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Science and Research Division

# Sensitivity Study of NSW Wheat Yield to Climate Change

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A horizontal collage of agricultural images: a forest, blue fish, a factory at night, two cows, sunflowers, and red tomatoes.

# Outline

- A brief overview of approaches for agricultural impact assessment from CC
- Research objectives and rationale
- Methodologies
  - Study locations
  - Tools and data
- Results
- Summaries



# Approaches and Stages of Agricultural Impact Assessment

## ■ Approaches

- Simulation: one of the major methods
- Climate changes were coupled with dynamic or mechanism crop models...

## ■ Three distinctive stages

- Sensitivity analysis: arbitrary changes (disconnected)
- Scenario analysis: GCMs based
- Bayesian analysis: GCMs based with probability assigned



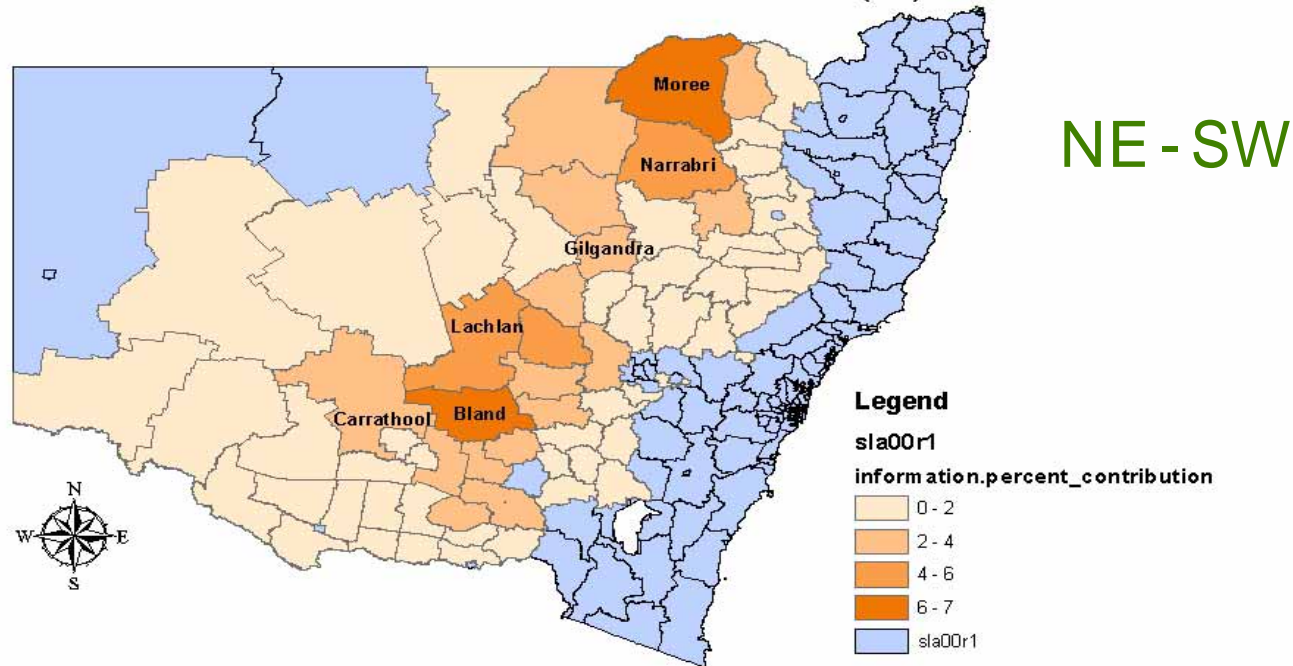
# Research Objectives and Rationale

- Wheat is an important crop in NSW (16% of NSW agricultural value)
- Climate is the major driving force of dryland agriculture
- Research objectives
  - Test the sensitivity of NSW wheat grain yield to climate change
  - Screen out the important environmental factors for informing adaptation



# Study Locations

Shire Level Wheat Production Contribution (%)





# Classification of Study Locations

<b>Locations</b>	<b>GSR* (mm)</b>	<b>Rainfall Areas</b>
<b>Moree</b>	<b>224</b>	<b>LRA<sup>1</sup></b>
<b>Narrabri</b>	<b>280</b>	<b>MRA<sup>2</sup></b>
<b>Gilgandra</b>	<b>259</b>	<b>MRA</b>
<b>Lachlan</b>	<b>201</b>	<b>LRA</b>
<b>Carrathool</b>	<b>210</b>	<b>LRA</b>
<b>Bland</b>	<b>252</b>	<b>MRA</b>

