

# Modelling the impacts of climate and land use change on the emission and transport of wheat rust spores

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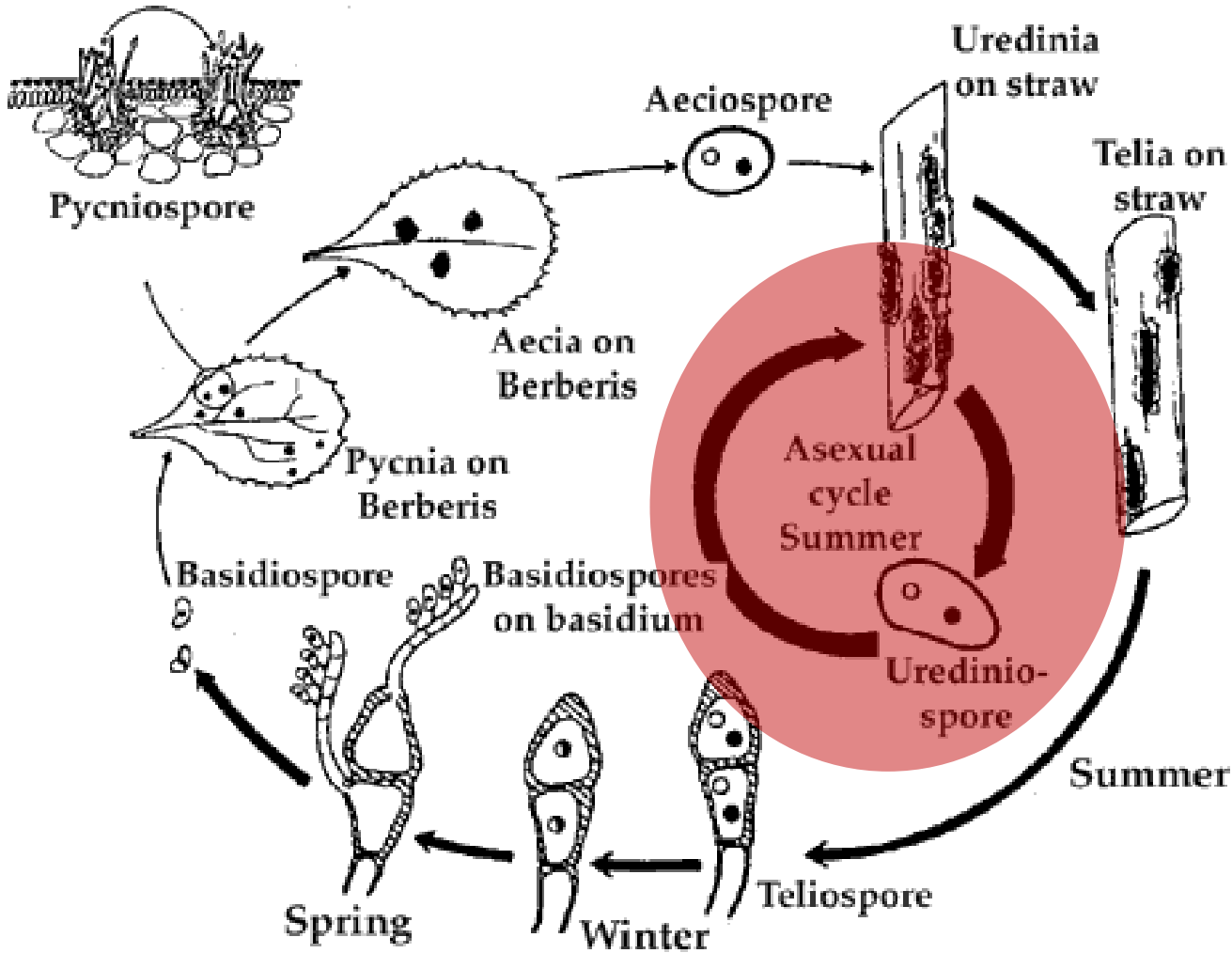


**DAVID R. ATKINSON CENTER**  
for a Sustainable Future  
Cornell University

- Phytopathogenic microbes with explosive epidemic potential represent a major threat to agriculture, food security and sustainability
- Recent rise of hypervirulent races such as Ug99 of the **wheat stem rust fungus** (*Puccinia graminis* f. sp. *tritici*)
- Severe yield losses (50 to 70% over large areas, up to 100% on isolated fields) for susceptible wheat varieties



# Life Cycle of *Puccinia gramininis*



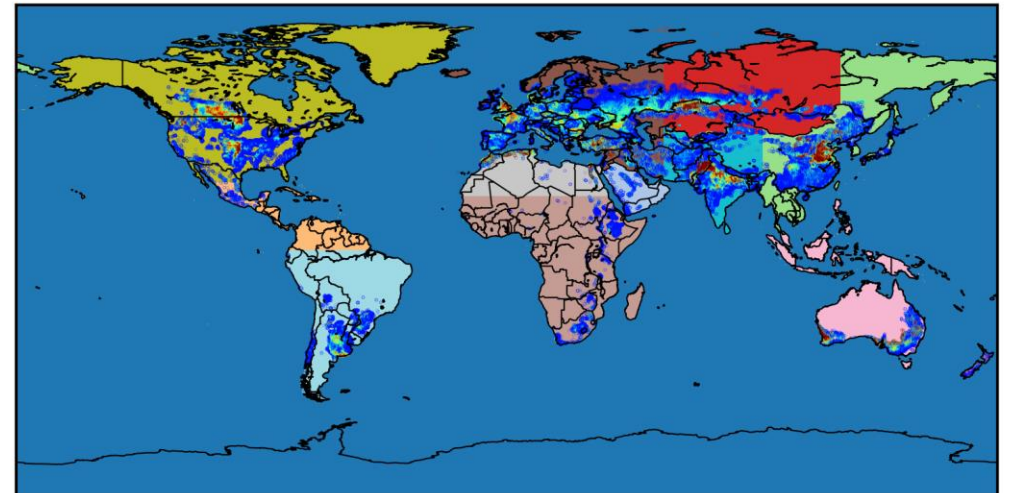
## • Asexual repeating cycle

- ~14 days in optimal conditions
- In optimal temperature (~30 °C) one uredinium produces 10 000 spores per day for 2-3 weeks
- Up to ~1e6 urediniums/m<sup>2</sup>
  - Roughly estimated from 5% severity being ~50 pustules per tiller
- Spores can be transported long distances (size ~20 micrometers)
- Sensitive to UV and temperature
- Require suitable temperatures, liquid water on leaves for 6 hours followed by >10000 Lux light intensity to germinate

