Environmental Linkages

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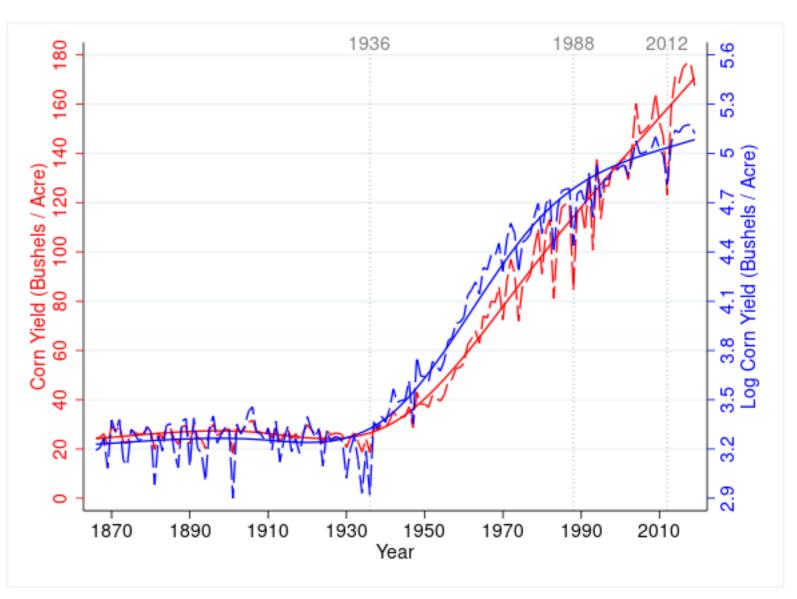
Federal Reserve Bank of Kansas City: 2021 Agricultural Symposium

The Roots of Agricultural Productivity Growth

Productivity: US Corn Yields 1866-2019



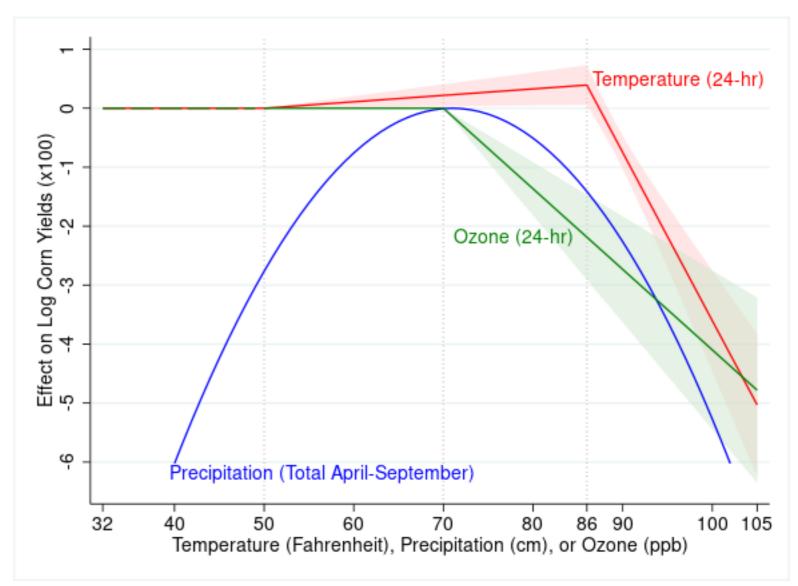
- Phase 1 (1866-1940)
 - Fairly constant average yields
- Phase 2 (1940-1980)
 - Exponential growth in yields
- Phase 3 (since 1980)
 - Linear growth in yields
- Fluctuation around average
 - Constant in percent terms
 - Environmental factors are key



Environmental Drivers of Corn Yields



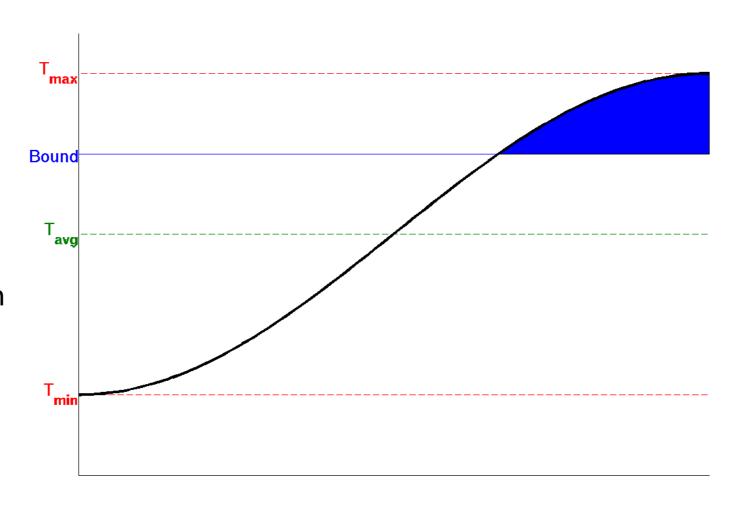
- Growing Season
 - April September
- Peak exposure crucial
 - Temperatures
 - Ozone
- Temperature
 - Degree days above 86F
- Ozone
 - Exposure above 70ppb
- Precipitation
 - Season-total



