	103	188	45.2
Mollusca	154	137	291	52.9
Reptilia	44	49	93	47.3
Languages	113	347	460	24.6

Tershy et al., 2015 "The Importance of Islands for the Protection of Biological and Linguistic Diversity"

Correlation of Linguistic Diversity & Biological Diversity



Corenflo et. al., 2012, "Co-occurrence of linguistic and biological diversity in biodiversity hotspots and high biodiversity wilderness areas"

Global biodiversity hotspots

Heatmap of world's languages

Goal: Formalize this intuition by looking at global “hotspots” a state-of-the-art climate model

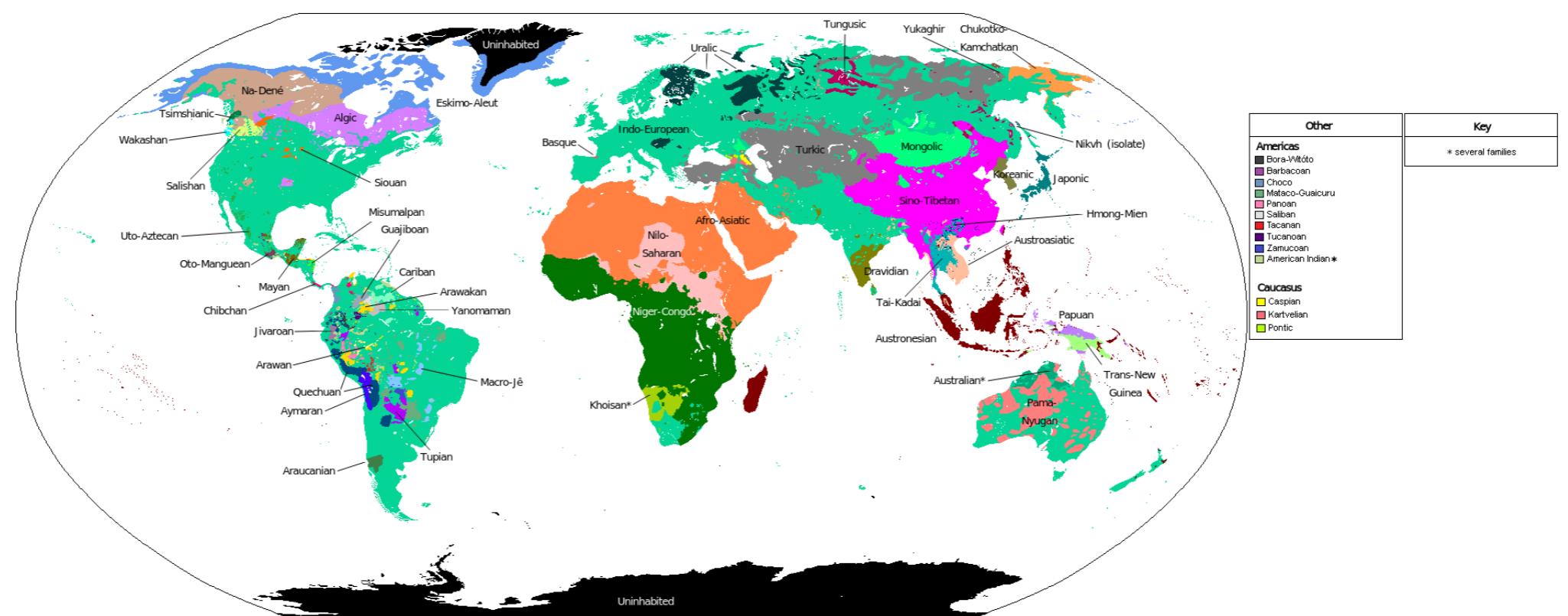
Outline: Desiderata / Questions

- Finding Climate Hotspots
- Will climate change have an outsized impact on linguistic diversity?
- What languages / language families will be impacted the most?
 - Do different climate pathways affect the same or different languages?
- Are endangered languages at greater risk from climate change?



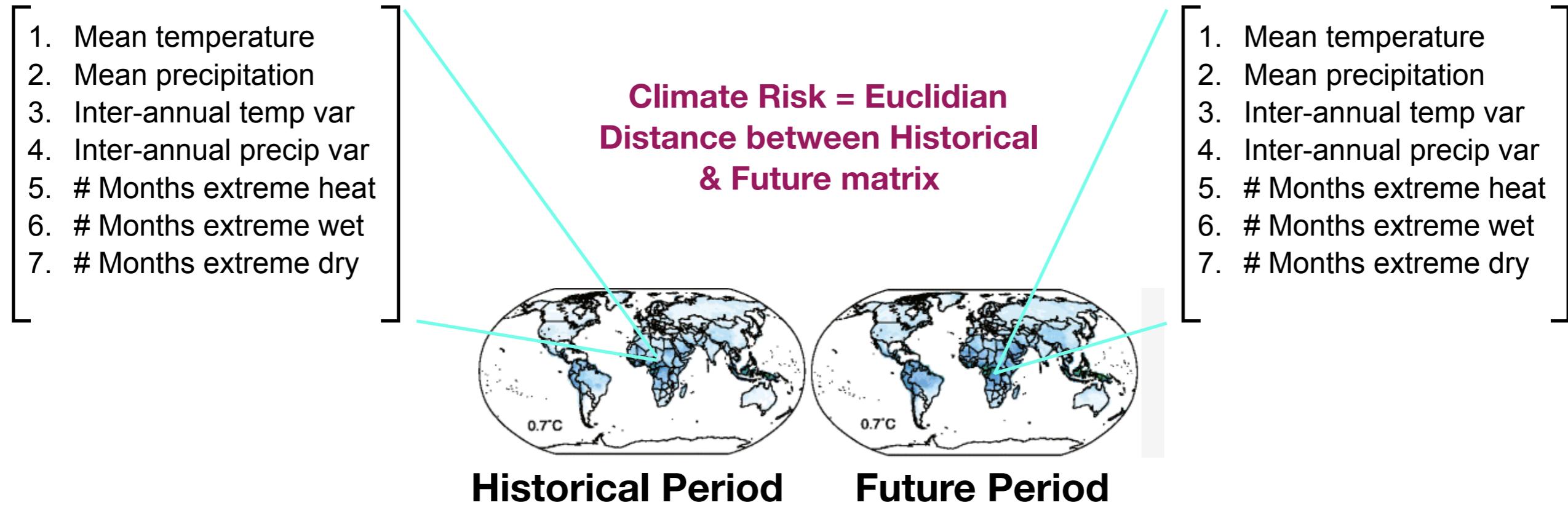
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Finding Climate Hotspots: Previous Models

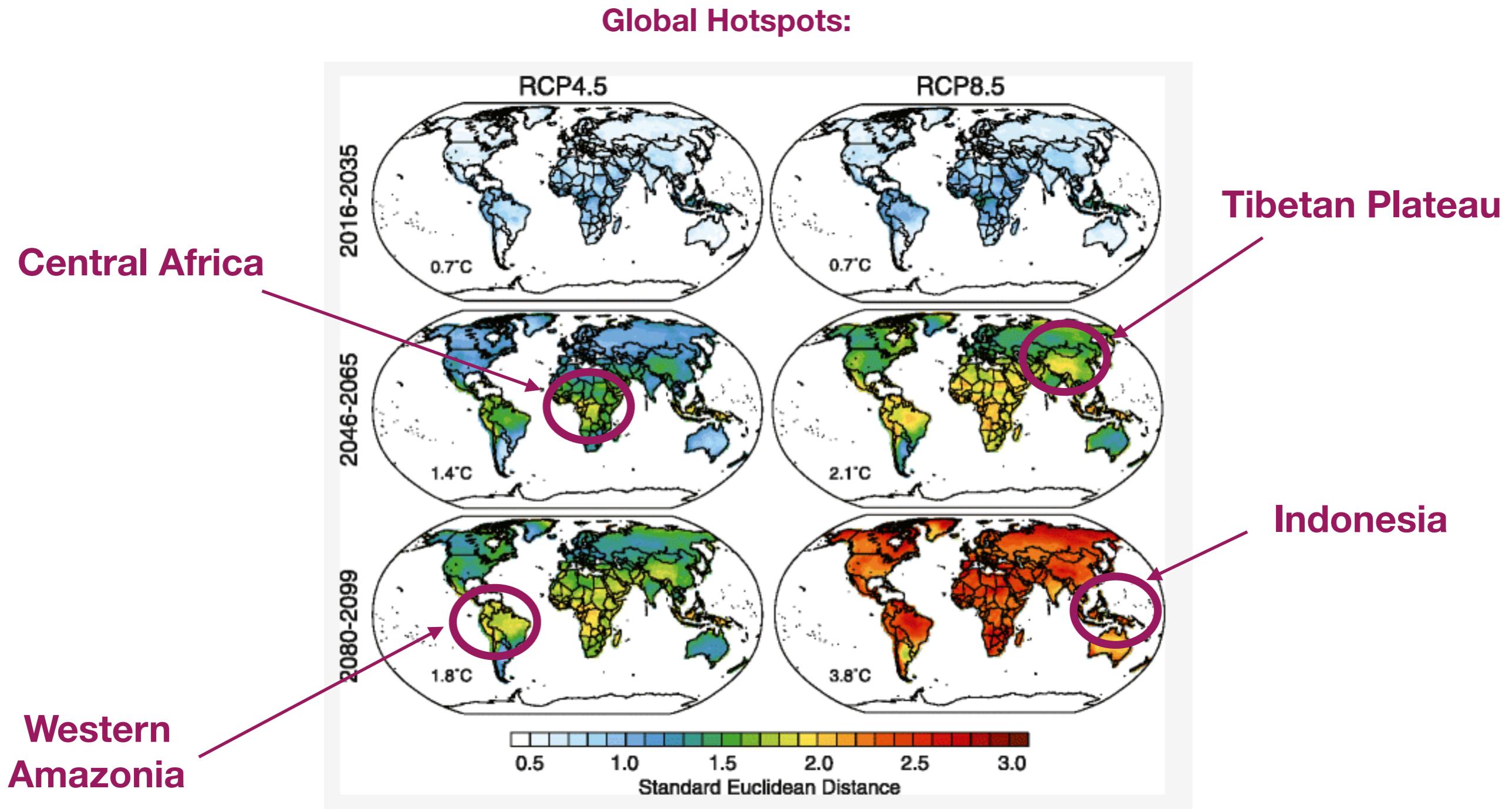
“Climate Change Hotspots in the CMIP5 Global Climate Model Ensemble” Diffenbaugh & Giorgi, 2012



- *Historical Period:* 1986-2005 & 3 *Future* periods (2016-2035, 2046-2065, 2080-2090)
- 20 Models - CMIP5 Framework
- Use forcing function that corresponds to predicted carbon outputs:
 - RCP4.5 (650ppm/2.4 degrees warming)
 - RCP8.5 (>1370ppm co₂ / 4.9 degrees warming)

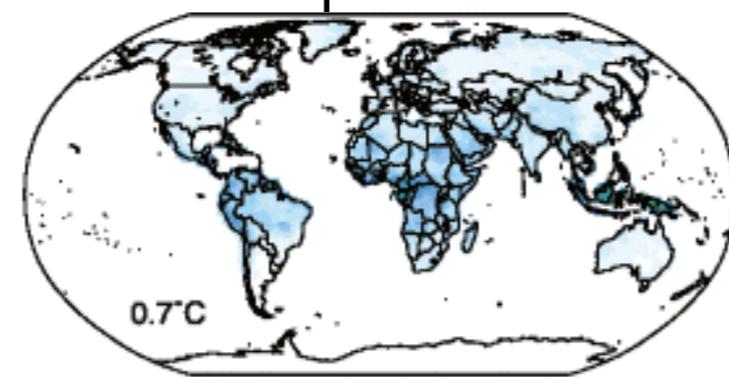
Finding Climate Hotspots: Previous Results

“Climate Change Hotspots in the CMIP5 Global Climate Model Ensemble” Diffenbaugh & Giorgi, 2012



