Assessing the future of sagebrush ecosystems to inform climate adaptation



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Assess future ecological drought in drylands

Inform long-term planning under climate change

Reduce uncertainty in adaptation strategies

Assessing the future of sagebrush ecosystems to inform climate adaptation



Future ecological drought in sagebrush ecosystems (Daniel)

- Soil moisture modeling approach
- Changes in soil moisture patterns
- Future shifts in ecological resistance & resilience

Implications for sagebrush plant communities (Martin)

- Plant community modeling approach
- Changes in plant functional types
- Implications for sagebrush habitat

Coping with uncertainty to support adaptation investments (John)

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Coping with uncertainty to support a capitation investments (out)

Simulation modeling approach — SOILWAT2

- Complex interactions between weather, vegetation, and soils in drylands
- Tight links between moisture availability and ecosystems, e.g., wildfire, biomass production, grazing
- Ecological drought through lens of soil moisture

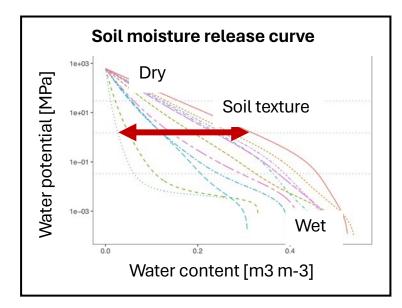


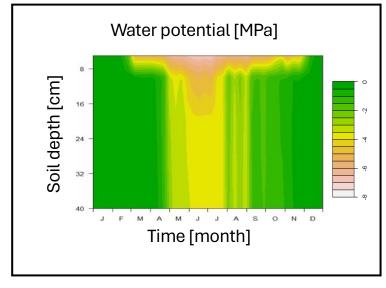




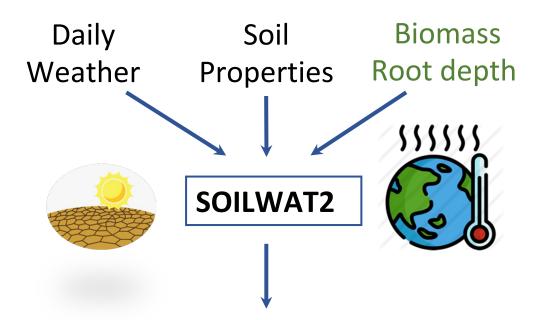
Simulation modeling approach — SOILWAT2

- Elevation and precipitation can be useful but do often not sufficiently capture full range of ecological drought
- Model criteria for soil moisture simulations
 - 1. Frequent temporal resolution: flash drought; moisture storage
 - 2. Site-specific soil conditions: moisture vs. tension; plant available moisture
 - 3. High resolution across soil profile: seasonal & spatial dynamics
 - 4. Vegetation structure and physiology, roots
 - 5. Responses to climate change: CO2-fertilization; shifts in structure and physiology of vegetation



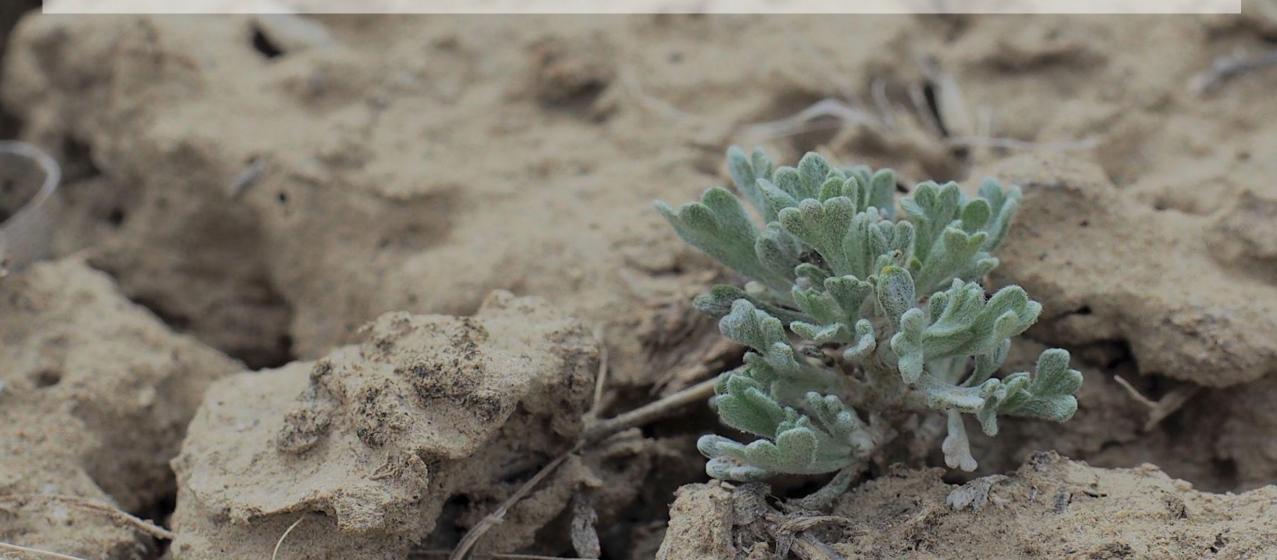


Simulation modeling approach — SOILWAT2

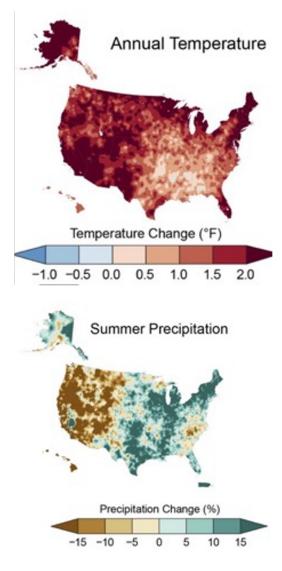


Daily water balance & plant available water

Sagebrush ecohydrological niche & future drought

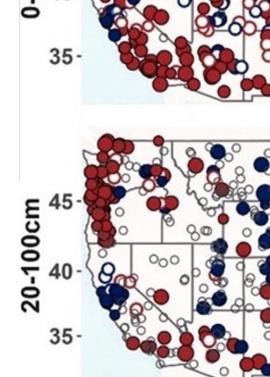


Historical trends in ecological drought



- Annual Temperature Climate trends (last 20 years vs. early 20th century; NCA5)
 - Trends of soil moisture over 1976-2019
 - Increases in soil moisture in NC
 - Widespread decrease in soil moisture (matches overall trends in T & PPT)
 - Stronger decreases in shallow soil moisture (matches shift of PPT towards cool season)



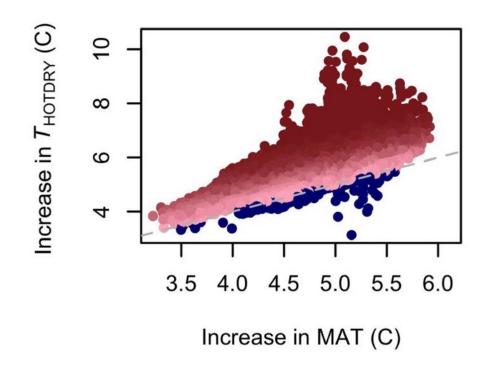


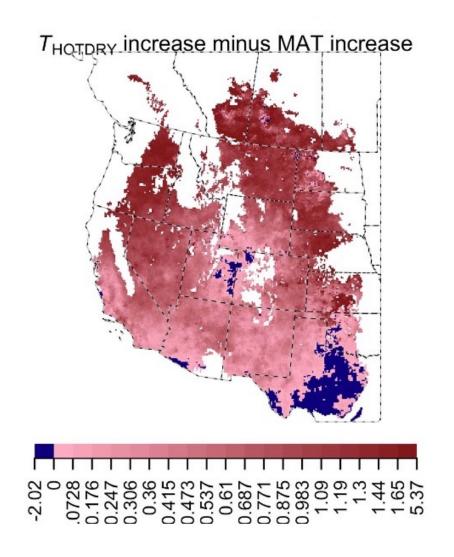
- decrease
- significant decrease
- increase
- significant increase

