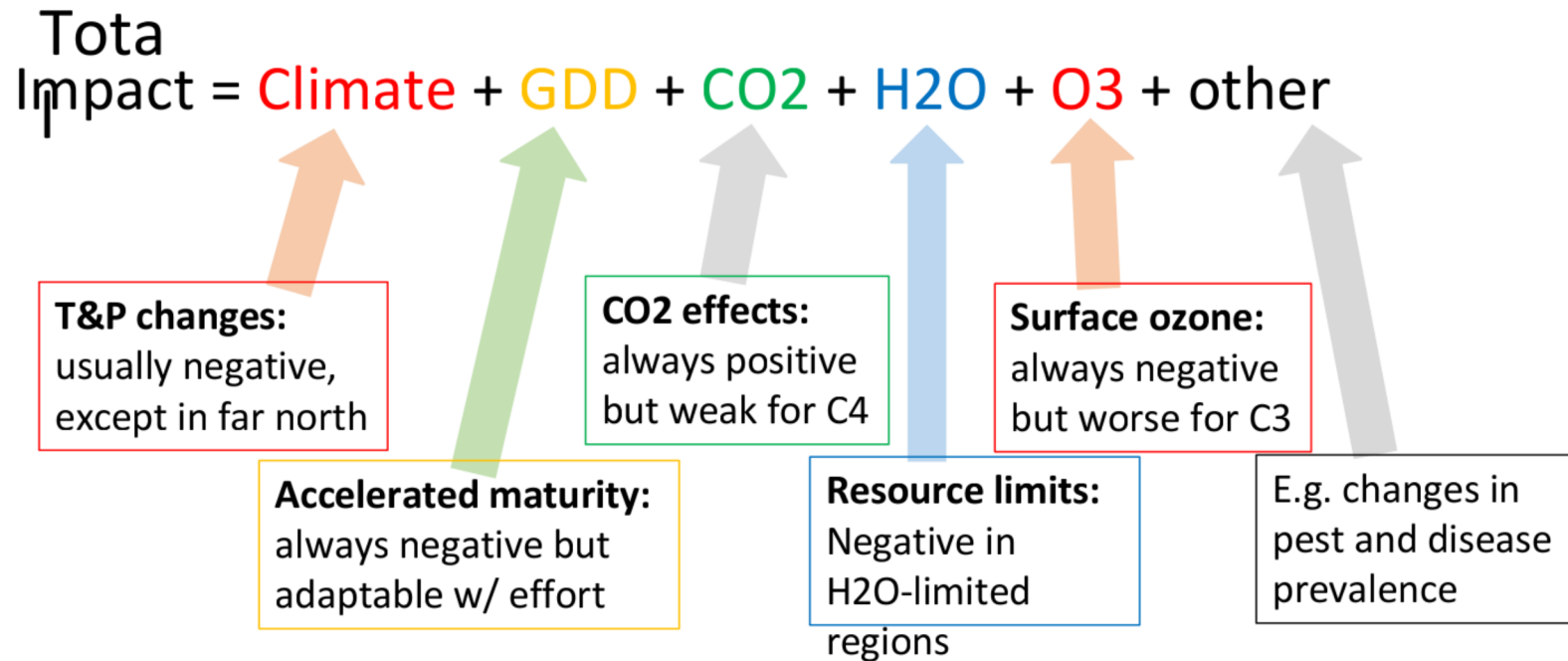


Deficiencies of models, data, methods, and applications

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How do emissions impact food production?



- Effects of emissions on crops are **highly complex**
 - Many of these terms have **strong interactions!**
 - **Requires integrated approaches** to modeling to inform integrated approaches to adaptation (esp. breeding)

Deficiencies of models, data, methods, and applications

- Known model issues
 - + Heat; drought; phenology
 - - Flood damage; uncertain CO₂ response; diffuse radiation; high T sterilization; planting dates; cold temperatures
- Unknown model issues (could become major issues in future climate)
 - Complex CO₂ responses (e.g. nutrients)
 - Ozone damage
 - Increased pest/disease?
 - Soil microbiome; etc.

CO2 and yield

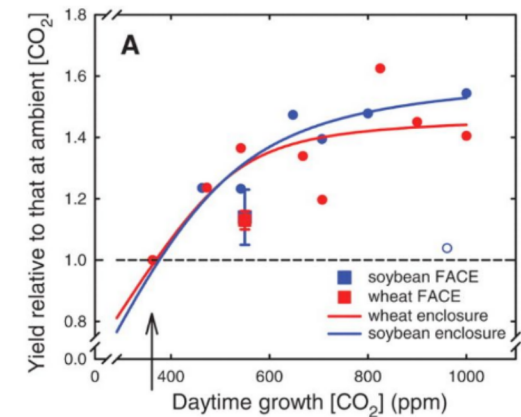
+ CO2



[CO2] effects:
always positive
but weak for C4

- Many and diverse effects of ↑ CO2
 - ↑ photosynthesis rate in C3 plants
 - ↓ water use in all plants
- Soy sees largest yield benefit by far
- C4 only gets effective benefit from water use in drought years
- Limitations of CO2 effects
 - Effect rapidly flat after ~550ppm
 - Effects limited by nutrient availability
 - Food quality (protein, zinc and iron) declines with CO2 in C3 crops

Source	Rice	Wheat	Soybeans	C4 crops
Kimball (1983)	19	28	21	-
Curren and Accock (1986)	11	10	22	27
Curren and Accock (1988)	35	21	32	4
FACE studies	9	13	19	6




Can breeding realize higher potential yield gains from CO2?

Deficiencies of models, data, methods, and applications

- Data issues (esp. for large scale studies)
 - Management data (fertilizers, irrigation, planting, cultivar, etc.)
 - Soil data and dynamics
 - Reference data quality
 - Generating/using proxies from remote sensing more effectively
 - Historical climate in data-poor regions
 - Climate change at the extremes
- Methodological issues
 - Model uncertainty
 - Accelerated phenology and adaptation
 - Calibration methods (esp. in data poor environments)
 - Inter-season dynamics
 - Calories to nutrients
 - Extreme events and variability
 - Orphan crops
 - Representations of irrigation
 - Linking approaches across scales
- Applications
 - Seasonal forecasting
 - Interactions between climate, extremes, tech trends, management, LUC, demand...
 - Data integration and Reanalysis
 - Deep model comparison
 - Coupled cross-domain decision support

Accelerated maturity and adaptation

- As temps , phenologies based on accumulated thermal units (GDD) experience **accelerated maturity**
 - Especially strong for cereal crops, weak for soybean
- Recent rate of genetic gain $\sim 1/4$ that required to keep up w/ expected warming
- Adaptation natural in breeding, but not perfect
 - ≥ 10 year “adaptation delay” expected w/o intervention (considered here as the **Business-As-Usual** case)

Can breeding keep up as climate change accelerates?

+ GDD



Accelerated maturity:
always negative but
adaptable w/ effort