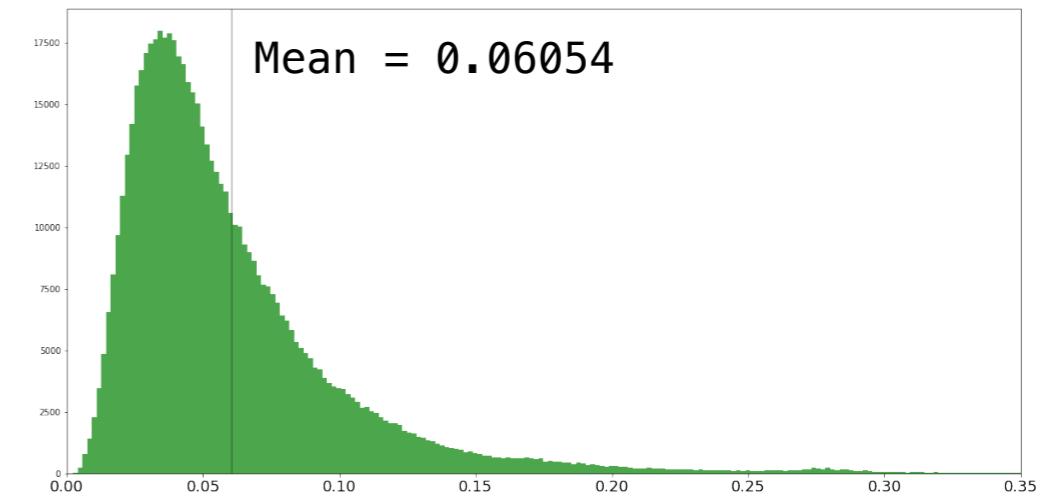
Finding Climate Hotspots: The Model

1. Normalized $\text{abs}(\text{mean temp}_p - \text{mean temp}_b)$
2. Normalized $\text{abs}(\text{mean precip}_p - \text{mean precip}_b)$
3. Normalized $\text{abs}(\text{mean SD(temp}_p) - \text{SD(temp}_b))$
4. Normalized $\text{abs}(\text{mean SD(precip)} - \text{SD(precip}))$
5. Normalized # of months hotter than hottest in baseline
6. Normalized # of months wetter than wettest in baseline
7. Normalized # of months drier than driest in baseline



“Climate Risk Factor”

- Mean of all seven predictors, from 0-1
- Mean normalized deviation from baseline across all 7 predictors
- Gives relative distribution of climate change across all globe points and future pathways



Histogram of Climate Risk Factor

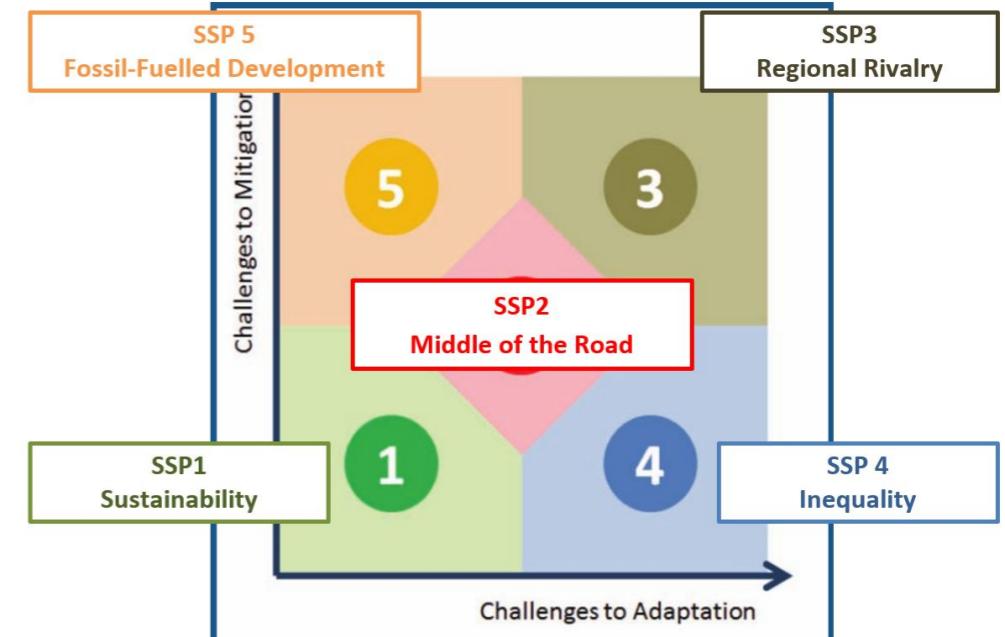
- CMIP 6 Framework
- Model: GFDL-NOAA Earth Systems Model 4 (results from this year)
- *Baseline Period:* 2005-2020 (model predictions) & 3 Future periods (2040-2060; 2060-2080; 2080-2100)
- Use “Shared Socioeconomic Pathways” instead of RCP Forcing Functions

Shared Socioeconomic Pathways (SSPs)

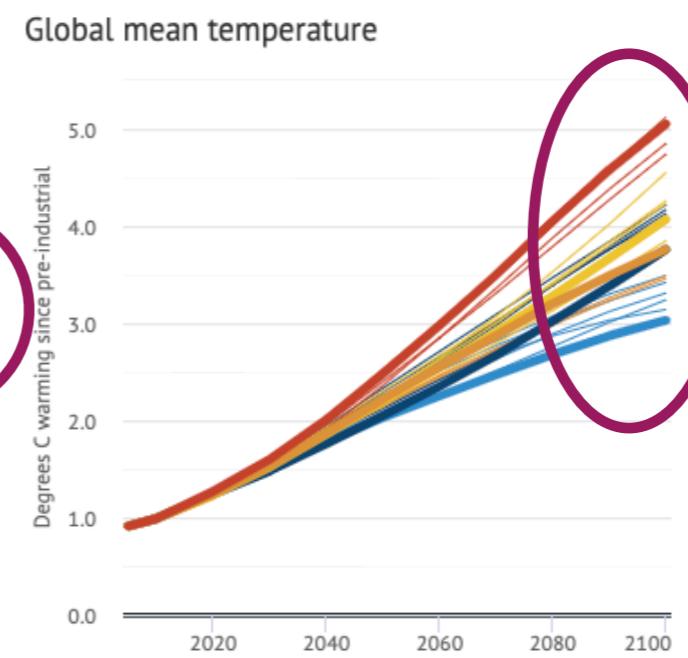
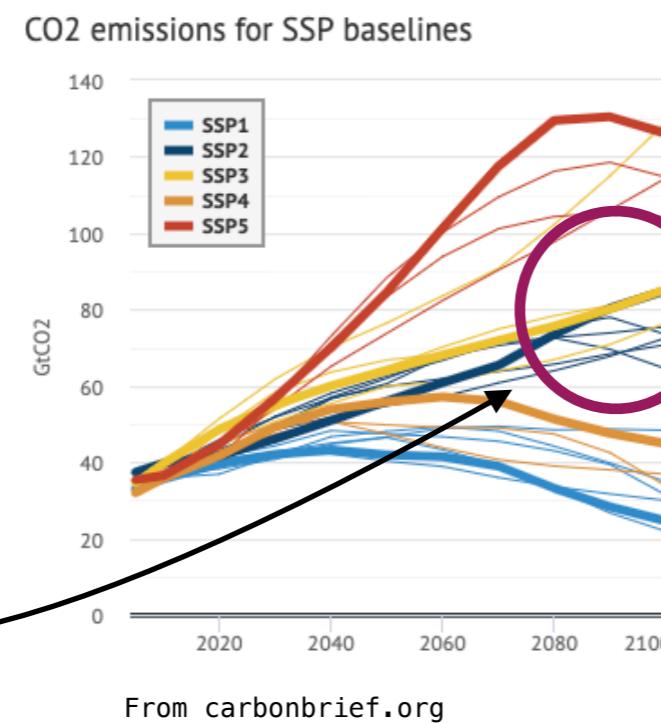
- Late 2010s: Switch from *Carbon Output* (RCPs) to **Climate Narratives** (SSPs)

Future is an interplay between...

- Challenges to **mitigation**
 - Can we reduce carbon output
- Challenges to **adaptation**
 - Shared response & coordination



- SSPs aren't strictly "better or worse"
- E.g. SSP2 & SSP3 predict more emissions than SSP4

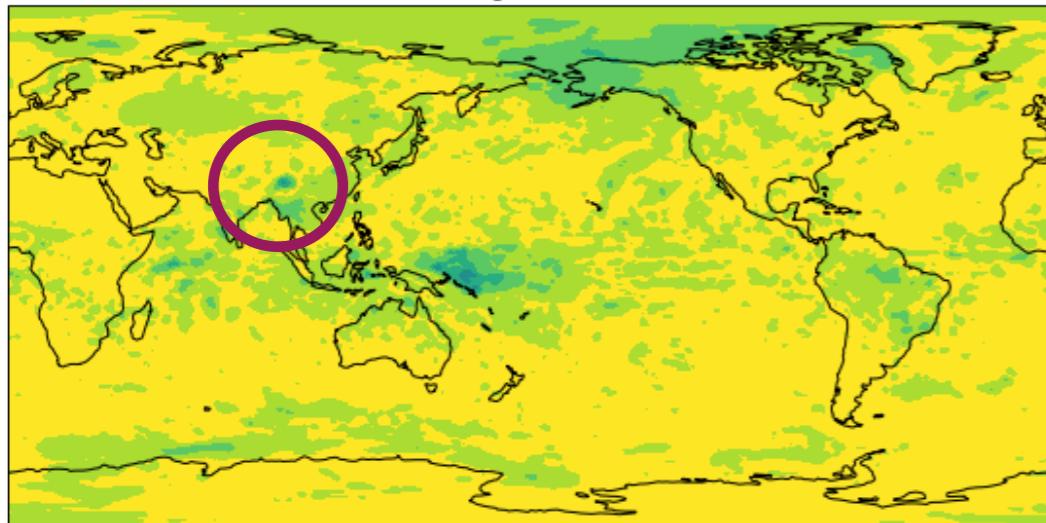


- Largest effects between pathways > 2060
- This work: 2015 - 2090 difference

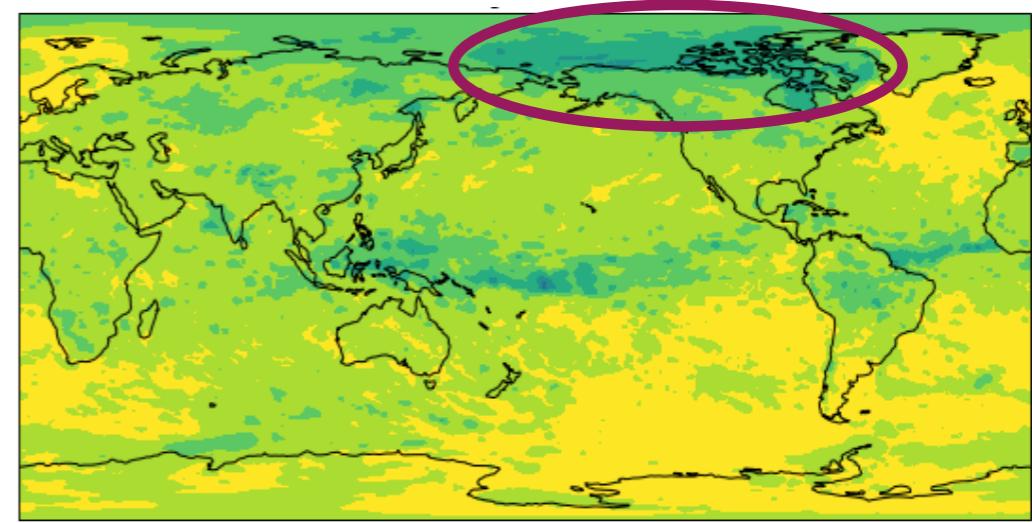
Finding Climate Change Hotspots

- Results: **Climate Risk Factor** (darker) = Deviation from Baseline Period
- Mean climate risk factor across all pathways = 0.06

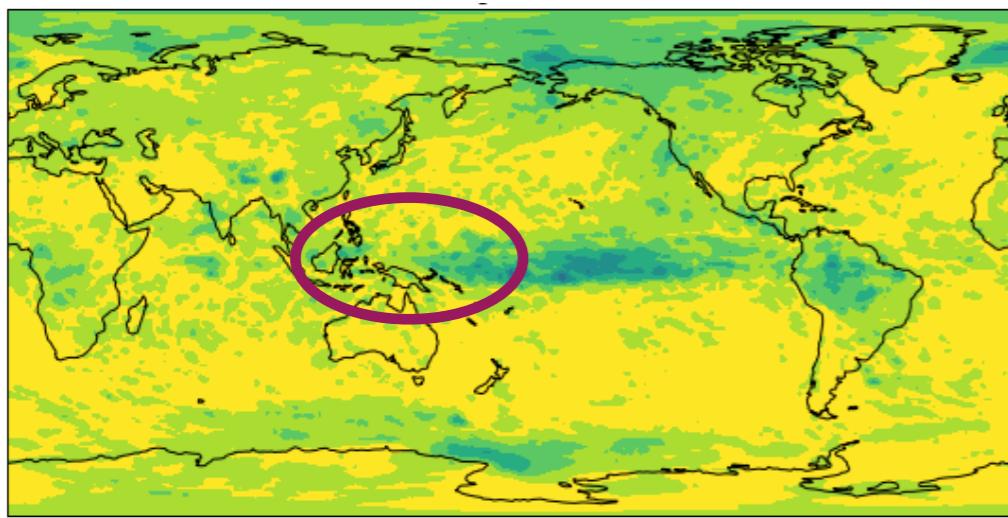
SSP1: “Sustainability”



