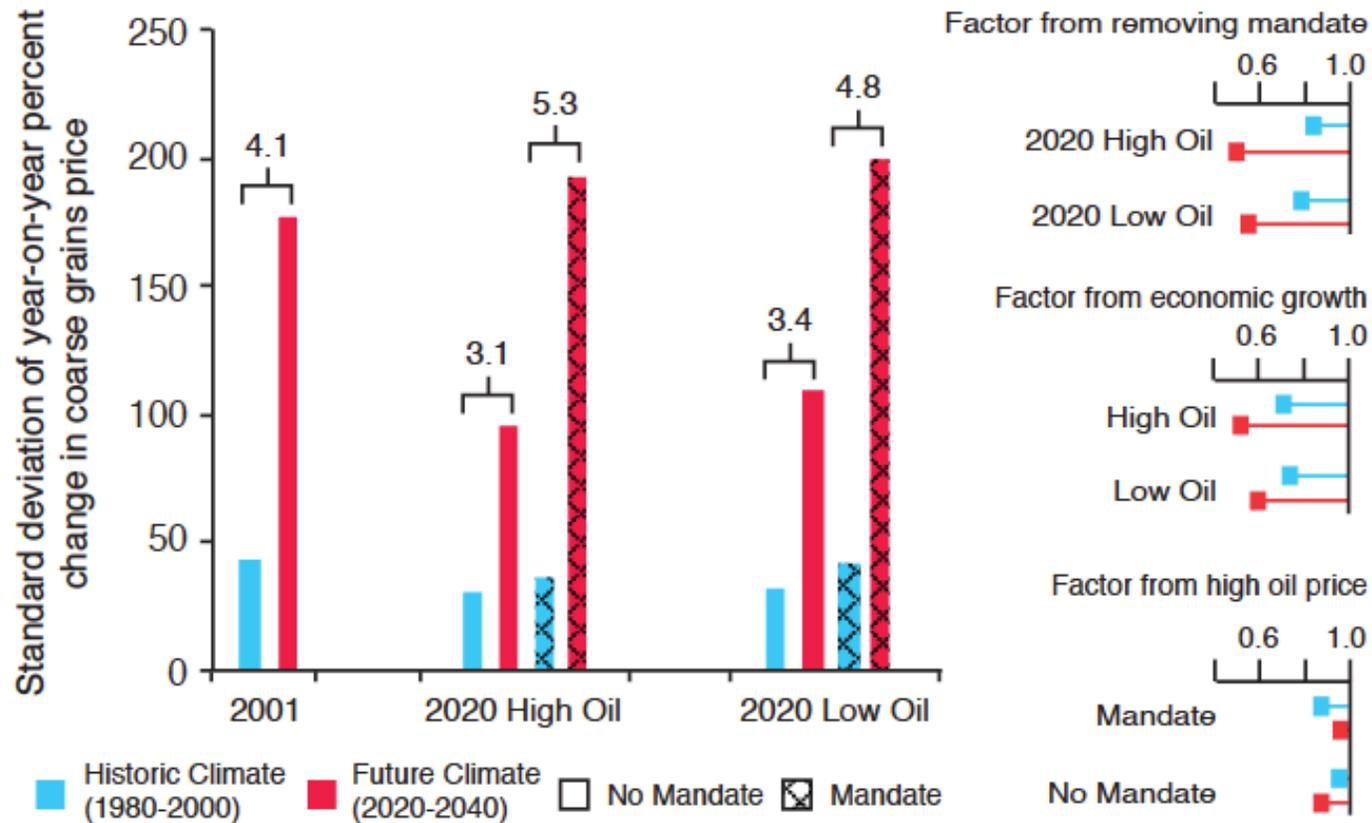
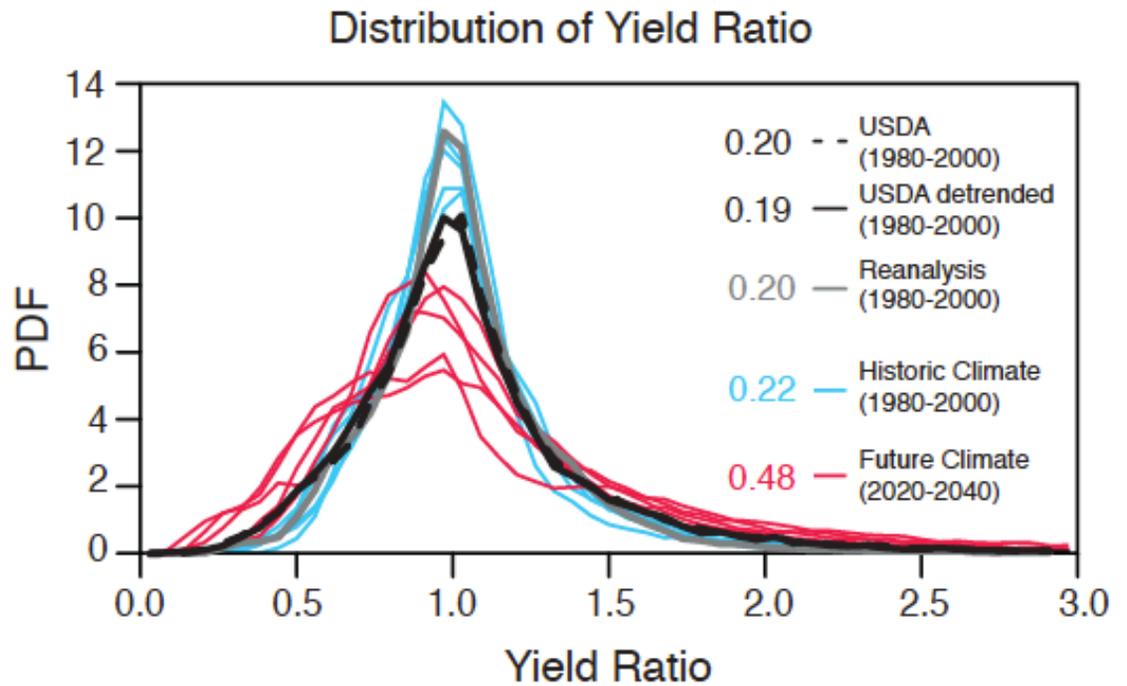