# Modelling with CESM 1.2.2

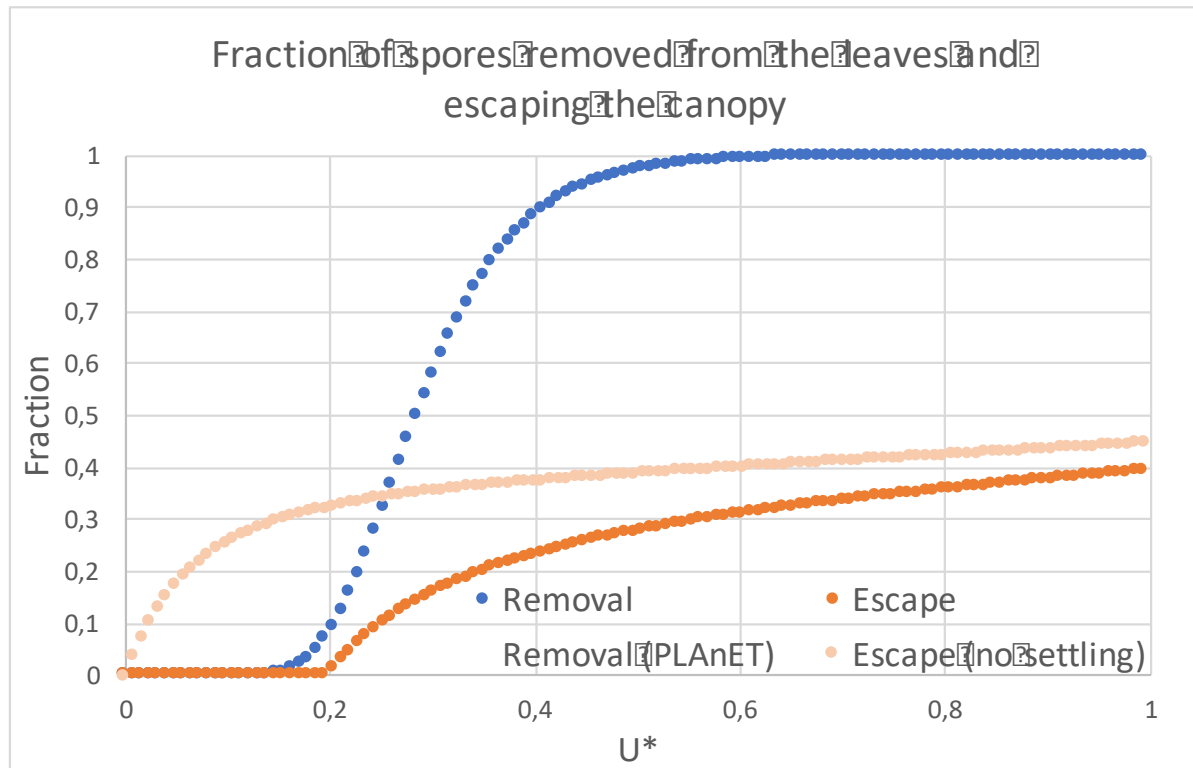
- Monthly wheat area from MIRCA 2000
    - Spring and winter wheat
  - Emission flux from infected fields
  - Tracers added to CAM5 for viable and dead spores or spore age
  - Germination probability
  - Infection development and spread
- Source-receptor relationships
    - Constant 20% infection severity on all wheat fields
    - 12 source/receptor regions
    - CESM simulations for 1850, 2000, 2100 (RCP8.5) + forced with MERRA2 reanalysis

MIRCA 2000 max wheat area %



# Spore emission

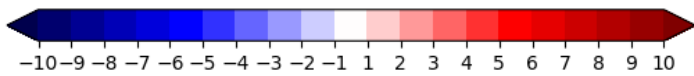
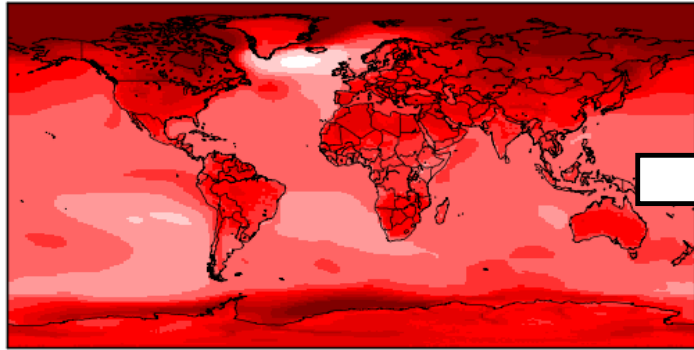
- Removal of spores from leaf surface ( $u_*$ , RH)
- Resistance analogy for local deposition and upwards flux



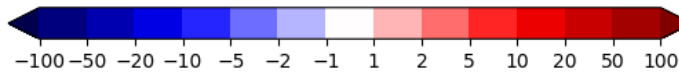
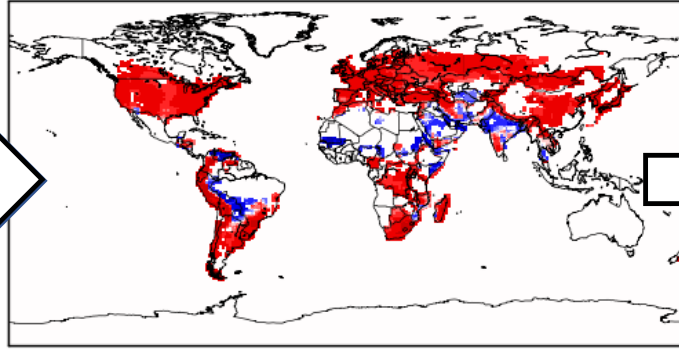
- It is often claimed that a very small fraction of spores escape the crop canopy (up to a few %)
- Annual average escape fraction of all wheat containing grid cells 1.6%
- Due to correlation between removal and escape, 17% of all produced spores escape
- Aylor & Ferrandino (1988) evaluated escape fraction 2 m downwind a line source of spores ( $d=32 \mu\text{m}$ )
  - 22-57% and 56-64% for spores released at 0.4 m and 0.7 m height in wheat canopy
  - $U^* 0.3-0.5$

# Impact of climate change on spore emission

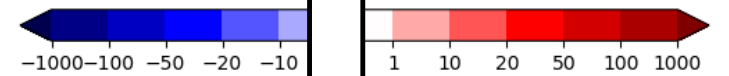
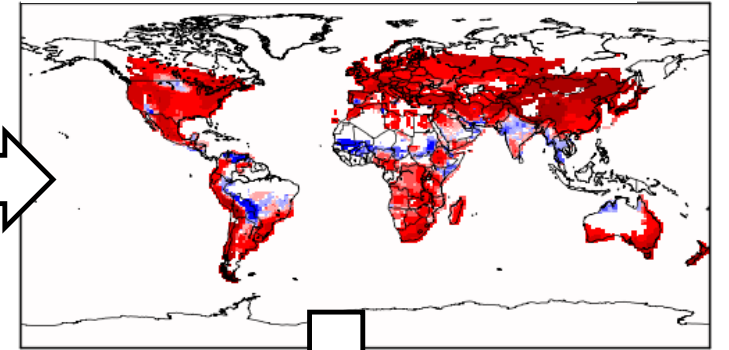
Change in 2 m temperature by 2100 (°C)



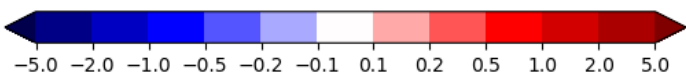
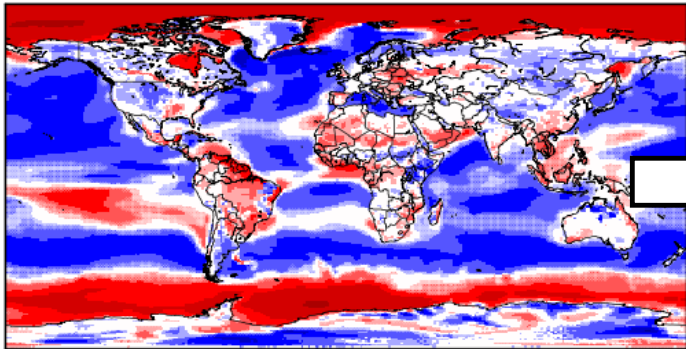
Change in occurrence of optimal temperatures (% of days)



