

# Use of Crop-Climate Models to Develop Advisories

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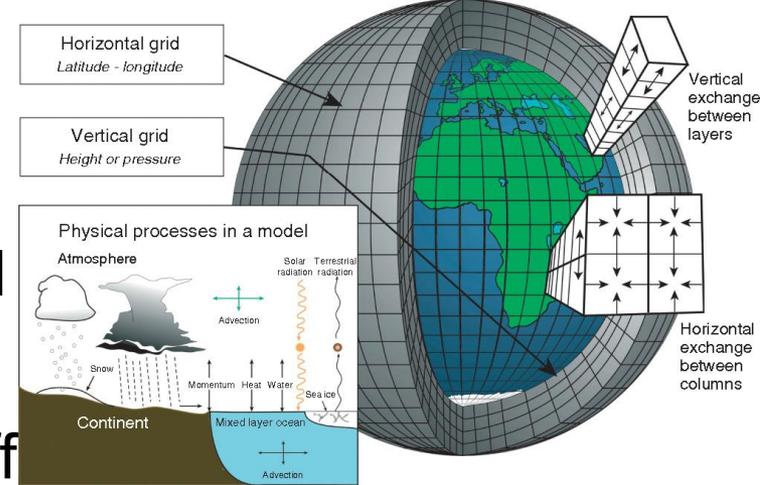
11<sup>th</sup> June 2021

**Plant Health in South Africa – Threats to  
Biosecurity, Biodiversity and Food Security**



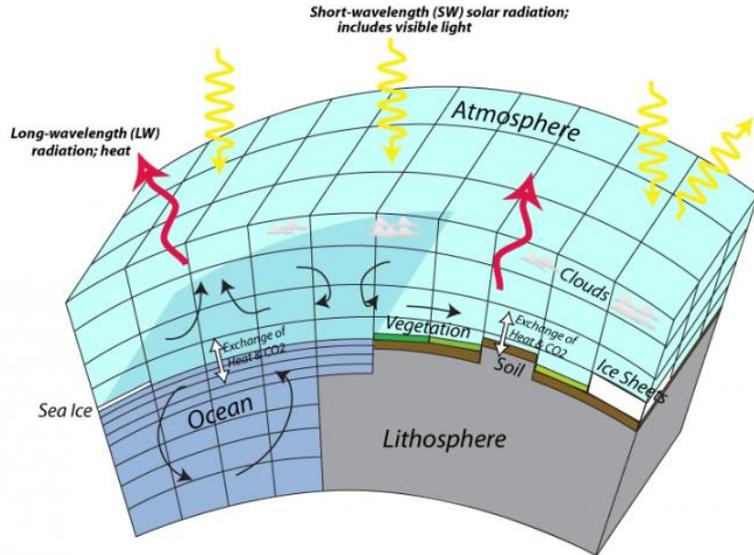
# Some Basics

- A model is representation of the real world.
- **A global climate model (GCM) is**
- a simulation of all factors that can affect climate.
- a complex mathematical representation of major climate system components (**atmosphere, land surface, ocean, & sea ice**), & their interactions.
- Separates the Earth's surface into 3-dimension grid of cells.
- Results of matter & energy processes modelled in each cell are passed to neighbouring cells over different time steps.
- Earth's energy balance between the four components is key to long- term climate prediction.
- Some factors do not change - region's distance from shore, elevation & latitude.
- Some factors do change - seasons, volcanic eruptions, air pollution.

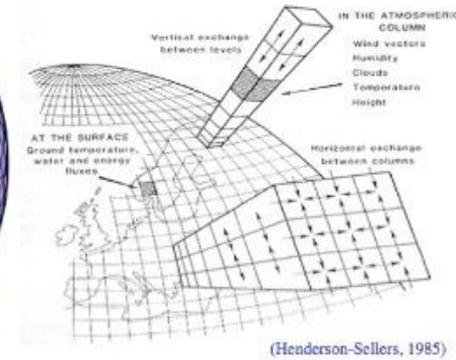
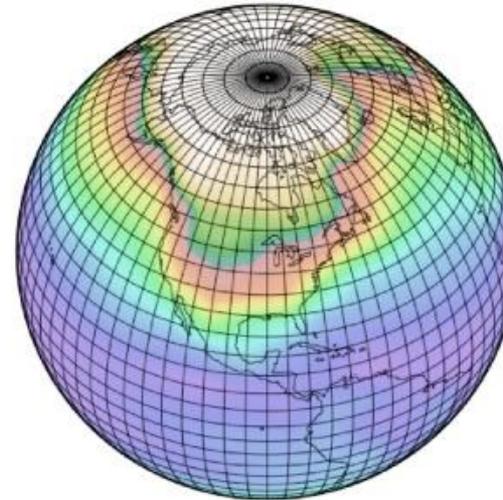