Key Concept: Measures of Peak Exposure

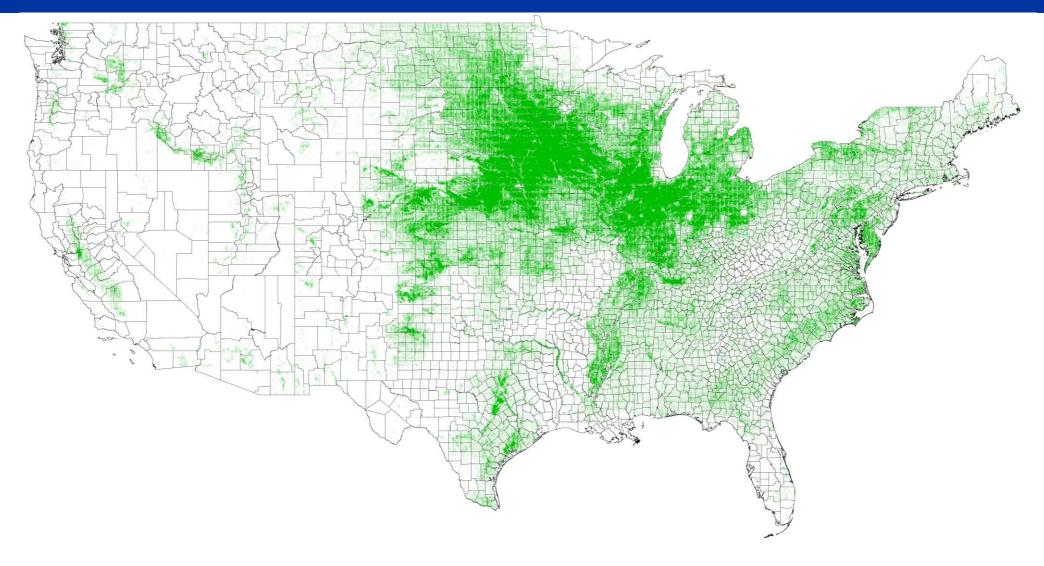


- Degree days above bound
 - measures how much above
 - measures how long above
- Degree days above 86F
 - Explains more than half of year-to-year variability in corn yields
- Peak ozone
 - Hourly ozone readings
 - Exceedance above 70ppb
 - Summed over all hours



Average for US over Corn Growing Area



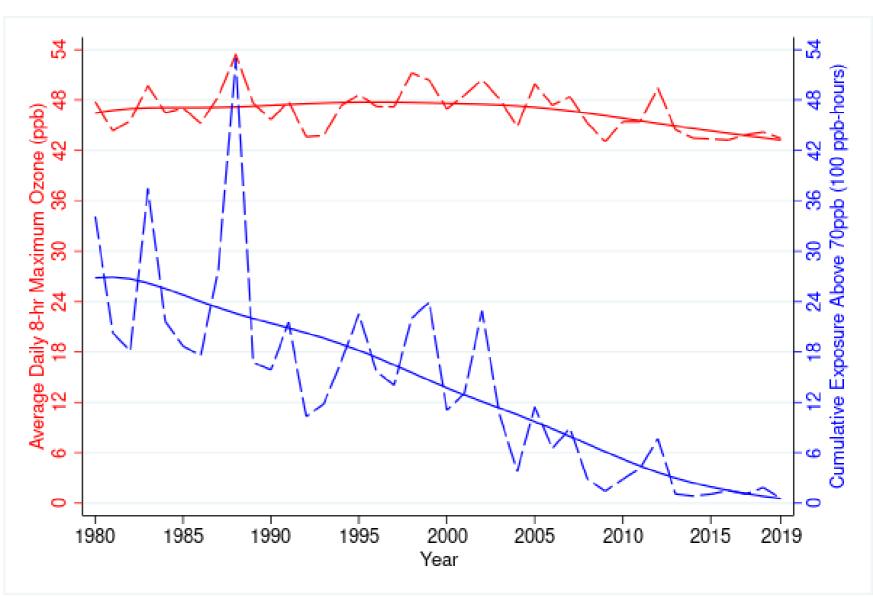


- Cropland Data Layer (30x30m satellite data 2010-2018)
 - Average of grid that grows corn

