



Predicting grapevine yields and development

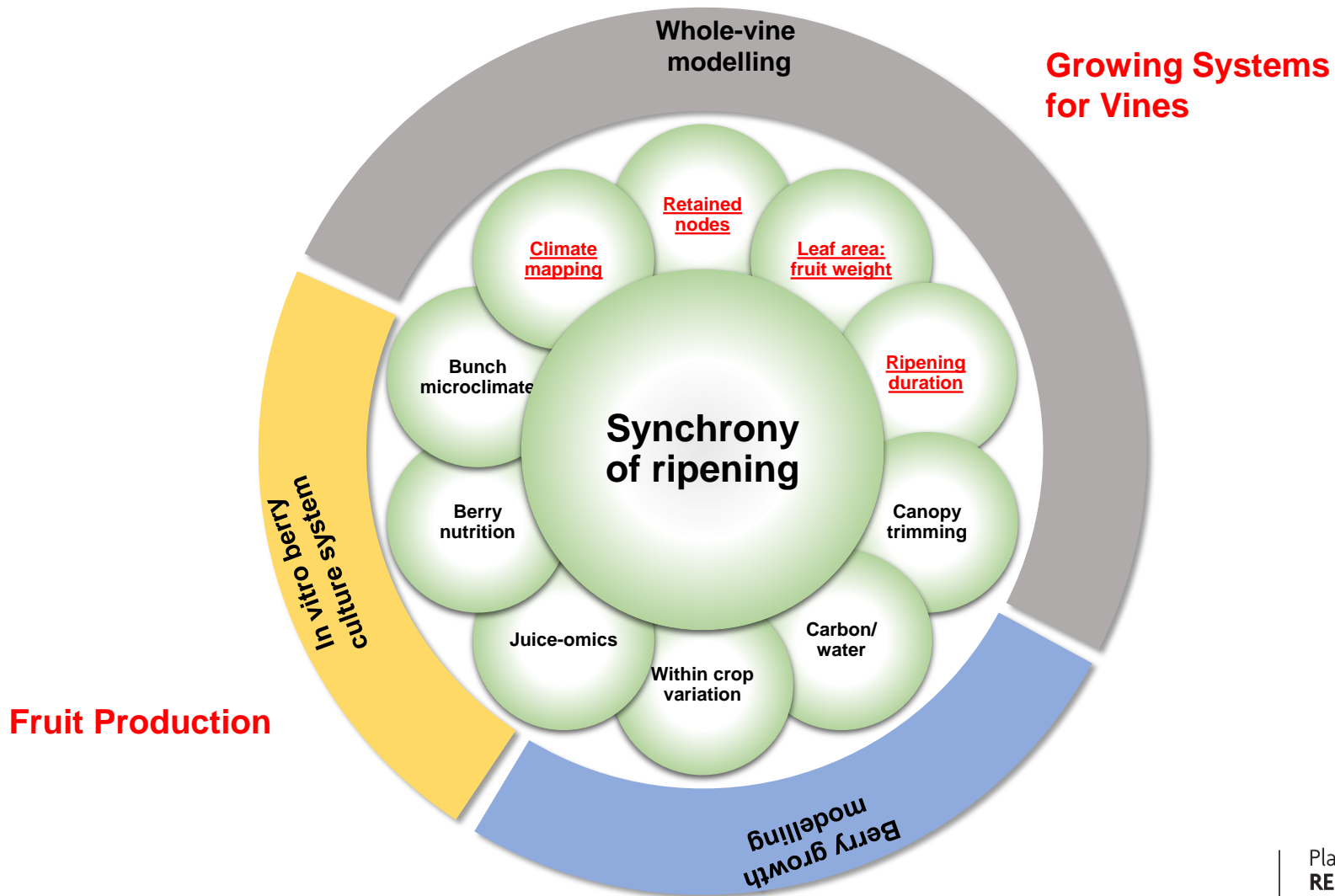
Junqi Zhu, Rob Agnew, Marc Greven, Mike Trought, Amber Parker, Fang Gou, Linlin Yang, Victoria Raw, Sue Neal, Steve Green, Rémi Fraysse, Damian Martin, Hamish Brown

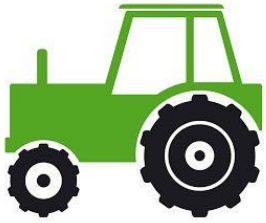
Winner
2017



**The
Prime
Minister's
Science
Prizes**

Research strategy – Grapevine modelling

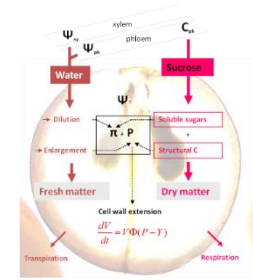




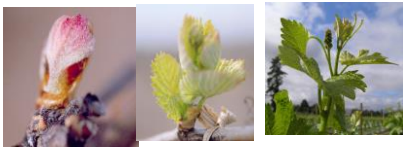
Management



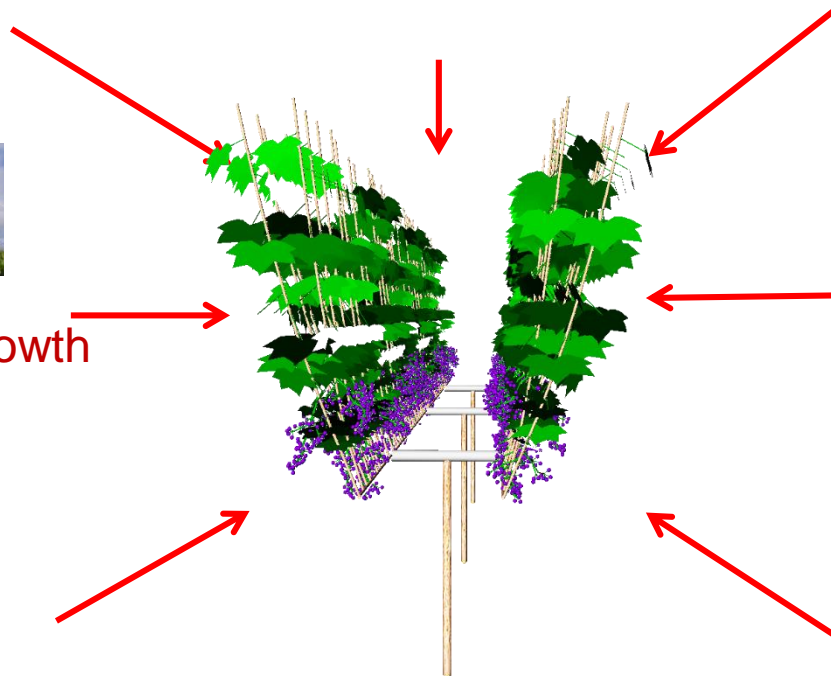
Photosynthesis and transpiration



Fruit growth



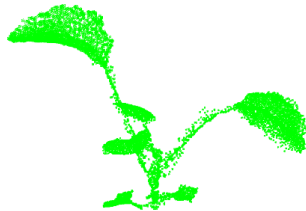
Monitored plant growth



Grapevine model



Water and carbon transport



LiDAR point clouds



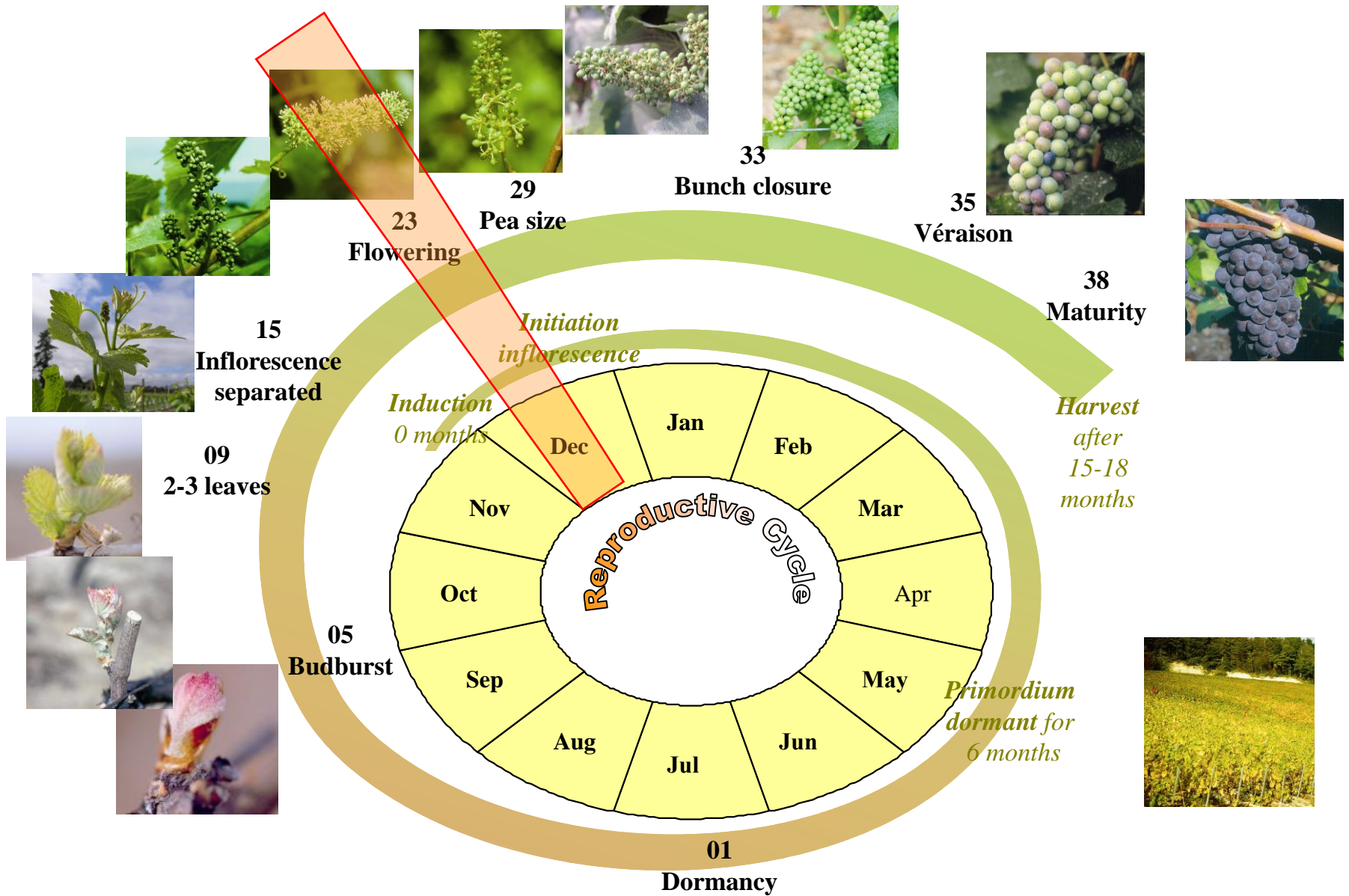
Training system

Outlines

- » Statistical yield prediction module based on historical data
- » Integrating the yield prediction module into a plant growth model
- » Following plans...