# Climate Models

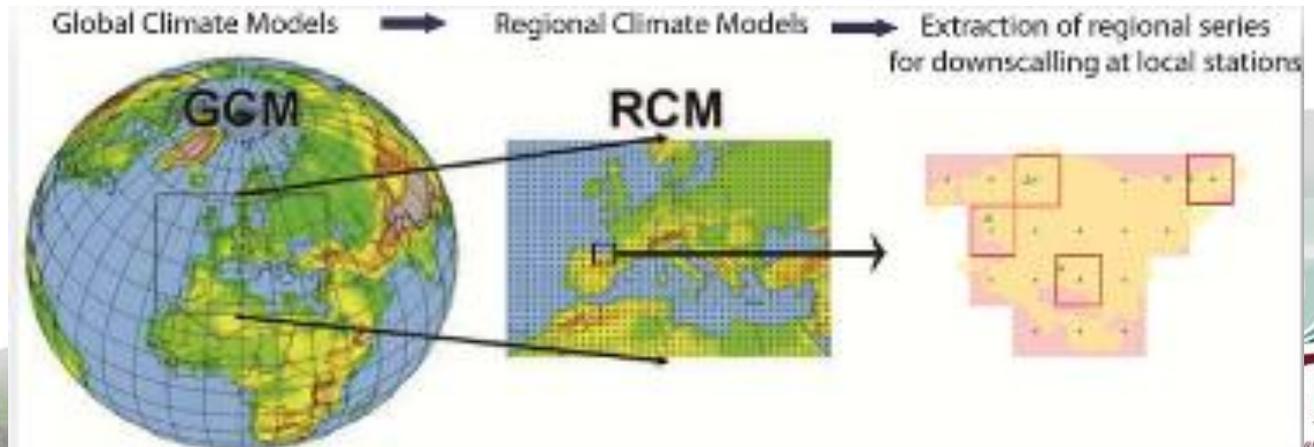
## Energy balance



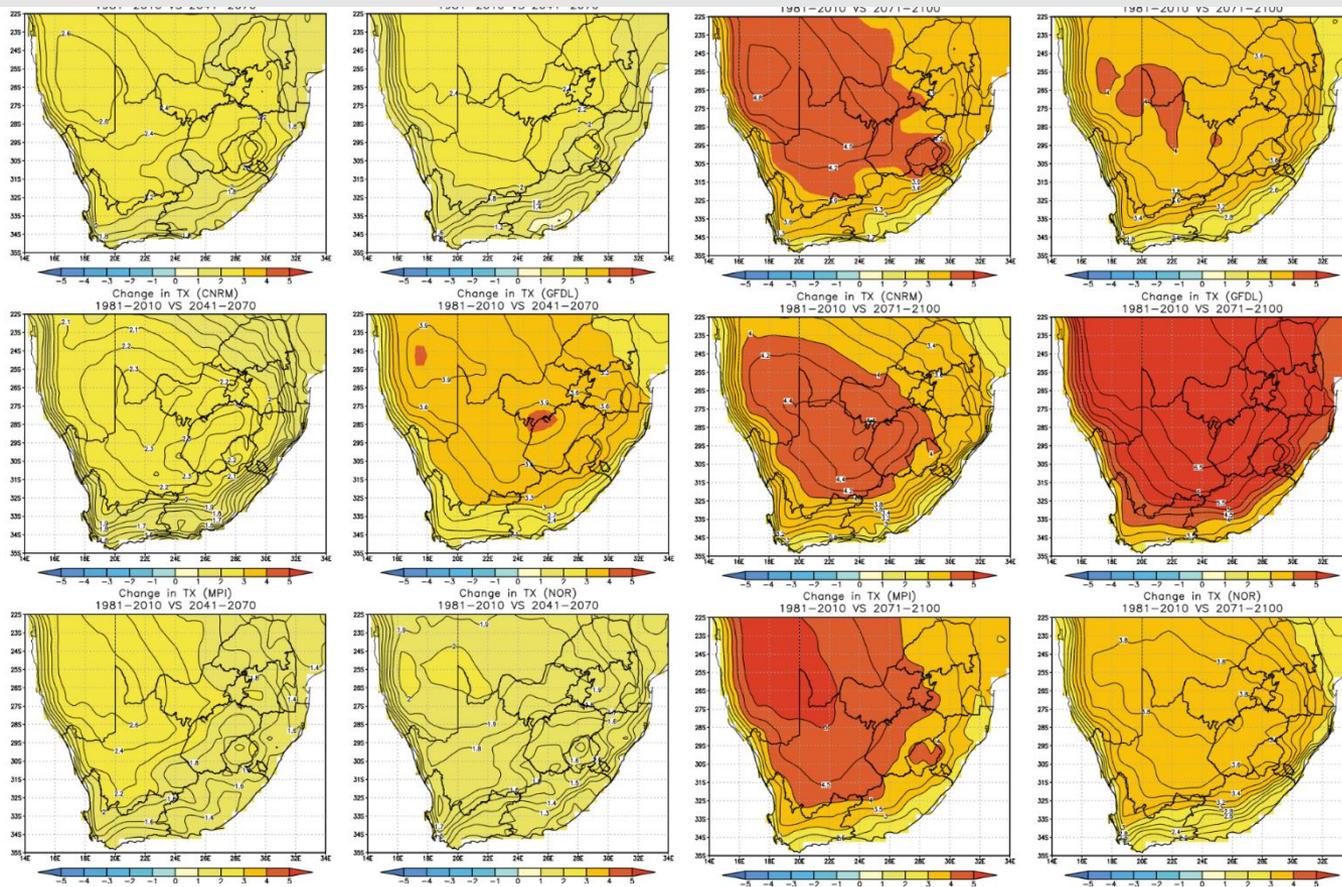
## 3-Dimension grid around globe



## Down-scaling



# Climate change across RSA



Warming is projected to take place over entire country.

- On left change in maximum temperature for 2041-2070  $\pm 2-3^{\circ}\text{C}$
- On right  $\pm 3-5^{\circ}\text{C}$  for max Temp 2071-2100
- Relative to 1981-2010