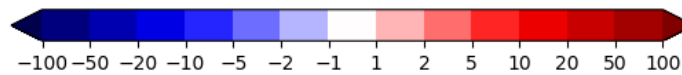
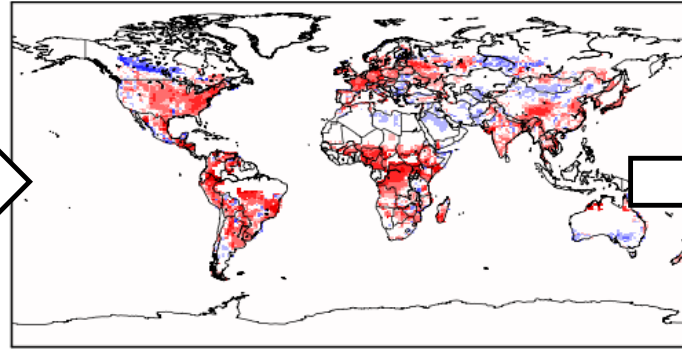
Change in spore production (%)



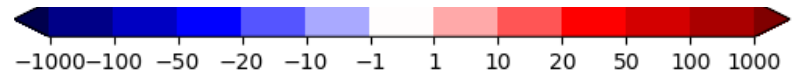
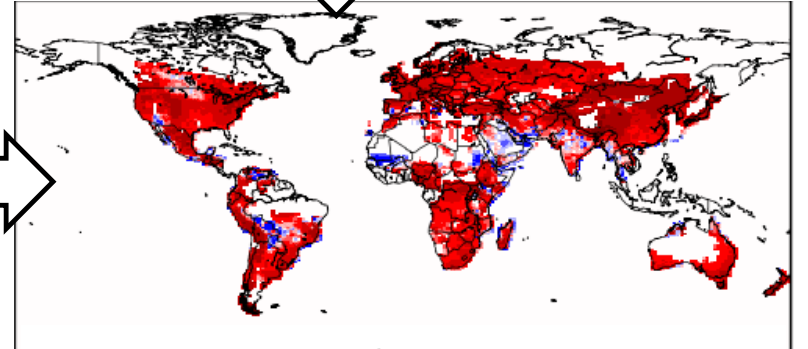
Change in 10 m wind by 2100 (m/s)



Change in escape fraction (% of spores)

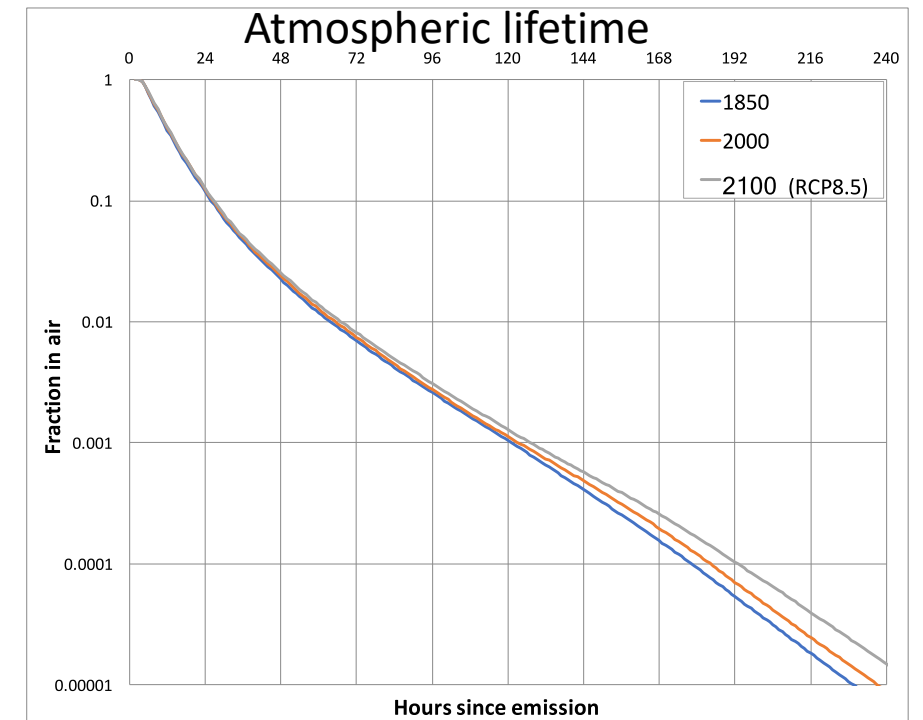


Change in # of spores emitted by similarly infected field (%)



# Intercontinental transport

- Frequent spore exchange between Africa, Asia and Europe
- Rare transport events across oceans
- Slightly longer atmospheric lifetimes in warmer climate

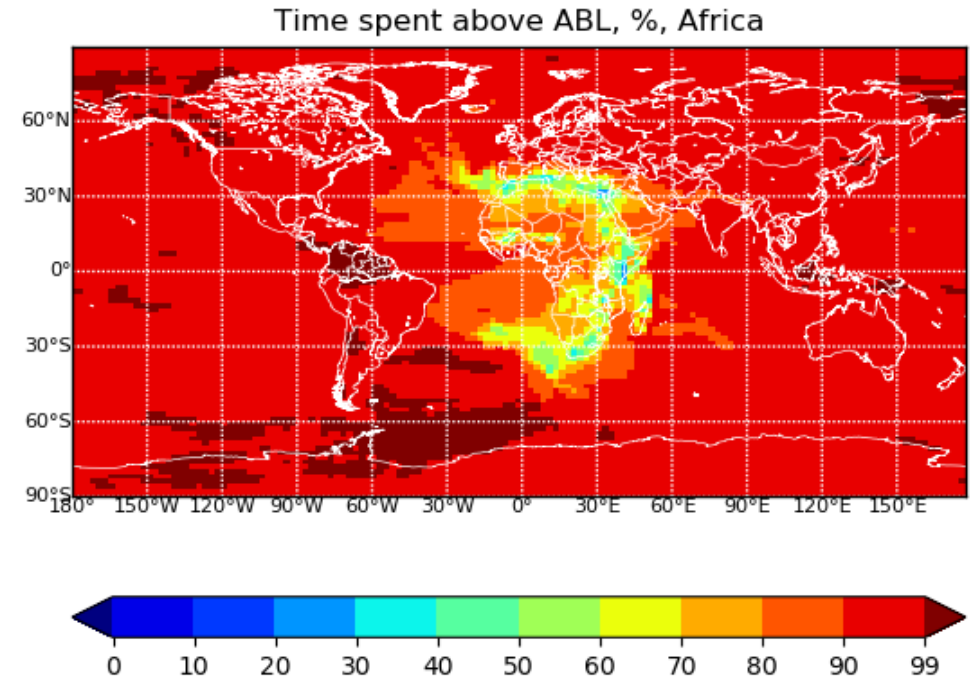


Source \ Receptor	Africa	Asia	Europe	North America	South America	Oceania	Antarctica	Ocean
Africa	5.5E-01	1.2E-02	2.6E-02	8.0E-08	3.3E-07	1.5E-06	6.6E-09	4.1E-01
Asia	3.3E-04	8.0E-01	1.3E-01	8.0E-07	1.0E-09	2.2E-09	2.2E-13	7.6E-02
Europe	5.3E-04	6.9E-02	8.4E-01	2.6E-07	1.2E-11	5.1E-13	1.2E-15	8.8E-02
North America	1.3E-05	1.8E-06	2.8E-05	9.8E-01	4.6E-08	4.0E-13	2.8E-14	2.4E-02
South America	2.4E-06	3.2E-09	1.1E-08	1.8E-07	8.8E-01	2.5E-08	4.0E-08	1.2E-01
Oceania	2.2E-10	1.1E-06	5.0E-15	1.2E-13	2.3E-07	8.3E-01	2.3E-08	1.7E-01