Background of yield prediction

- » Yield prediction is a global priority for many multi-national wine producers
- » Cool climates subject to large inter-annual yield variations ($\pm 35\%$ for some varieties)
- » Advance warning of yield variances very helpful for business planning
- » Climate change poses various threats and opportunities

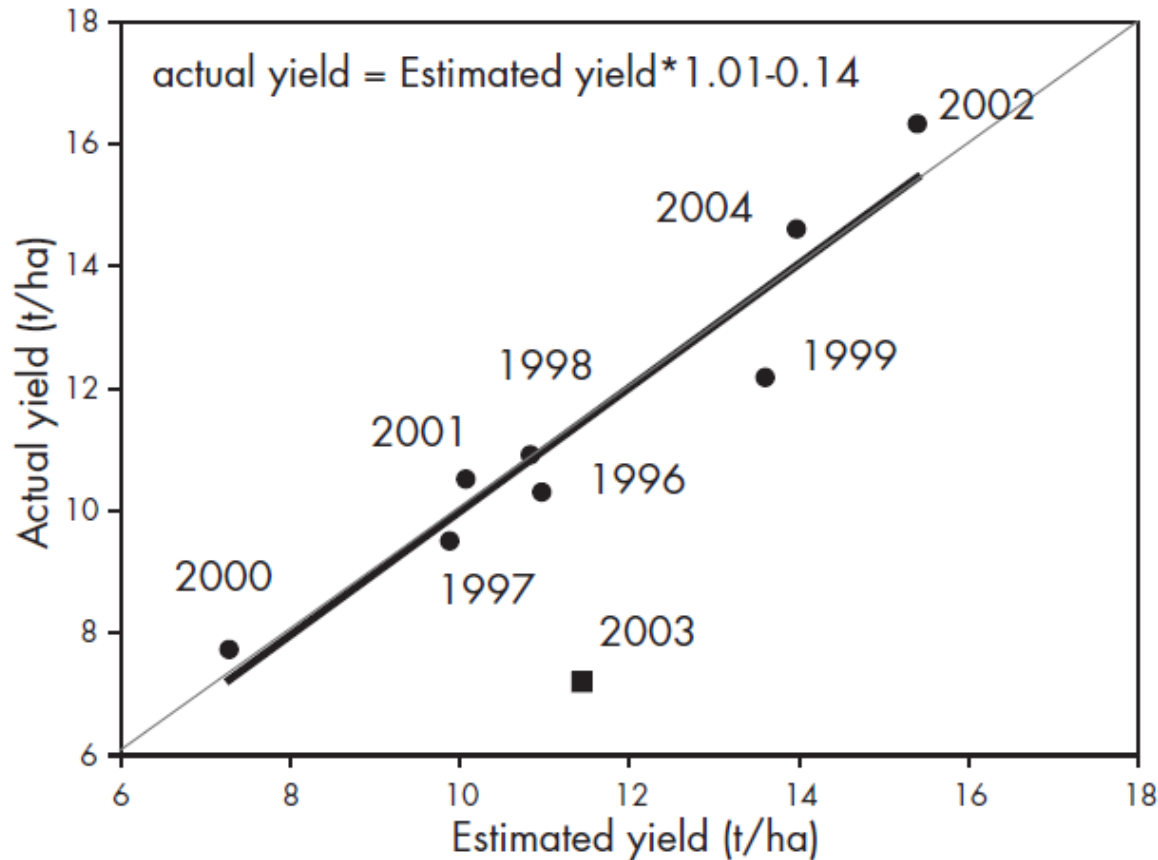


Adapted from Gillian Wilson, 1996
by Marc Greven

Yield model by Mike Trought

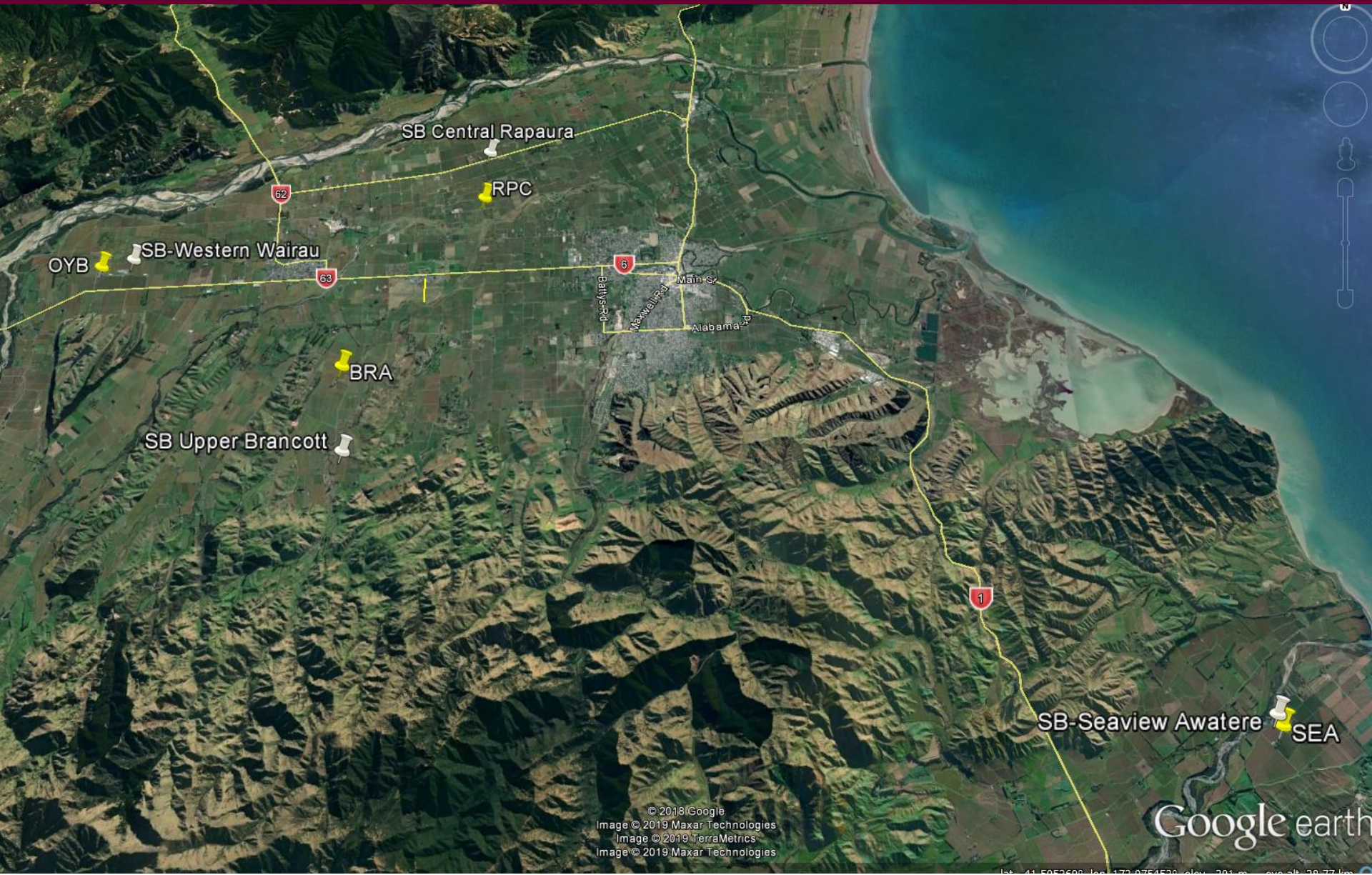
» Estimated Yield (t/ha) =

$$(2.728 * \text{initiation temperature}) + (2.918 * \text{flowering temperature}) - 29.48$$



Trought 2005

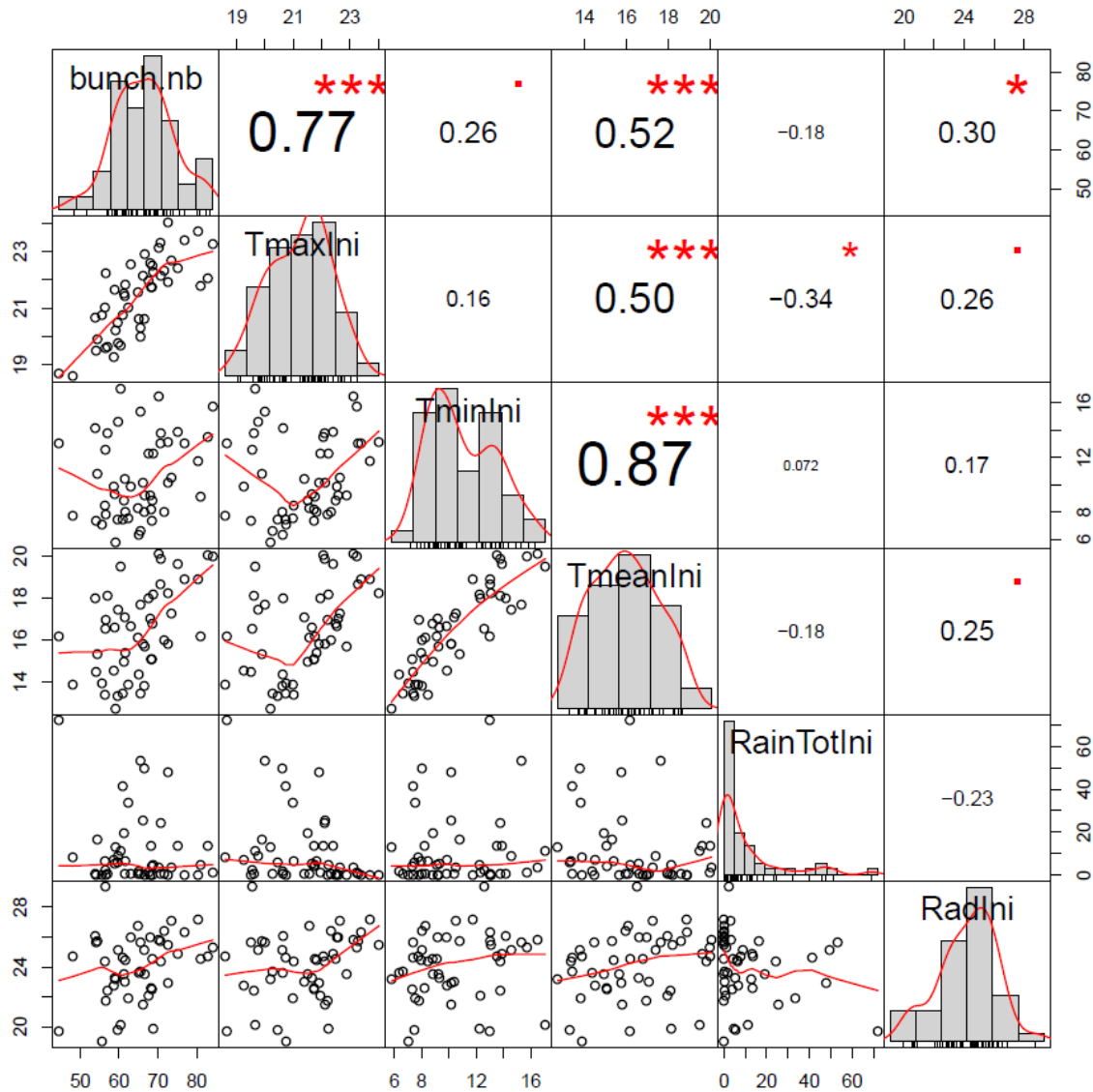
Long-term phenology and yield monitoring – Rob Agnew & Victoria Raw