Future changes in ecological drought

Rising temperature → Greater demand

And larger increase of temperature when soils are dry (particularly in northern Great Plains) → Greater stress

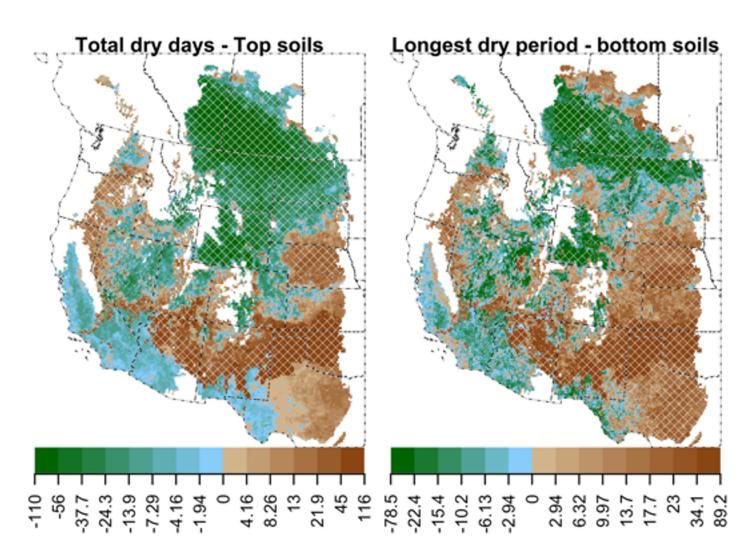




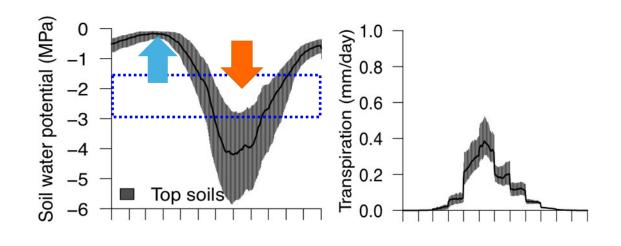
Future changes in ecological drought

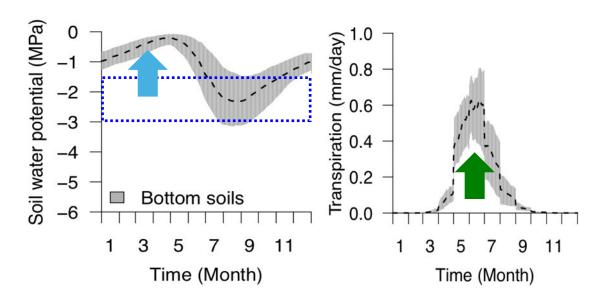
Robust signals in changes of dry soils

→ Some areas of increase, some areas of decrease (including NC)



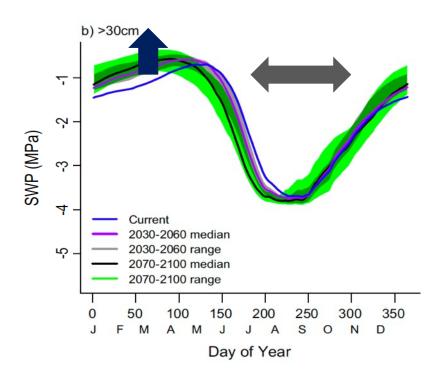
Sagebrush ecohydrological niche

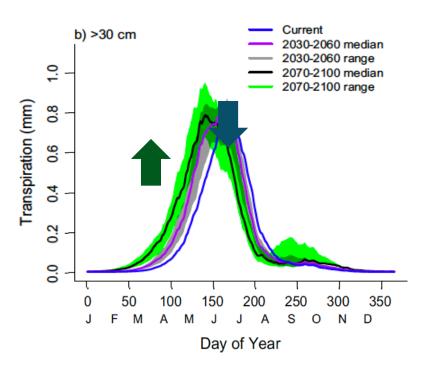




- Seasonal water dynamics defined by cool season recharge of soil water
- Summer dry period in shallow soil layers
- More transpiration from deep than shallow soil layers
- Sagebrush ecohydrological niche: utilization of deep, seasonally-stored water

Insights about future drought in sagebrush





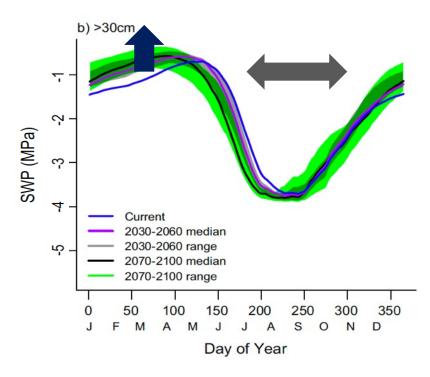
Wetter winters

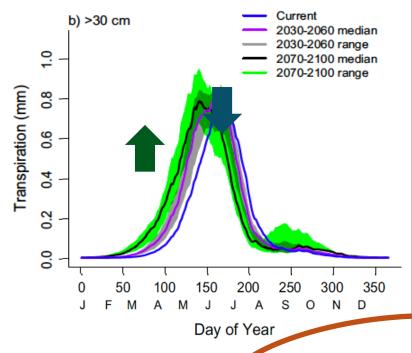
Longer (& hotter) summer dry soil periods