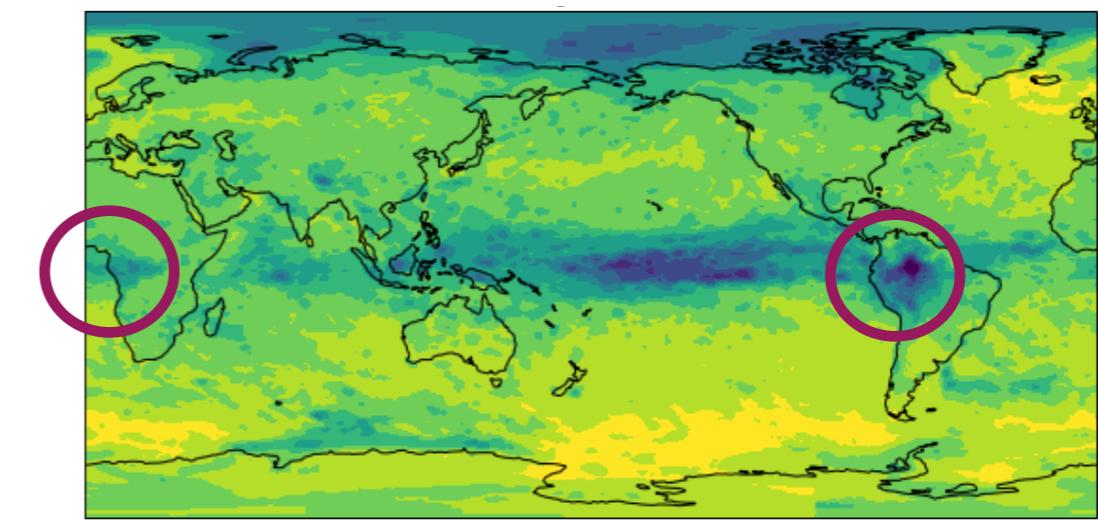
SSP2: “Middle of the Road”



SSP3: “A Rocky Road”



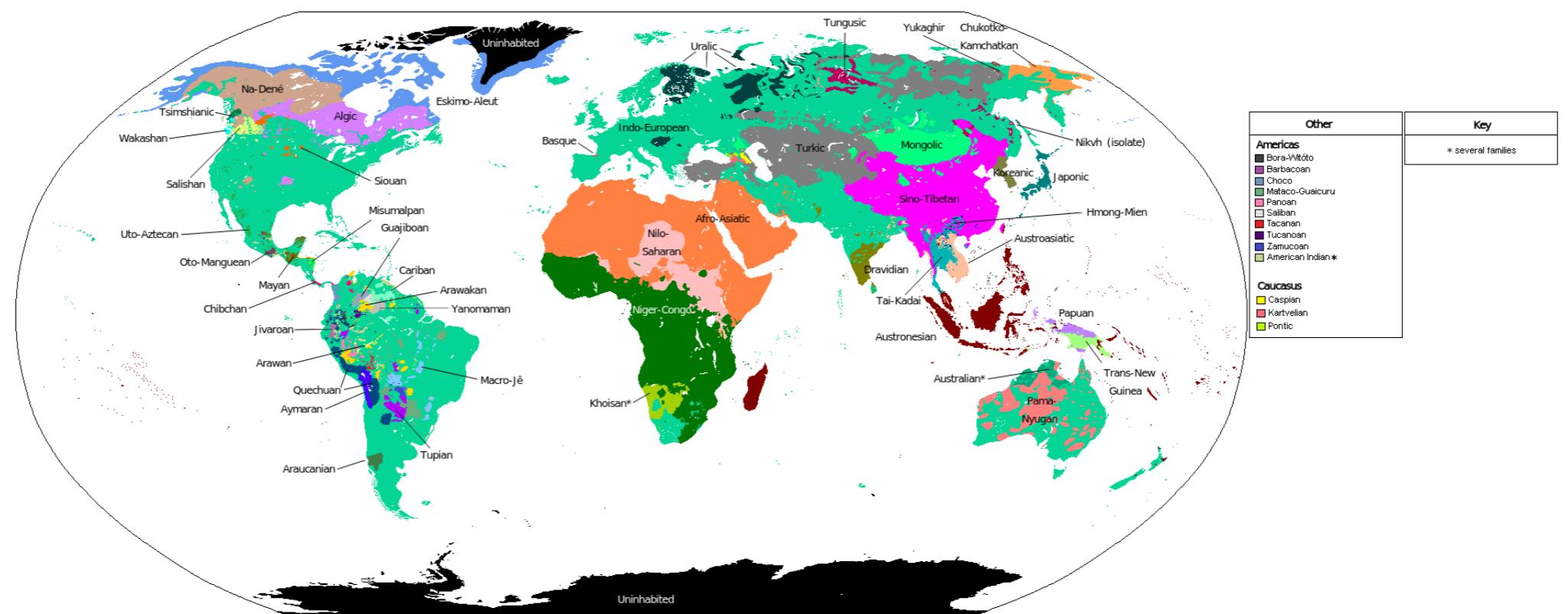
SSP5: “Fossil-Fueled Development”



Global Hotspots: Indonesia, Western Amazon, East Africa, Tibet & Arctic

Outline: Desiderata / Questions

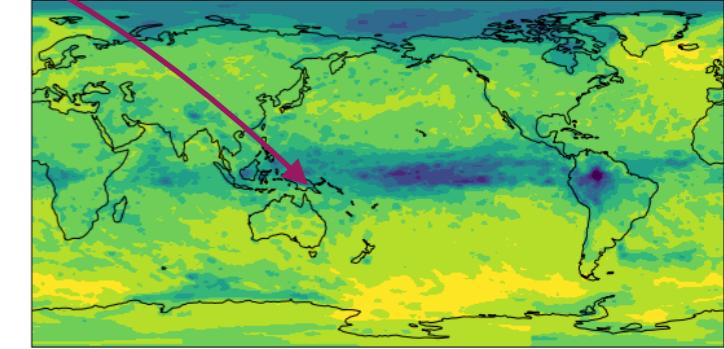
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Language Dataset

- Language Dataset: Ethnologue 2019

ISO_639	Language_Name	Region_Name	L1_Users	Digits	Countries	Family	Latitude	Longitude	EGIDS	Status	
0	aaa	Ghotuo	Western Africa	9000.0	4.0	1	Niger-Congo	7	5	6a	Vigorous
1	aab	Alumu-Tesu	Western Africa	7000.0	4.0	1	Niger-Congo	9	8	6a	Vigorous
2	aac	Ari	Melanesia	50.0	2.0	1	Trans-New Guinea	-8	141	6b	In_Trouble
3	aad	Amal	Melanesia	830.0	3.0	1	Sepik	-5	141	6a	Vigorous
4	aae	Albanian, Arbëreshë	Southern Europe	100000.0	6.0	1	Indo-European	38	16	6b	In_Trouble
5	aaf	Aranadan	Southern Asia	200.0	3.0	1	Dravidian	11	75	6b	In_Trouble
6	aag	Ambrak	Melanesia	290.0	3.0	1	Torricelli	-4	142	6a	Vigorous
7	aai	Miniafia Oyan	Melanesia	3470.0	4.0	1	Austronesian	-10	148	5	Developing
8	aak	Ankave	Melanesia	1600.0	4.0	1	Trans-New Guinea	-8	145	5	Developing
9	aal	Afade	Middle Africa	5000.0	4.0	2	Afro-Asiatic	12	14	6a	Vigorous



Desiderata 1: Will climate change have an outsized impact on linguistic diversity?

Geographic Distribution

Analysis 1: Correlation between climate risk and linguistic diversity

Analysis 3: Total exposure to risk across 4 pathways.

Analysis 2: Counterfactual linguistic distribution vs. actual linguistic distribution

Correlation Between Linguistic Diversity & Climate Risk

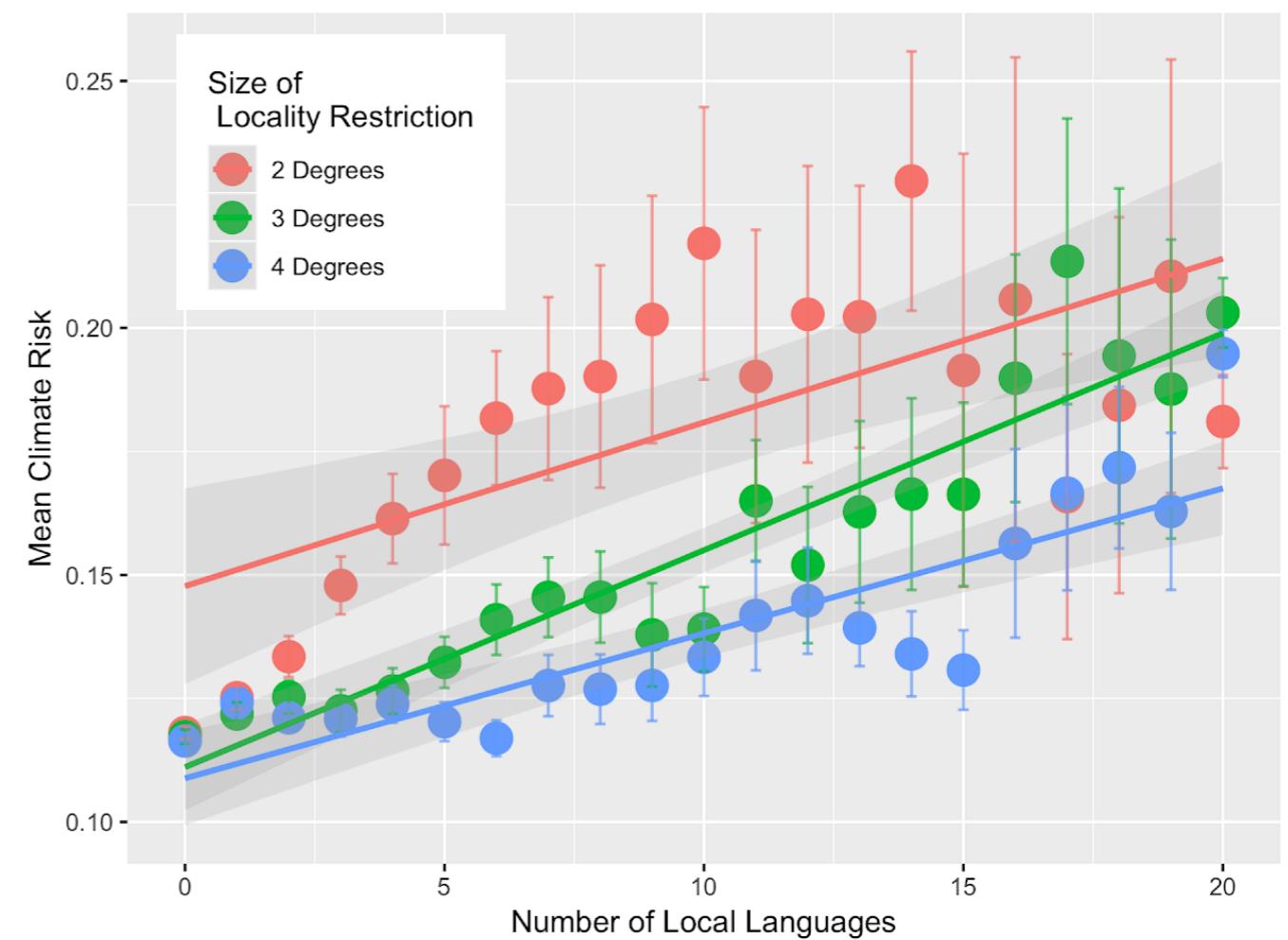
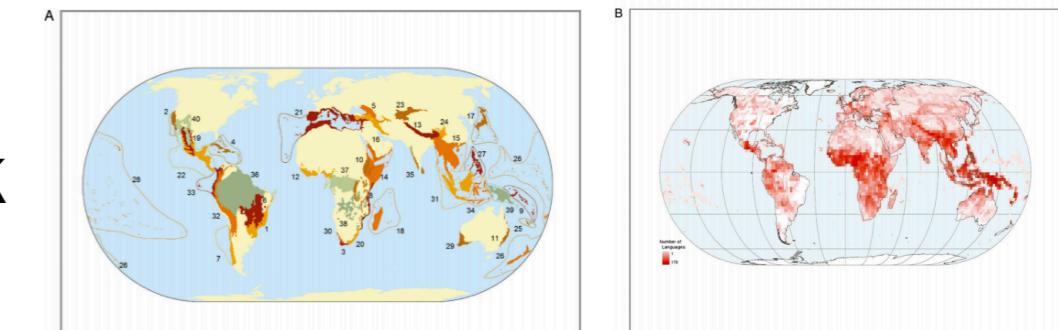
- **Motivating Intuition:** Correlation between biological diversity, climate change and linguistic diversity.