Improvement for the yield prediction model

- » Collating the long-term phenology and yield monitoring data into a consistent dataset (takes long time...)
- » Organising the nearby meteorology data, e.g. maximum and minimum temperature, radiation, rain
- » Test the effects of all climatic factors and their interactions on each yield components, e.g. bunch number, berry number, berry weight
- » Find the best periods for predicting those yield components using flowering and véraison as guide
- » Derive the final prediction equation with the combinations of different factors

Correlation between bunch number and weather factors at different periods

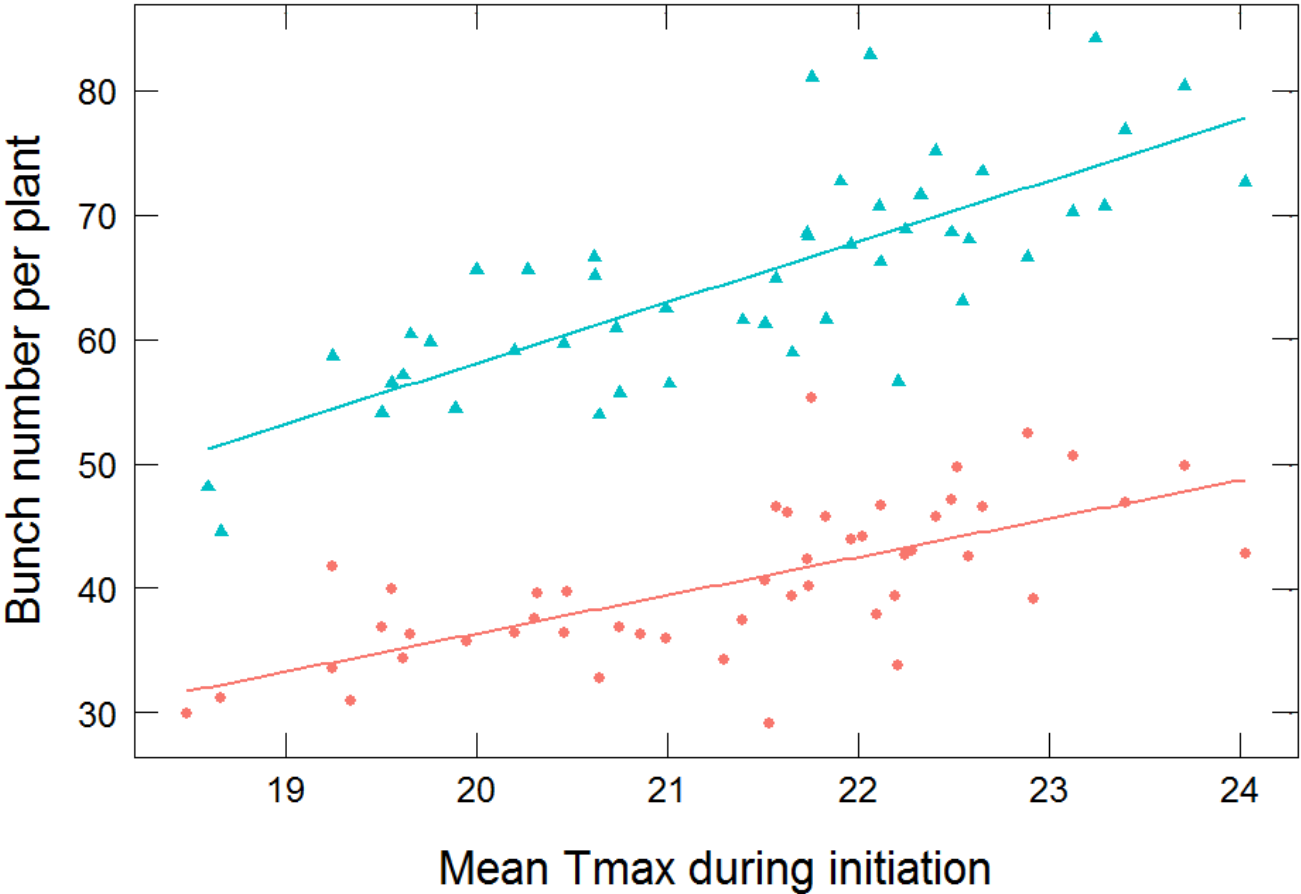


Zhu et al., 2020
OENO one

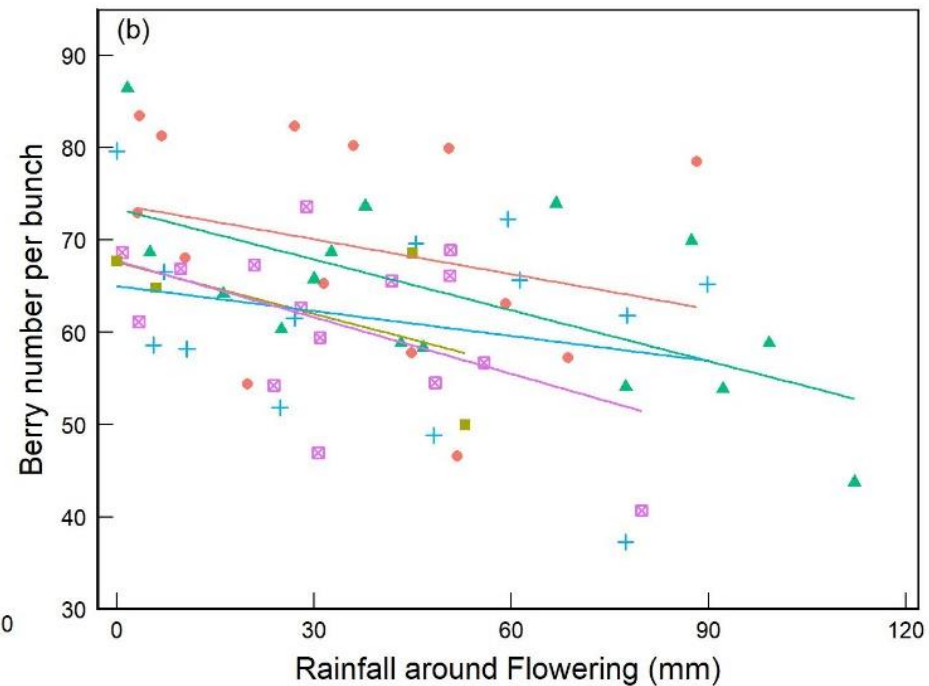
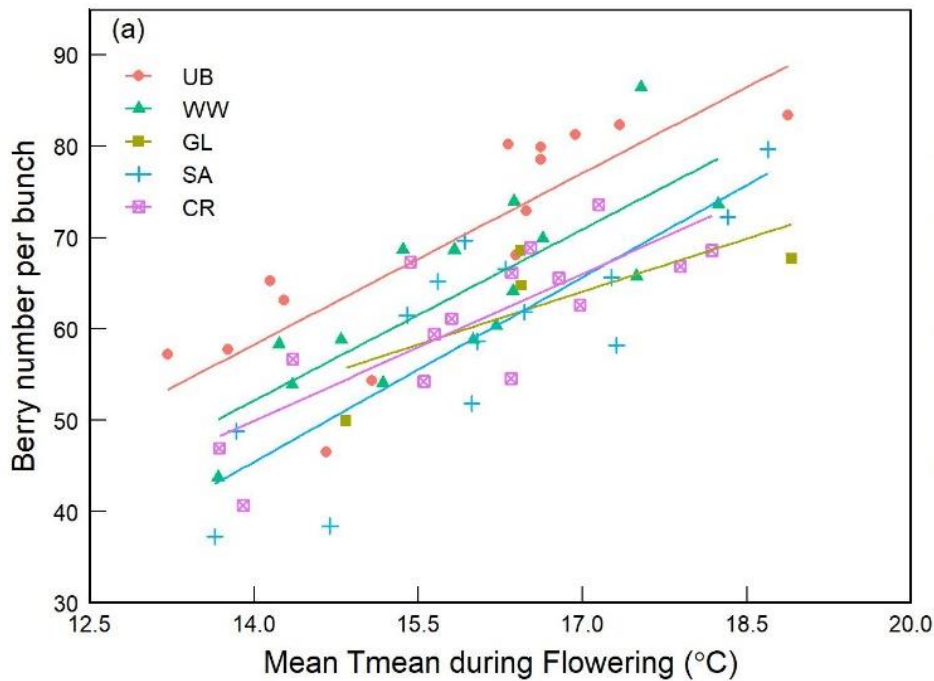
Critical periods

Yield component	Factors	Thermal days before 50% flowering	Thermal days after 50% flowering
Bunch number per vine	TmaxIni	15.90	1.27
	RadIni	10.42	0.14
Berry number per bunch	TmeanFlow	7.08	0.02
	RainTotFlow	10.50	2.69
	TmaxIni	7.92	30.37
Berry weight	TmeanFlow, RainTotFlow, RadFlow, RainTotVer		
Bunch weight	TmeanFlow, RainTotFlow, RainTotVer		