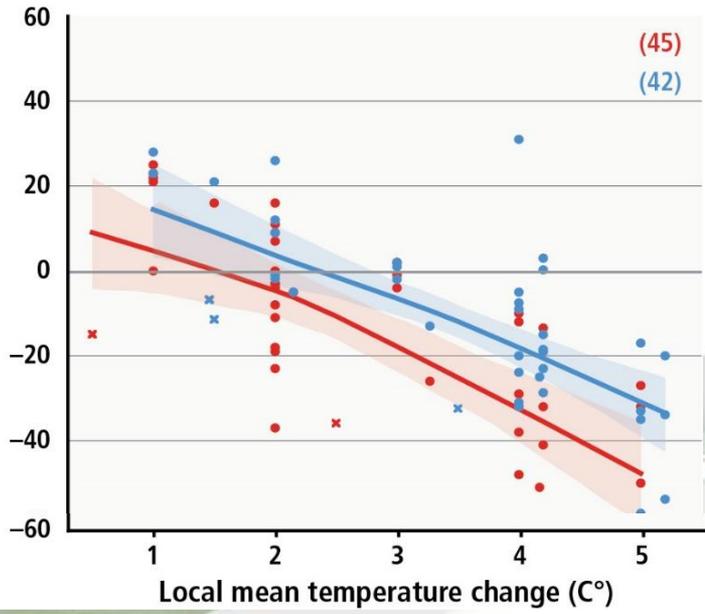
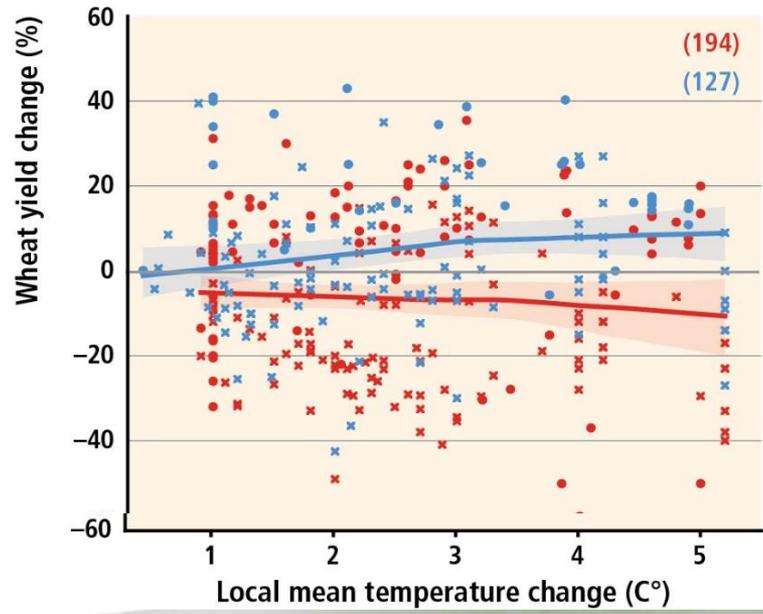
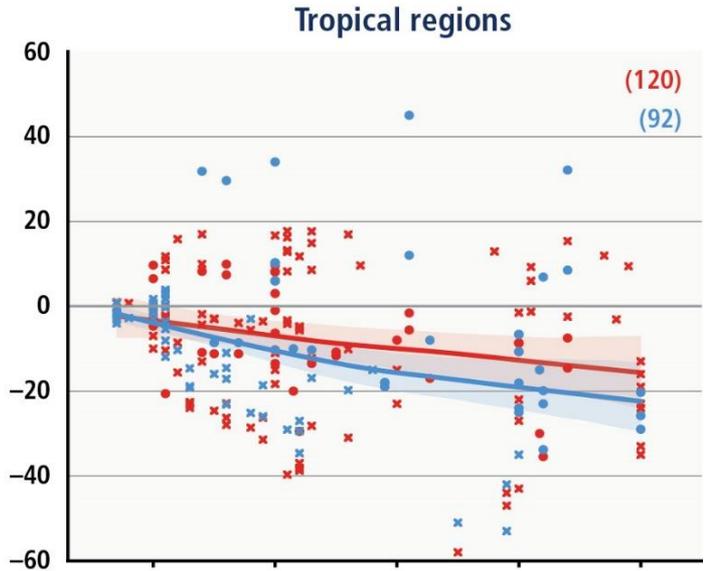
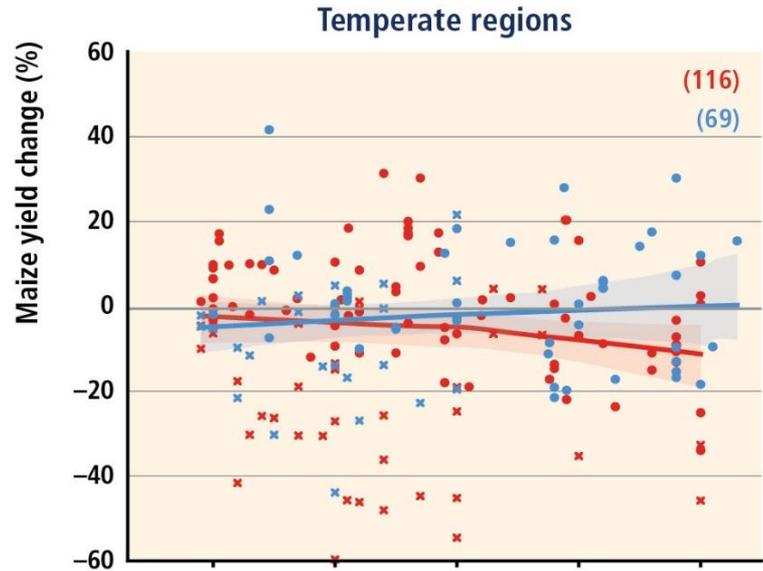
## **IMPLICATIONS FOR AGRICULTURE IN SOUTH AFRICA**

More frequent droughts - More heat waves of longer duration - Reduced soil moisture - Shorter growing season - Longer burning season - Reduced maize crop yield - Reduced livestock production

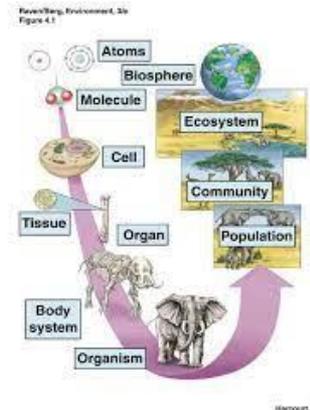
Part of the ARC-CCCC project titled *"Future projections of extremes, singularities and atmospheric mass transport, and its implications for the agricultural sector"* Dr Christien Engelbrecht



# Effect of Temperature on Crop Production



# Some Basics continued



- **A crop-climate model** is mathematical equations that represent reactions occurring within plants & interactions between crops & environment.
- Agricultural systems are characterized by many organizational levels - from individual components in single plant, thru constituent plants, to farms or a whole agricultural region or nation.
- main aim of crop models is to estimate harvestable (economic) yield.
- Types of models:
  - Empirical – regression equations – not easily transferable
  - Mechanistic – describe behavior of system & mimic relevant physical, chemical or biological processes
  - Static and dynamic models – without or including Time - as differential equations
  - Deterministic & stochastic models – definite predictions for quantities
  - Simulation & optimizing models – imitate system & management options

# Crop Simulation Models

According to specific crop characteristics and environment

- Usually daily time step
- Soil and crop characteristics as standard input
- Daily climate data
- Agronomic management practices
- Need calibration & validation for cultivars & environment
- Predict growth, development, yield, water use