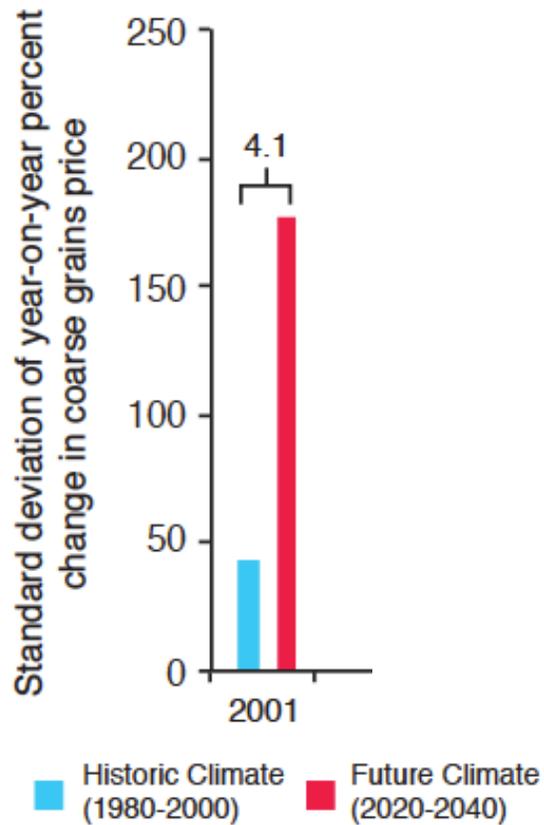