Blue – low values, red – high values

# Spore viability during long range transport

- ~10% of spores germinate after 20 h of sunshine (Maddison and Manners, 1972), less than 0.1% after 35 hours
- Sensitivity higher at high relative humidity
- Germinability is not the same as infectivity
  - Infectivity 3-6 times more sensitive to UV
- Freezing kills in humid conditions

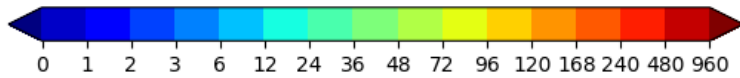
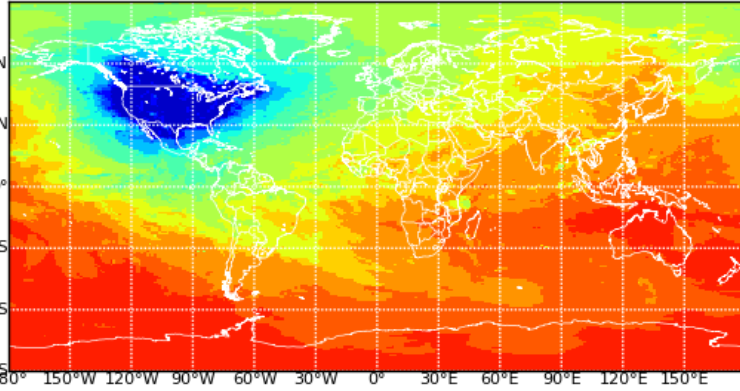


Long range transport happens above the boundary layer

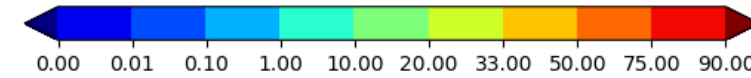
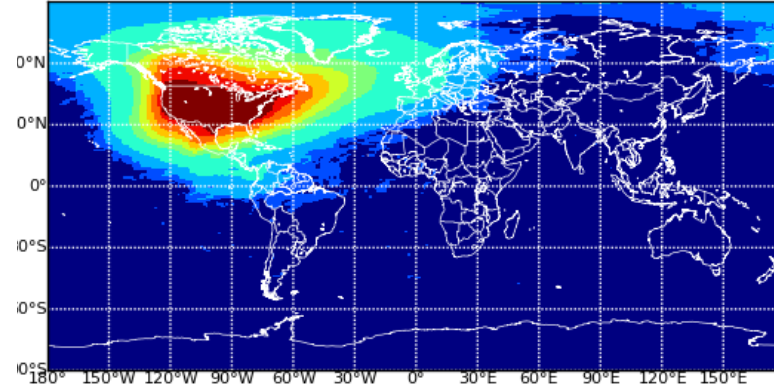


# Age of spores at deposition

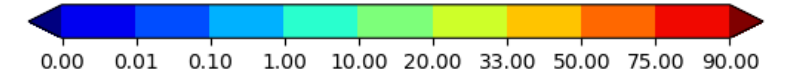
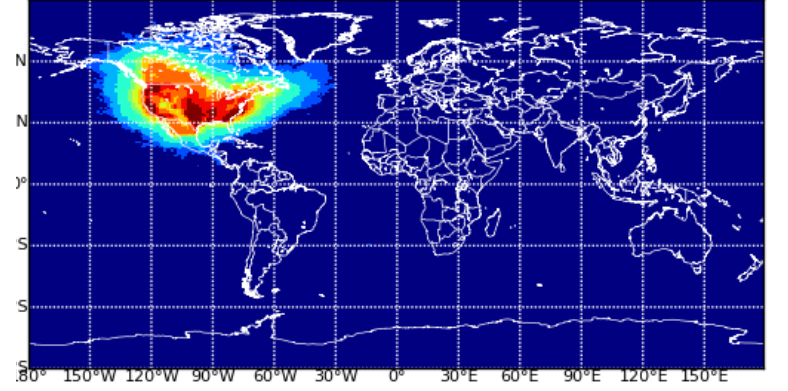
Minimum daily deposited spore age, hours, North-America



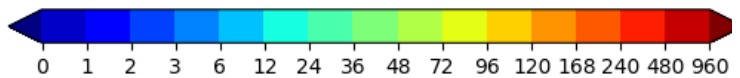
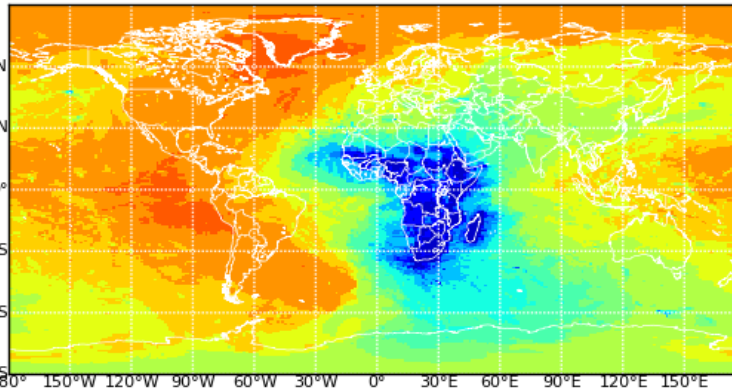
% of days with deposited spore age < 3 days, North-America



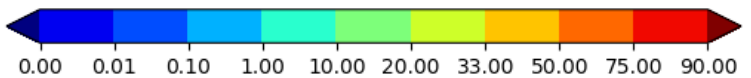
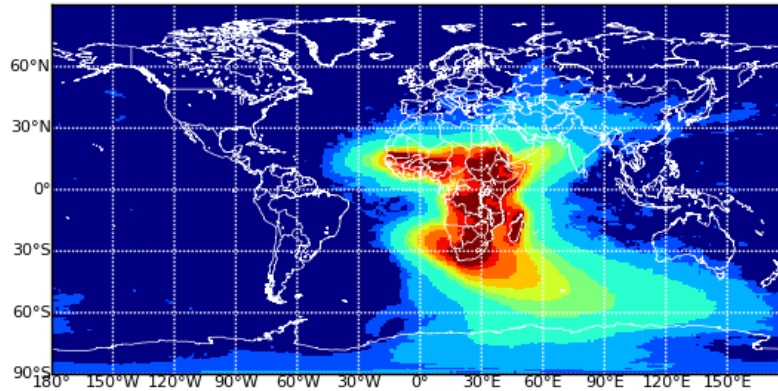
% of days with deposited spore age < 1 day, North-America



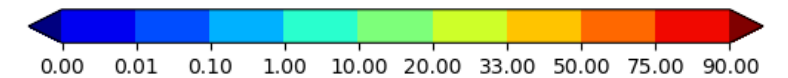
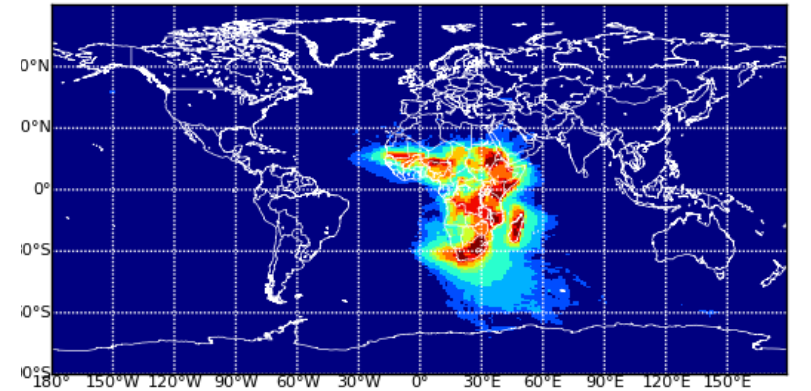
Minimum daily deposited spore age, hours, South-Africa