Ozone over Corn Area over Time



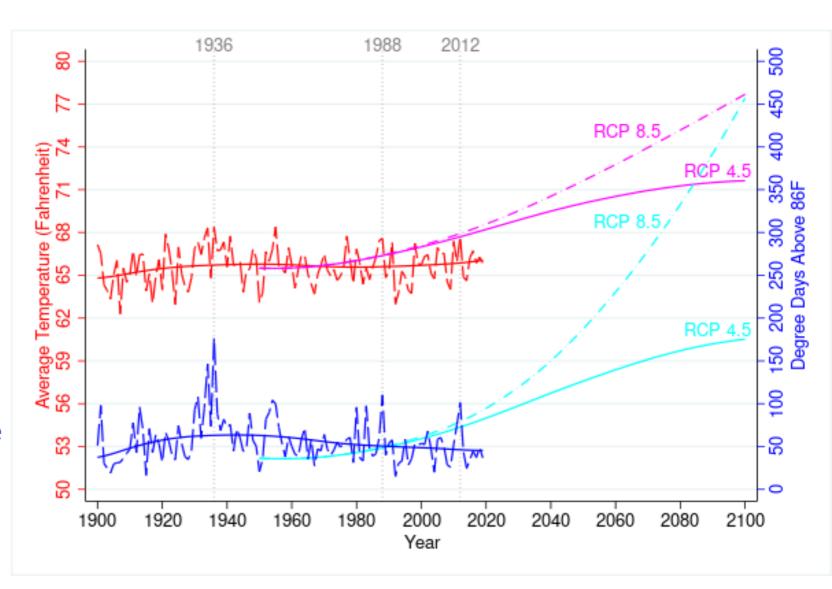
- Average ozone
 - Red line (left y-axis)
 - Minor decrease
- Peak ozone
 - Blue line (right y-axis)
 - Phased out
 - Clean Air Act
 - No further reduction going forward



Temperature over Corn Area over Time



- Average temperature
 - Red line (left y-axis)
 - Small increase since 1980
 - Not as much as predicted
- Degree days above 86F
 - Blue line (right y-axis)
 - Decrease 1980-2020
 - Cooling effect of irrigation
 - Intensification of agriculture
 - Predicted to increase
 - Especially under RCP 8.5



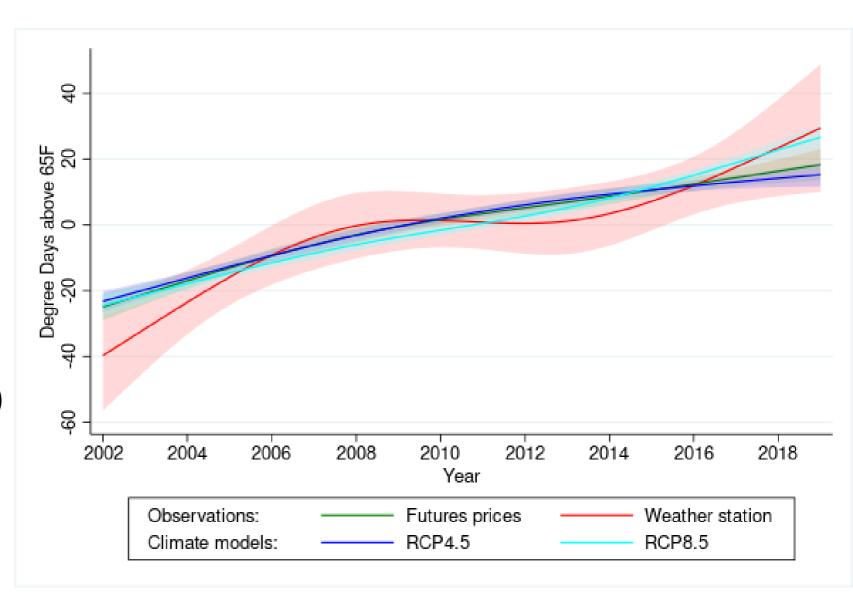
Weather Derivatives at US Airports



- Weather futures
 - Payout based on weather
 - 8 airports in the US
 - ATL, CVG, DFW, LAS, LGA, MSP, ORD, SAC