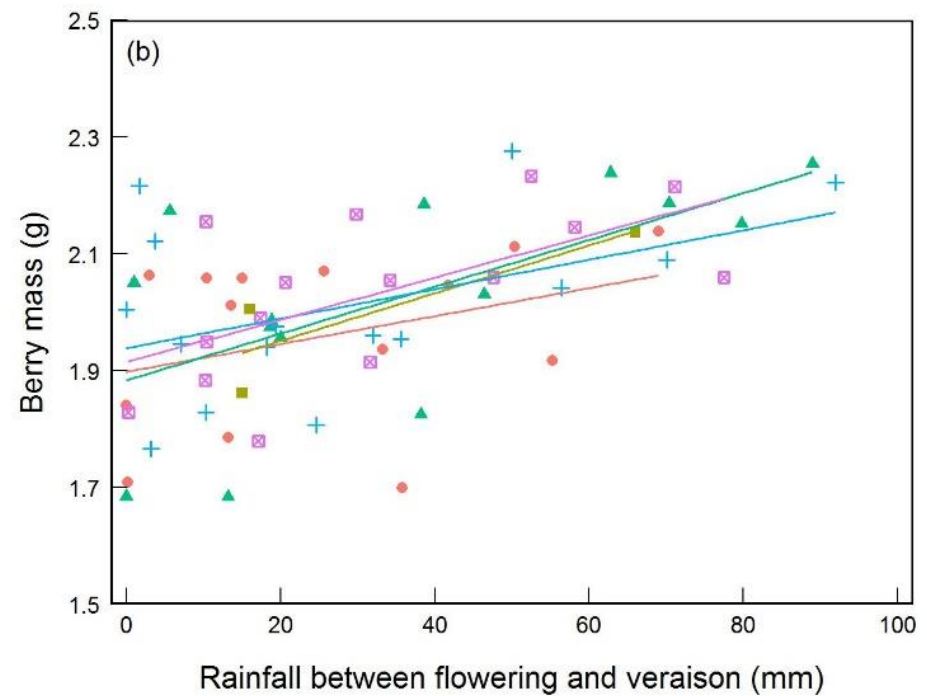
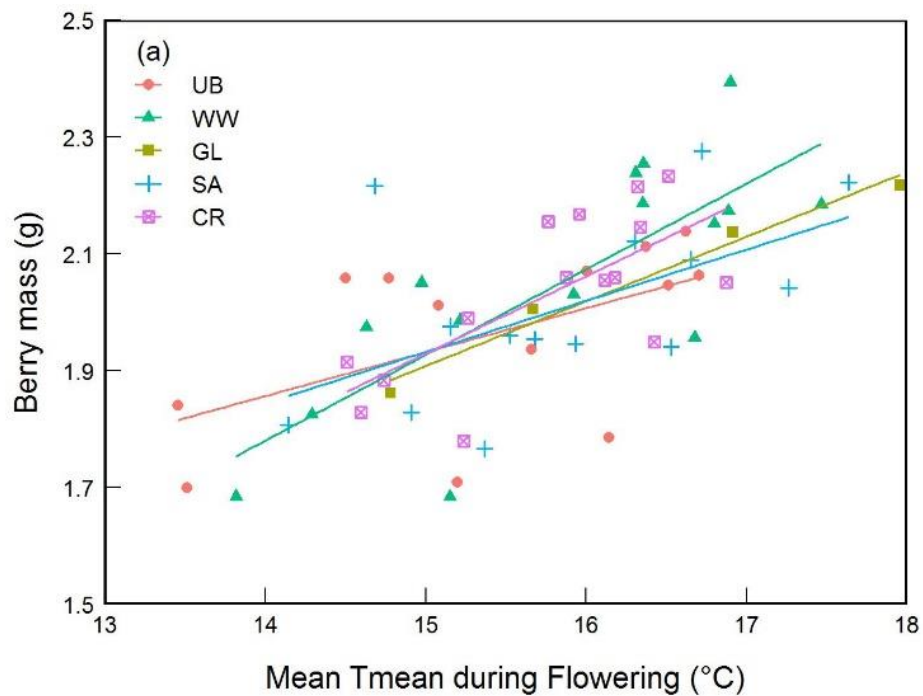
Bunch number vs TmaxIni



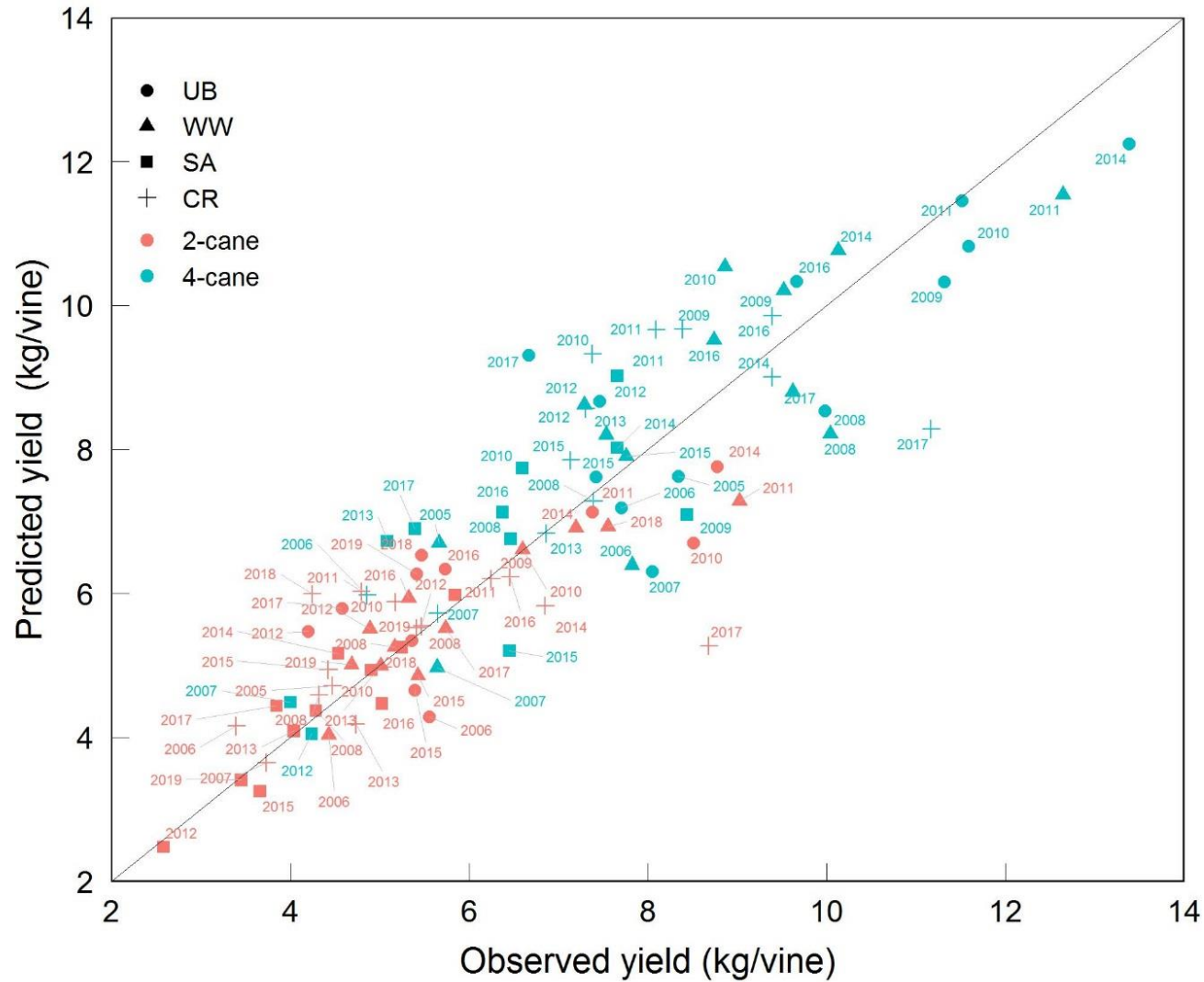
Berry number vs Ta and Rainfall



Berry mass vs Ta and Rainfall



Yield prediction



Current highlights

- » Daily Tmax (not Tmean) is most influential factor on berry number and bunch mass
- » Optimized critical periods for Tmax mainly before 50% flowering either in the previous or current season
- » Mean Radiation also an important input variable
- » Rainfall around flowering - negative effect
- » Rainfall post-flowering - positive effect
- » Statistical model explained 65-85% of the seasonal variations in yield per vine

Publication on VineFacts



- » First bunch number prediction in VineFacts on 17 October 2019
- » Berry weight, bunch weight and yield per vine on 23 January 2020
- » The accuracy of the prediction was evaluated after harvest in April, 2020
- » Bunch number prediction for 2020-2021 published in April 2020

Bunch number for two-cane vines in 2019-2020

Vineyard	Long-term average bunch No./vine	Predicted bunch No./vine compared to Avg.	Actual bunch No./vine compared to Avg.	Accuracy of Actual compared to predicted
Central Rapaura	41.4	37.1 90%	33.5 81%	10% lower
Seaview Awatere	34.9	32.5 93%	32.3 93%	1% lower
Upper Brancott	42.8	38.3 89%	33.0 77%	14% lower
Western Wairau	41.7	37.5 90%	40.1 96%	7% higher

Bunch number for two-cane vines in 2020-2021

Vineyard	Long-term average bunch No./vine	Predicted bunch No./vine in 2021	Predicted bunch No./vine in 2021 as % of LTA
Central Rapaura	41.4	45.6	110%
Seaview Awatere	34.9	38.7	111%
Upper Brancott	42.8	44.0	103%
Western Wairau	41.7	44.3	106%

Integrating into a plant growth model

The image displays a software interface for a plant growth model, organized into three main panels:

- Simulations:** Contains a hierarchy of simulation components. Under "Replacements", there is a "Grapevine" category with sub-items for grape varieties: SauvignonBlanc, Chardonnay, Merlot, PinotNoir, and PinotGris. Below these is a "Phenology" category with a "Memo" icon and several phenological events: ThermalTime, EndoDormancy, Budding, Flowering, FruitSet, BerryDevelopment, LeafDeathPhase, GotoPhase, BudBurstDOY, FloweringDOY, VeraisonDOY, CurrentSeason, and AccChillBefPrune. At the bottom is an "Age" parameter.
- Leaf:** Lists parameters for leaf growth and development, including ThermalTime, InitialLeaf1, InitialLeaf2, InitialLeaf3, CohortParameters, Photosynthesis, FRGRFunction, ExtinctionCoeff, Total, BiomassRemovalDefaults, DMConversionEfficiency, RemobilisationCost, CarbonConcentration, StructuralFraction, StomatalConductanceCO2M, DMDemandPriorityFactors, FrostFraction, WidthFunction, and DepthFunction. A "Berry" category is also present with sub-items: Memo, MetFactors, and YieldComponent.
- Structure:** Lists parameters for plant structure, including ThermalTime, MainStemPrimordialInitiationRate, Phyllochron, FinalLeafNumber, BranchingRate, BranchMortality, DroughtInducedBranchMortality, StemSenescenceAge, BudNumber, and HeightModel. A "Trunk" category includes InitialWt, DMDemands, DMDemandPriorityFactors, DMRetranslocationFactor, DMConversionEfficiency, NReallocationFactor, NReetranslocationFactor, NitrogenDemandSwitch, MinimumNConc, MaximumNConc, and BiomassRemovalDefaults.