Climate-Energy-Policy Interaction



What we missed was Adaptation:

- How can policy on bio-fuels affect it? Trade?

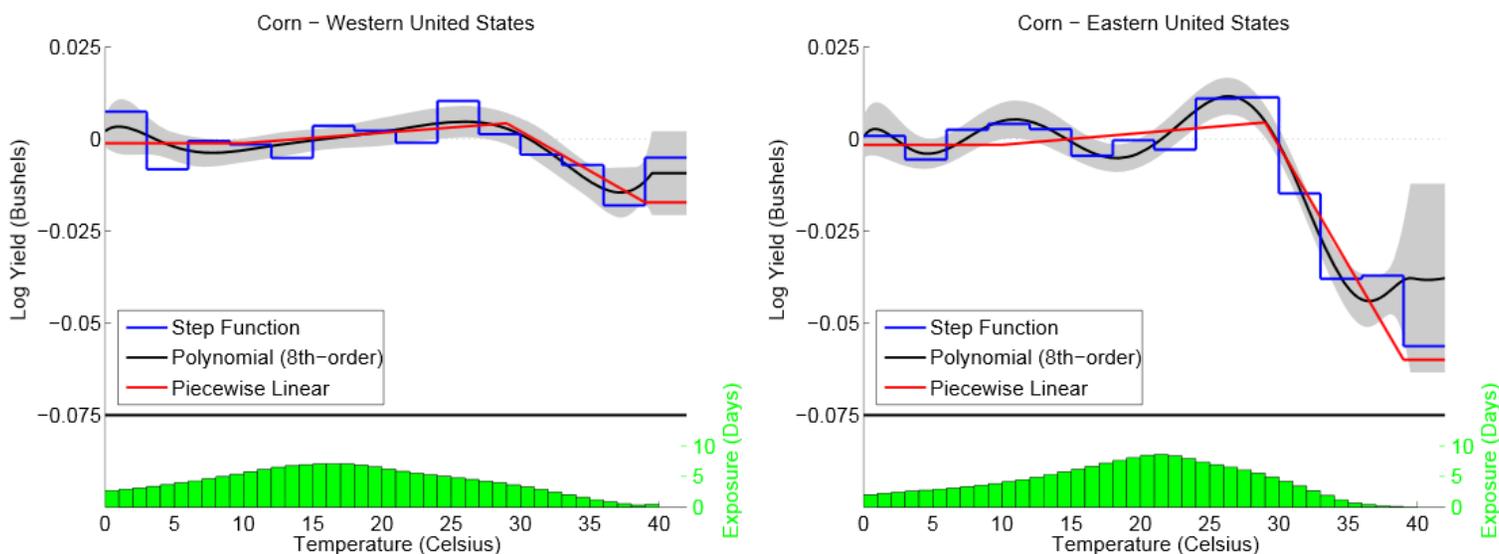


What about irrigation as adaptation?

Corn price Standard Deviation quadruples due to doubled SD of US corn yields, driven by Climate change

Irrigation's Potential Impact

- How irrigation affects yield (model input, US yield SD) $YR_{US,t} = \sum_c w_c YR_{ct}$
- S&R: effect of temperature much different in East and West, major difference - irrigation



Source: Schlenker and Roberts, PNAS 2009, Fig A10

Yield Variability as input

Start with the modified S&R regression (NCC study)

$$\frac{y_{ct}}{y_{ct-1}} = YR_c = e^{\alpha\Delta\phi_{ct}^- + \beta\Delta\phi_{ct}^+} \cdot e^{\delta_1\Delta P_{ct} + \delta_2\Delta P_{ct}^2}$$

$$\left. \begin{aligned} YR_{cn} &= e^{\phi_{cn}'''} \cdot e^{P_{cn}'''} \\ YR_{ci} &= e^{\phi_{ci}'''} \cdot e^{P_{ci}'''} \end{aligned} \right\} \text{Same functional form}$$