- **Linguistic Diversity vs. Climate Risk**

1. Sample 10,000 Land Points
2. Count # of Langs within n degrees lat & long
3. Plot against mean climate risk at point across *all pathways*.
4. For 3 parameters of n

Results:

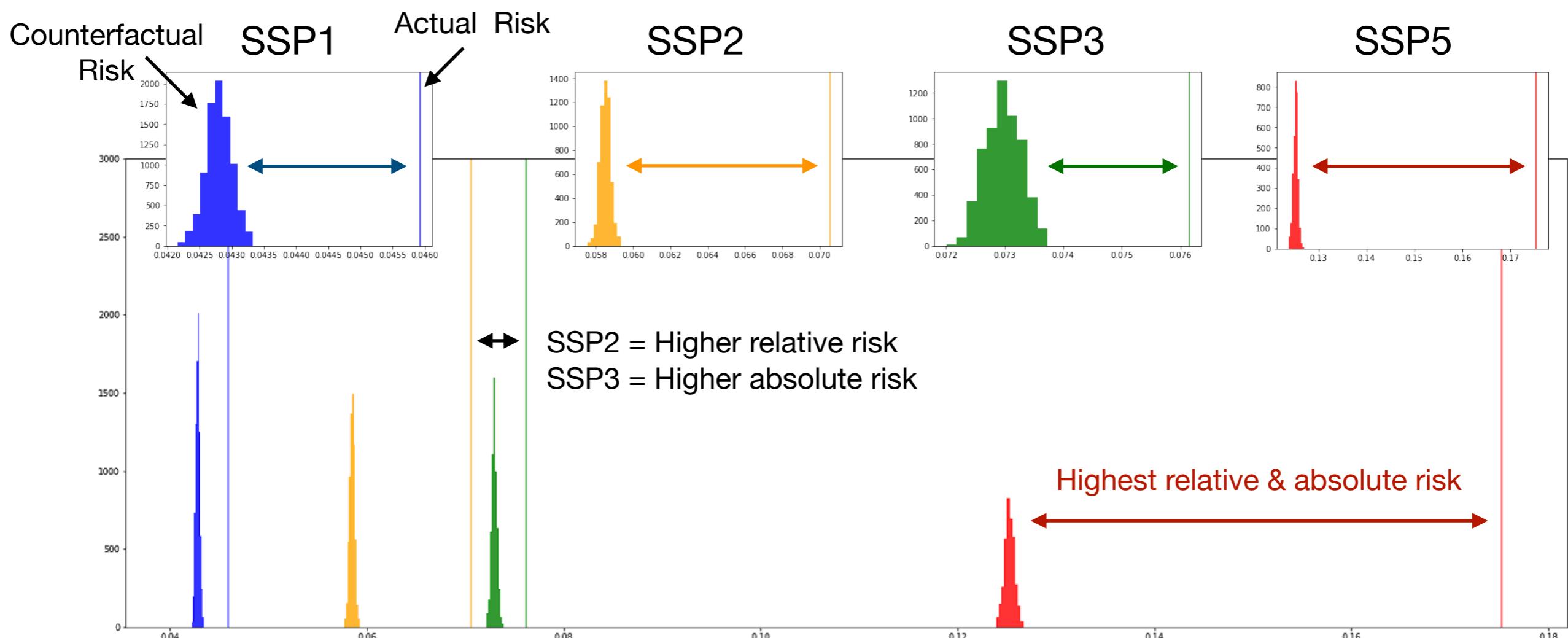
- Positive correlation ($p<0.001$) for all tested values of n
- Smaller locality restriction = higher average climate risk, indicating more risk in super diverse regions.



Language Distribution & Climate Risk

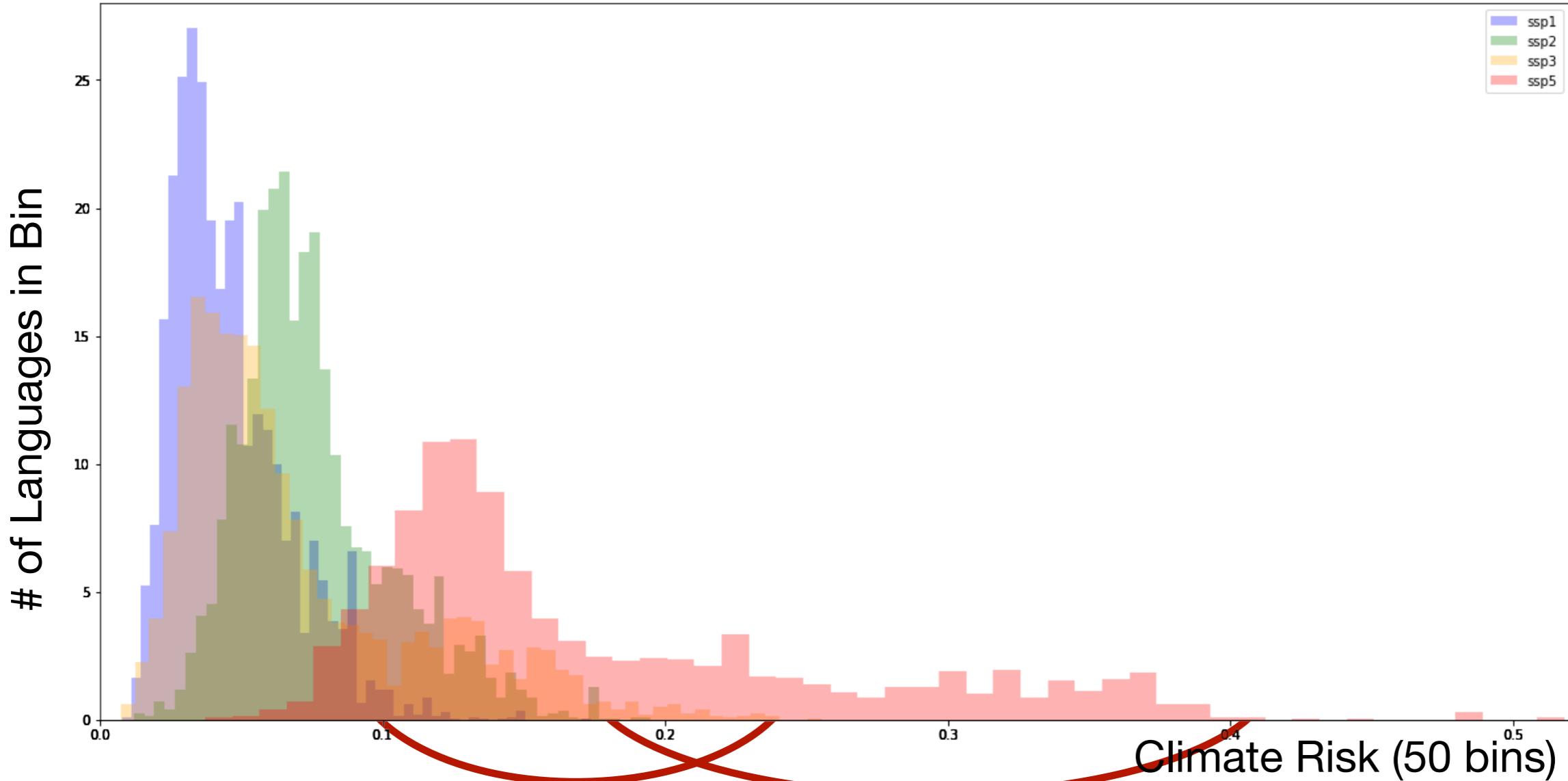
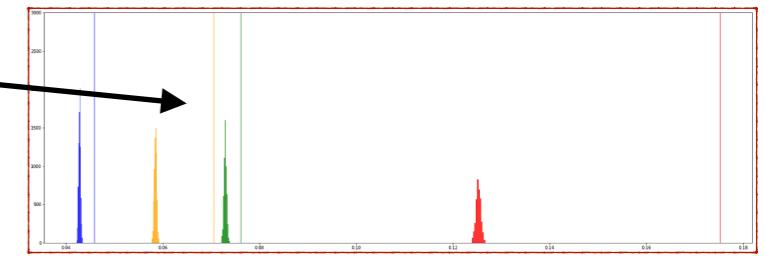
- Does the geographic distribution of languages expose them to outsize risk?
- Method:
 - Sample ~6,400 land points at random
 - Calculate mean climate risk across all 6,400 points
 - Do this 500 times to get histogram of risk across all languages (pyramid)
 - Compare to risk across actual languages (line)

Counterfactual language distributions



Risk Distribution Across Pathways

- Shows mean risk of language points
- What is the spread of risk across pathways?

