

## Improving performance of index insurance using crop models and phenological monitoring

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# Outline

- 1 Risk of extreme weather events
- 2 Weather index insurance
- 3 The goal of study
- 4 Methodology and case study
- 5 Results and next steps



APSIM

# Risk of extreme weather events

- Over the years climate risks are creating significant impacts on agriculture communities.
- Extreme events include adverse weather conditions such as global warming, heat waves, floods, etc.
- Risks need to be managed efficiently to reduce negative impact of extreme events.
- Farmers in communities need to understand & predict weather conditions to determine which management practices they should use in their geographical locations.



# Index insurance

**Index insurance is coverage based on an 'index' which is correlated with farmers' losses**

*Index insurance pays out farmers based on an index, such as rainfall or temperature, rather than based on response of farmer's crop yield to them (rainfall deficit).*

**Farmers get paid only if this index falls above or below a pre-defined threshold.**

*if the maximum temperature value rises above a pre-defined threshold, then the insurance pays out.*

**Index insurance is more accessible to smallholder farmers than traditional insurance.**

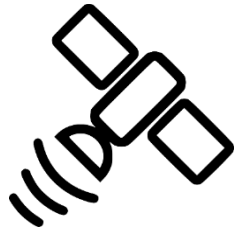
*Unlike traditional insurance schemes, the insurance company does not require to measure damages which makes this scheme to be less expensive.*

**Index insurance should accurately capture the damages and farmers' loss on the ground.**

*The payment of index insurance highly depends on accuracy of index products and quality of the datasets used in them.*



**Growing season rainfall**  
(a 'weather-based' index)



**Vegetation levels**  
(a 'satellite-based' index)



**Average regional yield losses**  
(an 'area yield' index)

# The goal of study

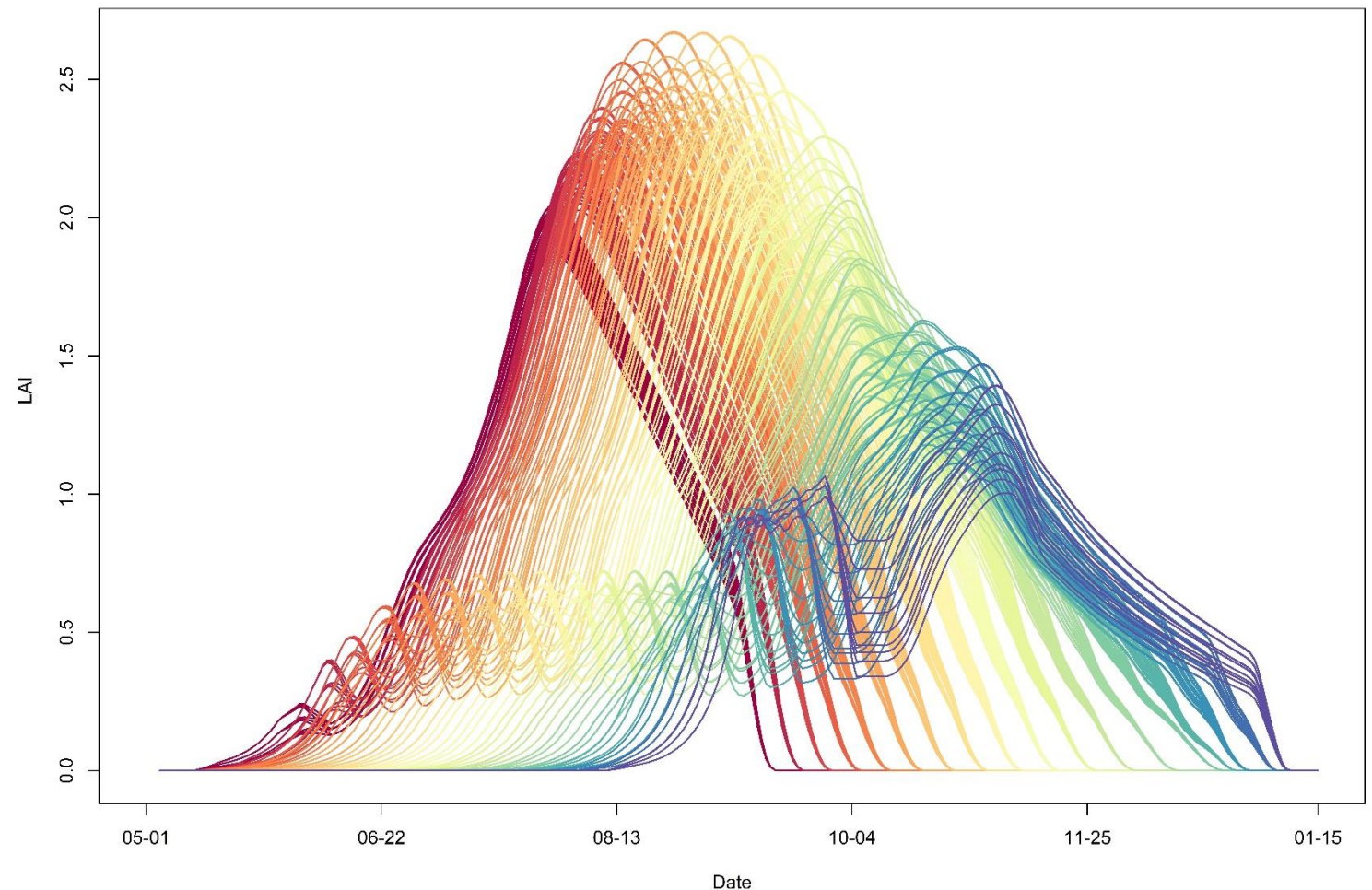
Existing weather index-based insurance contracts is that payouts are triggered based on weather indices defined over fixed calendar periods