Earlier spring green-up

Earlier senescence

Insights about future drought in sagebrush



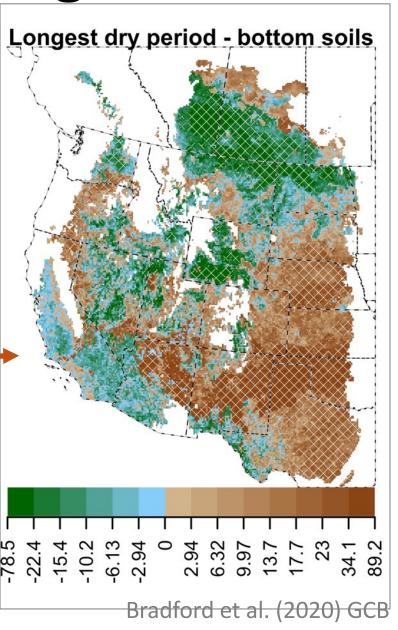


Earlier spring green-up

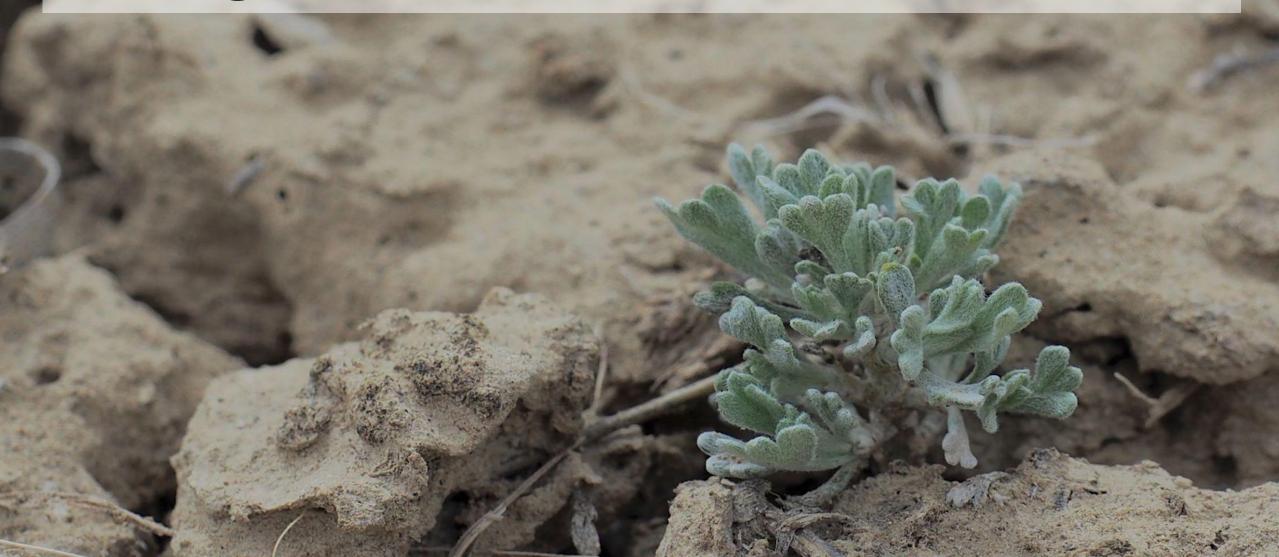
Earlier senescence



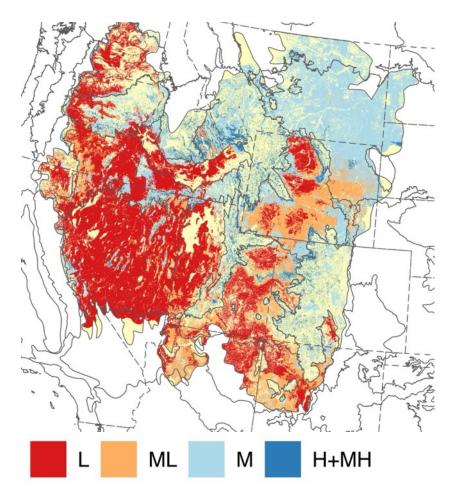
Longer (& hotter) summer dry soil periods



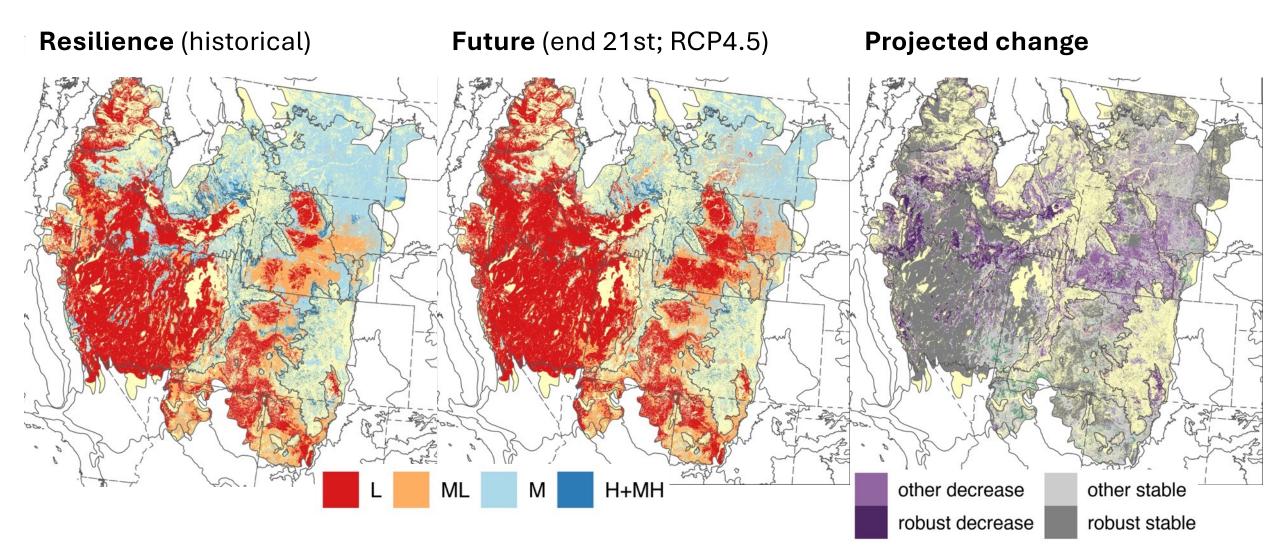
Ecological resilience & resistance to cheatgrass (R&R indicators)



Resilience (historical)

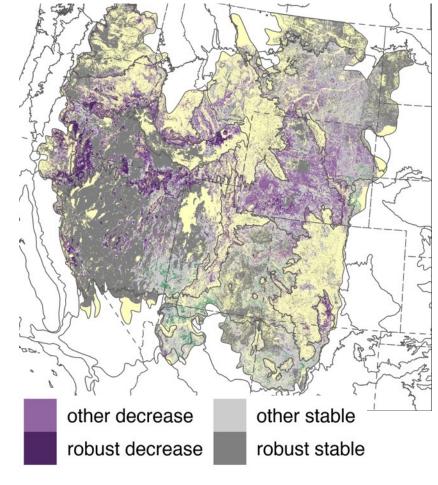


- R&R indicators (Chambers et al.)
 - Resistance to cheatgrass invasion
 - Resilience to recover from stress (e.g., drought, fire)
 - Categories: L, ML, M, H+MH
- Defined set of metrics
 - Ecological drought
 - Responsive to climate change
- Developed predictive models of ecological resistance and resilience indicators
- Future projections based on climate models

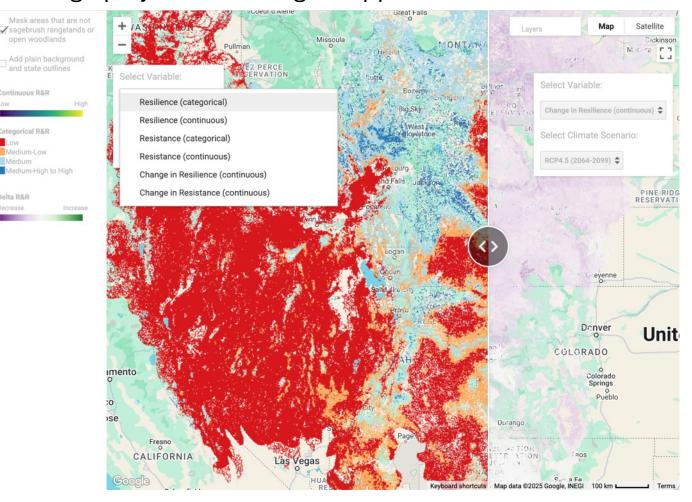


- Most of the area that is historically Low remains Low (gray)
- Other categories either decreased (purple) or remained the same (gray)
- The Moderate R&R category had the most widespread decreases (particularly WY & MT)
- → Climate change amplifies restoration challenge