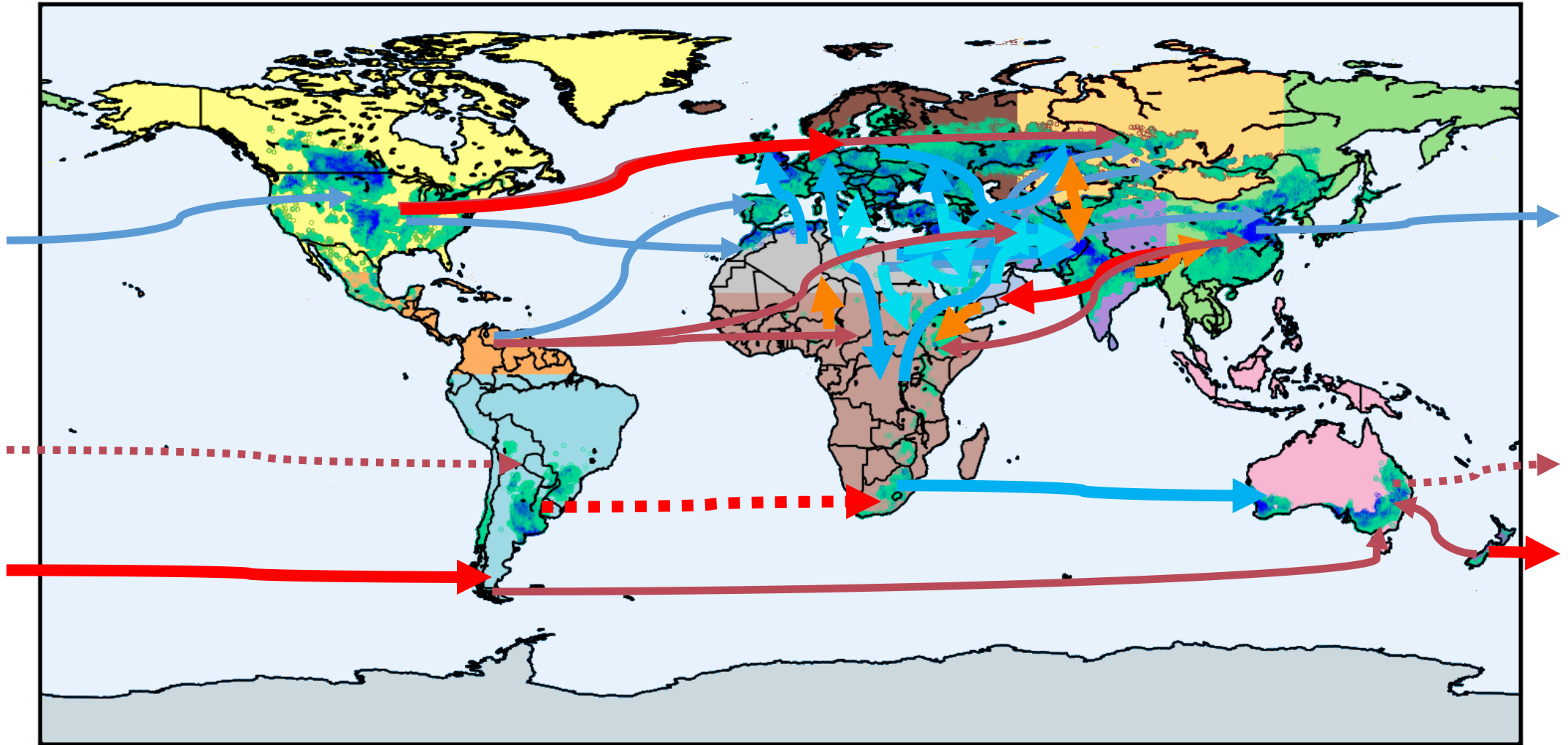
% of days with deposited spore age < 3 days, South-Africa



% of days with deposited spore age < 1 day, South-Africa



# Impact of climate change on spore transport

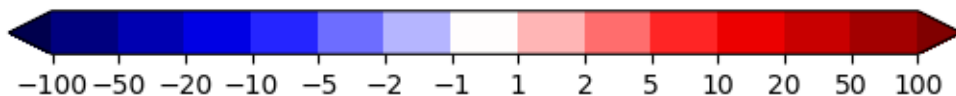
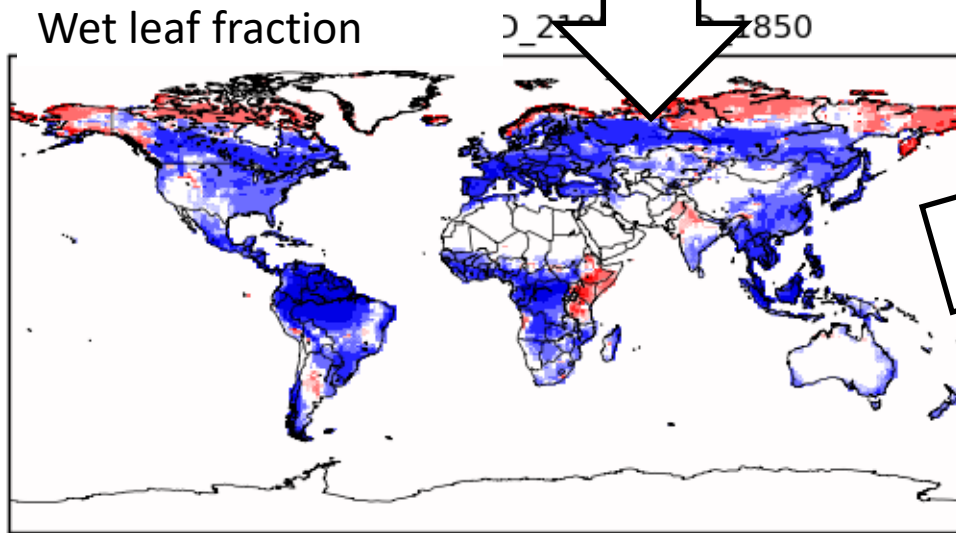
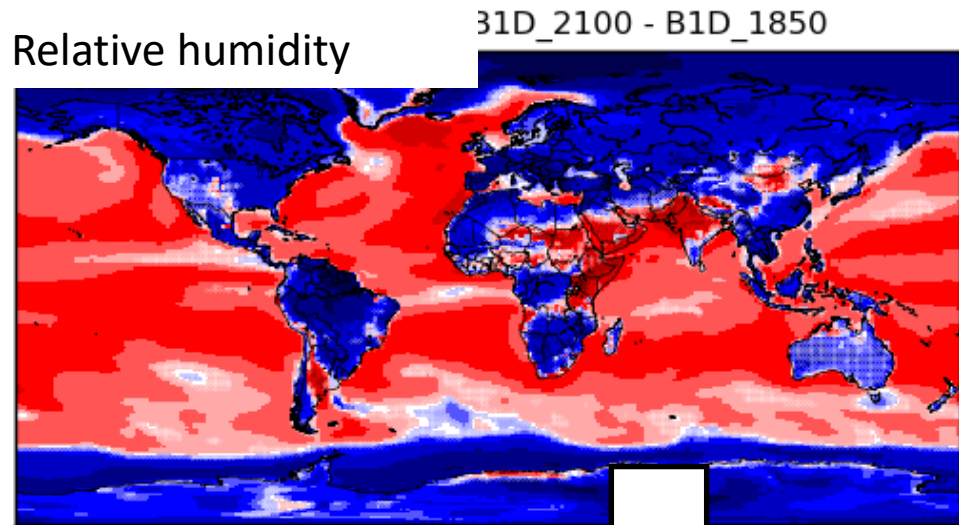


Changes in transport event frequency (fraction of days with deposition > 10 spore/ha). Arrows plotted for statistically significant changes of >5% of present value (FDR controlled at level 0.1).