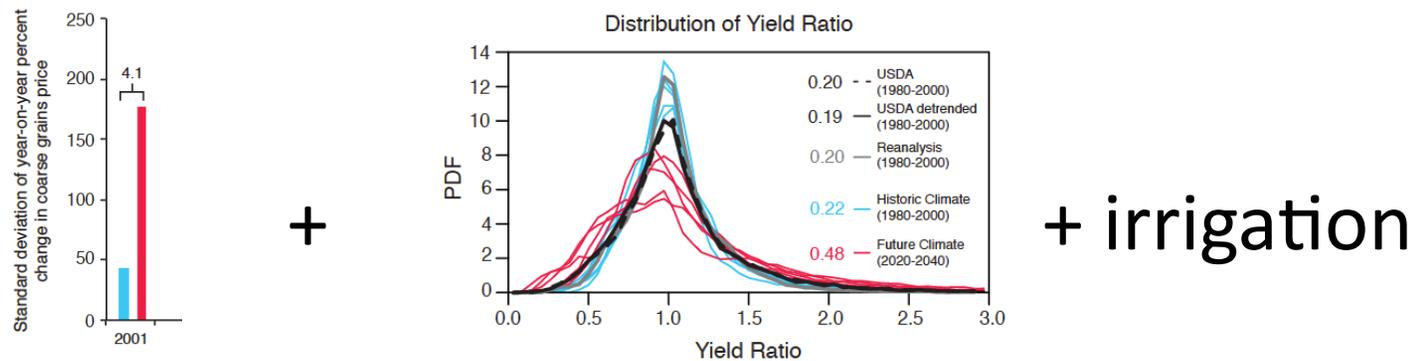
$$YR_c = (w_{ci}YR_{ci} + w_{cn}YR_{cn}); w_{ci} + w_{cn} = 1$$

Irrigated and non-irrigated corn production shares in county's corn production

- USDA-NASS data for Nebraska– irrigated and non-irrigated corn yield/production county data (1990-2012)
- Construct the same metric for Nebraska
 - Yield SD for irrigated corn: 0.12
 - Yield SD for non-irrigated corn: 0.34 (~ 3 times)
 - Yield SD: 0.15

- Question, what our previous graphs would look like with irrigation.

- Focus on simple case, leave out policy and oil price scenarios, concentrating on just climate change



- How do we bring in irrigation into our standard model framework, for comparison with earlier results?

- $$YR_{US} = \sum_c w_c (w_{ci} YR_{ci} + w_{cn} YR_{cn})$$

$$= \underbrace{\sum_c (w_c YR_{cn})}_{\text{no-irrigation story}} \left(w_{ci} \frac{YR_{ci}}{YR_{cn}} + w_{cn} \right)$$

- what we had with our no-irrigation story
- Know its present climate SD
- Know that it doubles with climate change

A more generic version, including irrigation

Implications

- Case 1: No Irrigation ($w_i = 0, w_n = 1$)

$$YR_{US} = \sum_c (w_c YR_{cn})$$

- Same as NCC work form, with no irrigation

- Case 2: Full Irrigation ($w_i = 1, w_n = 0$)

$$YR_{US} = \sum_c (w_c YR_{cn}) \frac{YR_{ci}}{YR_{cn}}$$

Simplifying assumptions in absence of data –

- NE data applies to all counties/states
- UNL study to approximate $\frac{e^{\phi_{ci}}, e^{P_{ci}}}{e^{\phi_{cn}}, e^{P_{cn}}} = \frac{YR_{ci}}{YR_{cn}}$ (Grassini, Yang, Cassman 2009)

$$\left(\frac{e^{\phi_{ci}}}{e^{\phi_{cn}}} = \frac{-0.32}{-0.34} \text{ and } \frac{e^{P_{ci}}}{e^{P_{cn}}} = \frac{0.30}{0.67} \right)$$

- $\frac{YR_{ci}}{YR_{cn}} = 0.42 < 1$ implies

“year on year yield ratios for fully irrigated crop are less than those for non-irrigated crop, hence pointing to potential of irrigation as adaptation”

- SD with irrigation = 0.42*SD without irrigation

- Case 3: Partial irrigation ($w_i = a, w_n = 1 - a$)

$$YR_{US} = \sum_c (w_c YR_{cn}) \left[1 - w_{ci} \left(1 - \frac{YR_{ci}}{YR_{cn}} \right) \right]$$