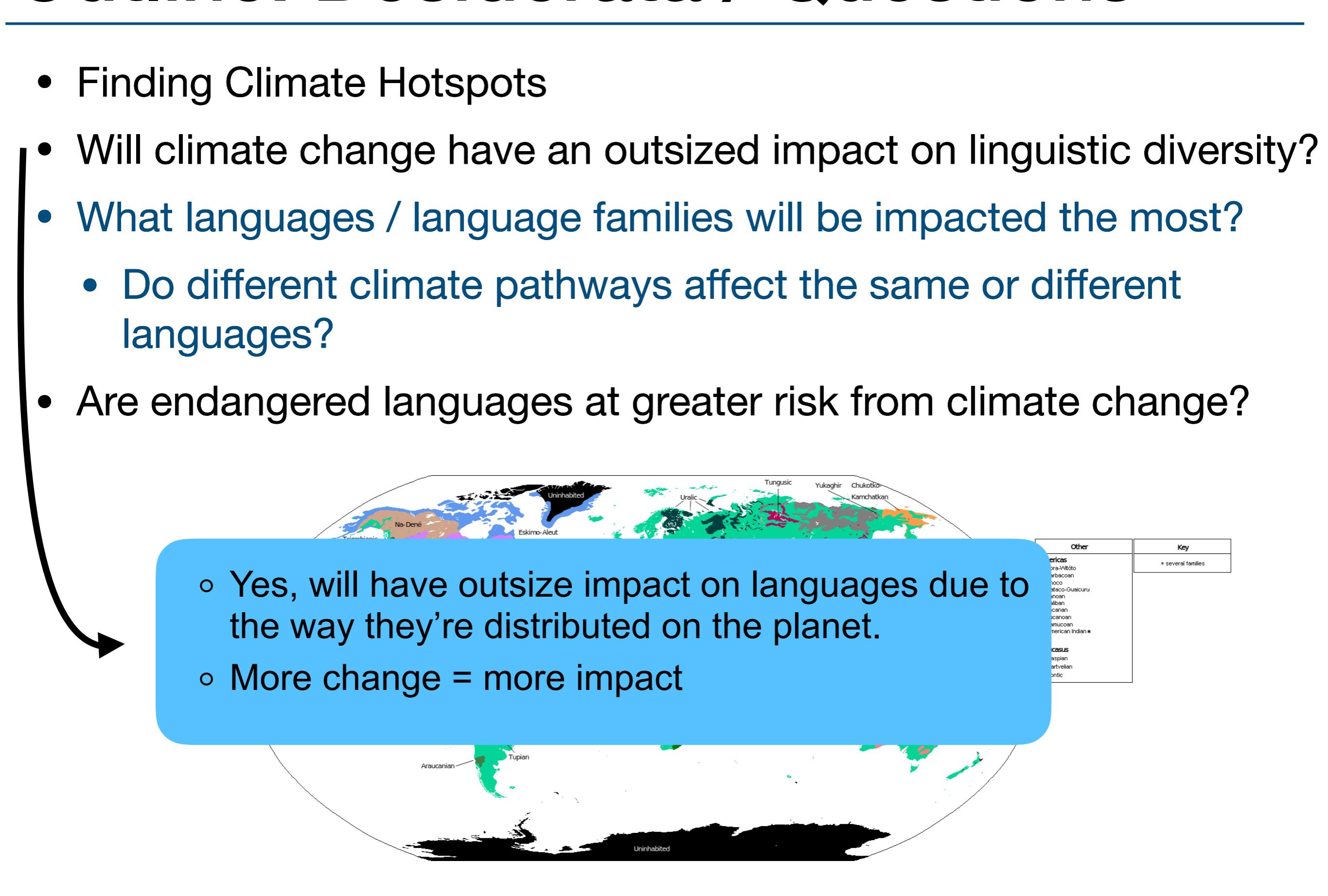


More change = more risk

The long tail of risk grows as pathways become more serious

Outline: Desiderata / Questions

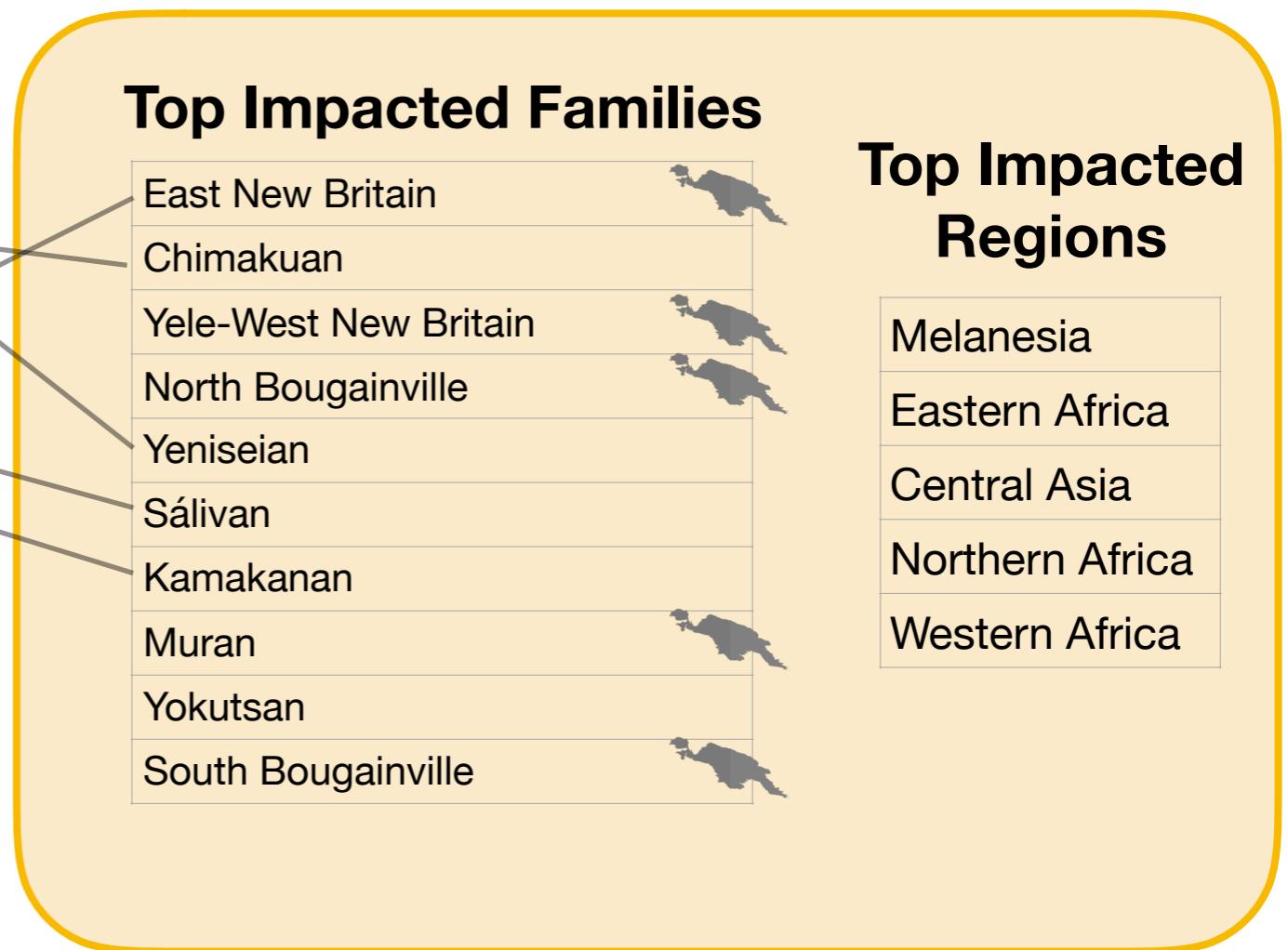
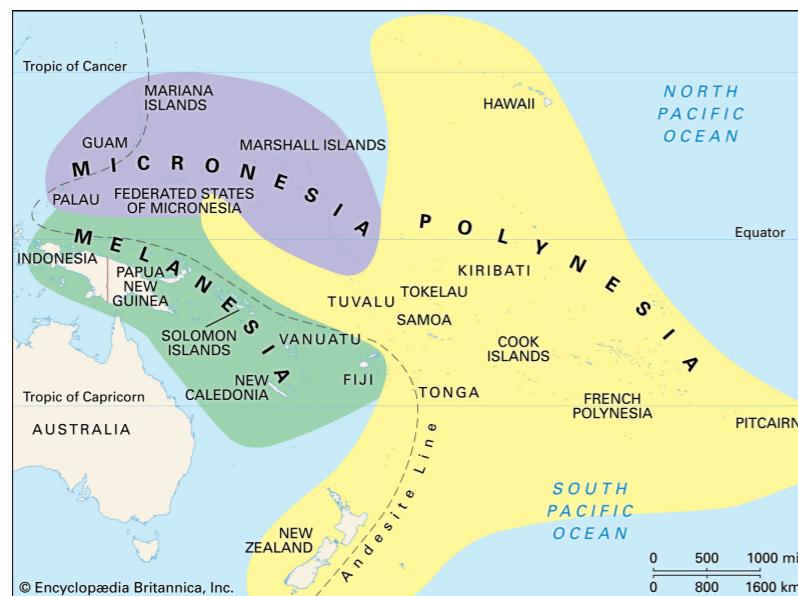
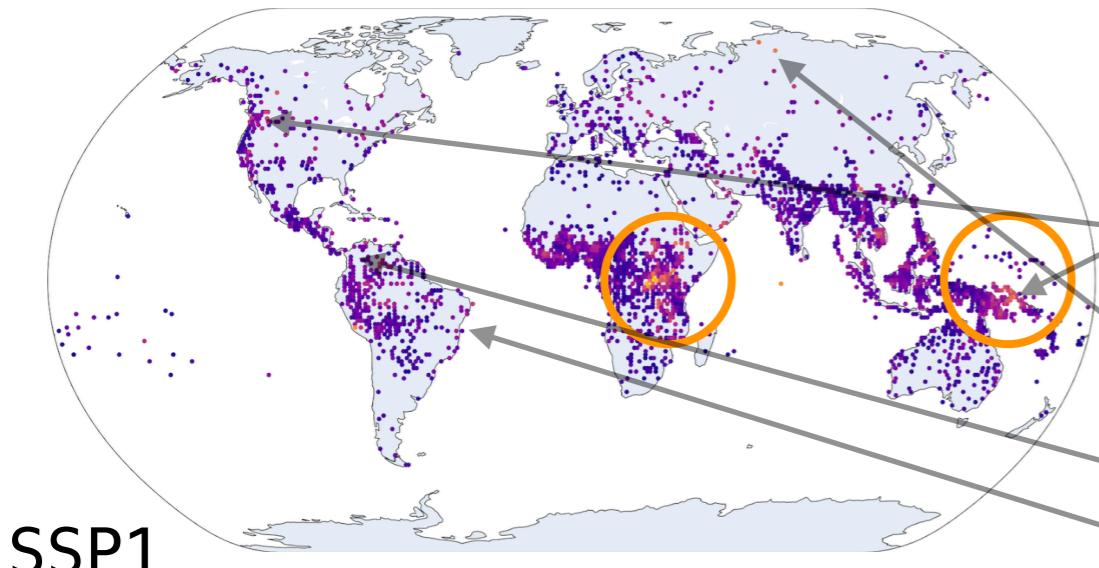
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- 
- Yes, will have outsize impact on languages due to the way they're distributed on the planet.
 - More change = more impact

Other	Key
ericas	* several families
casus	

By-Language Impact in SSP1

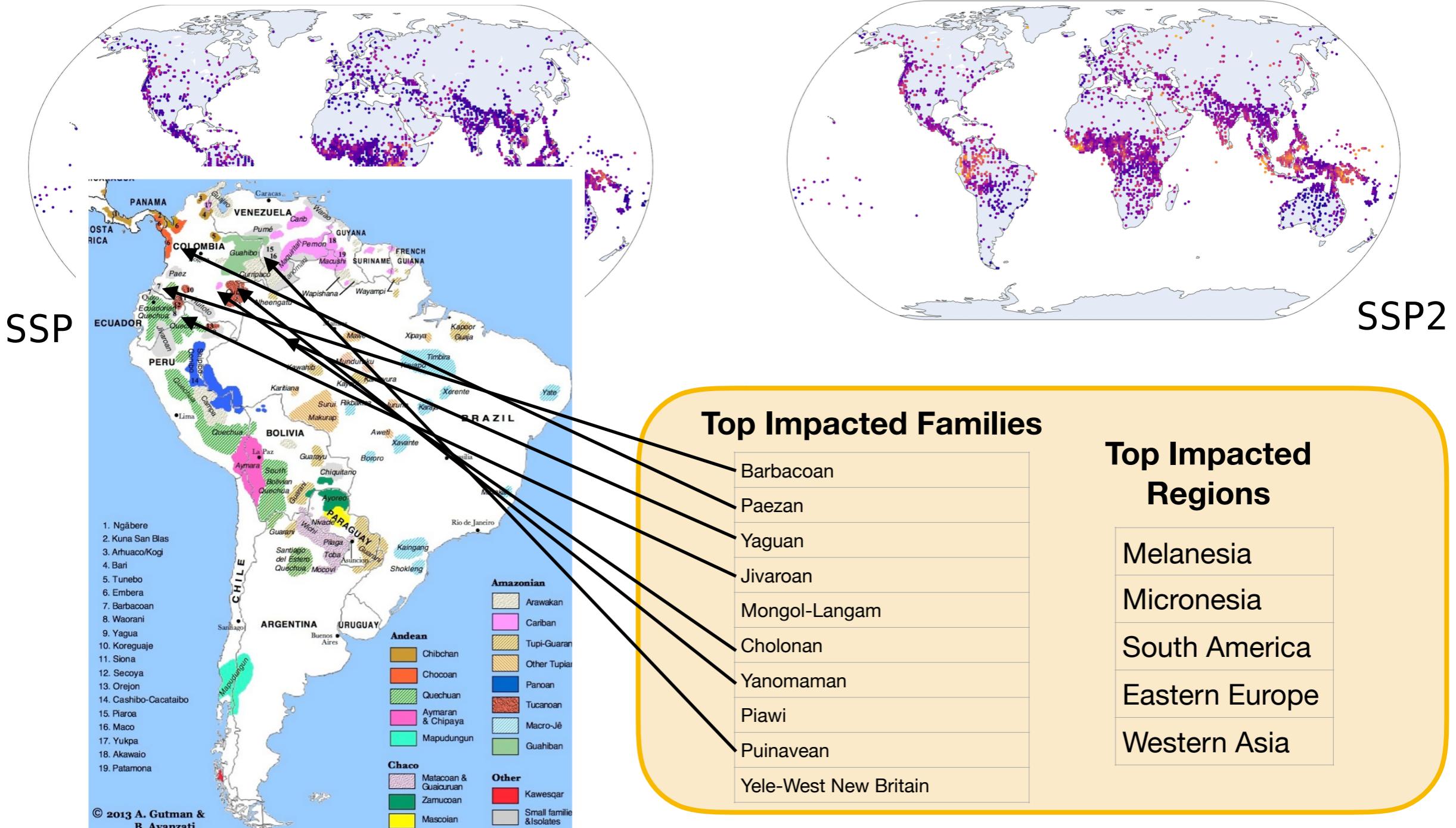
- Plot each language w/ its climate risk (colors not normed across SSPs)
- Language family & region information from Ethnologue



- Top impacts in Melanesia and central / Eastern Africa
- Impacted language families come from a diverse set of locations
- Most impacted families come from New Guinea
()

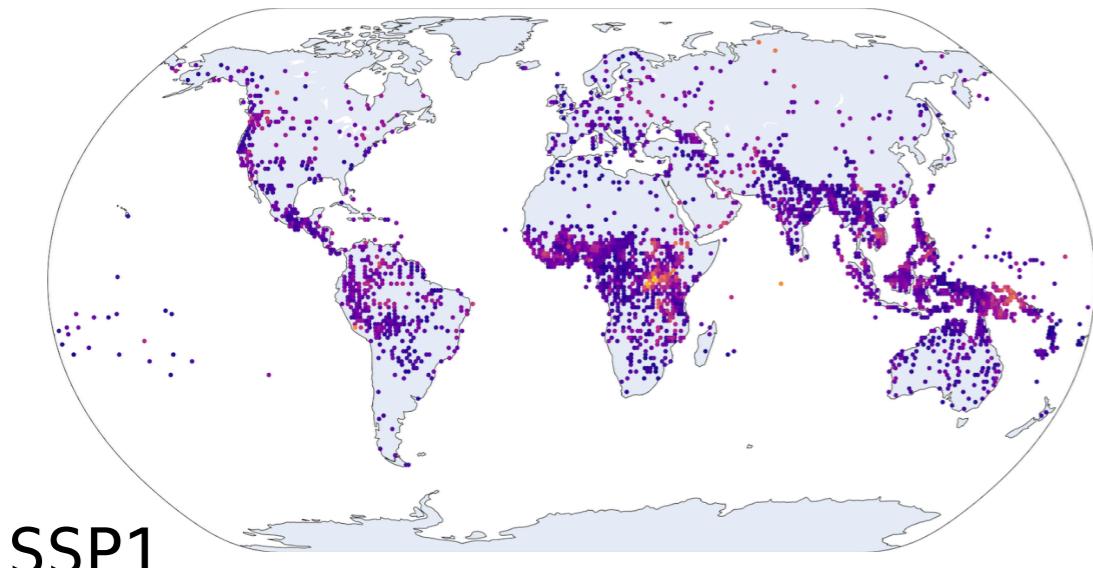
By-Language Impact in SSP2

- Risk is spread out more evenly across the globe
- More impact in Western Africa, South America and South-East Asia / Micronesia