*In reality, the timing of crop's sensitivity to weather often varies significantly between individual plots or farmers due to their management practices (e.g., sowing date, cultivar)*

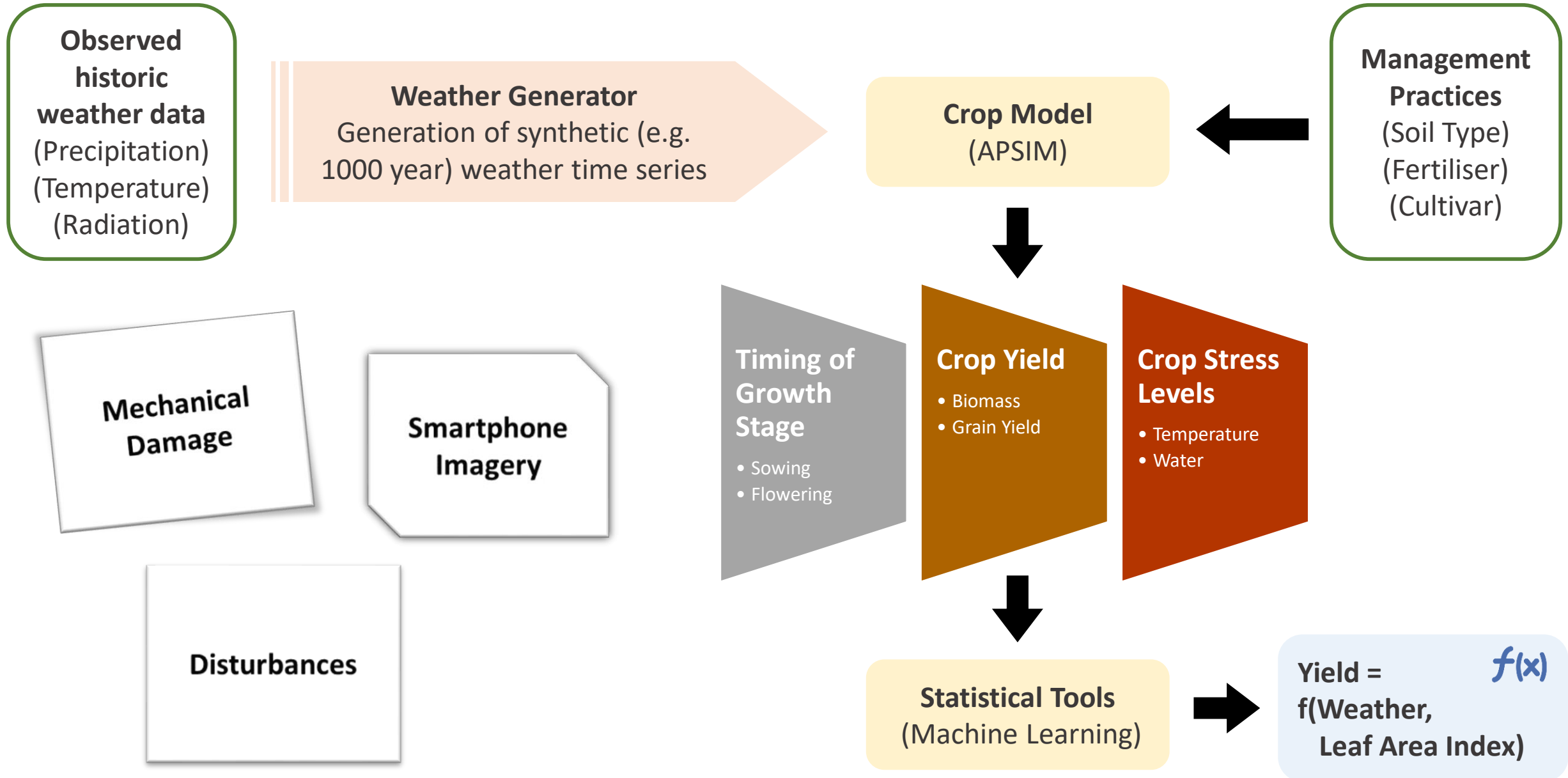
*Failure to consider this heterogeneity is potentially a significant driver of basis risk.*

*The goal of this study is to improve the quality of index insurance by designing phenology-specific insurance contracts.*