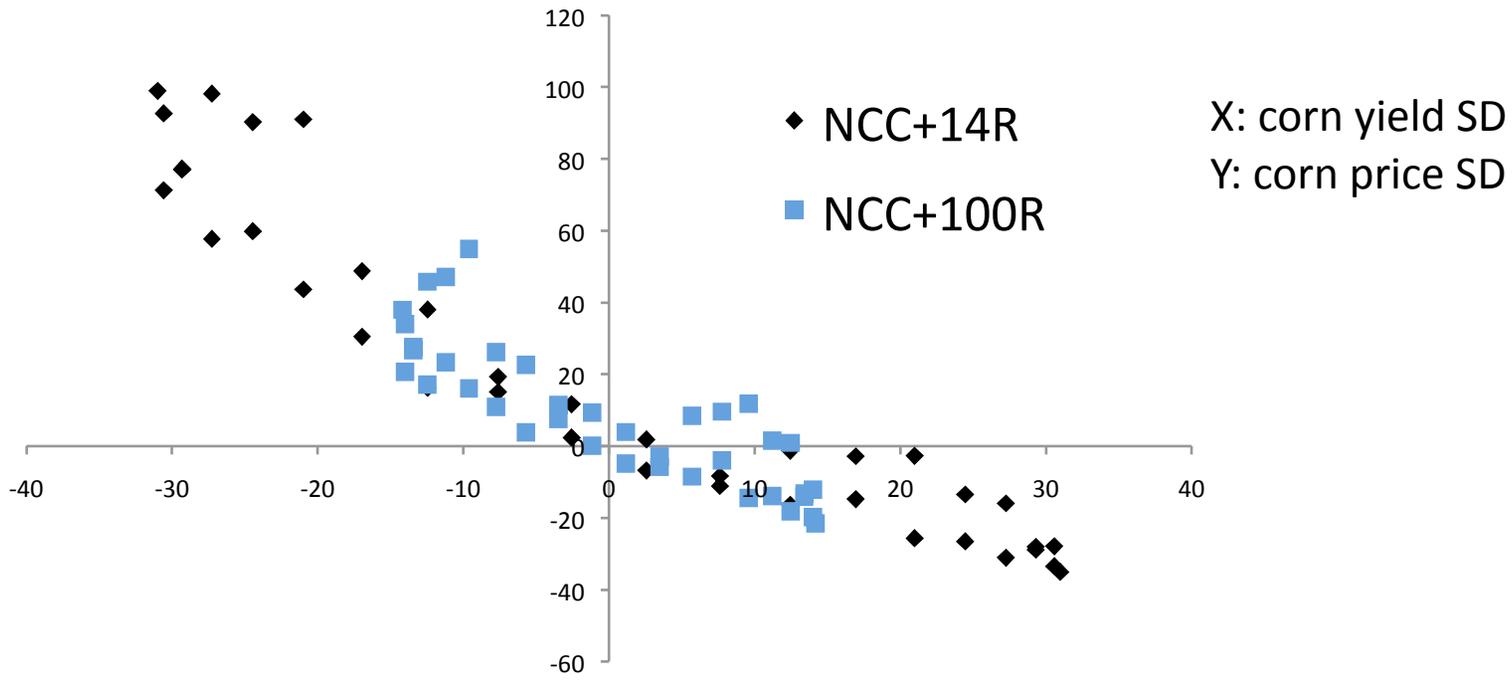
– SD is decreasing in share of production under irrigation

a	$a \frac{YR_{ci}}{YR_{cn}} + (1 - a)$	Rebased	SD (US yield)
Case1: no irrig	1	1.09	23.89
Case3(Base for 2001): 0.14	0.92	1	21.92
Case2: full irrig	0.42	0.46	10.03