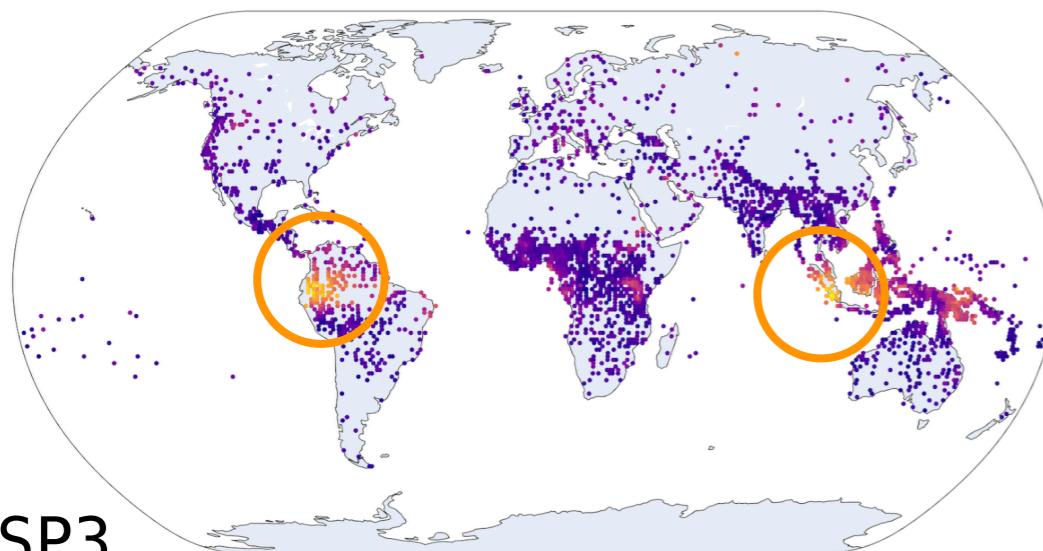


By-Language Impact in SSP3

- Risk is concentrated in SE Asia / Melanesia + South America
- Greater impacts in Sumatra, Java and Borneo than previous pathways



SSP1



SSP3

Top Impacted Regions

Melanesia
South America
South-Eastern Asia
Caribbean
Southern Europe

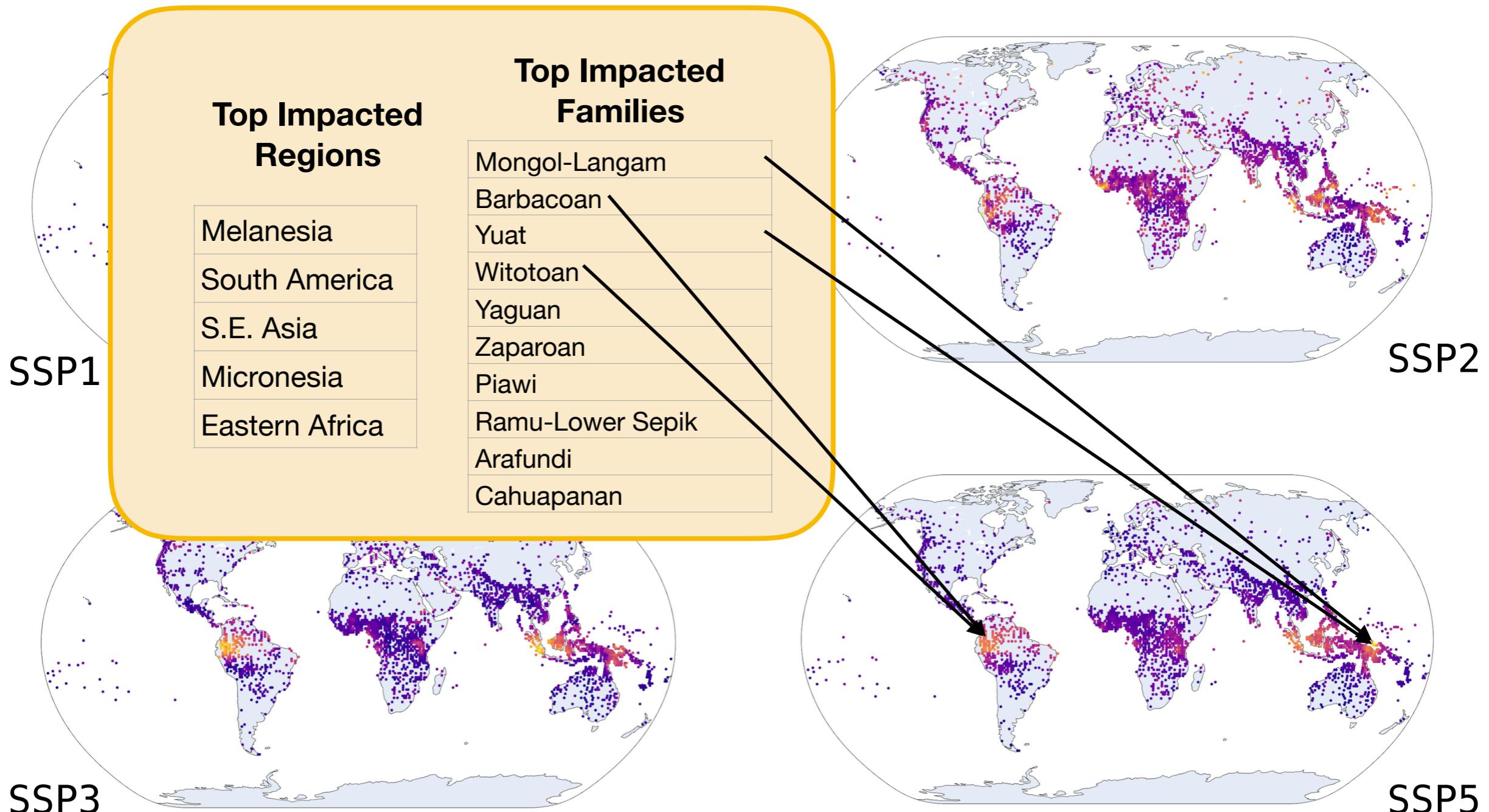
Top Impacted Families

Zaparoan
Barbacoan
Witotoan
Jivaroan
Yaguan
Tucanoan
Katuvinan
Cahuapanan
Paezan
Puinavean

All of these are in
Columbia, Venezuela,
Ecuador and Peru

By-Language Impact in SSP5

- Similar impacts to SSP3, with less impact in Sumatra, Java and Borneo
- Impacted Families: Either on New Guinea or in Northern Amazonia

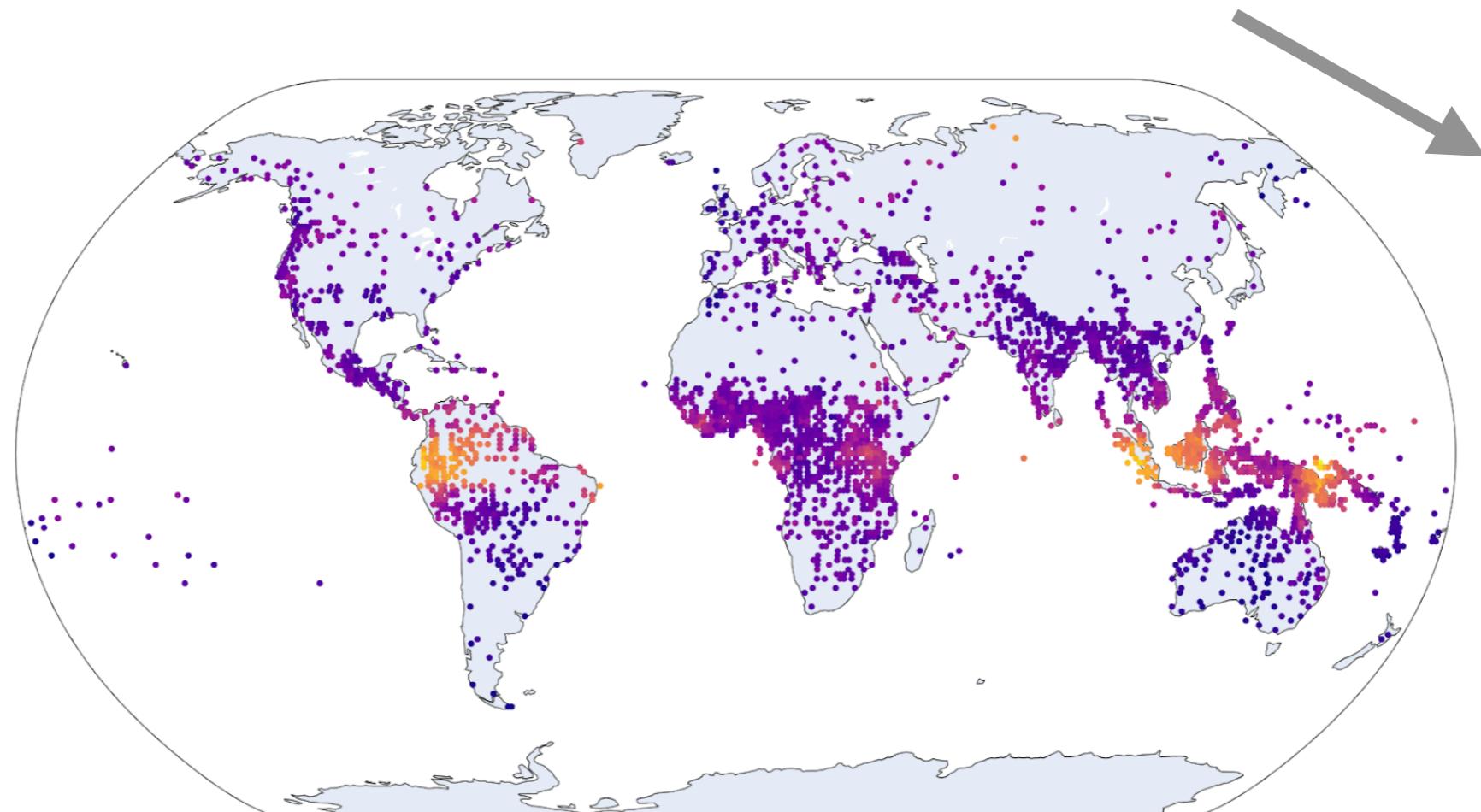


By-Language Impact across all SSPs

- Risk averaged across all pathways
- Top Impacted Families are either in South American or Melanesia

Top Impacted Regions

Melanesia
South America
S.E. Asia
Micronesia
Eastern Africa
Caribbean
Western Africa
Northern Africa