\*GSR: growing season rainfall from May to Oct. inclusive

1: low rainfall area, 2: medium rainfall area



# Tools and Data

- Tool: the Agricultural Production System simulator (APSIM)-Wheat model
- Data
  - Soil water and nutrients: parameters
  - Crop genetic coefficients: P and V
  - Crop management information
    - Cultivars
    - Fertiliser/ residue application: timing, amount and type
    - Planting density and depth
  - Climate
    - Historical daily climate data: 1901-2007
    - Climate Change



# Soil

- Two extreme soils
  - Kandosol, MAW\* = 487mm
  - Sand, MAW = 90mm
- Initial soil condition
  - Soil water
  - Soil nitrogen
  - Residuereset on 1<sup>st</sup> March each year

MAW: maximum available water



# Cultivars and Sowing Rules

## ■ Cultivars

- Sunvale: mid-late maturing cultivar
- Janz: early mature cultivar

## ■ Sowing rules

- Criteria

Medium rainfall areas:  $\text{cumR}[3] \geq 20\text{mm}$

Low rainfall areas:  $\text{cumR}[3] \geq 15\text{mm}$

- Sowing

Criteria are met between 15Apr - 15Jun then sow Sunvale

Criteria are met between 16Jun - 15Aug then sow Janz

Criteria not met: forced sowing applies on the 15<sup>th</sup> Aug  
associated with cultivar of Janz



# Crop Management Information

<b>Rainfall Areas</b>	<b>Planting density (plants/m<sup>2</sup>)</b>	<b>Planting depth (mm)</b>	<b>Starting N (kg/ha)</b>	<b>Residue application (kg/ha)</b>
<b>MRA</b>	<b>150</b>	<b>30</b>	<b>187</b>	<b>2000</b>
<b>LRA</b>	<b>100</b>	<b>30</b>	<b>137</b>	<b>1000</b>