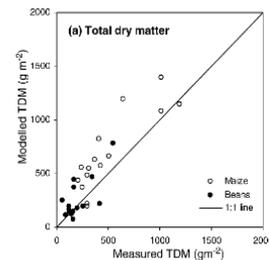
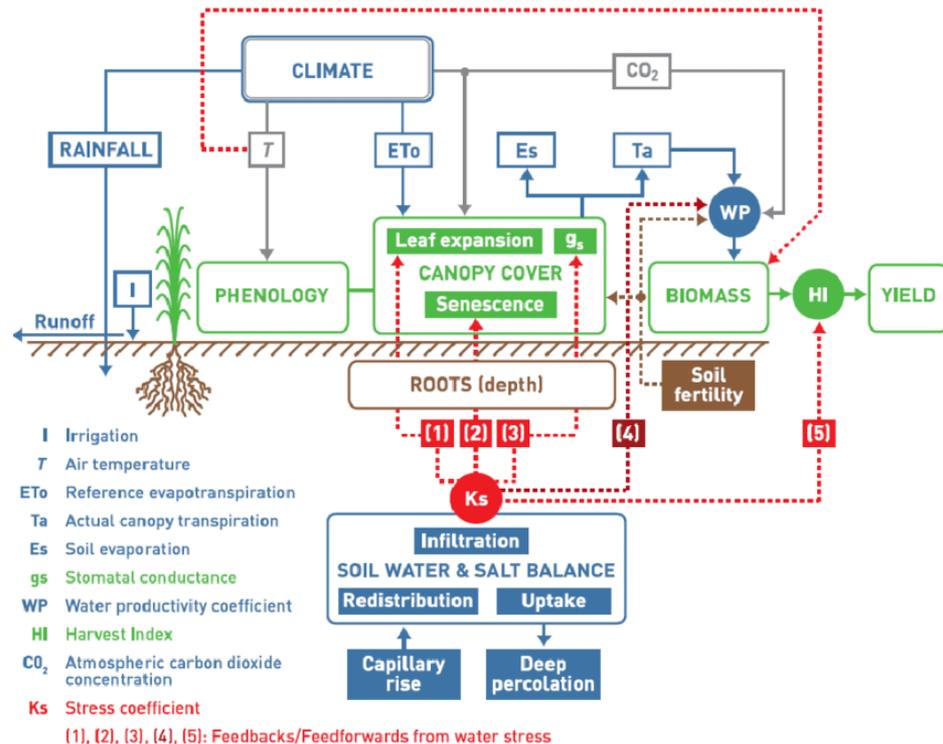
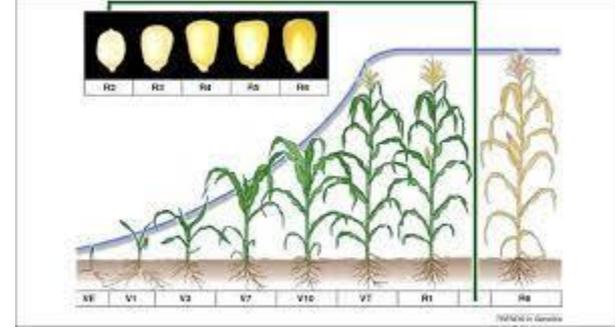


Fig. 3. Comparison of the measured and modelled values of (a) maize and (b) sorghum using Model 2. TDM data was not available for the 1997/1998 season.

# Use of Crop Models



- Research tools
  - Understand system across disciplines,
  - yield analysis, genetic improvement, data analysis etc
- Crop system management tools
  - Agronomic practices, input management,
  - Risk / investment assessment, site specific optimization
- Policy analysis tools
  - Establish best practice for recommendations, yield forecasting, assessing crop-climate suitability
  - Global climate change & crop productivity or gap analysis

# Crop System Management Tool

**Agronomic practices, inputs management & Advisories**

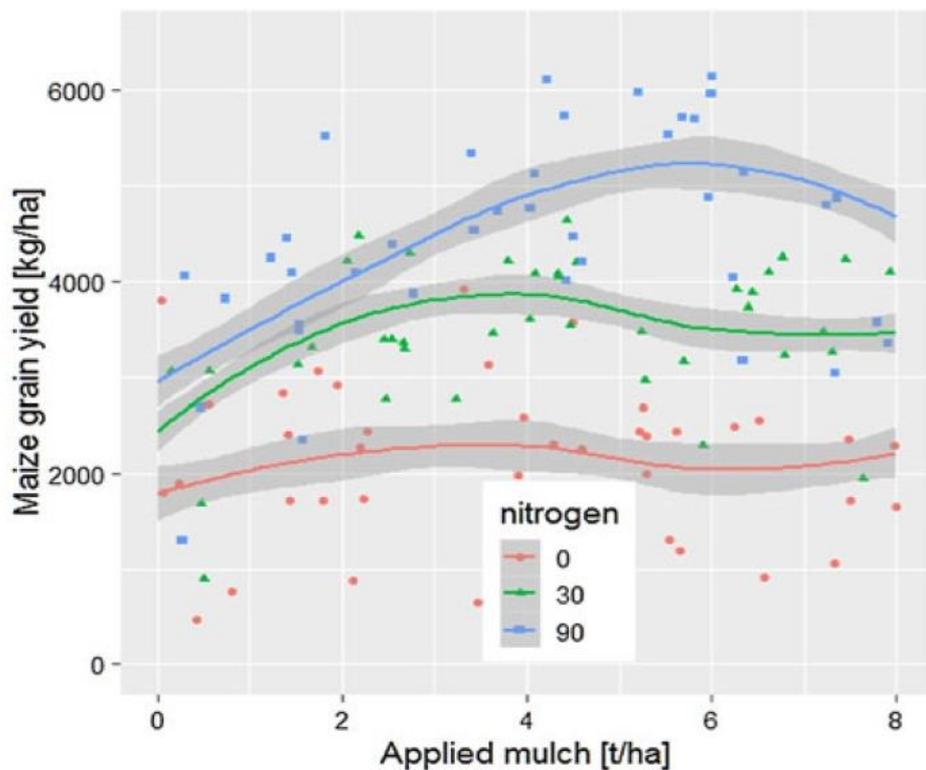


Fig. 4. Interaction effects of residue biomass levels and N fertilizer on grain yield ; University of Zimbabwe site in 2014 growing season.