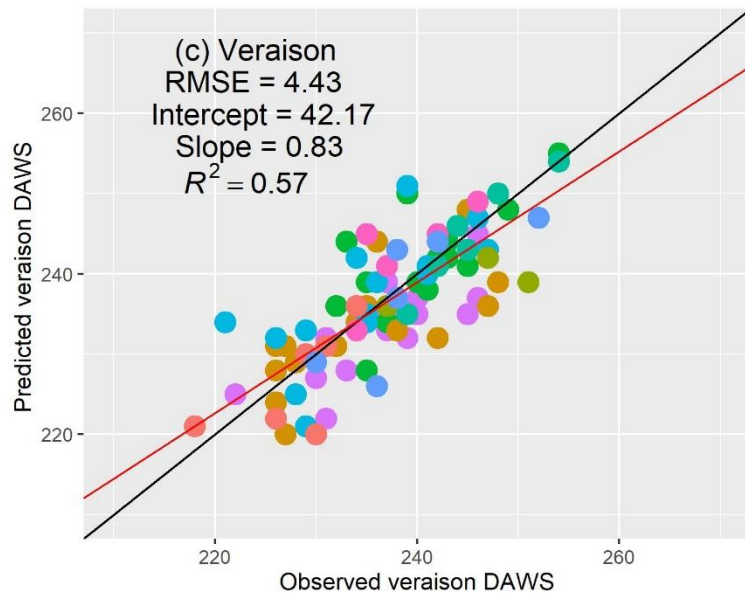
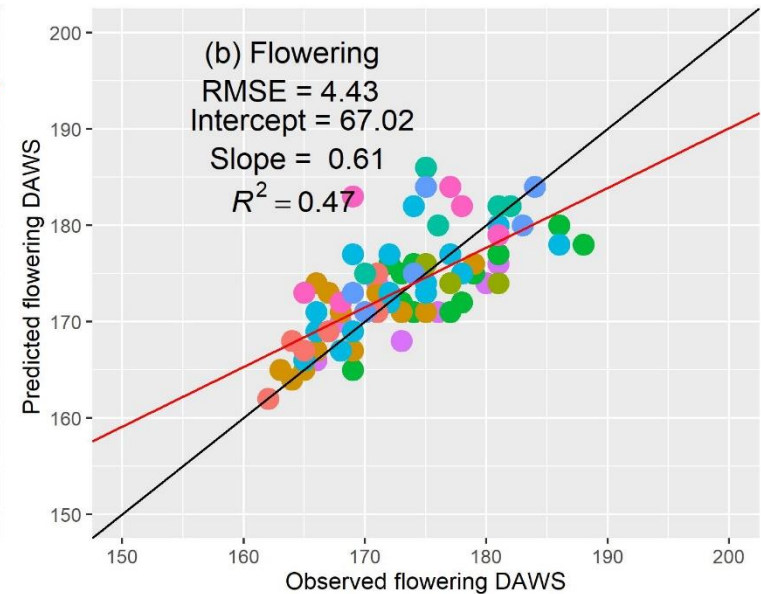
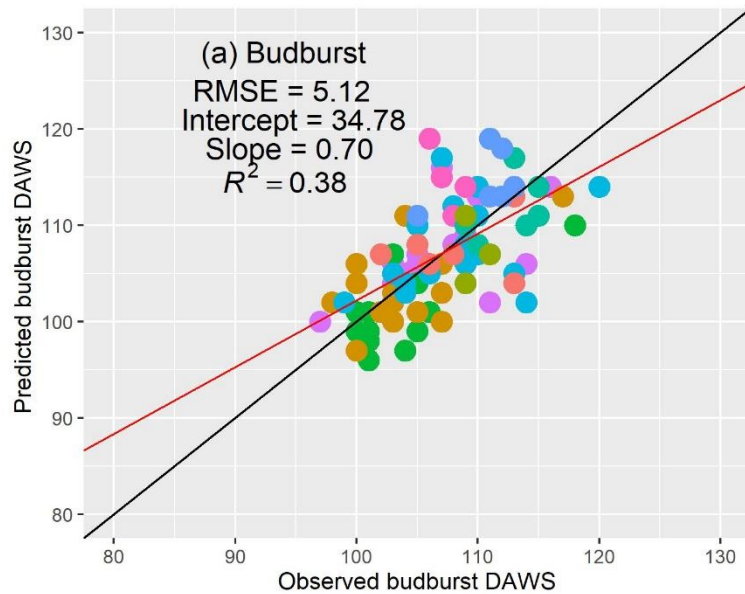
Overview of APSIM grapevine model

- » **Agricultural Production Systems sIMulator (APSIM)**
- » A vine and inter-row strip configuration to represent the vineyard setup.
- » Strip light interception model
- » New carbon allocation method
- » A new yield module
- » Flexibility in setting different training systems

Model functionality

- » Phenology (budburst, flowering, fruitset, véraison)
- » Light interception
- » Photosynthesis
- » Leaf number, leaf size, and leaf area on primary shoot and lateral shoot
- » Carbon allocation between different organs and carbon storage
- » Yield formation
- » Soil water dynamics (under development)

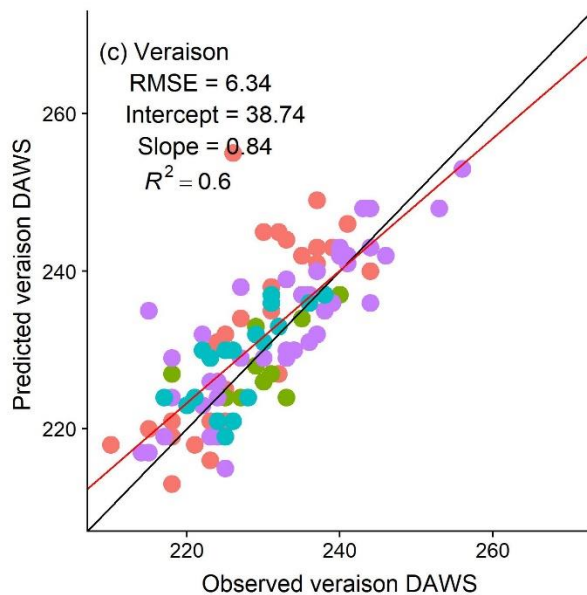
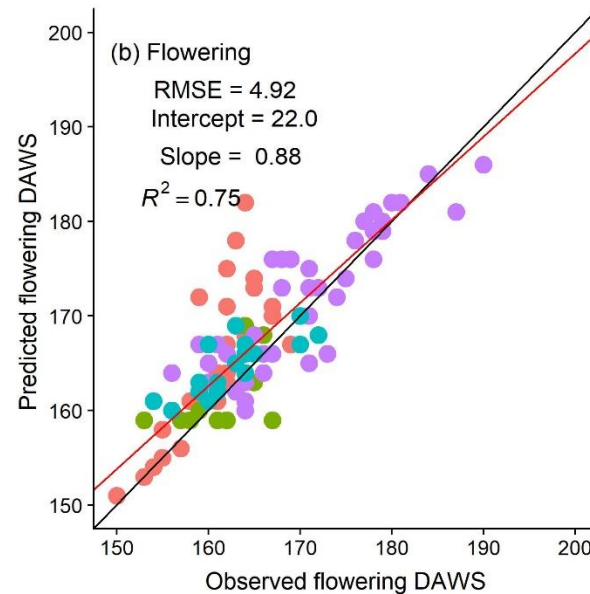
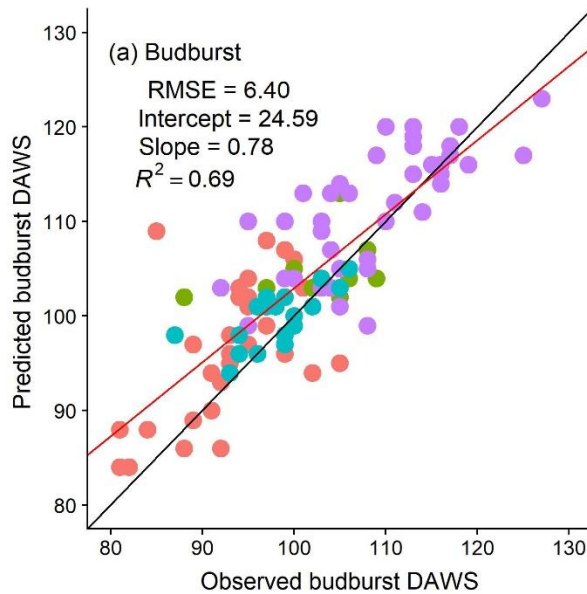
Phenology prediction