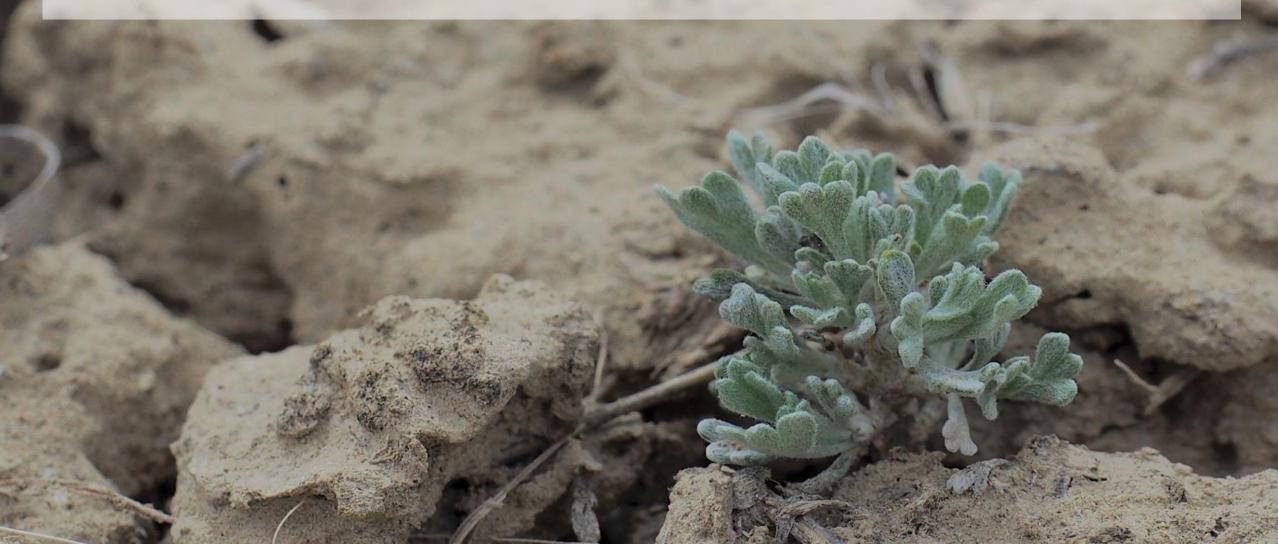


- Schlaepfer et al. 2024 ScienceBase (DOI: 10.5066/P928Y2GF)
- https://ee-martinholdrege.projects.earthengine.app/view/futurerr

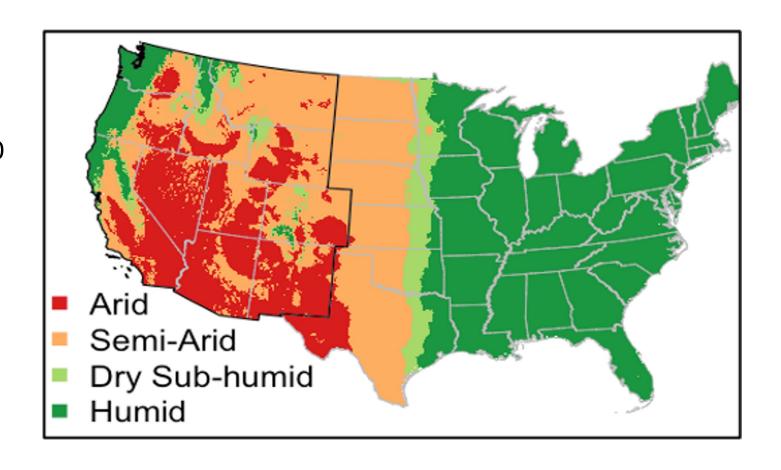




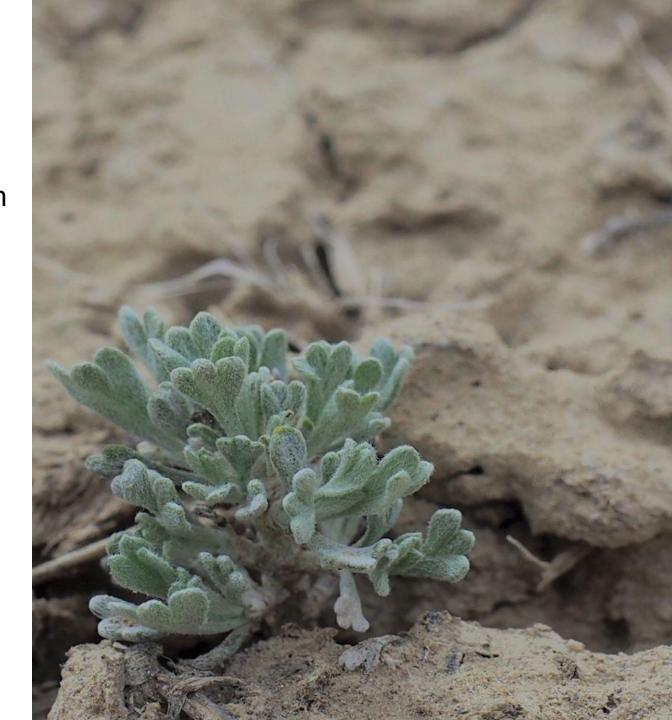
Next steps: Projection of long-term soil moisture and ecological drought



- Extent and time
 - CONUS (4/10-km gridMET/MACA grid)
 - Historical and future 1980-2100
- Dataset
 - Daily soil moisture for multiple soil depths
 - Ecological drought metrics
- Data dissemination via Climate Toolbox
- Funded by USGS CASC



- Ecological metrics to inform long-term management decisions (e.g., Chenoweth et al. 2023)
 - Sensitive to climate change
 - Overall conditions
 - Seasonal variability
 - Seasonal timing
 - Drought characteristics
- What information related to future ecological drought would be useful for you?



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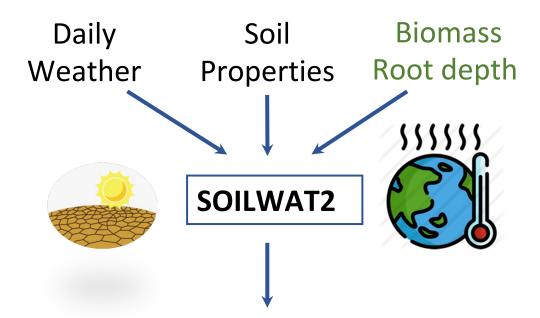
Implications for sagebrush plant communities (Martin)

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- Implications for sagebrush habitat

Coping with uncertainty to support adaptation investments (continue)