Implementation

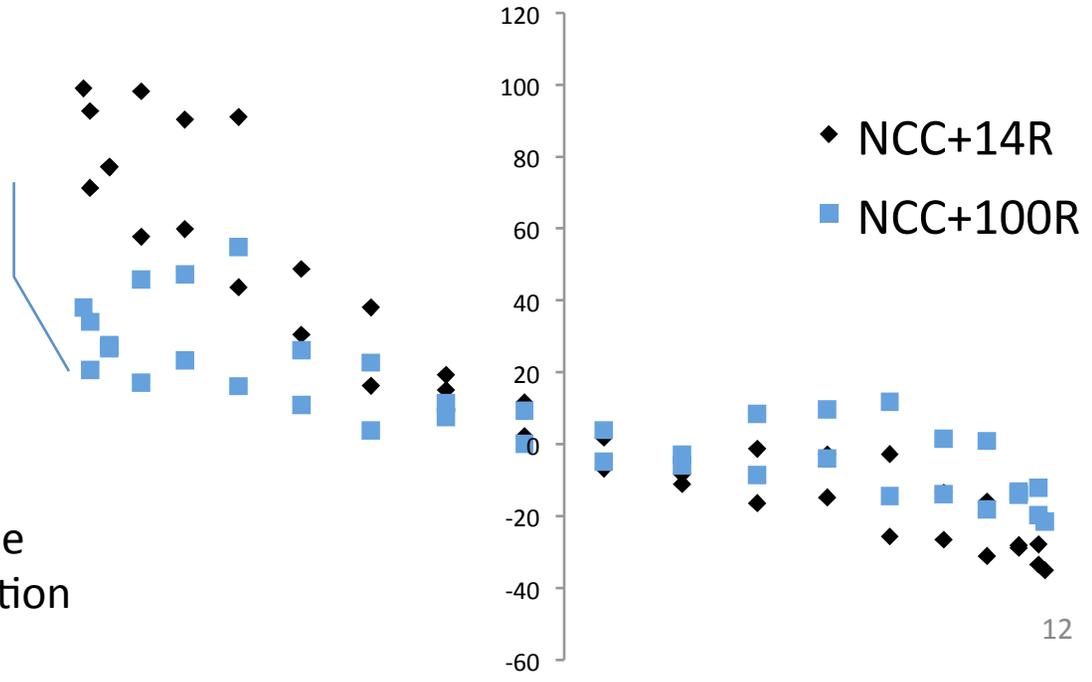
- Use the factor to scale the yield distribution
- Scenarios
 - NCC + 14R (yield SD ~ 22)
 - NCC + 100R (yield SD ~ 10.03)
 - CC + 14R (yield SD ~ 44/20)
 - CC + 100R (yield SD ~ 39/4)
- What happens with climate change? $\left(\frac{YR_{ci}}{YR_{cn}}\right)$