## Zimbabwe Maize Grain Yield under Mulch vs Nitrogen Applications

Mupangwa et al., 2019 Renewable Agriculture Food Systems

**Risk/investment Assessment, site specific optimization & Advisories**

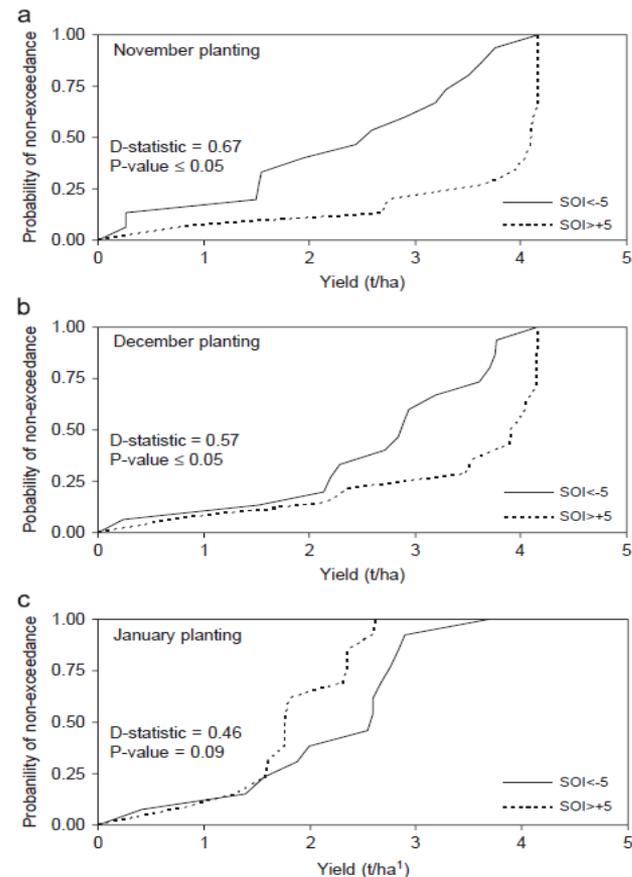


Fig. 3. Cumulative probabilities of simulated long-term (1950/1951–2001/2002) maize yield with water harvesting for three planting dates (averaged over cultivar, plant density and initial water content) in two SOI classes

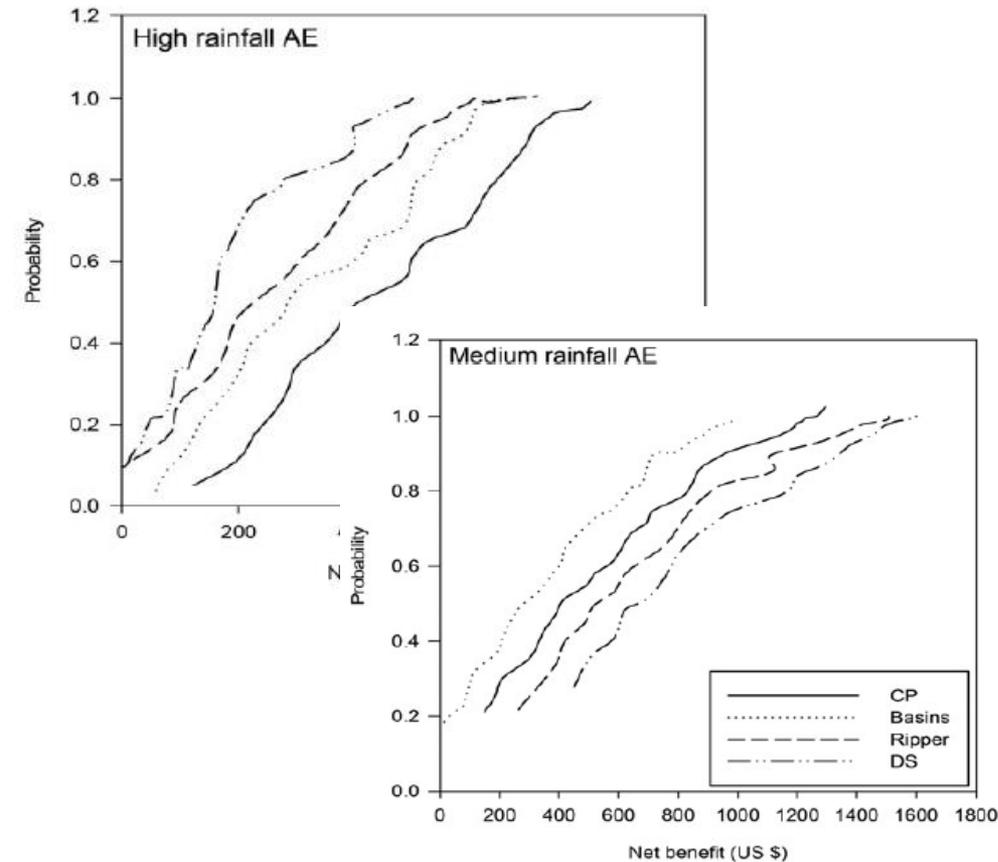
## Bloemfontein Maize Grain Yield under El Niño vs La Nina