Modeling Framework

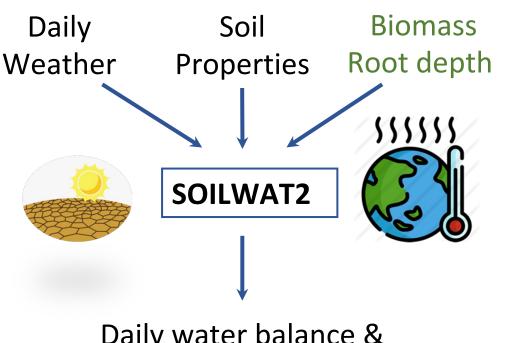
Soil Moisture



Daily water balance & plant available water

Modeling Framework

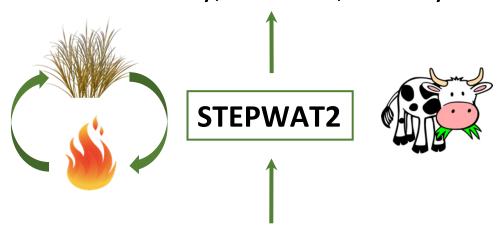
Soil Moisture



Daily water balance & plant available water

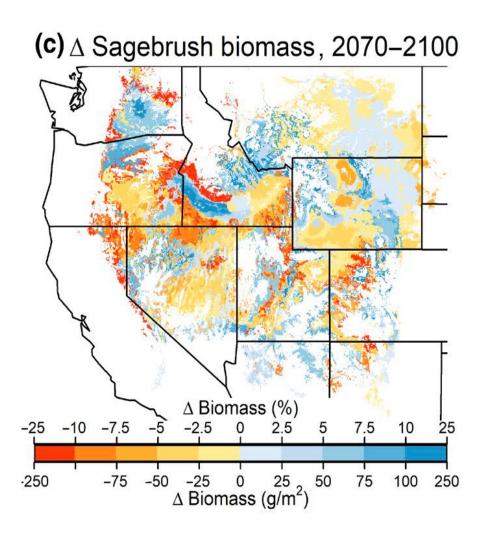
Plant community

Plant establishment, growth, mortality, biomass, density



Transpiration by plant functional group

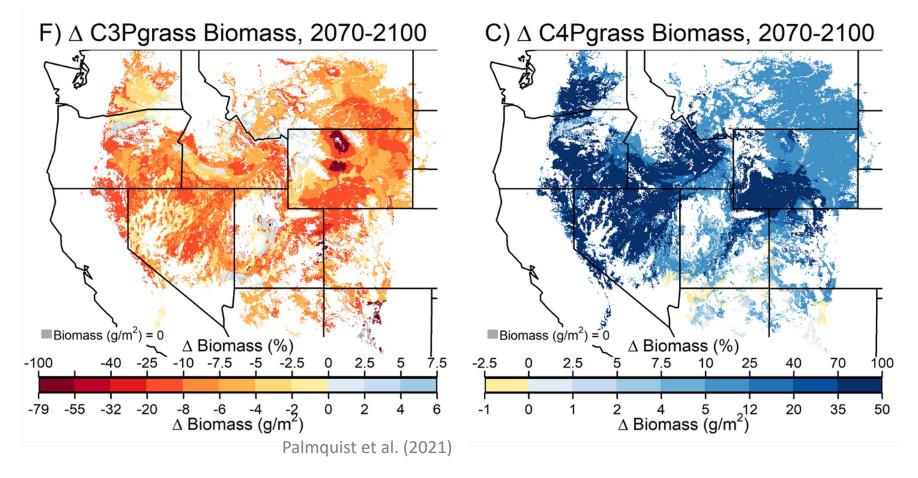
Climate change implications for **Sagebrush**



- Big sagebrush likely to remain climatically viable within much of the biome
- Potential declines in some areas

(Schlaepfer et al 2011, Still & Richardson 2015, Renwick et al. 2018)

Climate change implications for **Perennial Grasses**



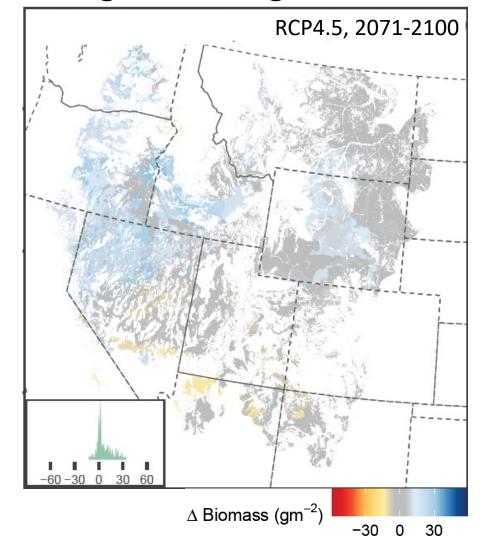
Future temperatures more consistent with warm-season (C4) perennial grasses than cool season (C3) perennials (Havrilla et al. 2023)

Cool season grasses may decline and warm season grasses might increase (Palmquist 2021)

Climate change implications for **Cheatgrass**

- Historical trend of cheatgrass invasion is very likely to continue
- Projected increases wildfire frequency (at least in many areas) likely to exacerbate cheatgrass invasion problems

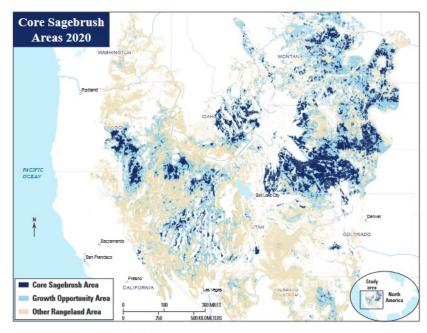
Change in Cheatgrass biomass





Prepared in cooperation with the Western Association of Fish and Wildlife Agencies and the U.S. Fish and Wildlife Service

A Sagebrush Conservation Design to Proactively Restore America's Sagebrush Biome



Open-File Report 2022-1081

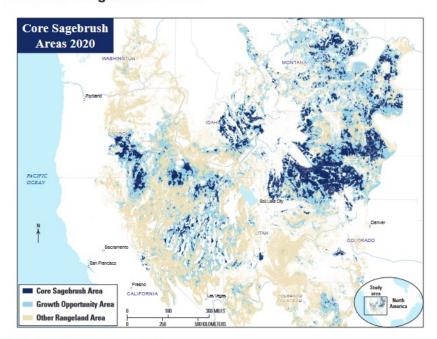
The Sagebrush Conservation Design helps identify intact sagebrush areas, and primary threats to the ecosystem

U.S. Department of the Interior U.S. Geological Survey



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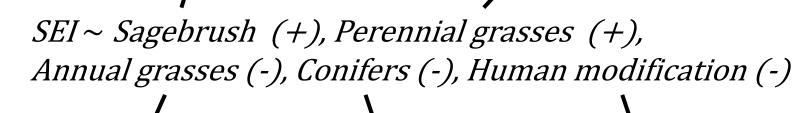
Open-File Report 2022-1081

Doherty et al. (2022)

U.S. Department of the Interior U.S. Geological Survey



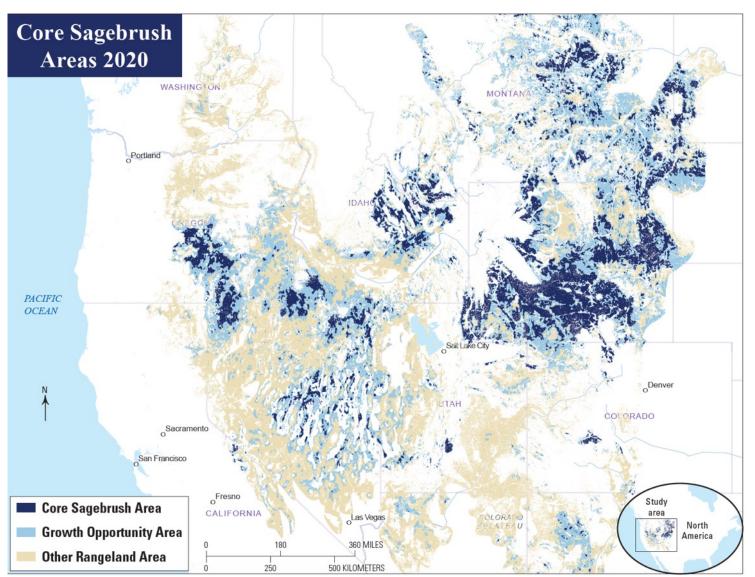












High SEI: Core Sagebrush Area (CSA)