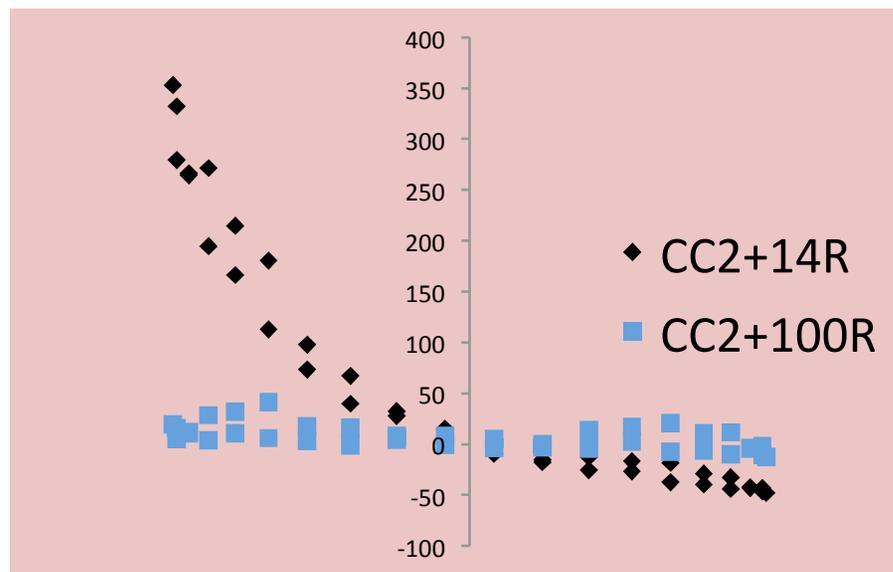
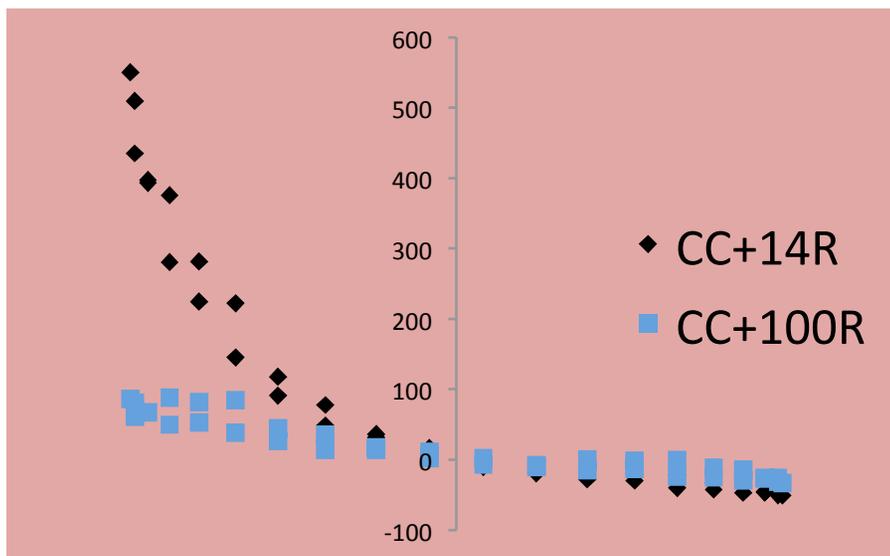
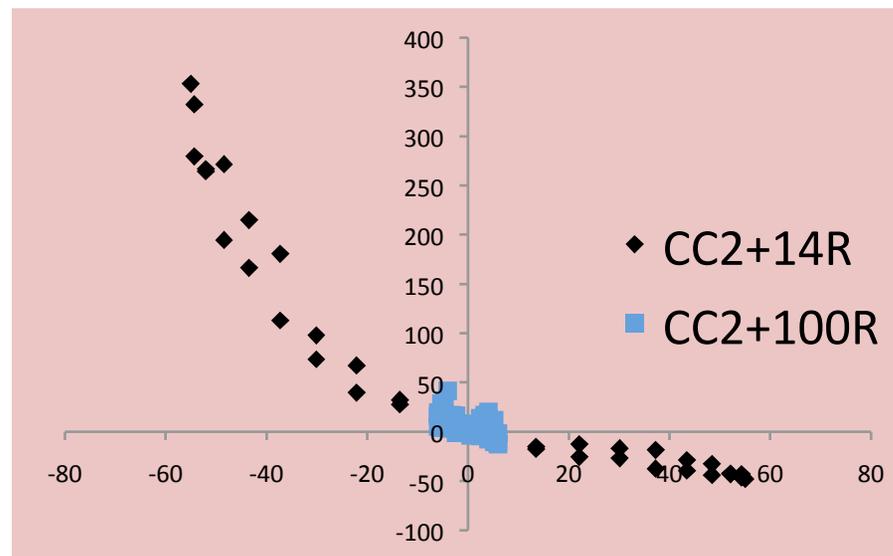
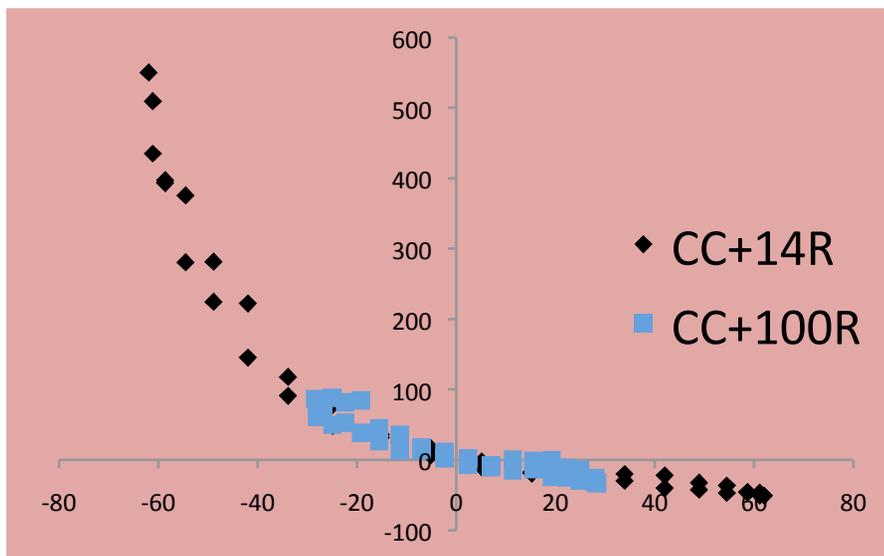
$\frac{YR_{ci}}{YR_{cn}}$ remains same in future climate or is halved, 2 extremes [0.42,0.21]