Variation of LAI profile for different transplanting dates



# Methodology



# Study area & management practices

## Management Practices for Rice

Sowing dates *5 day interval*

Seedling ages *(20-50 days)*

Fertilizer at transplanting *50-150 kg/ha*

Irrigation *No- partially- full-irrigation*

Plants density *100-200 plants/m<sup>2</sup>*

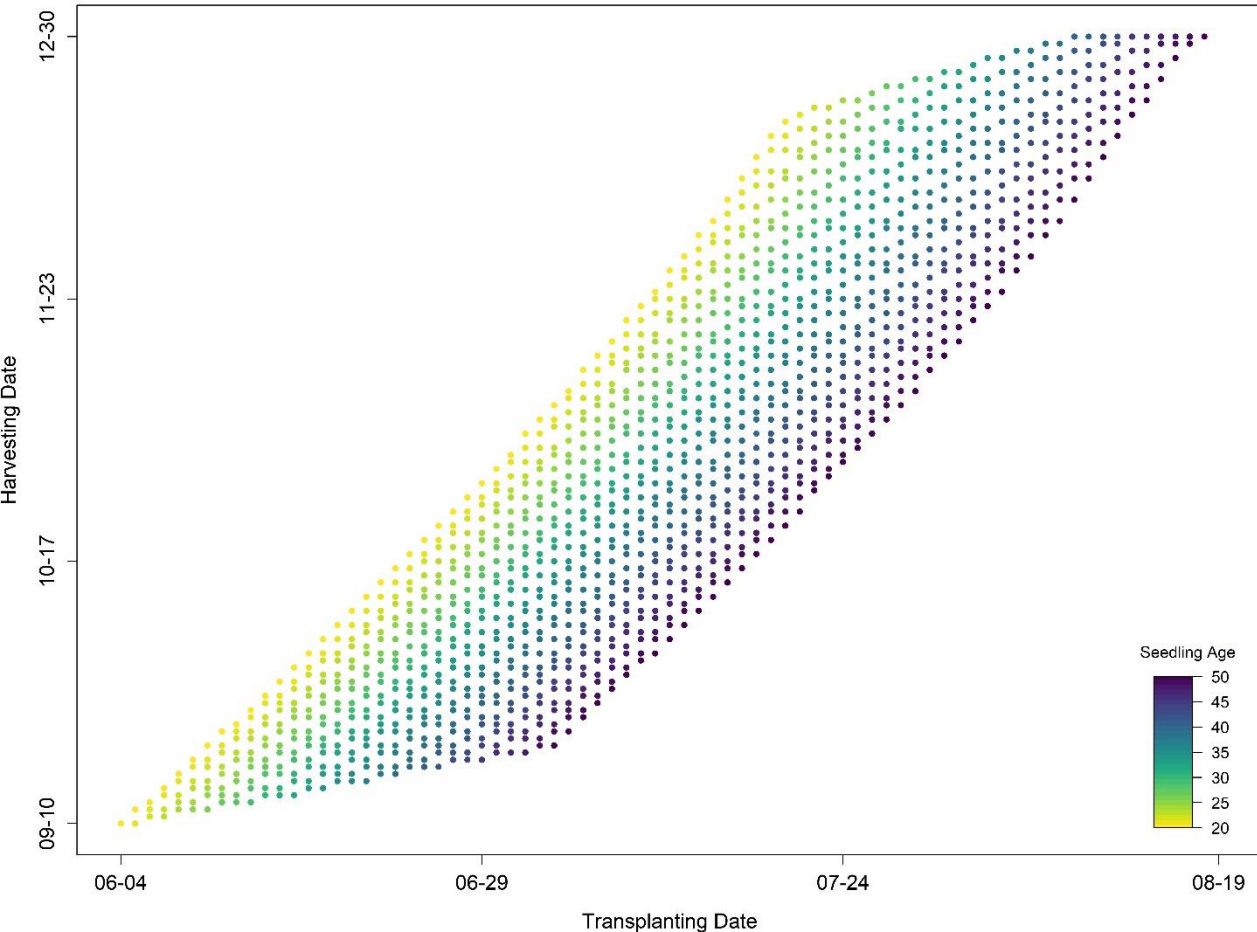
### Other factors:

- *Cultivar*
- *Initial soil fertility*
- *Soil type*

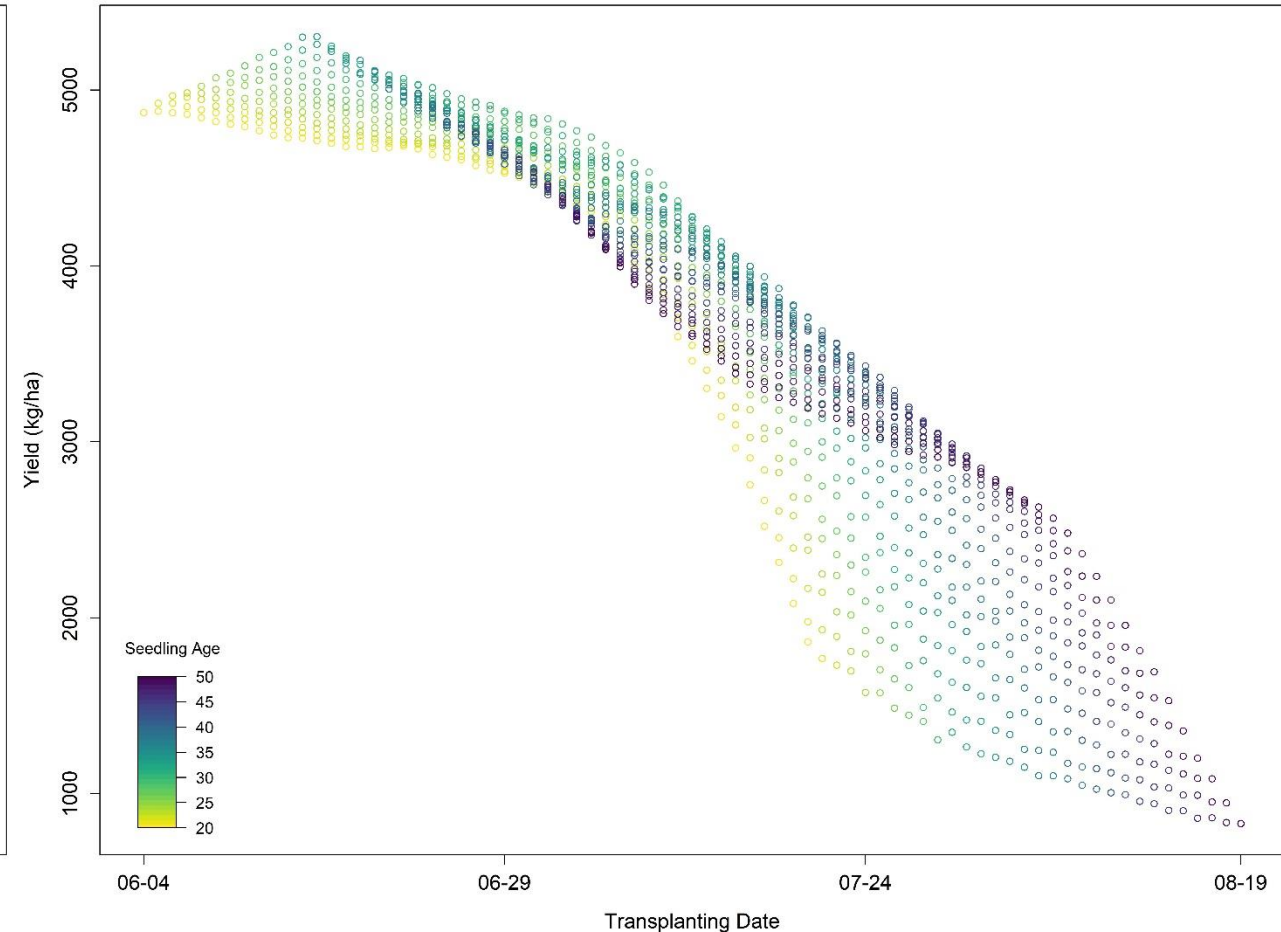


# Results – management practices (rice)

Impact of transplanting date and seedling age on harvesting date

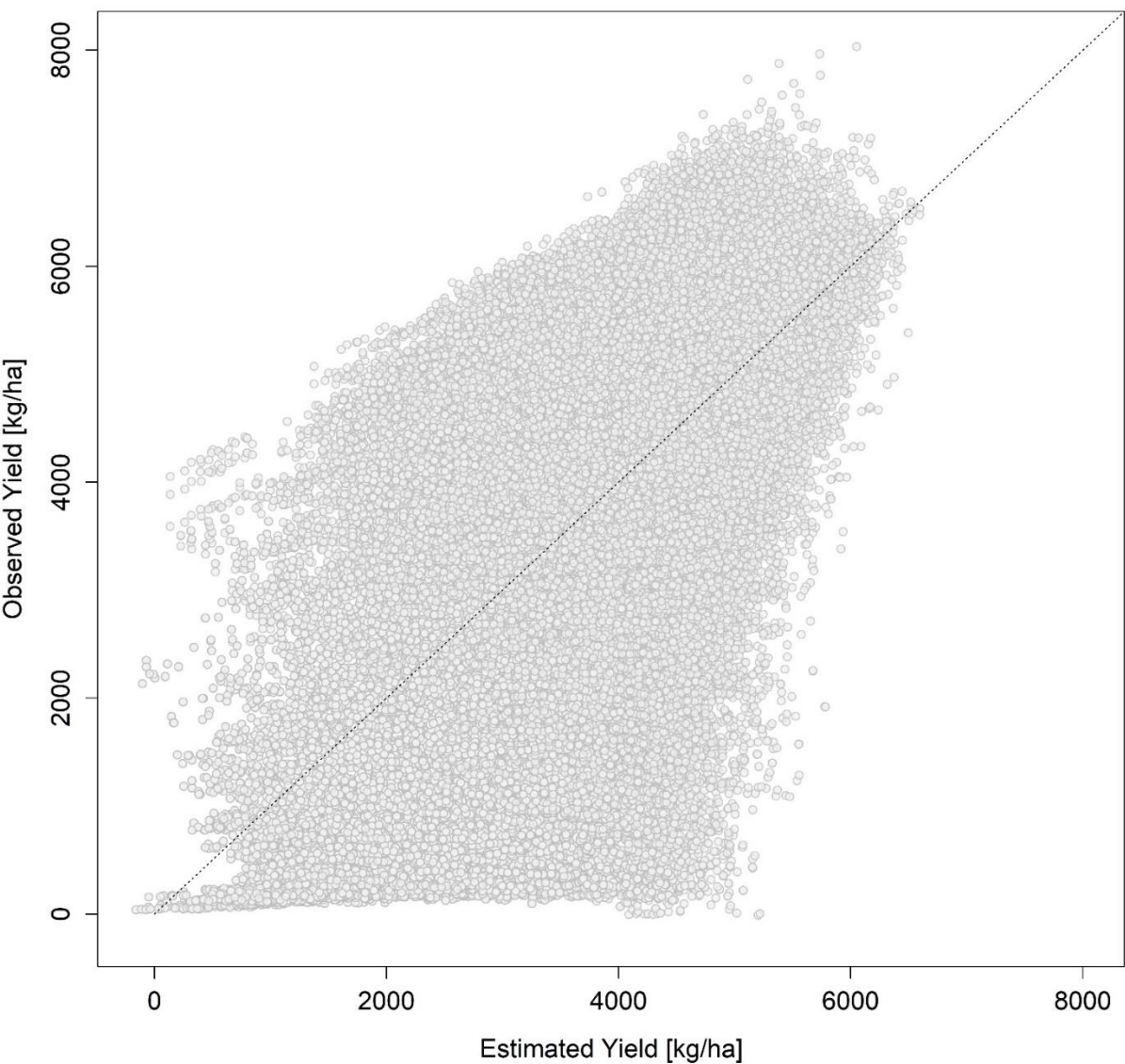