Top Impacted Families

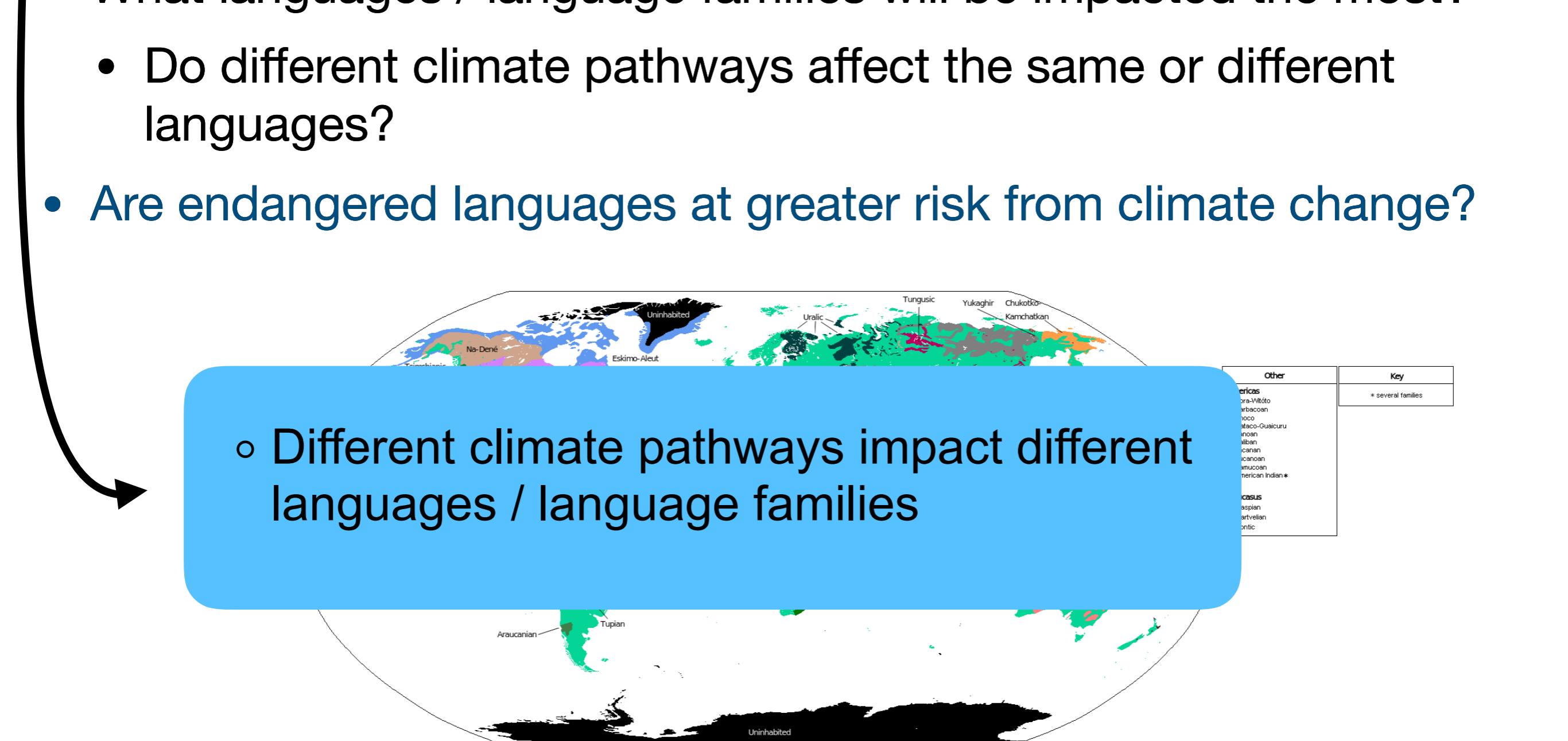
Barbacoan
Witotoan
Jivaroan
Yaguan
Zaparoan
Tucanoan
Mongol-Langam
Paezan
Cahuapanan
Puinavean
Piawi
Katukinan
Ramu-Lower Sepik
Yuat
Arafundi
Sálivan
Yanomaman
Trans-New Guinea
Torricelli
Sepik

Key Takeaways:

- Western South America & Melanesia remain high risk **throughout all pathways**
- Risk to other regions: Africa, S.E. Asia & Central Asia **varies with pathway**

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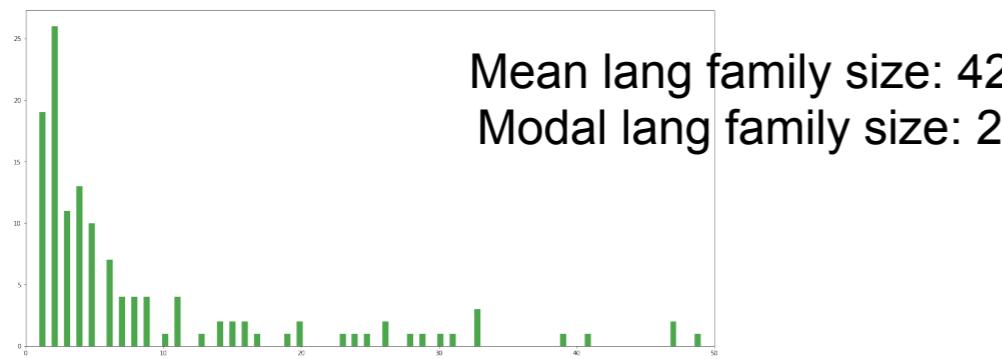
- 
- Different climate pathways impact different languages / language families

Other	Key
erica	* several families
bra-Vitõto	
irbacoan	
hoco	
steco-Guaicuru	
inean	
sibean	
canaan	
icanoan	
amucuan	
american Indian*	
casus	
aspian	
artvelian	
ontic	

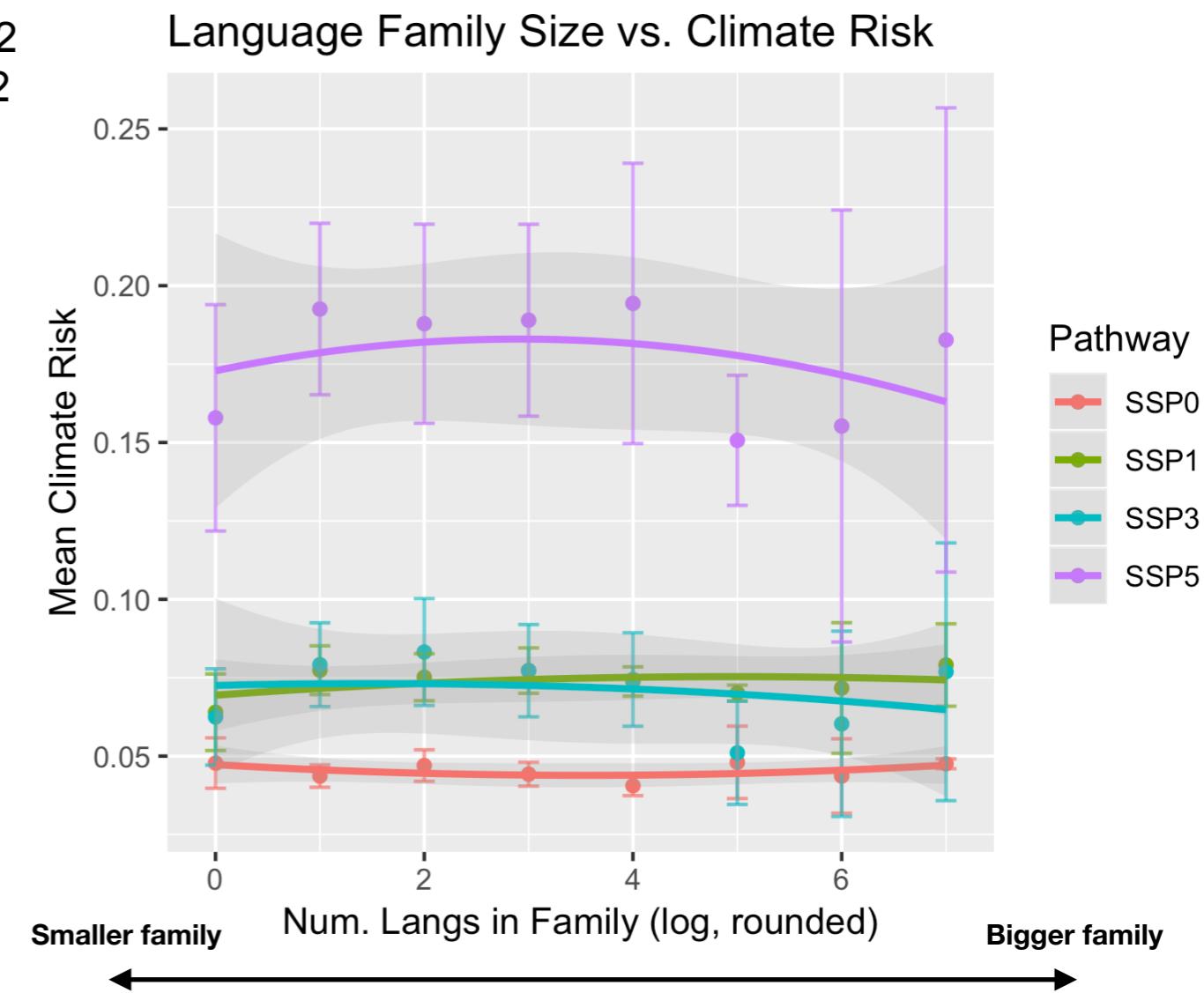
Climate Risk to Language Family by Size

- Each language family represents a unique vantage point into the human language faculty.
- Families with fewer languages are at a higher risk of going extinct
- Does climate change differentially impact smaller language families?

Histogram of language family size



- Group by number of languages in family (log, rounded); take mean climate risk for each group
- Top-level language families in Ethnologue — 148 families
- **No correlation** between number of languages in family and mean climate risk ($p>0.05$)



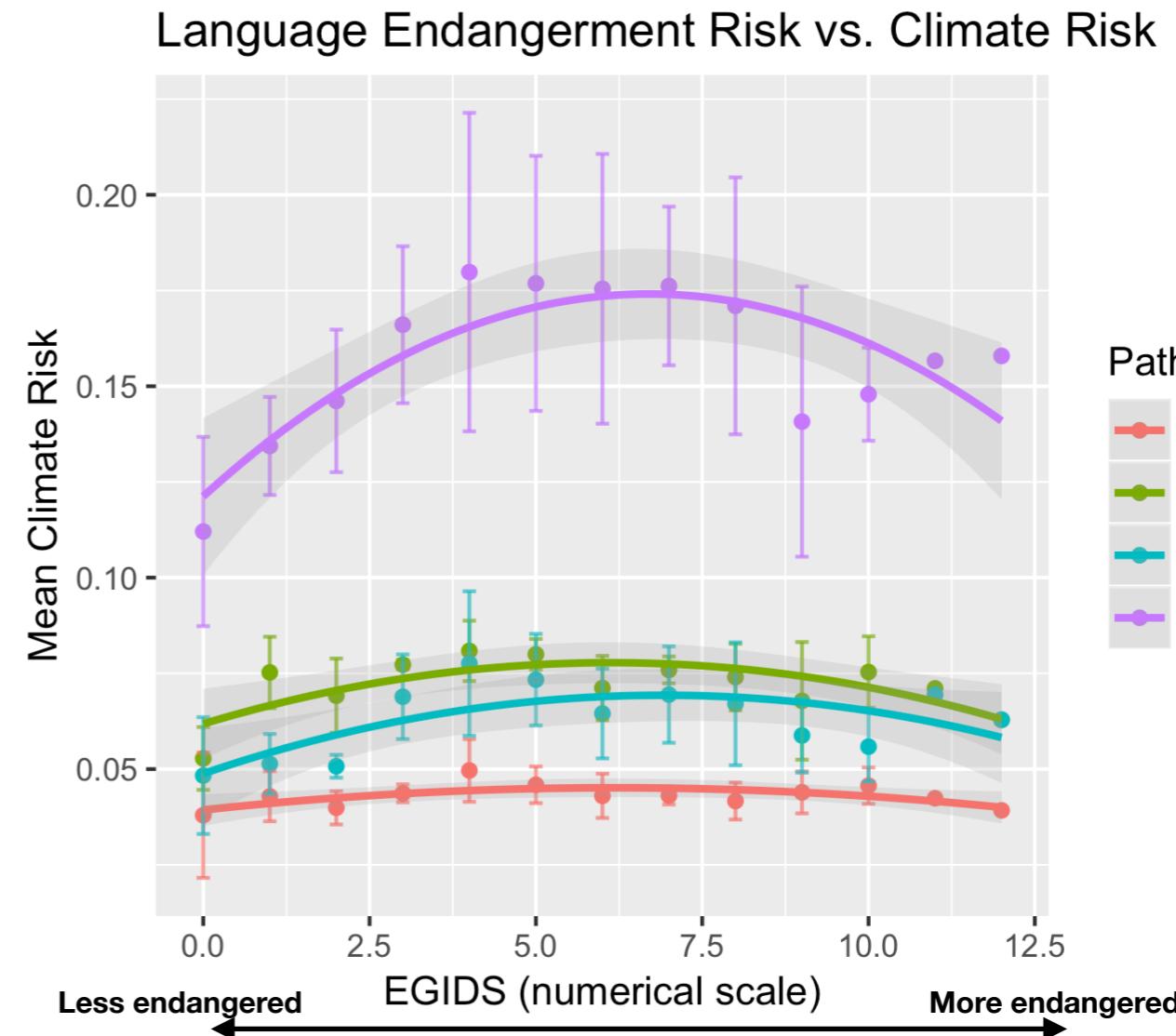
Climate Impact on Endangered Languages

- Does climate risk differentially impact endangered languages?
- Use numeric version of EGIDS endangerment scale from Ethnologue



Level	Label	Description
0	International	The language is widely used between nations in trade, knowledge exchange, and international policy.
1	National	The language is used in education, work, mass media, and government at the national level.
2	Provincial	The language is used in education, work, mass media, and government within major administrative subdivisions of a nation.
3	Wider Communication	The language is used in work and mass media without official status to transcend language differences across a region.
4	Educational	The language is in vigorous use, with standardization and literature being sustained through a widespread system of institutionally supported education.
5	Developing	The language is in vigorous use, with literature in a standardized form being used by some though this is not yet widespread or sustainable.
6a	Vigorous	The language is used for face-to-face communication by all generations and the situation is sustainable.
6b	Threatened	The language is used for face-to-face communication within all generations, but it is losing users.
7	Shifting	The child-bearing generation can use the language among themselves, but it is not being transmitted to children.
8a	Moribund	The only remaining active users of the language are members of the grandparent generation and older.
8b	Nearly Extinct	The only remaining users of the language are members of the grandparent generation or older who have little opportunity to use the language.
9	Dormant	The language serves as a reminder of heritage identity for an ethnic community, but no one has more than symbolic proficiency.
10	Extinct	The language is no longer used and no one retains a sense of ethnic identity associated with the language.