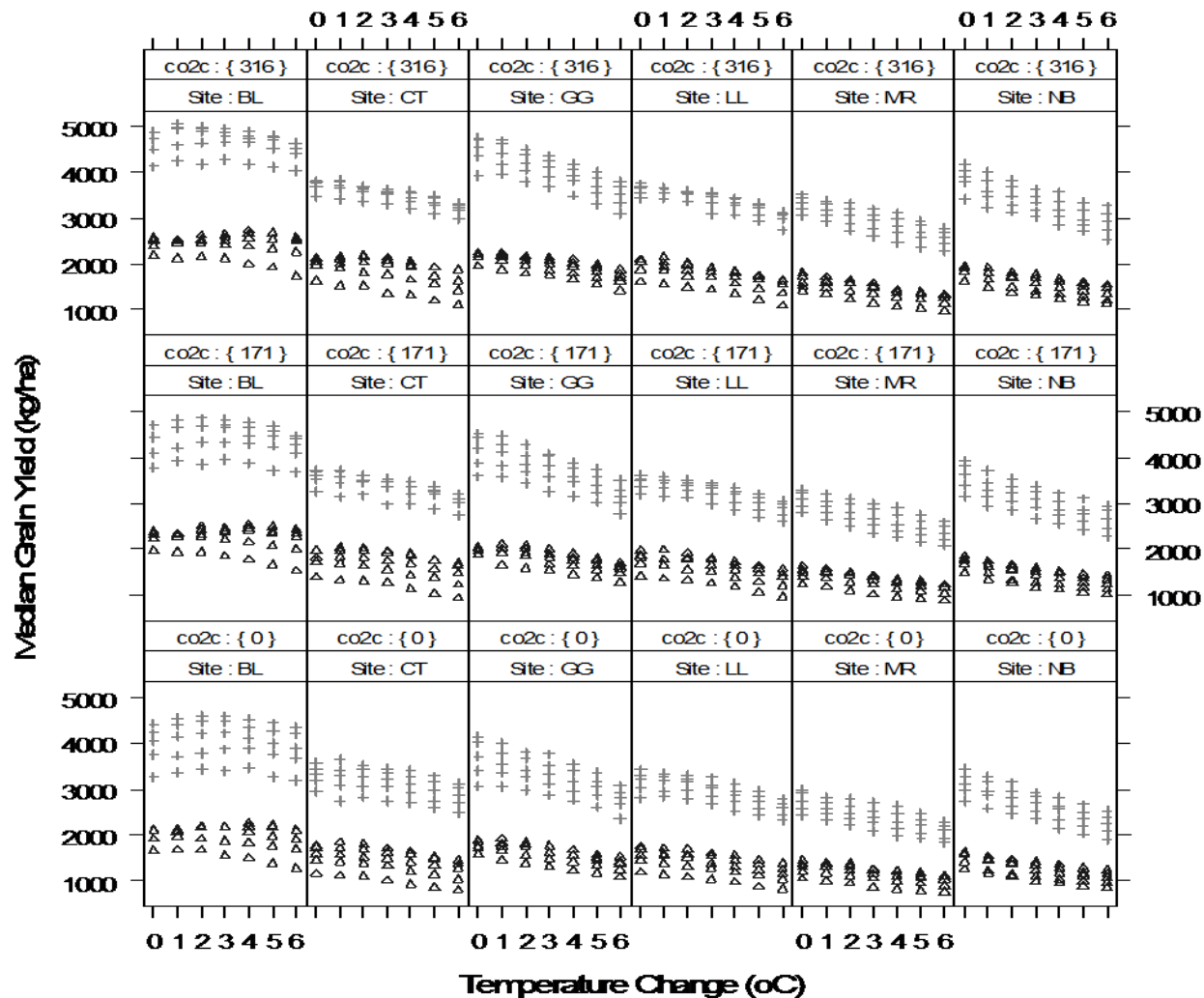


# Arbitrary Climate Changes

- 7 change levels in temperature: 0, 1, 2, 3, 4, 5, 6°C
- 5 change levels in rainfall: 0, ±10%, ±20%
- 3 change levels in pCO<sub>2</sub>: 0, 171, 316ppm
- Total simulation runs=1260
  - Climate changes ( $7*5*3*=105$ )
  - Two soil types
  - Six locations



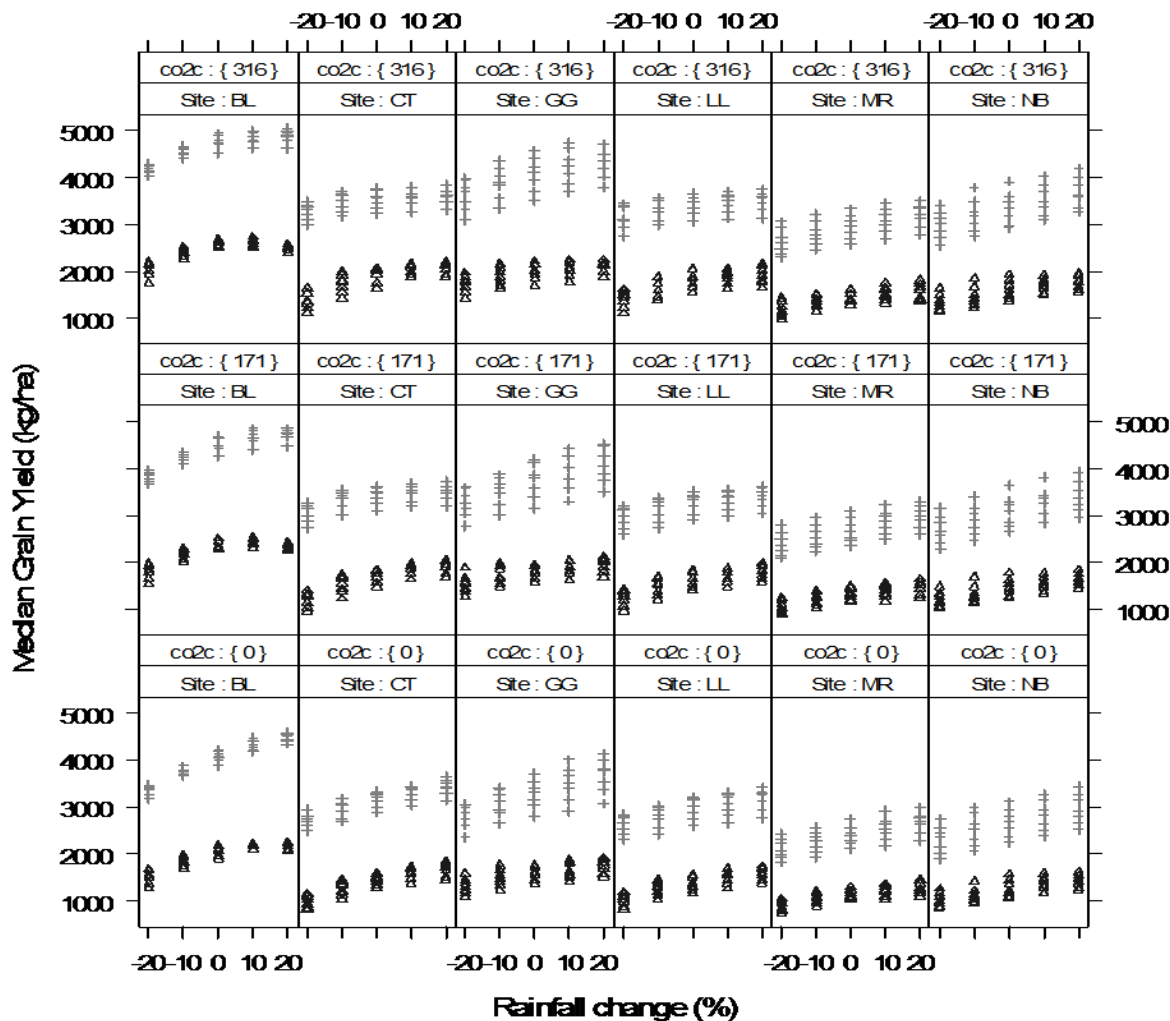
# Yield Response to Environmental Factors (I)