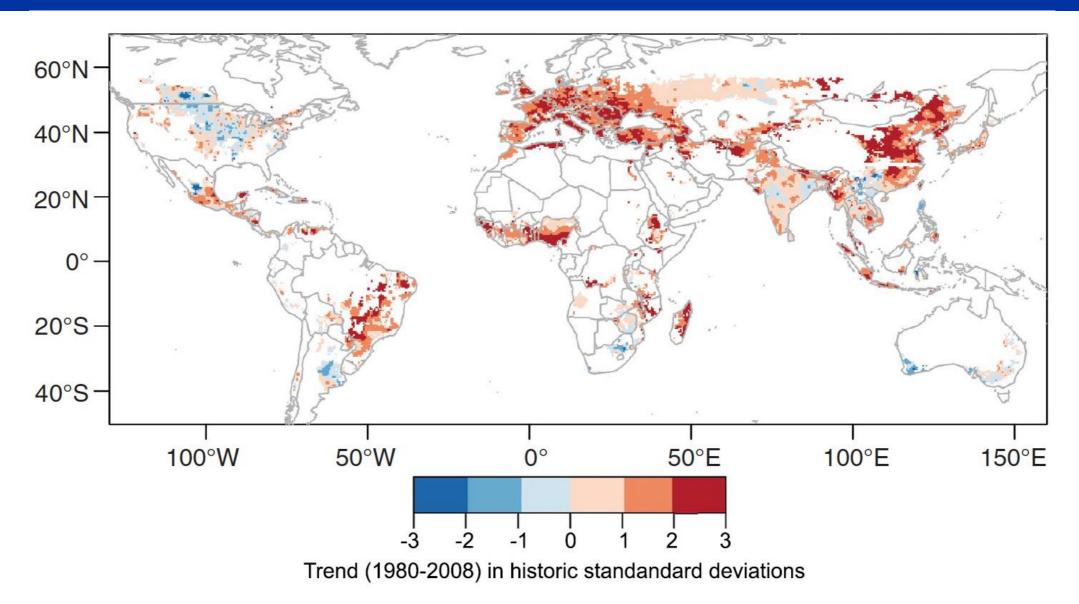
- Prices have been rising
 - Comparable trends
 - Price of derivative (green)
 - Actual weather (red)
 - Climate models (blue)

Schlenker & Taylor (JFE, 2021)



Observed Trend over Agricultural Area



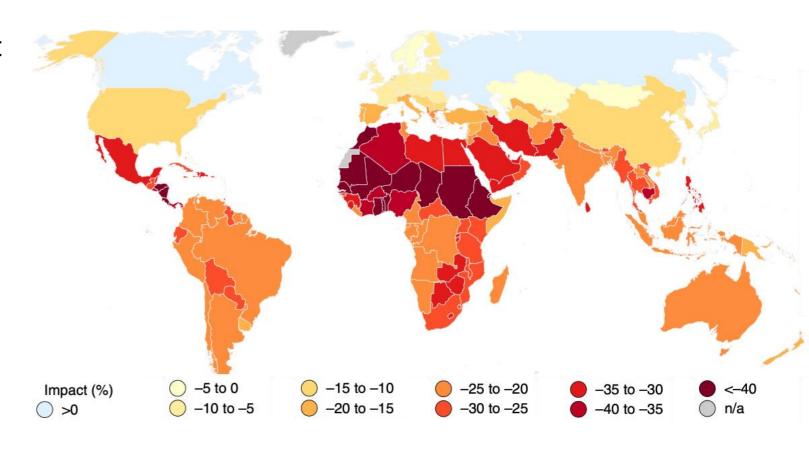


• Ortiz-Bobea et al. (Nature Climate Change, 2021)

Climate Effect on Total Factor Productivity



- So far: focus on output
 - Yields
 - Climate change might impact required input use as well
- Total factor productivity
 - Output minus input
 - TFP growth since 1961 linked to weather
 - Ortiz-Bobea et al. (NCC, 2021)
- Observed climate change lowered TFP
 - Effect varies spatially
 - Hotter areas more impacted



Going Forward



- Climate change
 - Four basic staple commodities (corn, wheat, rice and soybeans)
 - 75% of calories that humans consume, US market share 25%
 - Extreme heat will rise and lead to slowing of productivity growth
 - So far increase in extreme temperature has been limited
 - But local feedback loops can only counterbalance warming trends to a limited amount
 - Peak ozone has been eliminated further reduction not possible
 - CO2 fertilization increases productivity growth
- Lower global agricultural productivity growth
 - Increase in prices of basic food commodities
 - Good for farmers, bad for consumers, especially in developing countries
 - US: commodity cost small share of price in store
 - Regional shifts are likely (e.g., growing area expansion in Russia)

Conclusion: Socioeconomic Spillovers



- In the past, agricultural productivity declines had large ripple effects
 - Dust Bowl: large outmigration, especially of younger population
 - 1936 still year with highest number of degree days above 86F
 - Climate projections predict this to be an average year by mid century (RCP 8.5)
 - Migration in Africa
 - Linking bi-national flows to price shocks caused by world markets
 - If prices of cash crops decrease, outmigration increased
 - If prices on non-cash crops decreased, no effect on outmigration

Conclusion

- Agriculture still very much dependent on environmental inputs
- Relationship often highly nonlinear (temperature, droughts, ozone)
- Climate change lowers productivity growth in current growing areas