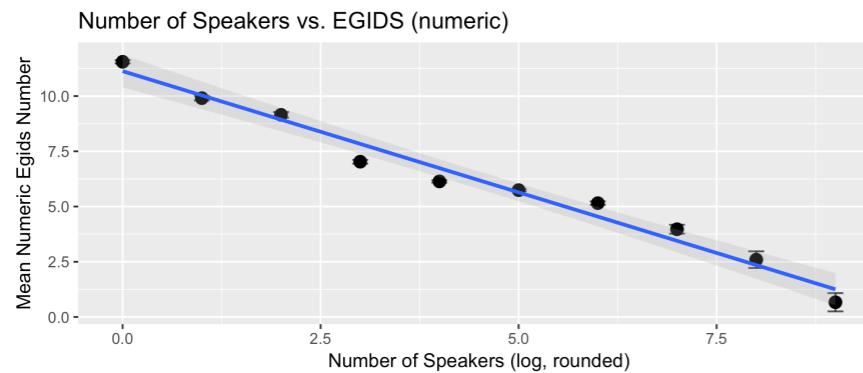
From ethnologue.com



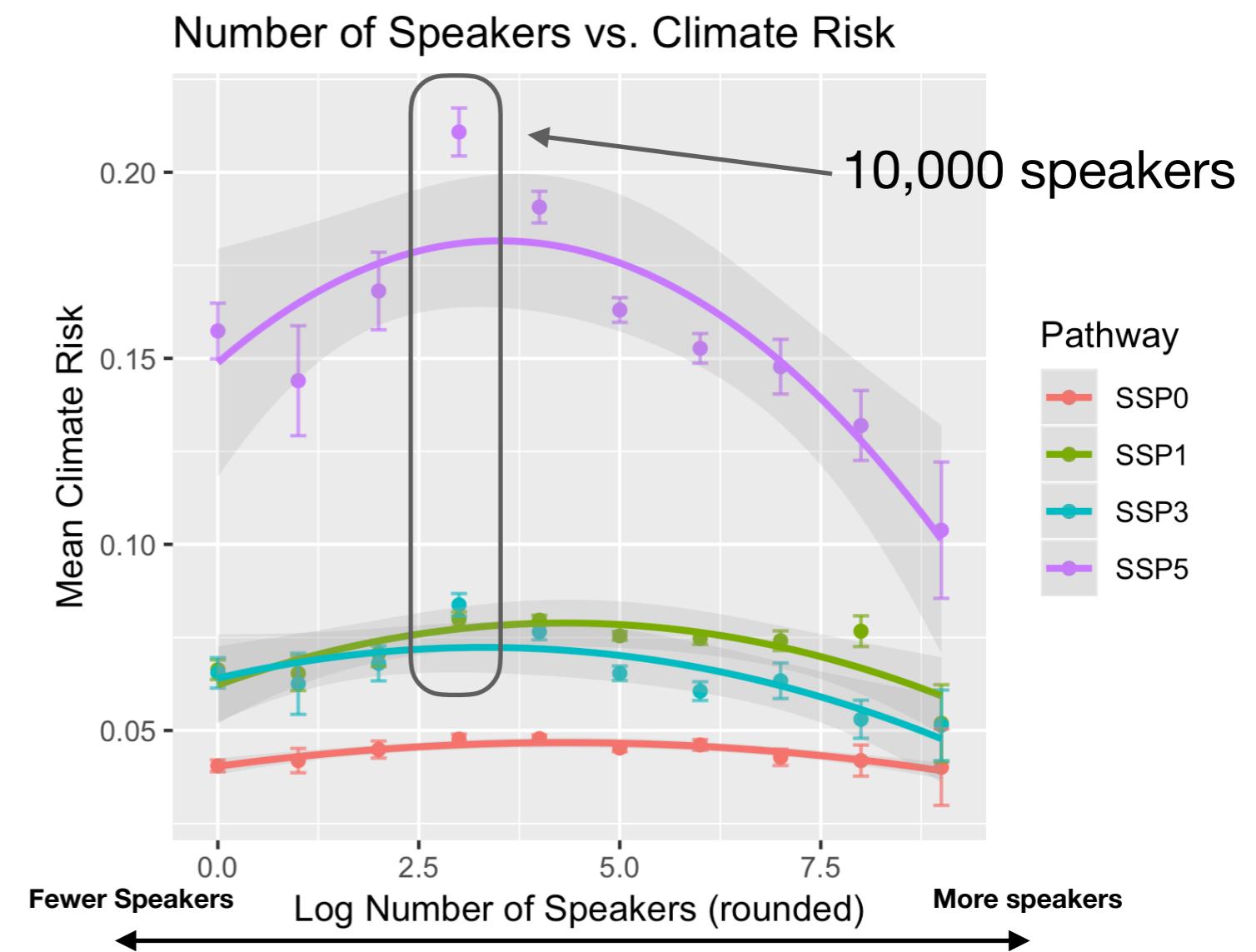
- Vigorous, threatened and shifting languages are at greatest risk
- Good on one hand, but also may target critical point on endangerment pathway

Climate impact on languages by Speaker Count

- EGIDS may be an imperfect way to measure endangerment
- Use # of Speakers as a different metric (the two are correlated)

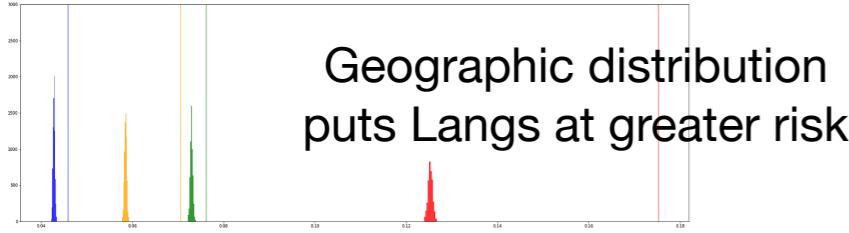


- Group by log normalized number of speakers and find mean climate risk per group
- Risk highest for languages with between 1,000 - 100,000 speakers
- Again, hard to interpret. May represent critical inflection point on endangerment pathway.

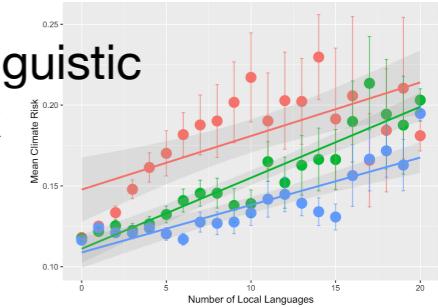


Conclusion

- Will climate change have an outsized impact on linguistic diversity?

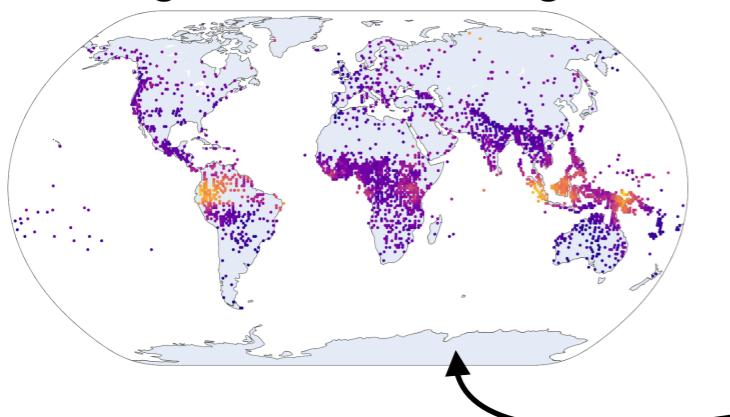


Correlation between regional linguistic Diversity and climate risk



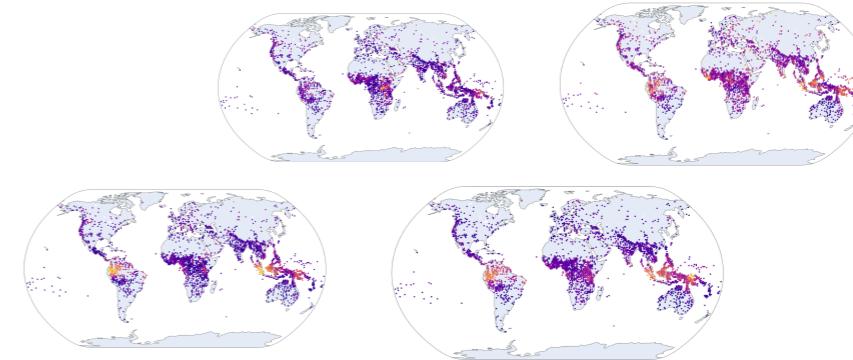
- What languages / language families will be impacted the most?

Some regions at risk throughout all pathways

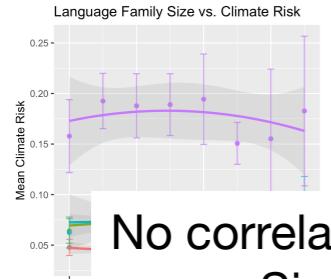


Melanesia
South America
S.E. Asia
Micronesia
Eastern Africa
Caribbean
Western Africa
Northern Africa

For some regions, risk varies with pathway

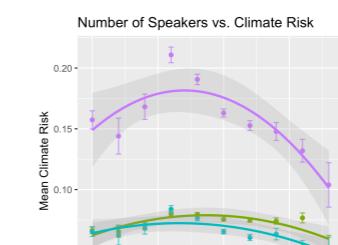
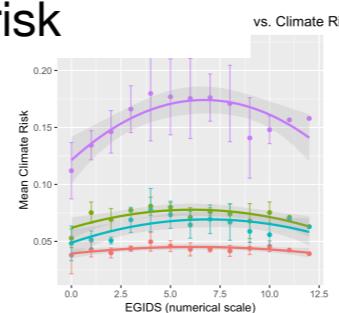


- Are threatened languages at greater risk from climate change?



Languages at **medium risk** (EGIDS) are
At the most climate risk

No correlation between lang family
Size and climate risk

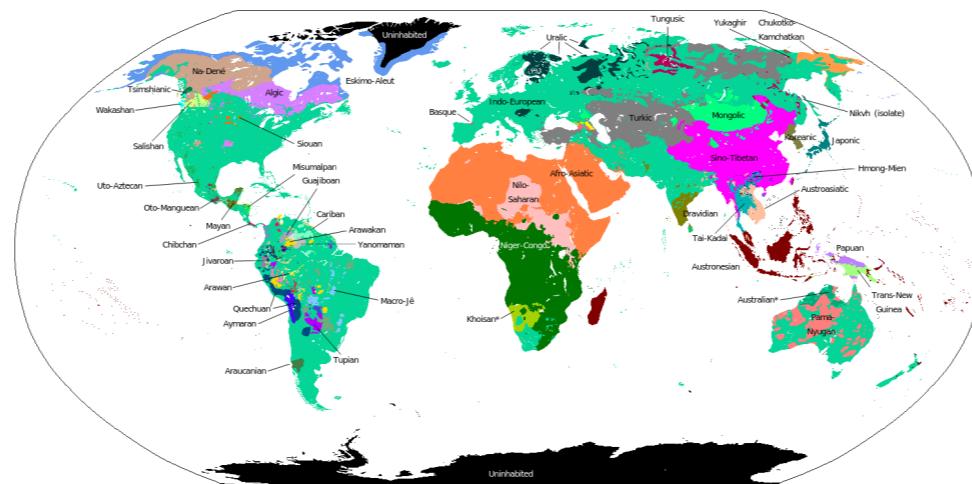


Languages with **medium # of speakers**
Are at the most climate risk

Future Directions and Discussion

Limitations of Current Study

- Doesn't take into account **sea level rise**
- Doesn't take into account **population dynamics**
- Is a **relative model**, not an absolute model
 - Doesn't make predictions about what will happen to the languages.
 - Need good historical data for this -- it's hard to come by!



Thanks for listening!

Discussion

- How to connect the linguistics & climate modeling community!
 - Applied for funding for a workshop in February
- What goals should linguists & climate scientists work towards?