Impact of transplanting date and seedling age on crop yield

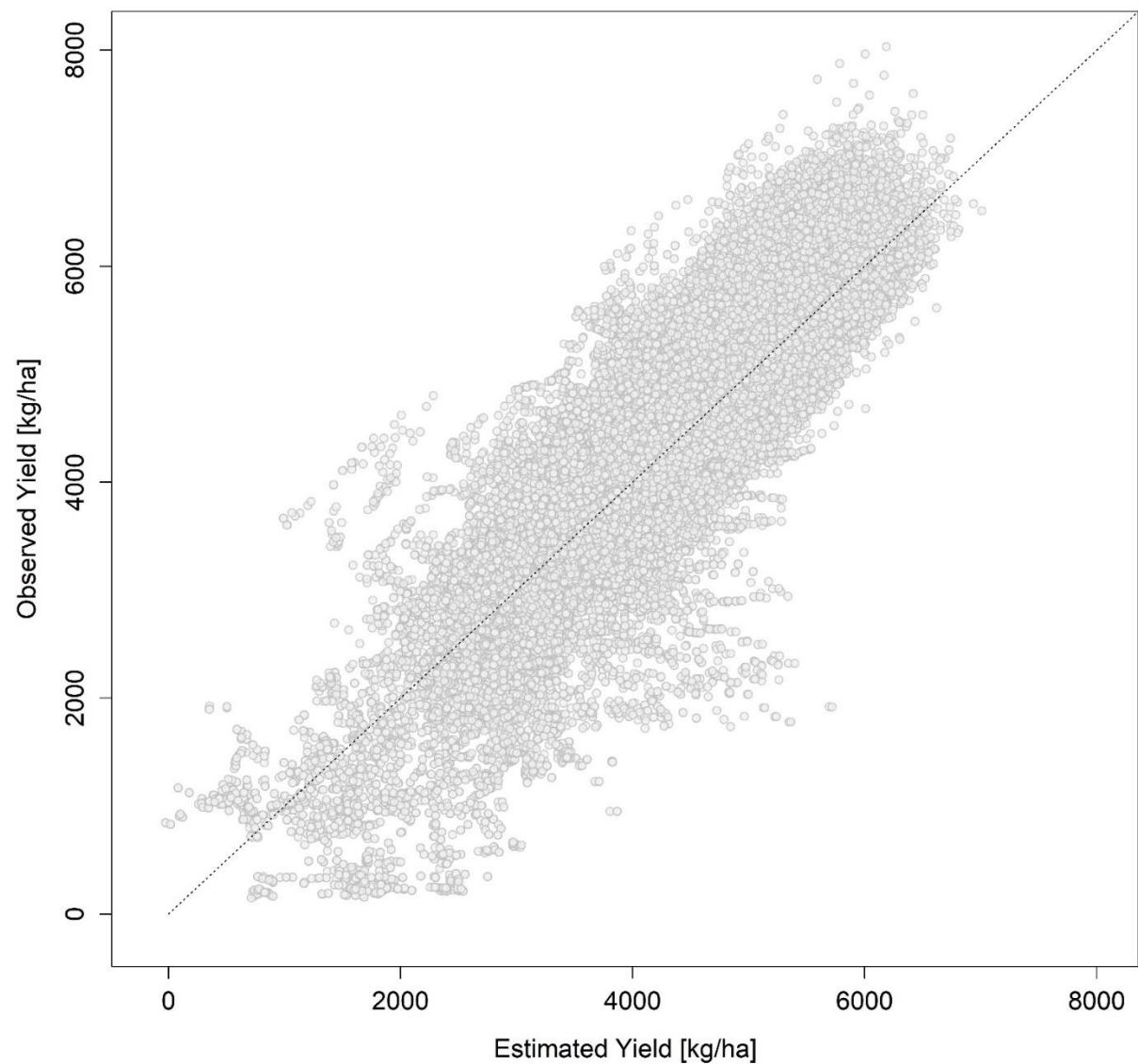




**Calendar based rice yield estimates**  
**Statistical model (nonlinear) estimates versus**  
**APSIM simulations**



**Phenological based rice yield estimates**  
**Statistical model (nonlinear) estimates versus**  
**APSIM simulations**



# Results – rice yield estimation

*Independent Variables: Temperature, Precipitation, Leaf Area Index*

*May2Dec: Get independent variables between May and December as a single observation*