Tsubo & Walker, 2007. J. Arid Environments Systems

# Policy Analysis using Crop Models

## Establish best practice for recommendations

Conservation agriculture for smallholders



## Global climate change & crop productivity or gap analysis

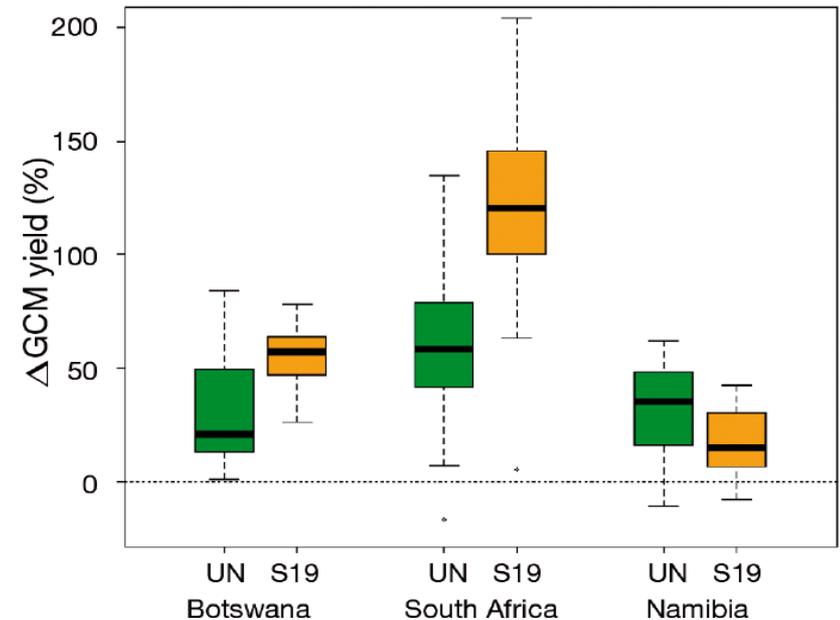


Fig. 6. Box and whisker plots of mean yield changes (%) in 20 GCMs (A–T in Table 1) under the RCP8.5 scenario in mid-century (2040–2069) at Botswana-Gaborone, South Africa-Bloemfontein and Namibia-Caprivi for the 2 landraces UN (green) and S19 (orange). Horizontal lines: median; boxes: range between lower and upper quartiles; whiskers: minimum and maximum values in the data set excluding outliers

## Zimbabwe Maize Grain Yield under Conservation vs Convectional Tillage

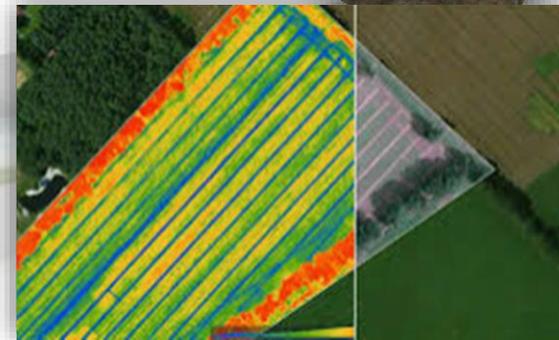
Mupangwa et al., 2016 Renewable Agriculture Food Systems

## Southern Africa Bambara groundnuts Yield 1980-2010 vs 2040-69

Karunaratne et al., 2015. Climate Research

# Gaps in Crop-Climate Models

- Diseases & Pests Modelling
  - Not holistic and powerful enough
  - Not simulate pest and disease outbreaks
  - No qualitative impact of pests & disease as yield-reducing factors
- Variability across field lacking
  - Only under precision agriculture applications
- Correct initialization point needed
  - Need monitoring instruments
  - For pests & diseases and infections



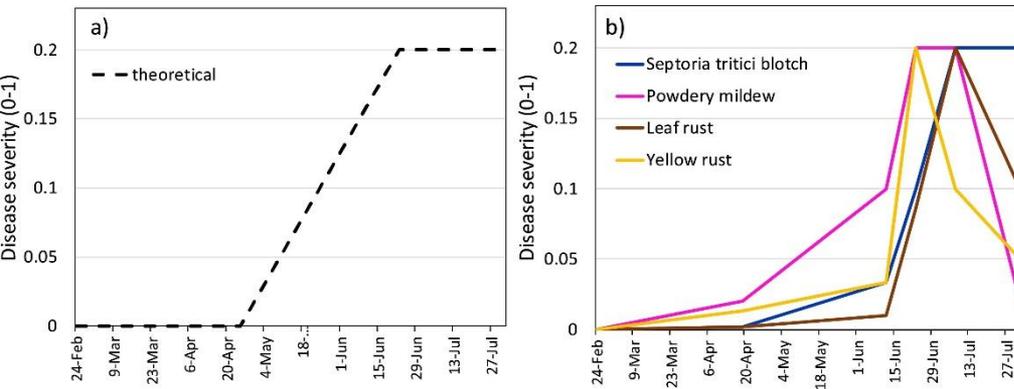
# Disease control methods that can be modelled

- Agronomic practices
  - Mulching, crop rotation, fallow
- Chemical control
  - Spraying, fumigation, etc
- Biocontrol agents
  - Integrated pest & disease management
  - a/c inoculation mode, time, duration
- Resistant genes
- Geocontrol
  - a/c temperature, rainfall, radiation etc