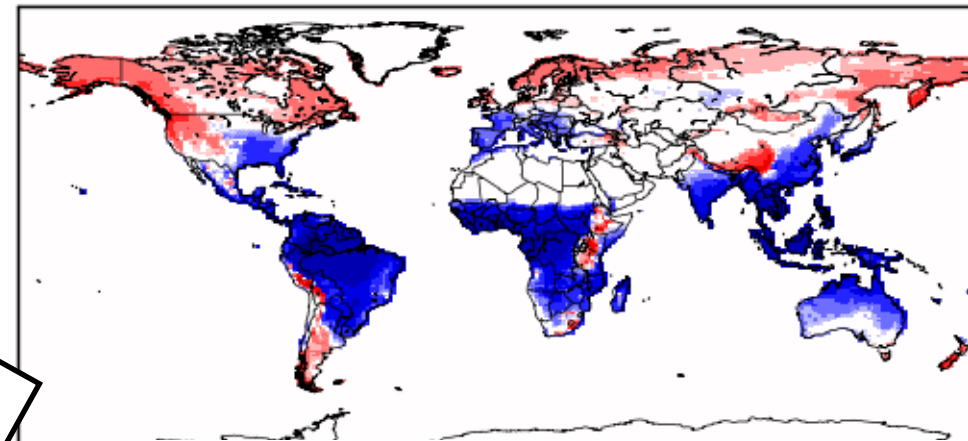
Increase      Decrease  
1 day      Orange arrow      Light blue arrow  
3 days      Red arrow      Blue arrow  
5 days      Brown arrow      Dark blue arrow

◄ ■ ► significant change for future but not for the whole period

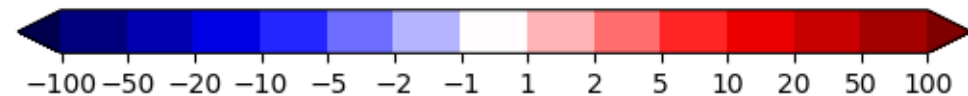
# Impact of climate change on germination probability



Difference in infect B1D\_2100 - B1D\_1850

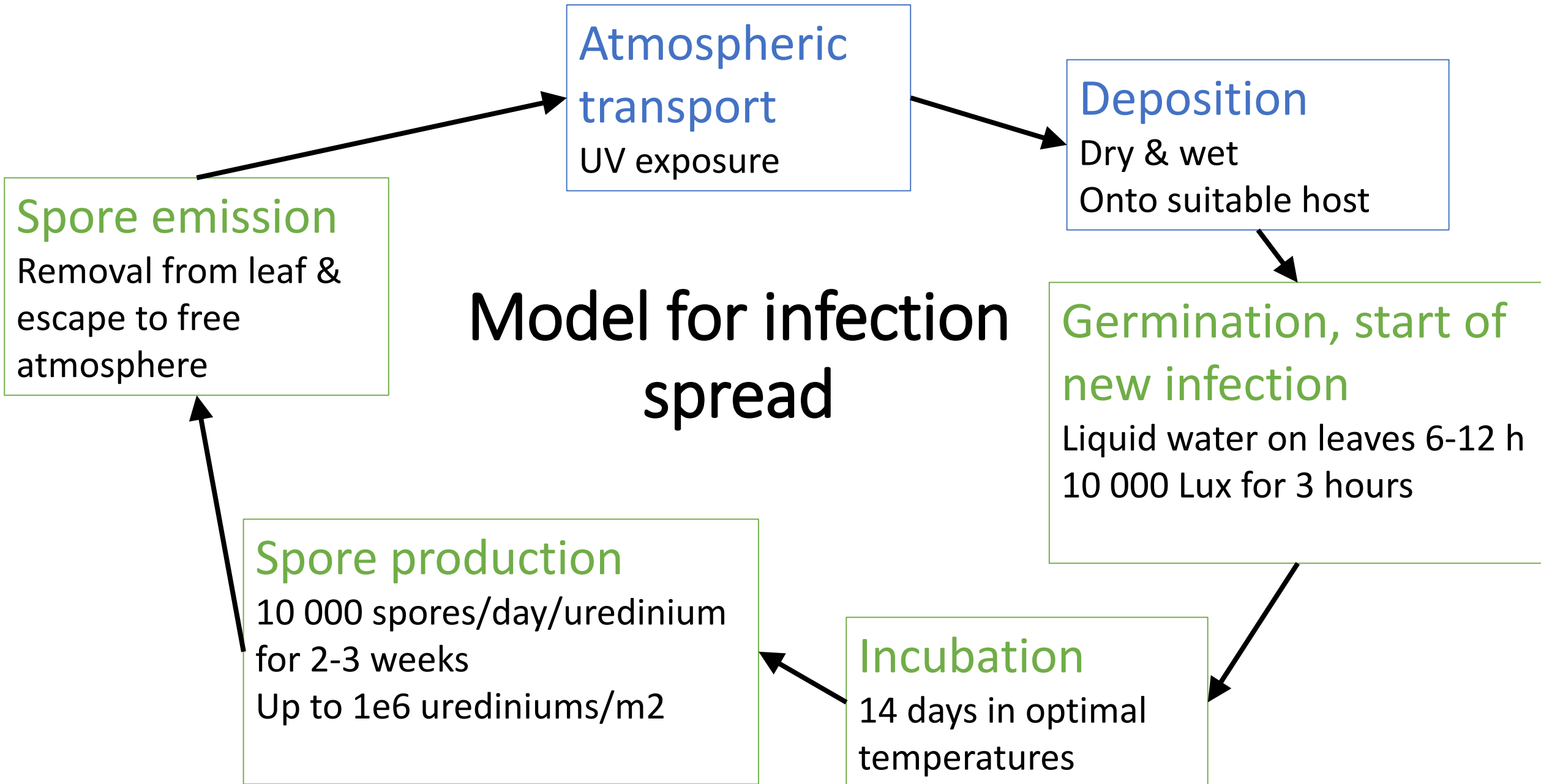


Suitable conditions for germination



Spores require suitable temperatures, liquid water on leaves for at least 6 hours followed by >10000 Lux light intensity to germinate