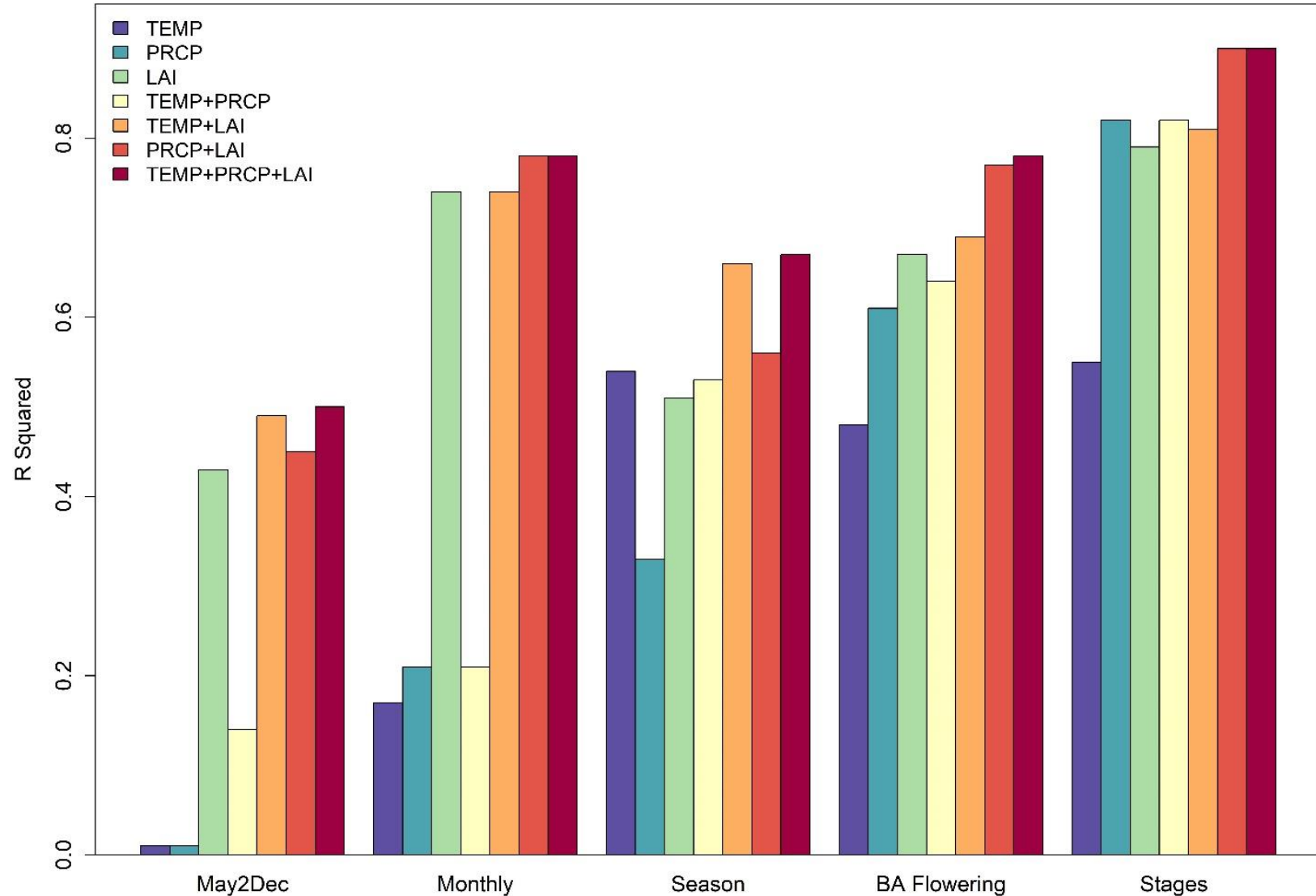
*Monthly: Independent variables are obtained on each month separately*

*Season: Independent variables are obtained over season (time varying) as a single observation*

*BA Flowering: Independent variables are obtained over two periods of before and after flowering (time varying)*

*Stages: Independent variables are obtained over each stage separately.*

Comparison of different heterogeneity levels on rice yield estimation



# Concluding remarks

*Statistical models can estimate APSIM simulated yields with good accuracy.*

*crop phenological based approaches perform better than fixed calendar dates approaches.*

*Leaf area index is the main driver of yield estimations in statistical models*

*Adding information about leaf area index helps statistical model both in fixed calendar- and phenological-based approaches.*

## Next steps

*Apply developed statistical models in order to estimate observed yields.*

*Assessment of the impact of observed damages through remote sensing and smart phone imagery on residuals of estimated yields by statistical models.*