**To reduce biomass accumulation**

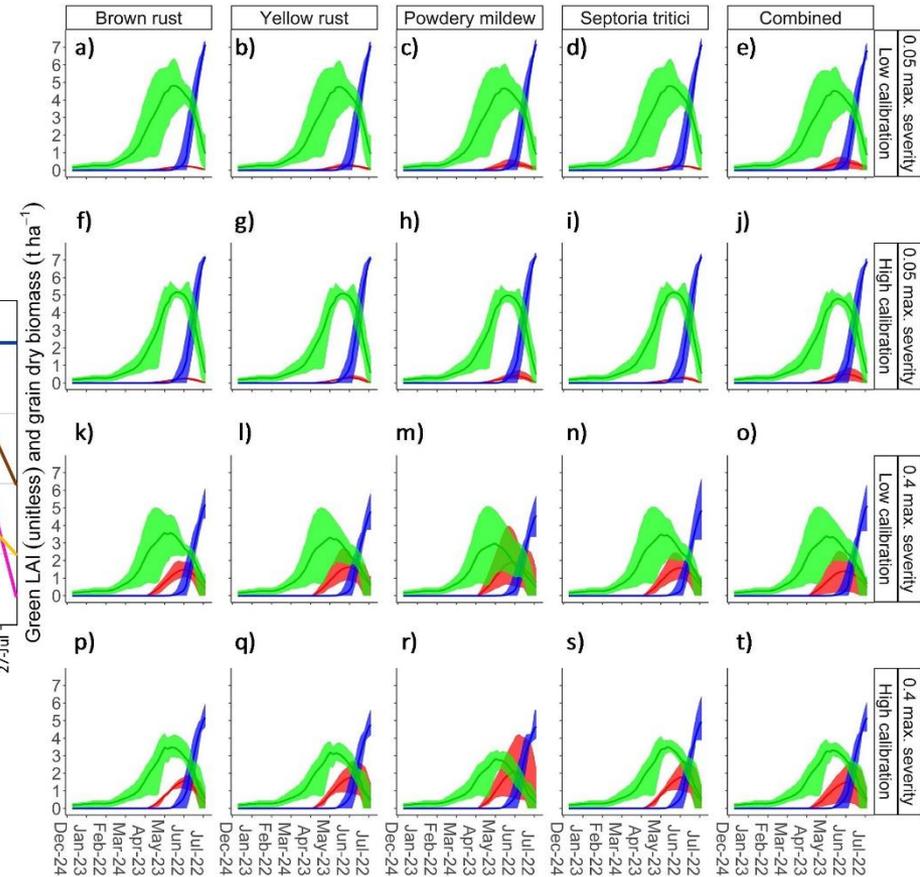
# Disease Modelling

## Characterize disease cycle by an infection chain



## Functional traits in response to environmental traits

- Temperature & rainfall & leaf wetness effect
- To retard leaf growth
- To decreased biomass



## Process-based information

- to constitute building blocks of a simple, generic, process-based modelling structure
- Relate disease to yield

# Examples: Weather affecting Diseases

## Wheat Stem Rusts infection – temperature

- Temp  $>20^{\circ}\text{C}$  increase spread stem & leaf rust
- Temp  $\leq 15^{\circ}\text{C}$  favor stripe or yellow rust

## Soybean Rust development

- Favored by temperatures range  $12^{\circ}\text{-}29^{\circ}\text{C}$
- continuous period of wetness on leaves
- with relative humidity  $>75\%$  for more 12 hours.

## Maize Smut

- Optimum germination 13 to  $20^{\circ}\text{C}$
- Unfavorable at soil temperatures above  $25^{\circ}\text{C}$
- Relative humidity 60-90% & 1 mm rain

## Downy Mildew

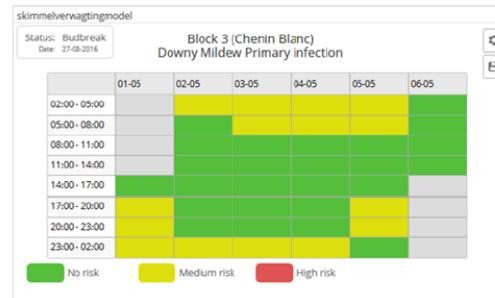
- hourly rainfall, temperature & relative humidity
- For primary infections period: 24-h rainfall  $> 10$  mm wet leaves  $> 3$  hours when 24-h average air temperature  $>10^{\circ}\text{C}$ .
- For secondary infection: 4 continuous h RH  $> 92\%$  with 2+h wet leaves & mean air temperature  $\geq 13^{\circ}\text{C}$ .



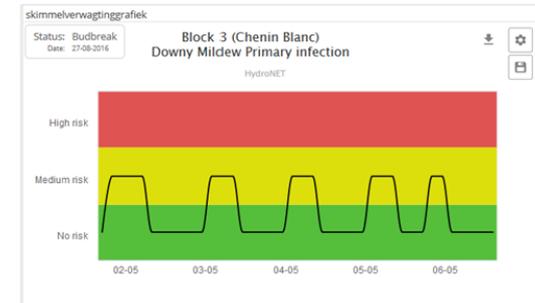
# Examples of Early Warning Model

## Grape Compass

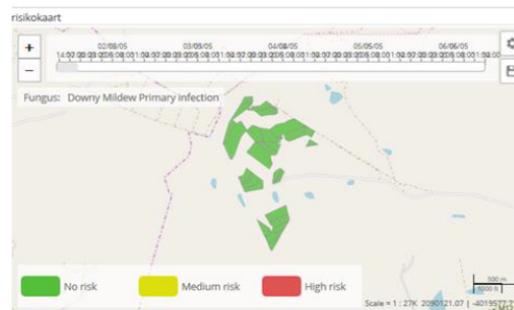
- An on-line decision support system for viticulturists / grape growers
- makes reliable forecasts of fungal disease risks in vineyards
- including
- **powdery mildew,**
- **downy mildew and botrytis**



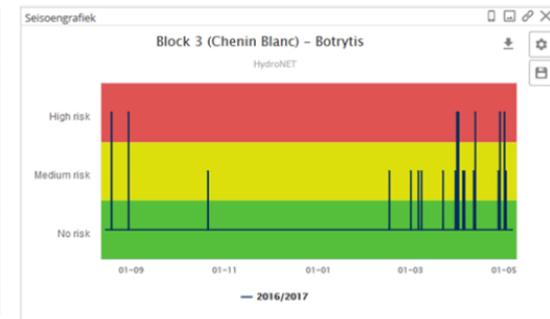
1. Downy mildew disease forecast (table)