Site

- HB_BP
- MRL_CR
- MRL_DA
- MRL_SA
- MRL_UA
- MRL_UB
- MRL_UW
- MRL_WW
- WV_GL

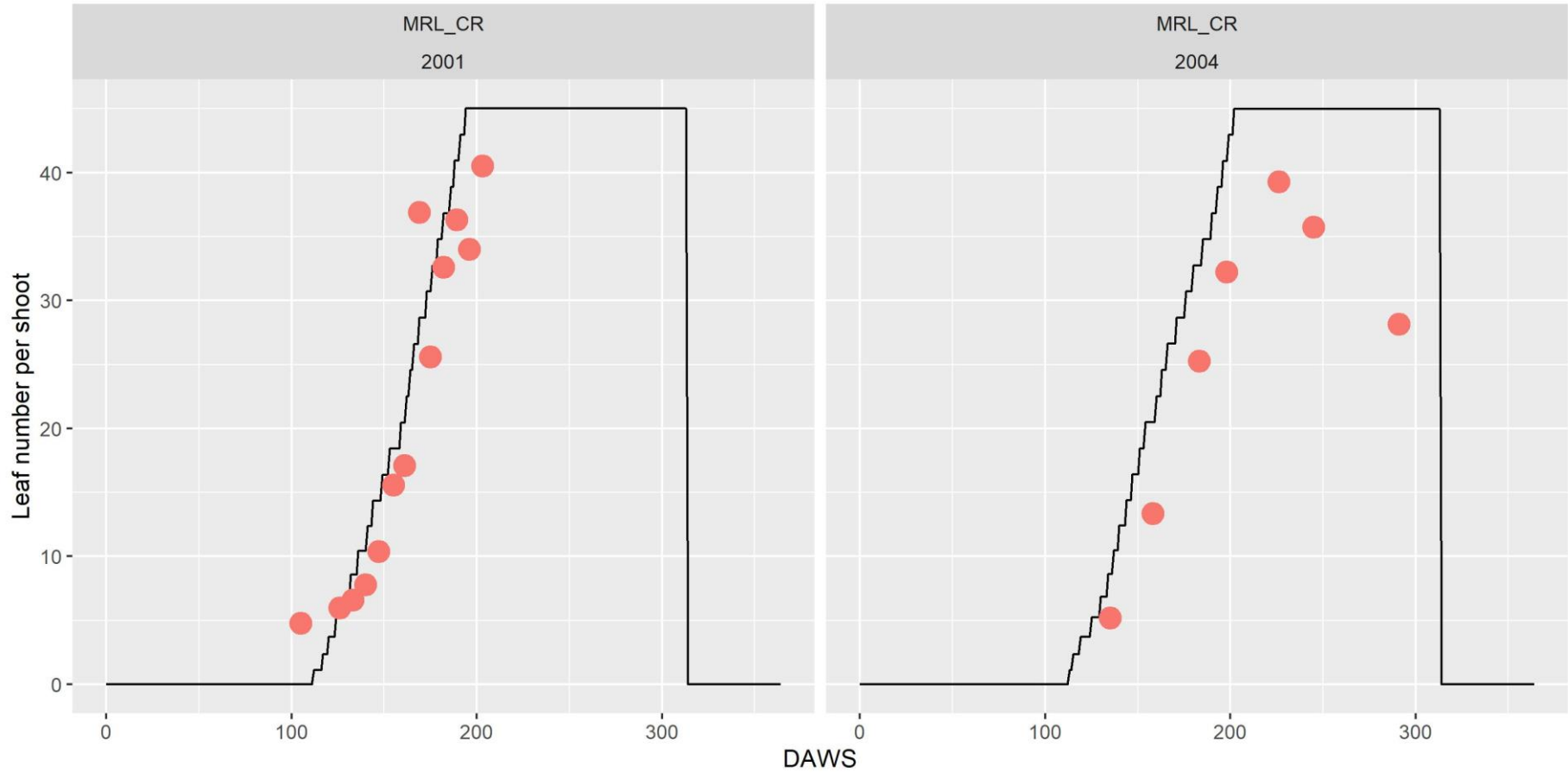
Phenology prediction for other varieties



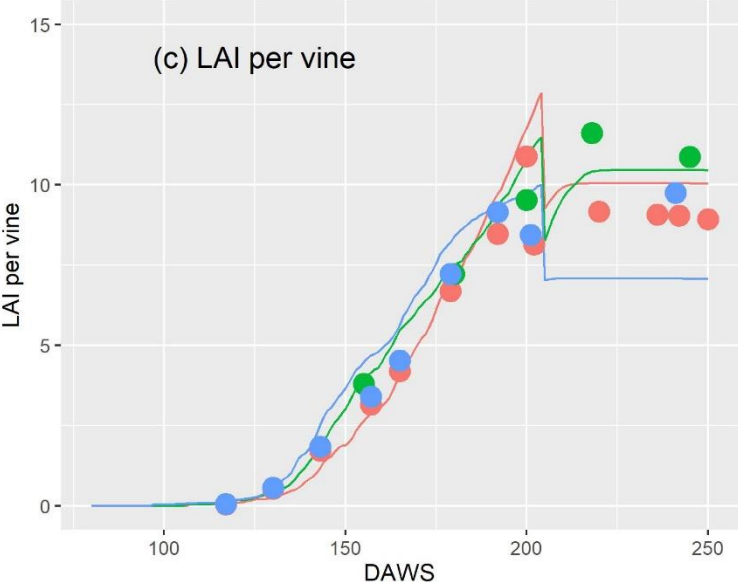
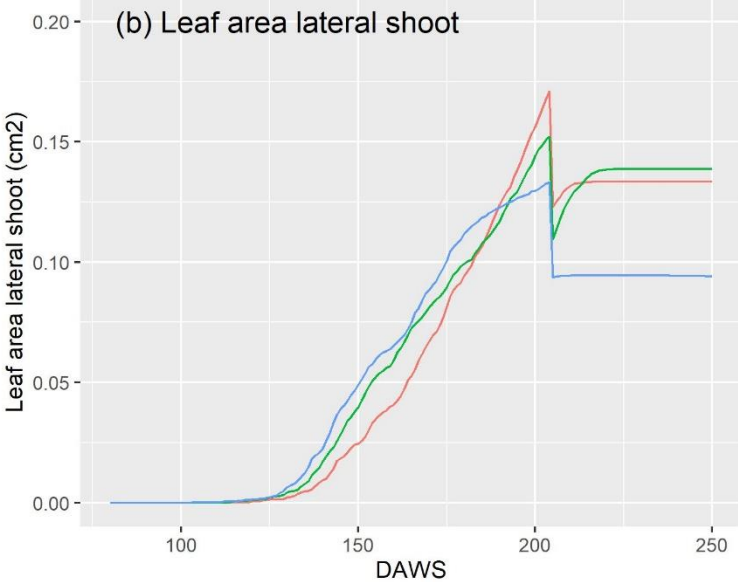
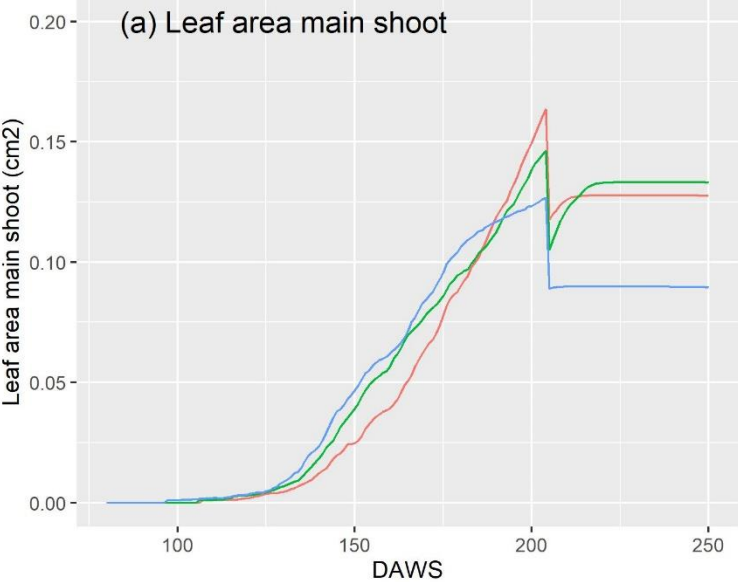
Site