Intermediate SEI: Growth Opportunity Area (GOA)



Low SEI: Other Rangeland Area (ORA)

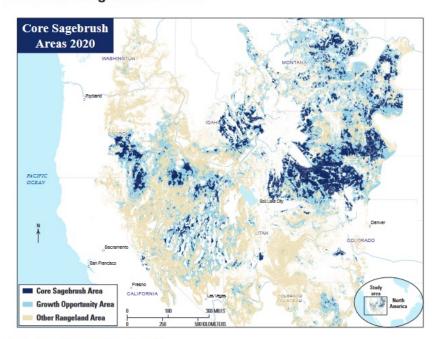


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 $(\Delta = \text{simulated change})$ in cover from STEPWAT2)





Future SEI ~ Sagebrush* Δ (+), Perennial grasses * Δ (+), Annual grasses * Δ (-), Conifers (-), Human modification (-)

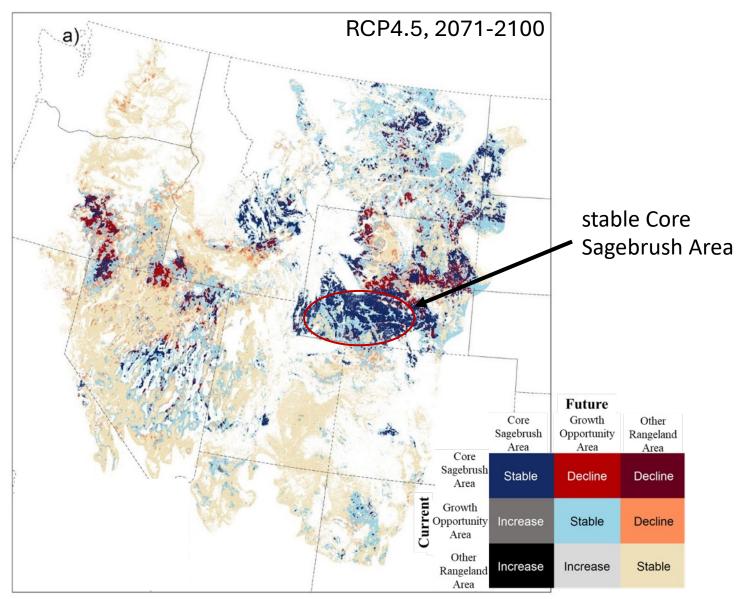






U.S. Department of the Interior U.S. Geological Survey

Projected changes in SEI class

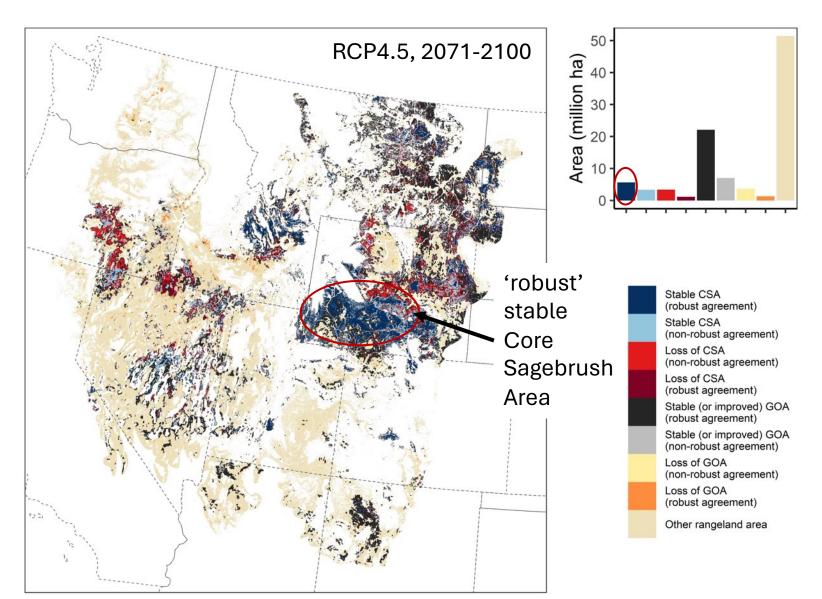


How will the abundance of sagebrush ecological integrity classes change in the future?



Holdrege et al. (2024)

Climate uncertainty in our projections



How consistent are these changes across climate scenarios?

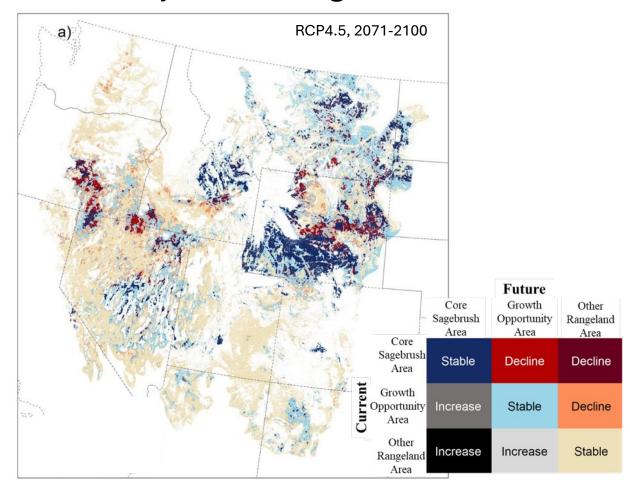


Holdrege et al. (2024)

Main findings: Climate impacts on sagebrush ecological integrity

- ~2/3 of Core Sagebrush Areas are projected to remain climatically suitable to stay Core (RCP4.5, 2071-2100)
- Loss of Core driven by projected decreases in sagebrush and/or increases in annuals
- Substantial variability among climate
 scenarios, time-periods, and global climate
 models, but general trends are similar

Projected Change

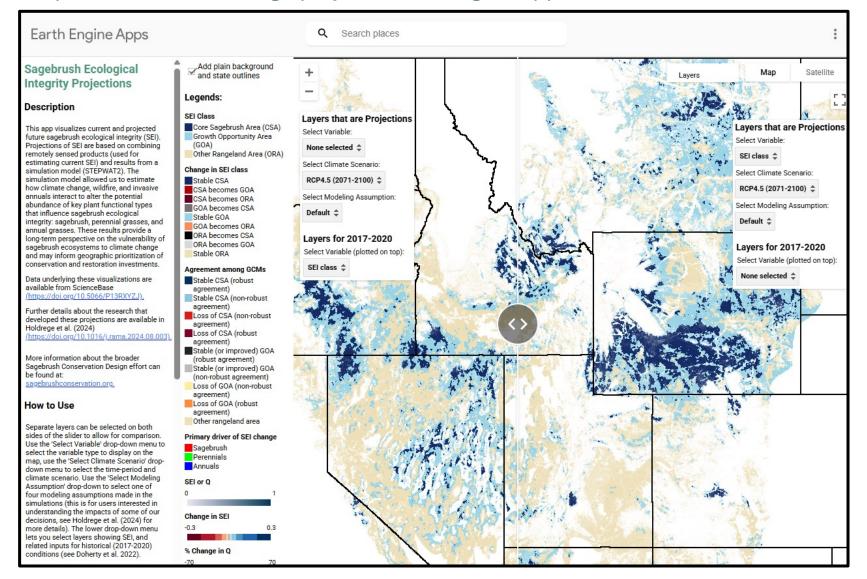


Publication: Holdrege et al. 2024, Rangeland Ecology & Management

(https://doi.org/10.1016/j.rama.2024.08.003)
Data Release: https://doi.org/10.5066/P13RXYZJ