- Kandosol(+) and Sand (Δ)
- Different sites have different response to soil type
- MGY has a negative correlation with T: linear or non linear
- MGY at the last 4 sites is more sensitive to temperature change levels under Kandosol
- $MGY \propto pCO_2$



# Yield Response to Environmental Factors (II)



- $MGY \propto R$ : linear and non-linear (BL, sand)
- MGY at the last 4 sites is more sensitive to temperature change levels under Kandosol
- $MGY \propto pCO_2$

# More on the Relationship between MGY and Climate Changes

$\Delta T$ ( $^{\circ}\text{C}$ )	0	1	2	3	4	5	6
$\Delta$ rate of MGY ( $\text{kg ha}^{-1} \text{ } ^{\circ}\text{C}^{-1}$ )		-57	-60	-81	-89	-106	-112
$\Delta R$ (%)	-20	-10	0	10	20		
$\Delta$ rate of MGY ( $\text{kg ha}^{-1} \text{ mm}^{-1}$ )		23.6	16.1	10.3	7.4		
$\Delta p\text{CO}_2$ (ppm)	0	171	316				
$\Delta$ rate of MGY ( $\text{kg ha}^{-1} \text{ ppm}^{-1}$ )		1.7	1.3				

The rate of decrease in MGY is more for higher  $T_s$

The rate of increase in MGY is less for higher  $R$  and  $p\text{CO}_2$

Non-linear relationship with climate changes



# Important Environmental Factors

- Soil type
- Location (R)
- Interaction (soil type X location)
- Rainfall change
- Interaction ( $\Delta$ temperature X location)
- Temperature change
- $pO_2$  Change

ANOVA analysis with Bland under Kandosol soil as the reference, at 0.1% significant level



# Informing adaptation

- Cropping on good soils with higher water holding capacity when decreased rainfall is projected
- Cropping at areas with better baseline climate such as higher growing season rainfall areas
- Promote soil water conservation practices such as no tillage, stubble retention, even though their actual beneficial effects and effectiveness need to be quantified
- Improving water use efficiency: choice of cultivars with early vigour
- Breeding drought, heat tolerant wheat cultivars



# Acknowledgement

- This project is funded by NSW DECC under climate change action grant
- The following personnel is acknowledged
  - Dr. Helen Fairweather from Qld CCC
  - Mr. Perry Wiles from NSW BOM



Thank You!