- Chardonnay
- Merlot
- Pinot gris
- Pinot noir

Leaf number per shoot

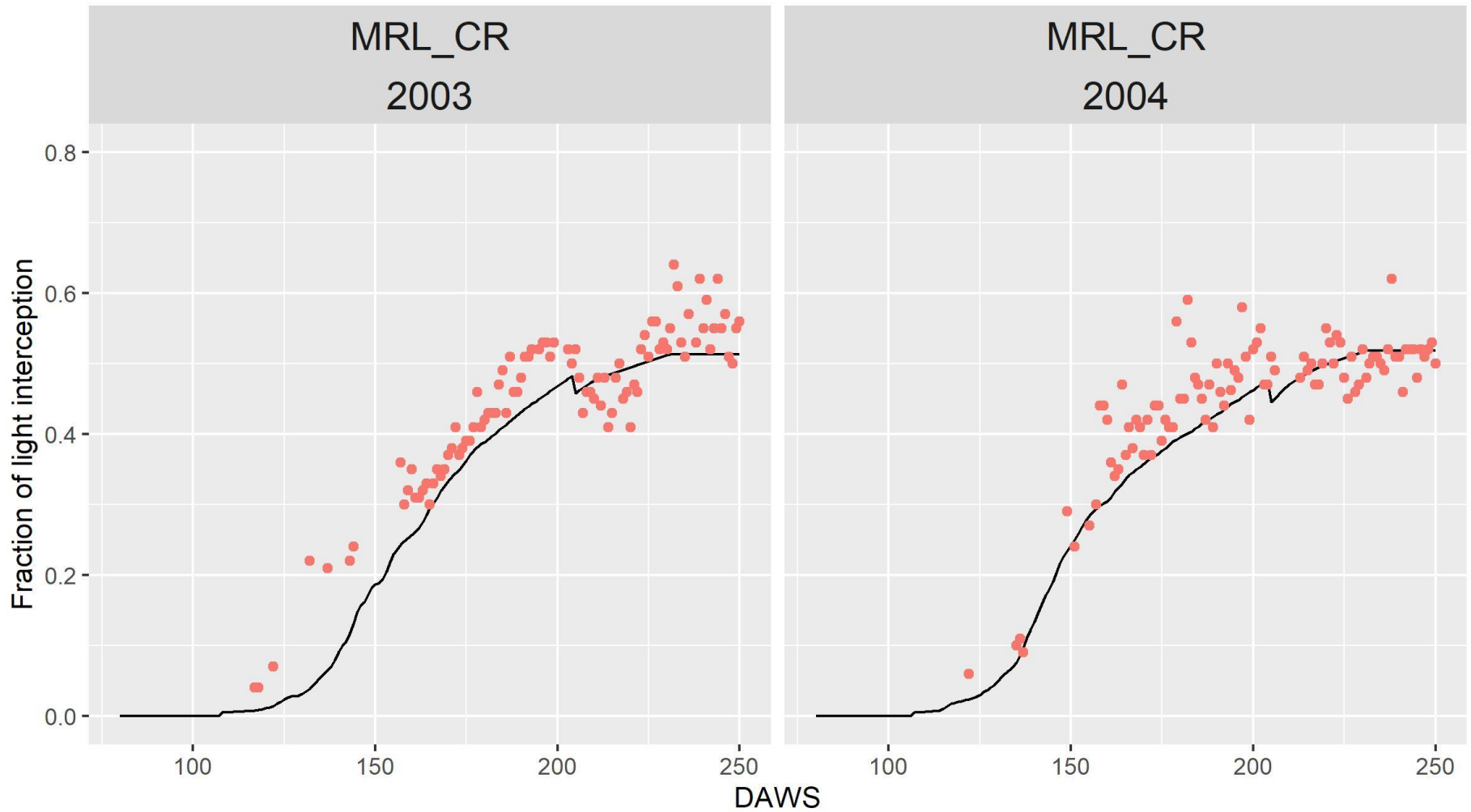


Leaf area

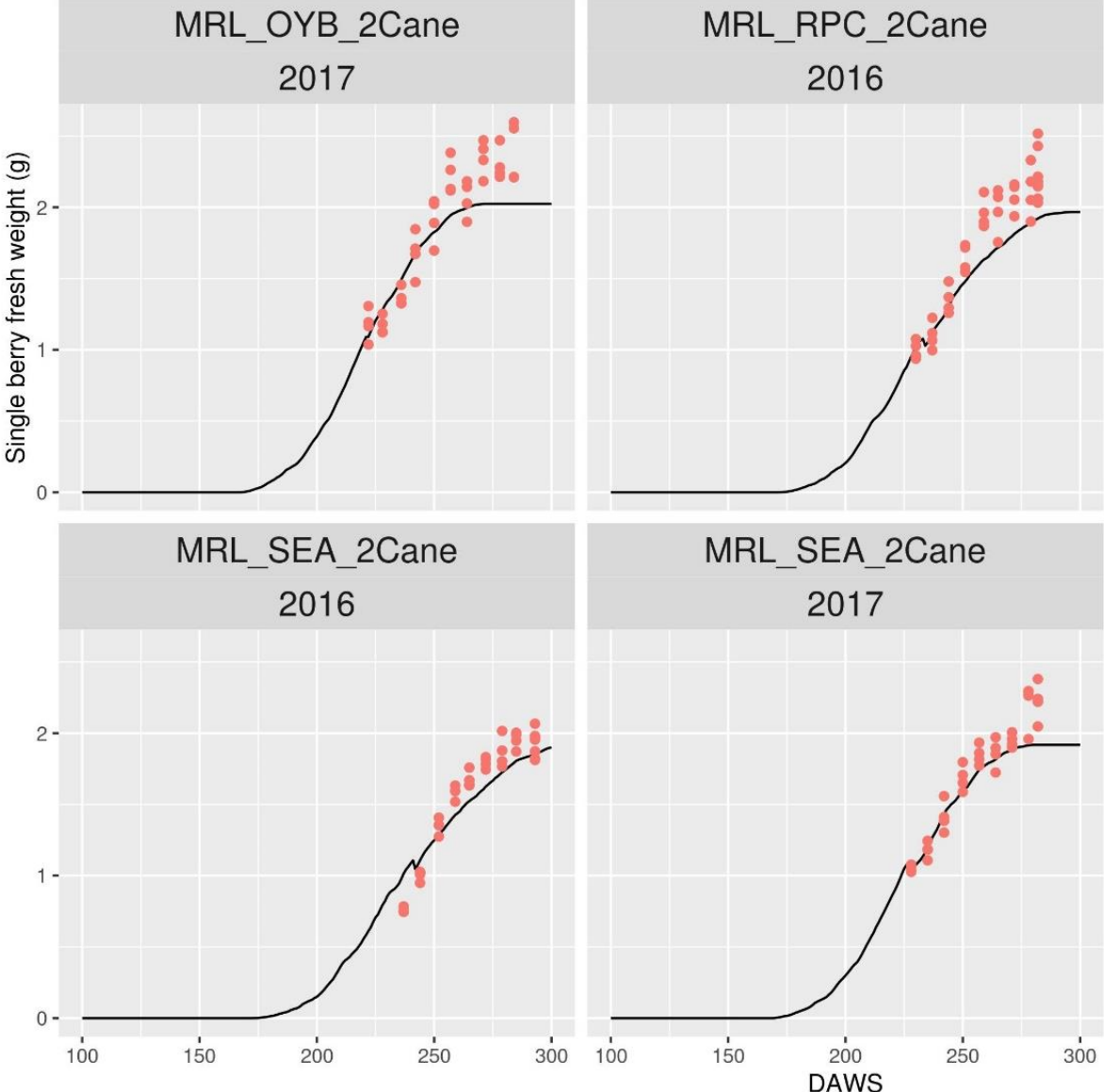


- Simulations
- MRL_CR-2003
 - MRL_CR-2004
 - MRL_CR-2005

Radiation interception

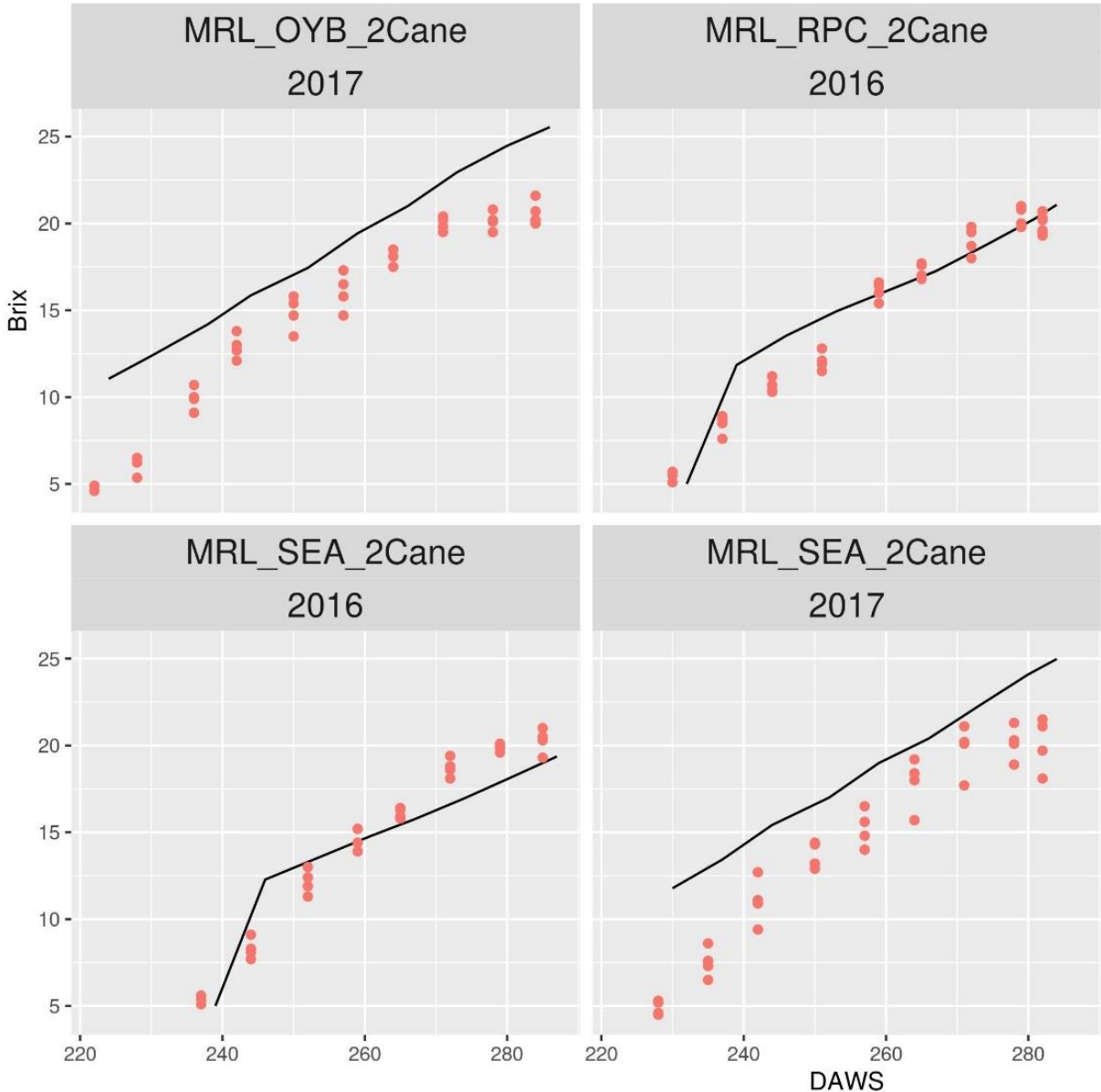


Berry fresh weight