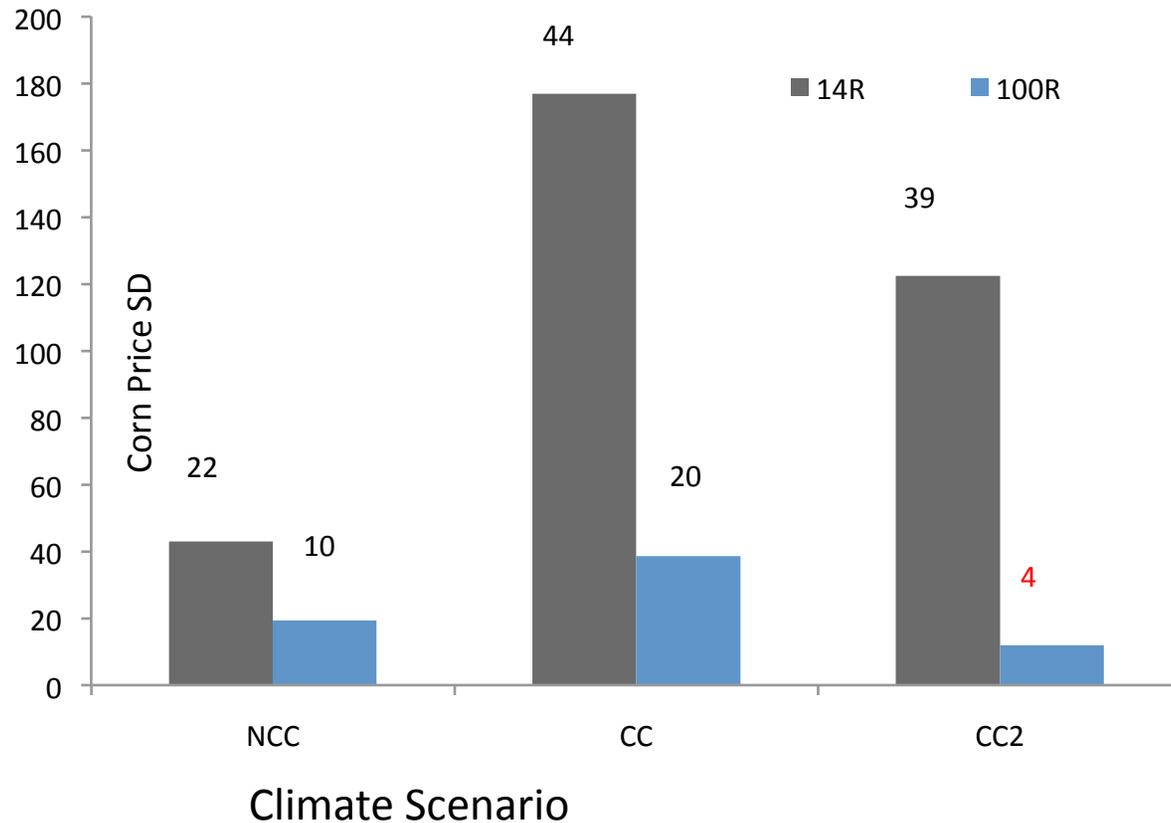
Vertical distance: difference in price SD coming from irrigation

Y: corn price SD
Two points on same vertical line represent same climate realization





Price and Yield SD under different climate and irrigation combinations



Height of Bar indicates Price SD and number next to bar is the yield SD

- Strange result (with irrigation even after climate change we get less variability than under same irrigation % and no climate change)
 - Other study: one from Swiss corn (Finger et al 2011, ClimChng)
- Bring in more economics: even if irrigation is effective, under what conditions would it be feasible/viable to use
 - One approach would be to take multiple corn price realizations for future and see if its profitable for farmers to use surface, ground water to irrigate
 - Cost of irrigation, infrastructure.
- Collaborate with actual working water model and see if these insights hold, magnitude of impact would likely change