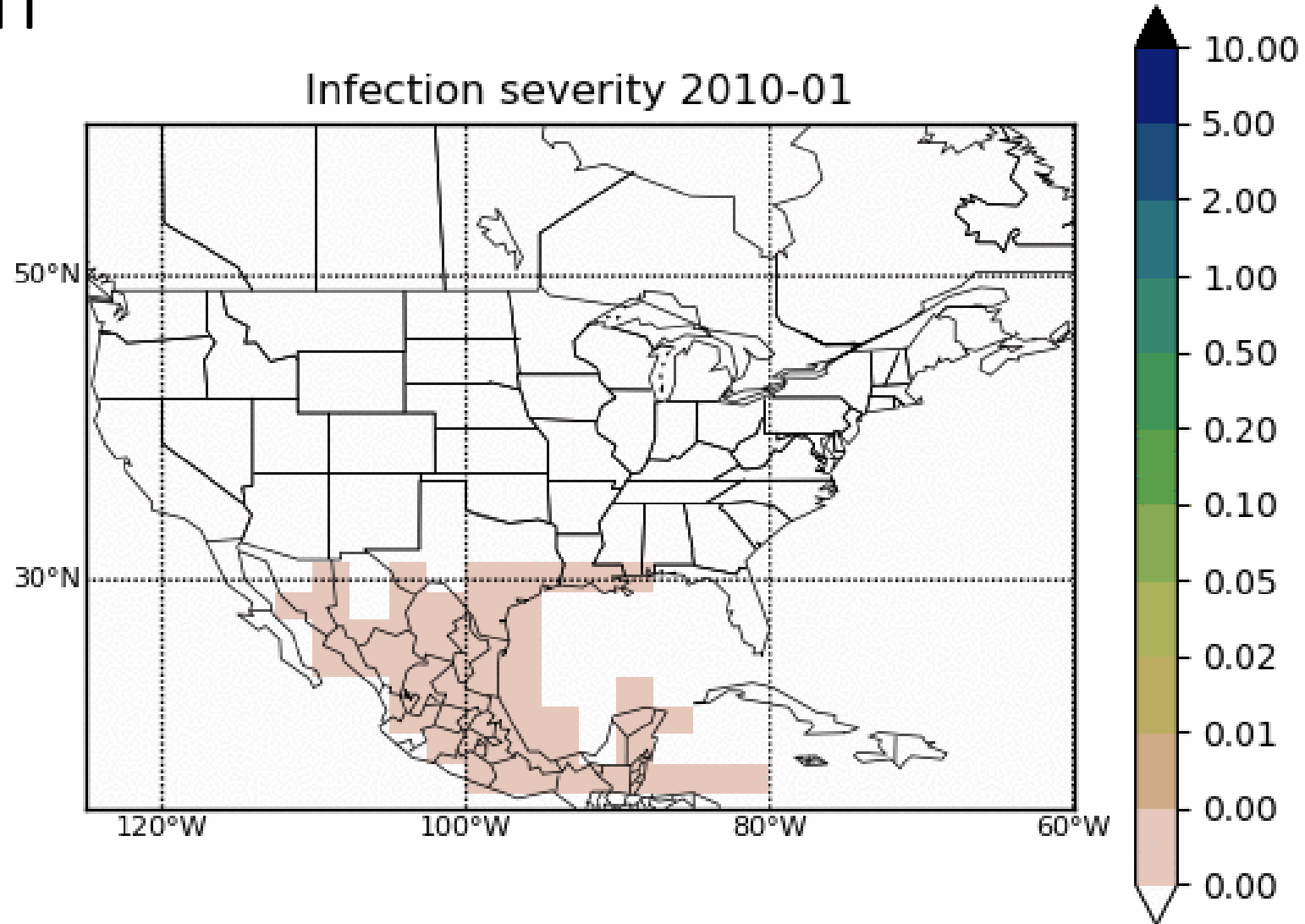
# Model for infection spread



# Viable spore loss

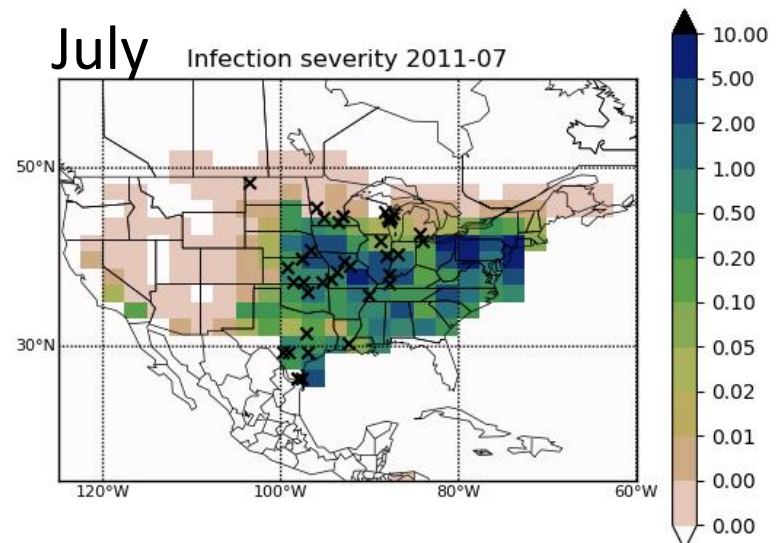
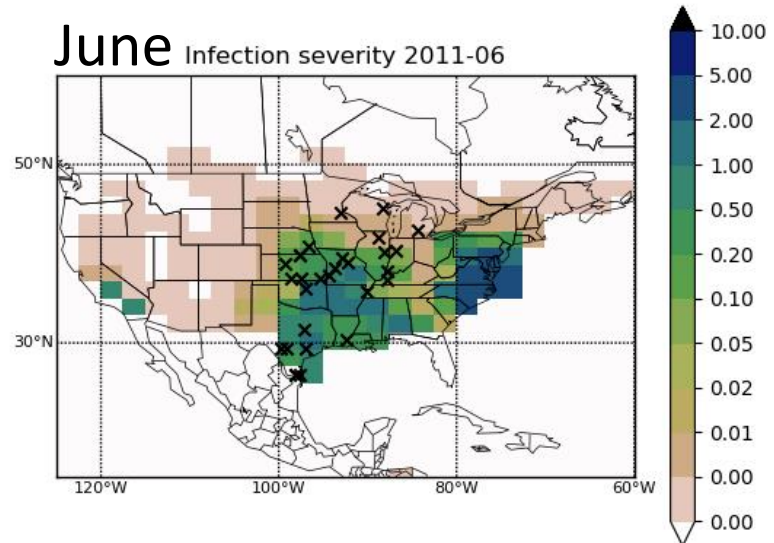
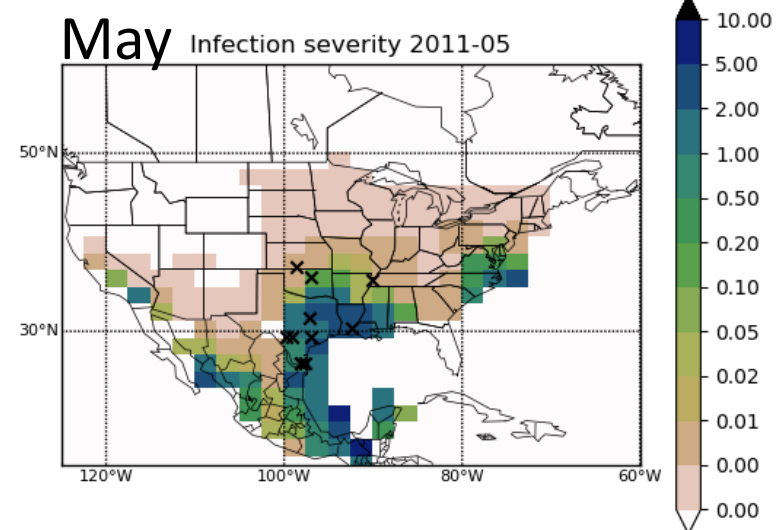
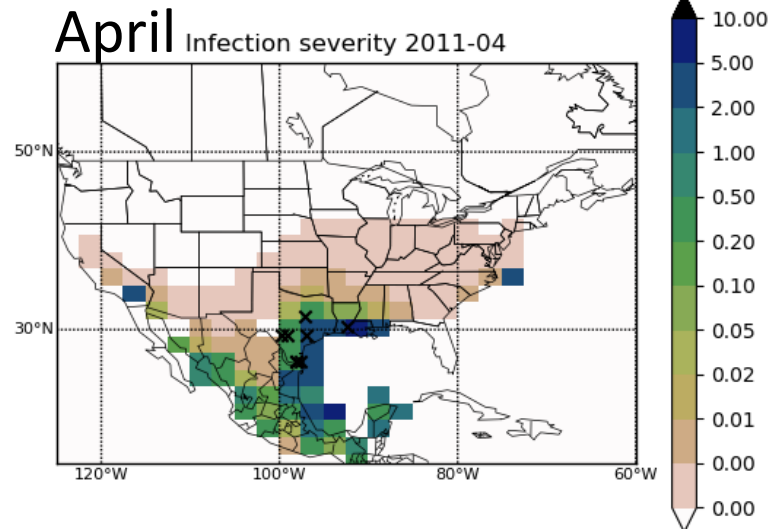
- UV acts on spores in air and also on fields
  - Half efficiency on field accounting for shadowing by leaves
- Rain
  - Spores washed off from plants with half atmospheric scavenging efficiency
- Frost kills
  - Incubating infection can survive in plants under thick snow cover
- Harvest
  - Ready spores emitted depending on humidity
- Spores that have started germinating can dry up before managing
- Spores deposited on a wheat field can fall on ground
  - LAI dependence currently missing