Web-app for visualizing these results

https://ee-martinholdrege.projects.earthengine.app/view/futuresei



Compare:

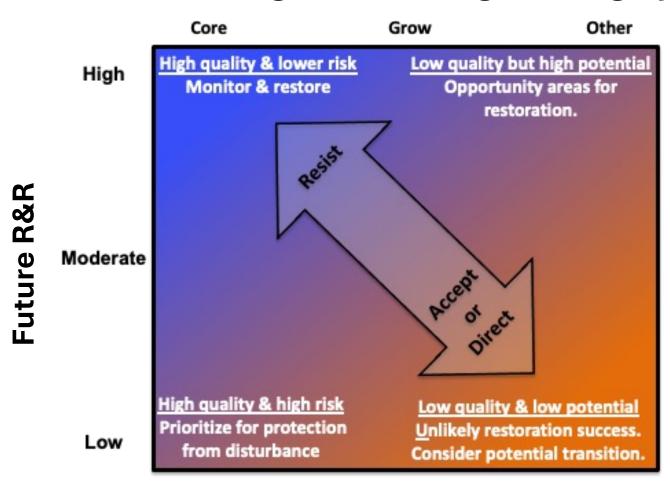
- Response variables
- Climate-scenarios
- Modeling assumptions



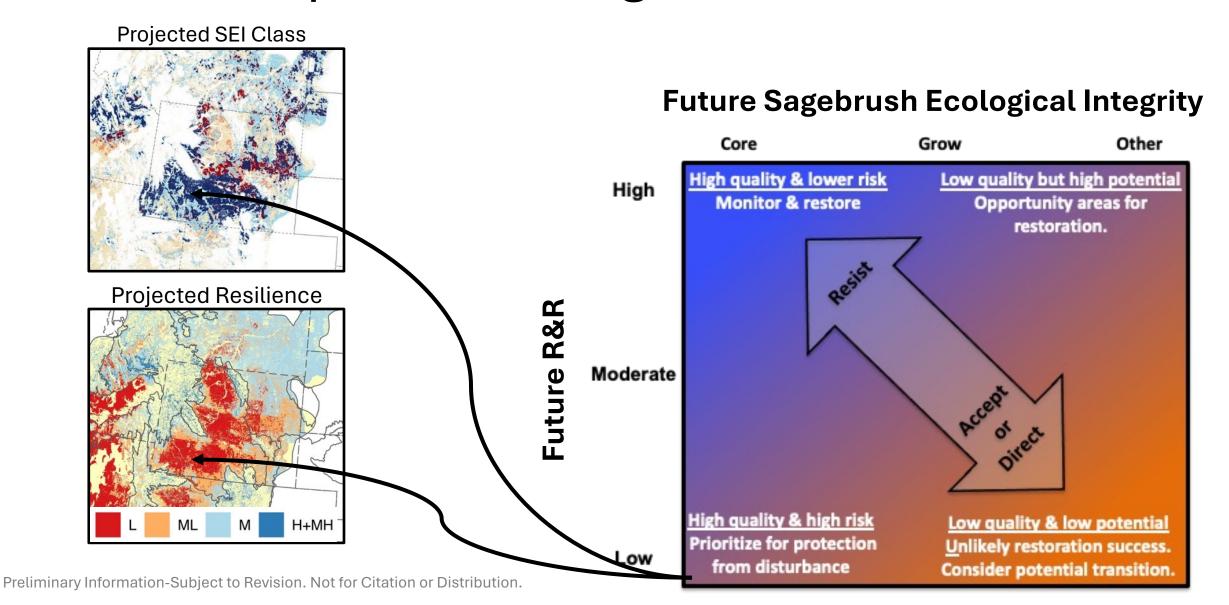
Next steps: Combining SCD & R&R datasets

Combining future Sagebrush Ecological Integrity and R&R to inform prioritization of conservation and restoration actions

Future Sagebrush Ecological Integrity



Next steps: Combining SCD & R&R datasets



Next steps: Interactions between grazing intensity, wildfire and climate change

Grazing sustainability

- How will the **sustainability of grazing** change with climate change?
- Can altering grazing intensity **mitigate climate** induced vegetation changes and wildfire?

Targeted grazing to minimize cheatgrass

- What do we know about the effectiveness of targeted grazing of cheatgrass?
- Can grazing be used as a tool to mitigate cheatgrass-fire-cycle under climate change (Project lead by Kyle Palmquist, Marshall U.)



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Future ecological drought in sagebrush ecosystems (Daniel)

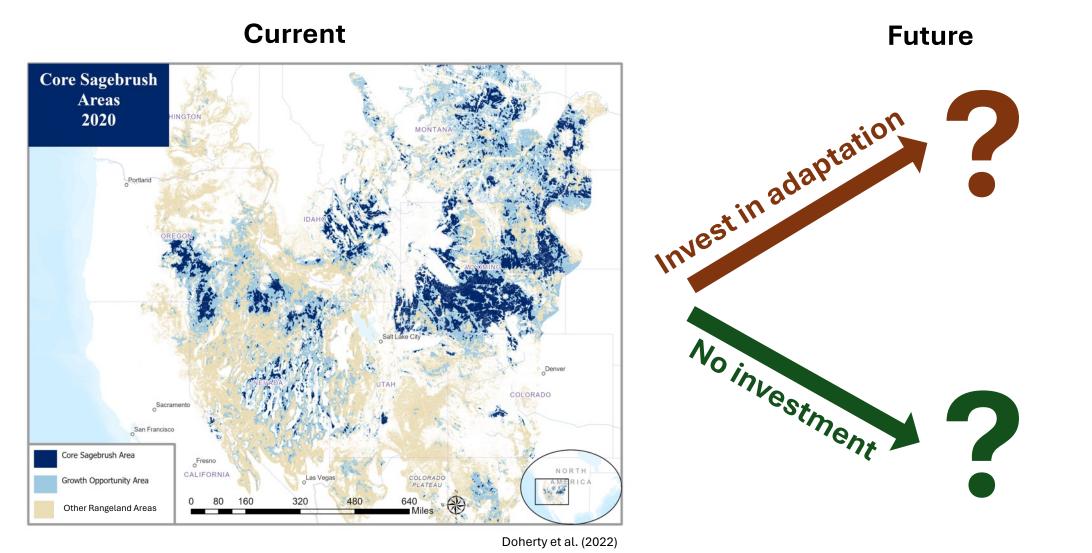
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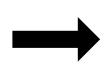
Coping with uncertainty to support adaptation investments (John)

A looming challenge: assess the wholistic impacts of climate adaptation investments