2. Downy mildew disease forecast (graph)



3. Downy mildew disease forecast (map)



4. Botrytis risk events per season (graph)

# AgriCloud with spray advise

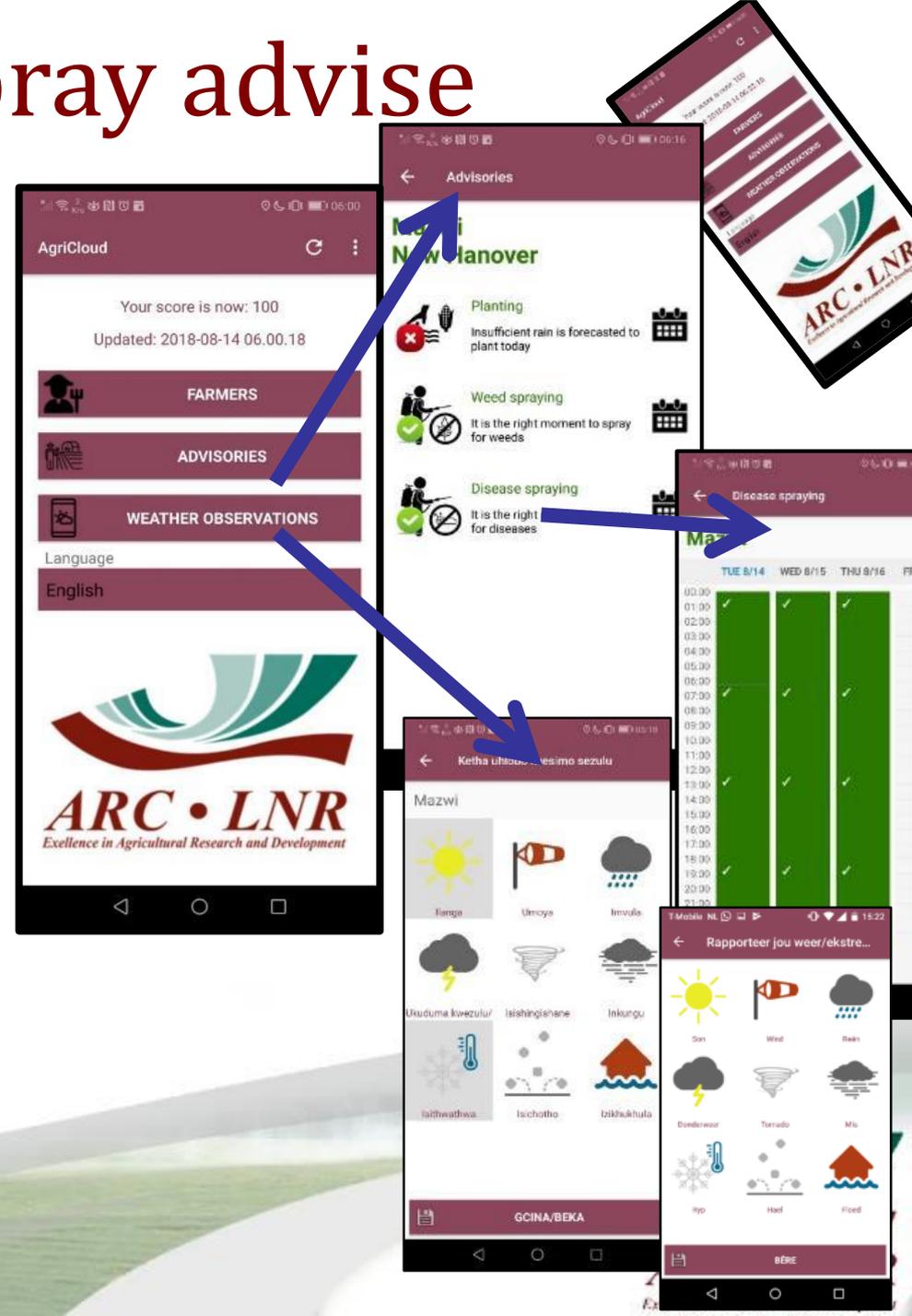
Online weather based agricultural advisory system that:

- Enriches weather & climate data with agricultural info & local knowledge
- Generates real-time personalised forecasts & warnings
- All aspects are tailored to farmers own needs & location.
- **Includes advice on weather conditions for spraying with ARC-PHP**

To assist with:

- Making well-informed farm management decisions
- Optimising use of farm inputs
- Reducing weather & climate related risks
- Improving food production in a sustainable manner.

Advisories must include an **action that a farmer can take** to change an adverse effect of weather parameters on production.



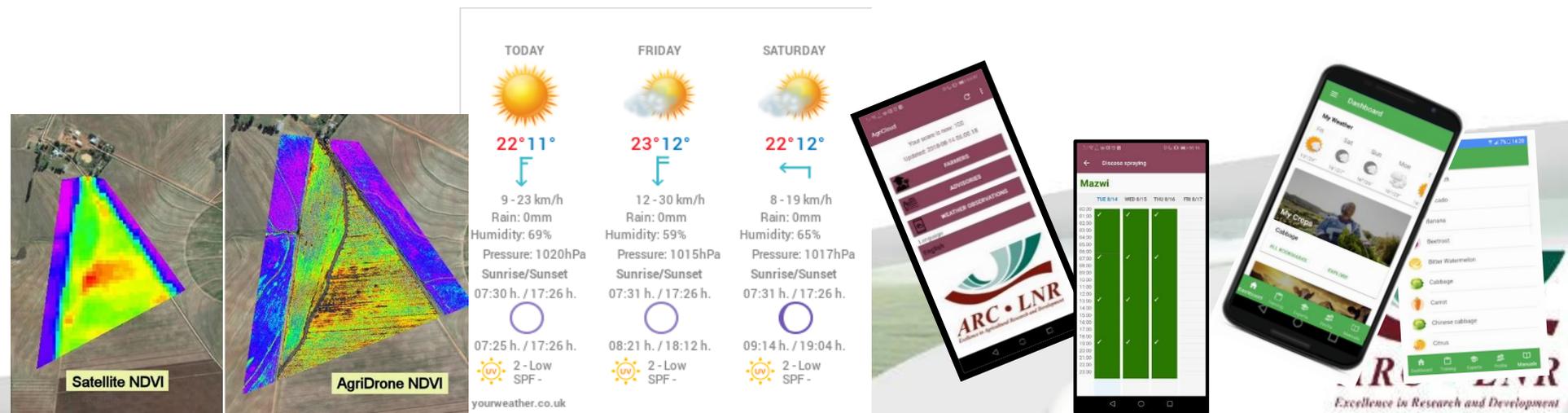
# Formulation of Advisories

## Inputs:

- Basic experimental results
- Relationships between crop growth & disease infestation and weather parameters
- Weather forecasts
- Satellite monitoring of fields

## Outputs:

- Routine advisories
- Location specific info
- Message relevant to farm operations
- Delivery system
- Client database



# Need to Work Across Disciplines . . . .

- **Climate models & weather forecasts**
  - down-scaled to at least 15km<sup>2</sup>
- **Crop models**
  - For variety of crops including effects of environmental stress
- **Disease / Pest models**
  - few available and not yet integrated with crop models
- **Advisories**
  - As early warning of conducive weather conditions for infestation
  - As advice to spraying for pests and diseases
  - As monitoring of cumulative favorable conditions for outbreaks
  - Need further development by transdisciplinary teams

## Acknowledgements

- ARC-NRE Team
- Prof Sue Walker [WalkerS@arc.agric.za](mailto:WalkerS@arc.agric.za)