# Evaluation



X – wheat stem rust seen on a field and reported to USDA

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# Impact of “green bridges”

- Growing both winter and spring wheat in the same area can form “green bridges” that allow the pathogen to overwinter
  - earlier initiation of epidemics in spring resulting in more severe disease
- Simulation of disease spread assuming maximum extent of wheat all year round



# Impact of “green bridges”

Infection % 2010 1



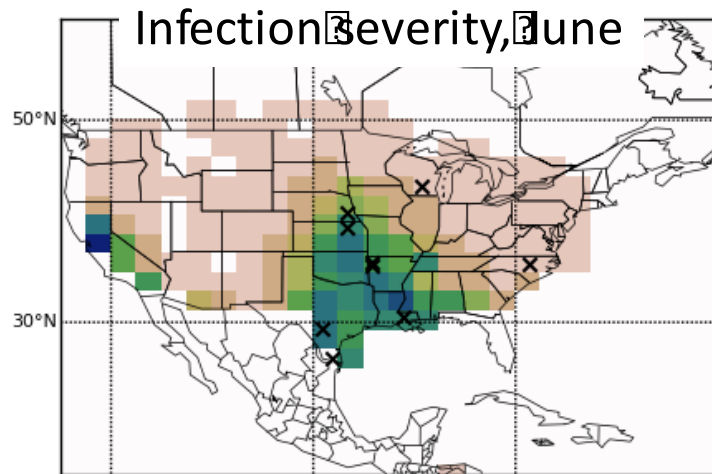
Monthly wheat area  
from MIRCA2000

Infection % 2010 1

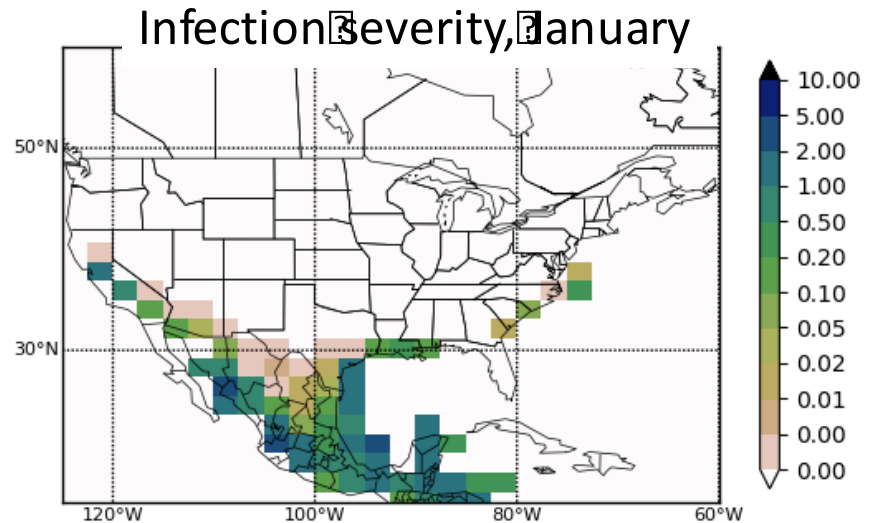
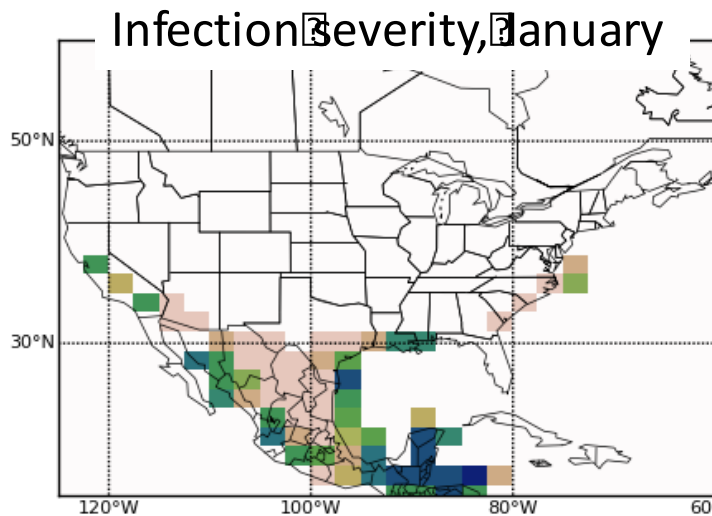
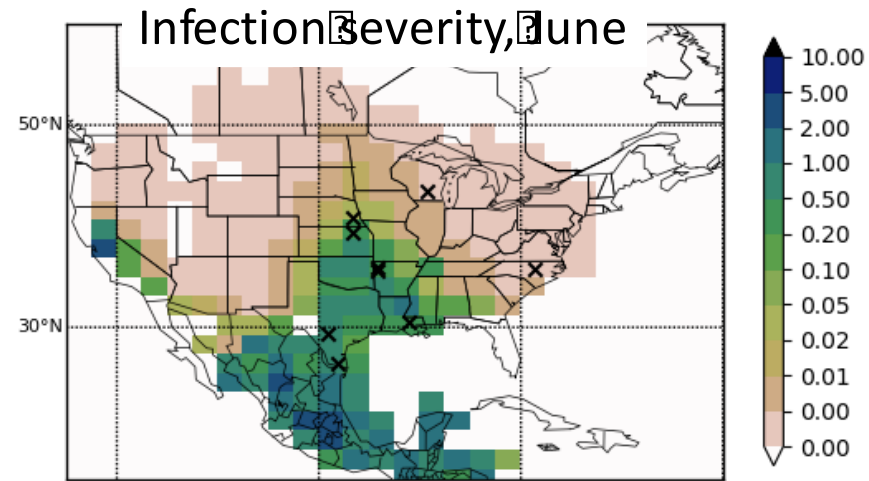


Maximum wheat area  
from MIRCA2000

# Monthly wheat area from MIRCA2000



# Maximum wheat area from MIRCA2000



# Conclusions

- Warmer and dryer climate will lead to more spores being produced and larger fraction escaping to the free atmosphere
- Drier conditions reduce substantially the germination probability
- Slightly larger fraction of spores have longer atmospheric lifetimes and some changes in the source-receptor relationships are seen for warmer climate
- In North America the subfreezing temperatures keep the fungus from overwintering further than ~30 degrees north
- The spread eastwards from Sub-Saharan Africa is controlled by the different wheat growing seasons

# Future work

- Evaluation of infection spread is challenging due to lack of observations
  - Existing observations:
    - Annual infection northwards spread in USA
    - Spread of Ug99
    - Frequent exchange between Australia and New Zealand, UK and Central Europe
- Missing processes
  - Host resistance
  - Fungicide use
  - Plant death
  - Irrigation
- Better integration with CLM
  - Land cover and crop distribution change
  - Changes in crop phenology, timing of sowing and harvest