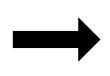


Sources of uncertainty in climate adaptation

Climate uncertainty



Ecological uncertainty



Management effectiveness uncertainty



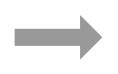




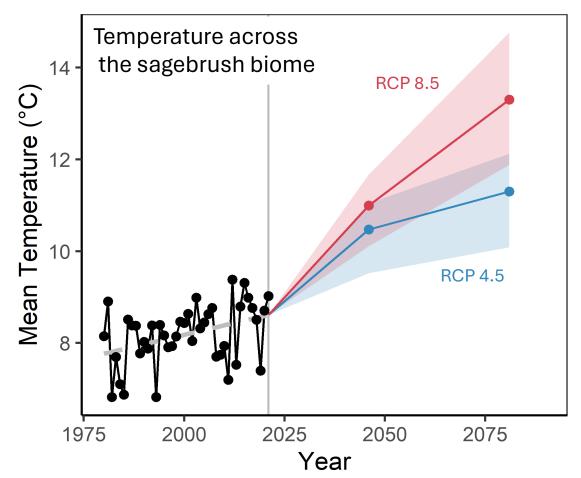


Photo: Bureau of Land Management





Management effectiveness uncertainty

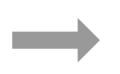


Uncertainty in how the <u>climate</u> will respond to a given amount of forcing

Partially captured by comparing scenarios & climate models

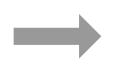
Relatively well recognized and often well addressed

Based on data from Abatzoglou (2013) and Abatzoglou and Brown (2012)



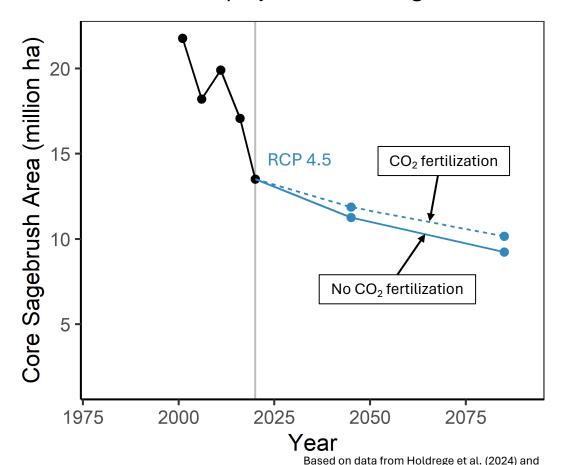
Doherty et al. (2022)

Ecological uncertainty



Management effectiveness uncertainty

Historical and projected Core Sagebrush Area



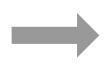
Uncertainty in how <u>ecosystem</u> will response to altered climate.

Often not well estimated

We considered uncertainty from some ecological processes (e.g., CO₂ fertilization might moderate ~ 15% of core losses).

We really need multiple ecological models!





Management effectiveness uncertainty

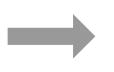


Uncertainty about how ecosystem services will respond to management actions.

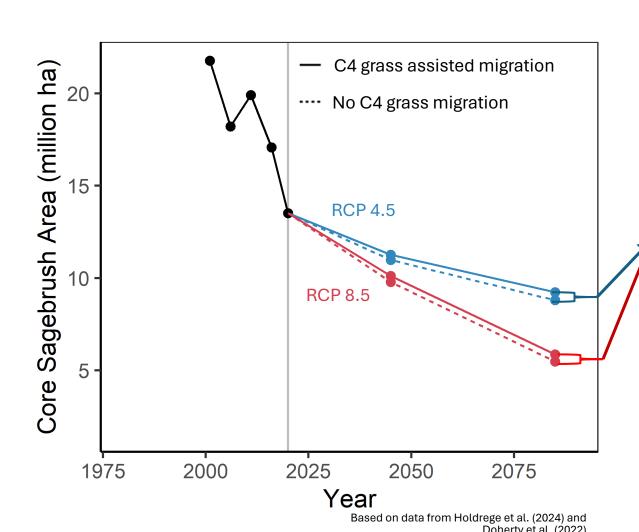
Rarely considered

In sagebrush ecosystems, these management actions might be fire suppression, post-fire restoration, invasive treatments, etc.





Management effectiveness uncertainty



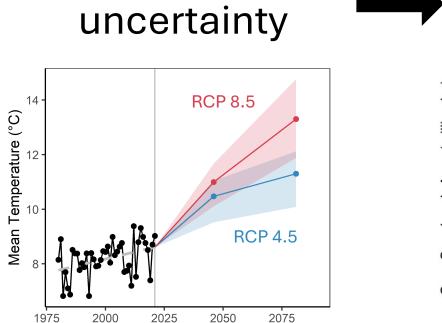
One example of management action might be assisted relocation of plant species.

Loss of Core Sagebrush is reduced by ~9% if we enable C₄ grass expansion (regardless of climate uncertainty)

These results could be integrated into a cost-benefit analysis of climate adaptation investments

- Costs of C₄ grass assisted migration vs.
- Benefits of protecting that Core habitat

Informing adaptation decisions requires understanding all these sources of uncertainty



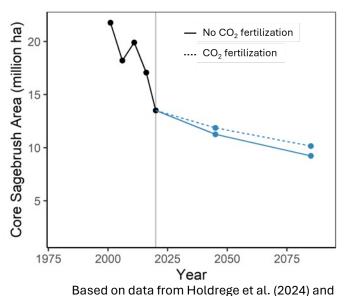
Year

Based on data from Abatzoglou (2013) and

Abatzoglou and Brown (2012)

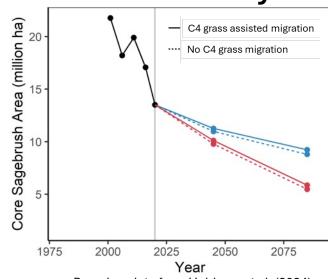
Climate





Doherty et al. (2022)

Management effectiveness uncertainty



Based on data from Holdrege et al. (2024) and Doherty et al. (2022)

Drought impacts in the northcentral region:

- NC may be relatively well positioned to maintain seasonal soil moisture patterns
- On average, potentially wetter soils but elevated stress from large temperature increases during dry soil periods



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Plant community impacts:

- Future changes in big sagebrush impacts vary spatially and are relatively modest in most of the NC region
- Perennial grasses may shift from cool-season to warm season
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Implications for sagebrush ecosystems:

- NC region supports some of the most climate resilient high quality sagebrush habitat
- However, rising temperatures are also expected to decrease R&R in most of the NC region

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Considering uncertainty in climate, ecology and management effectiveness may help build the case for sustained adaptation investments

More information in upcoming document:

Climate change impacts on big sagebrush vegetation: a science synthesis to inform BLM resource management.



Climate projections for the sagebrush region

- Increases in annual temperatures and CO₂ along with seasonal shifts in precipitation
- Higher probability of extreme weather events (for example, droughts, heat waves, and storms)

Synthesis of climate change impacts on sagebrush plant communities

Data sources	Individual plants	Plant communities
Field studies	Species and functional type responses Big sagebrush is resistant to most shifts in temperature and precipitation Drought will have immediate effects on bunchgrasses and high-intensity drought could induce sagebrush mortality	Plant community responses Identified five potential respontial response types Intermountain communities may become more stable under projected shifts Low elevation and southern communities at risk for invasion and increasing bare ground
Modeling	2. Species distribution models • Big sagebrush models show potential range expansion in north and contraction in the south • C ₄ grasses are likely to expand north with increased temperatures • Little information about forb responses	 4. Region-wide effects Core areas identified by Doherty and others (2022) are relatively stable. Forage species including C₃ and C₄ bunchgrasses are likely to experience compositional shifts

Key insights

- Relative stability for big sagebrush plant communities in the intermountain part of the region
- Increased threat of invasion in the southern part of the range
- Potential migration into higher elevations as snowmelt occurs earlier in the year

Implications for decisions and land management

Forage, wildfire, habitat management, recreation, and reclamation

Additional resources

Adaptation frameworks, visualizations and data products



Citations

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Simulation modeling approach — SOILWAT2

Daily weather

Soil properties

Vegetation