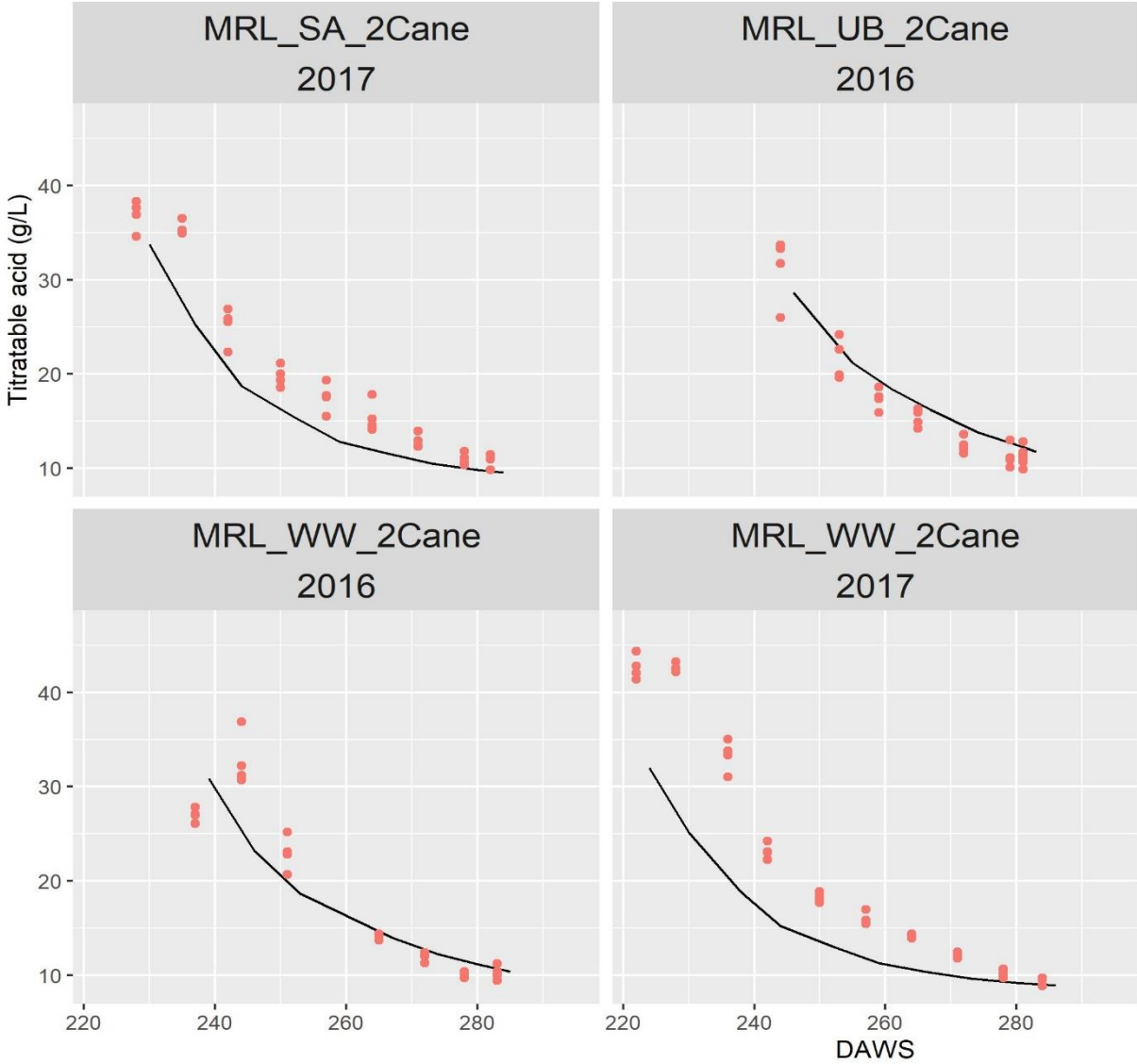


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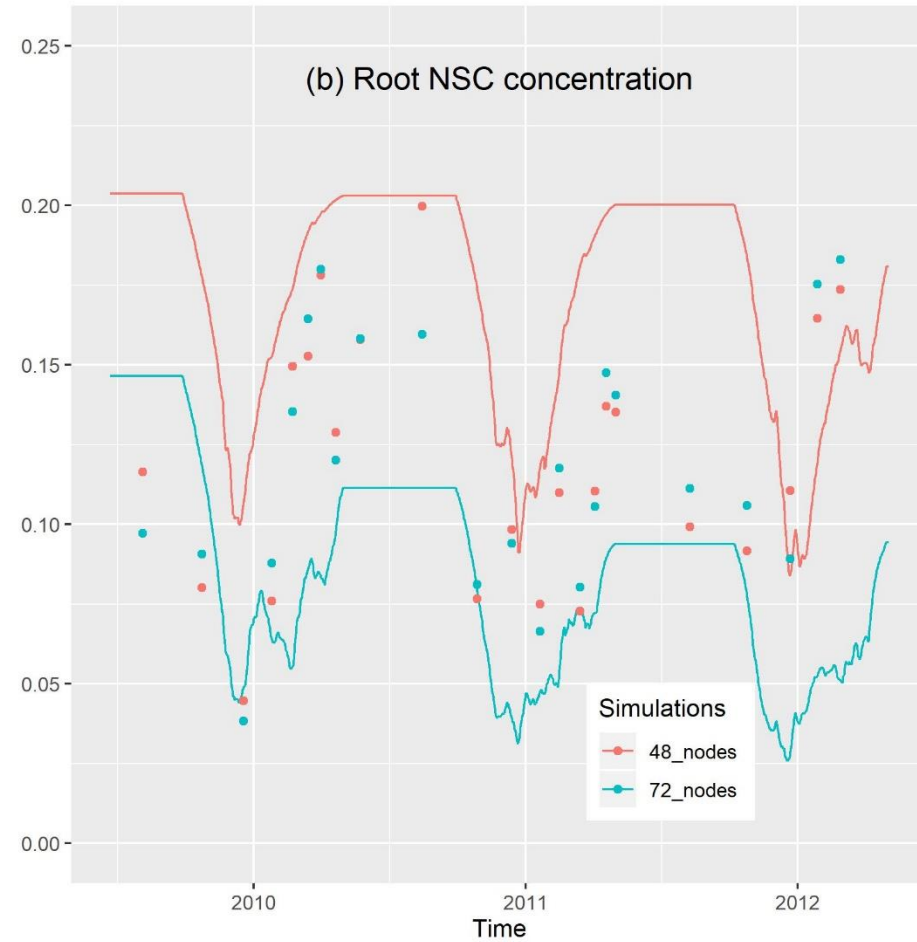
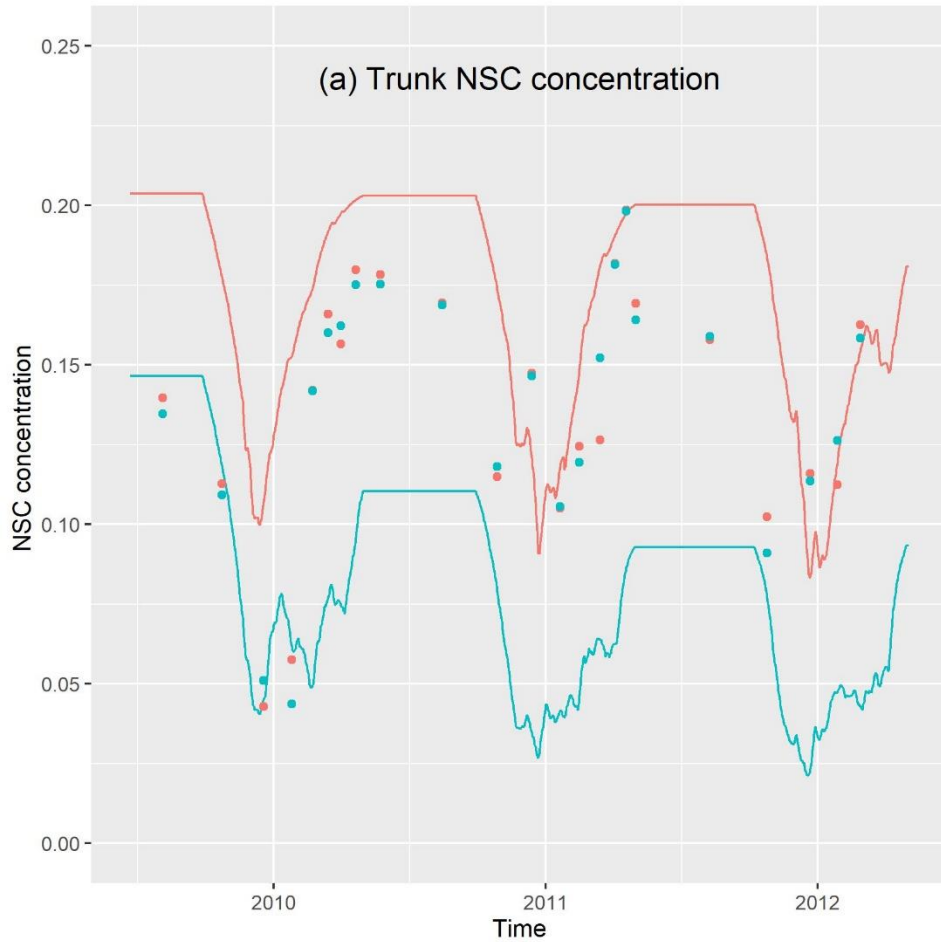
Berry brix



Berry Ta

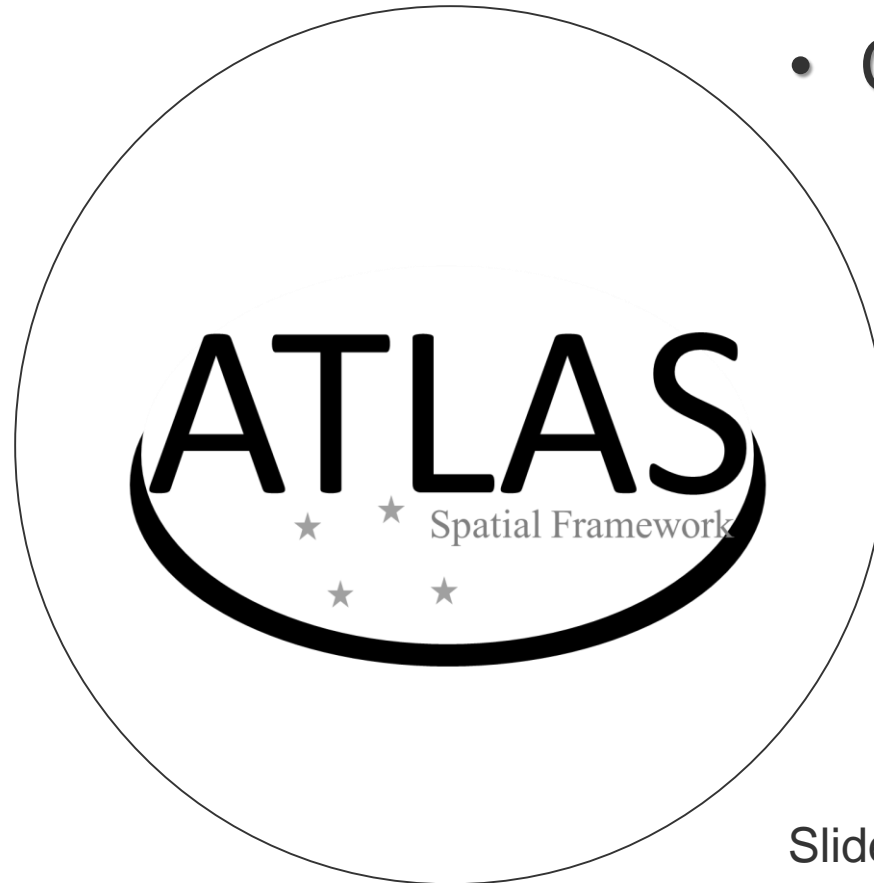


Carbon reserves



Assessment Tool for Landscape-scale Agricultural Systems

- Cross-CRI tool



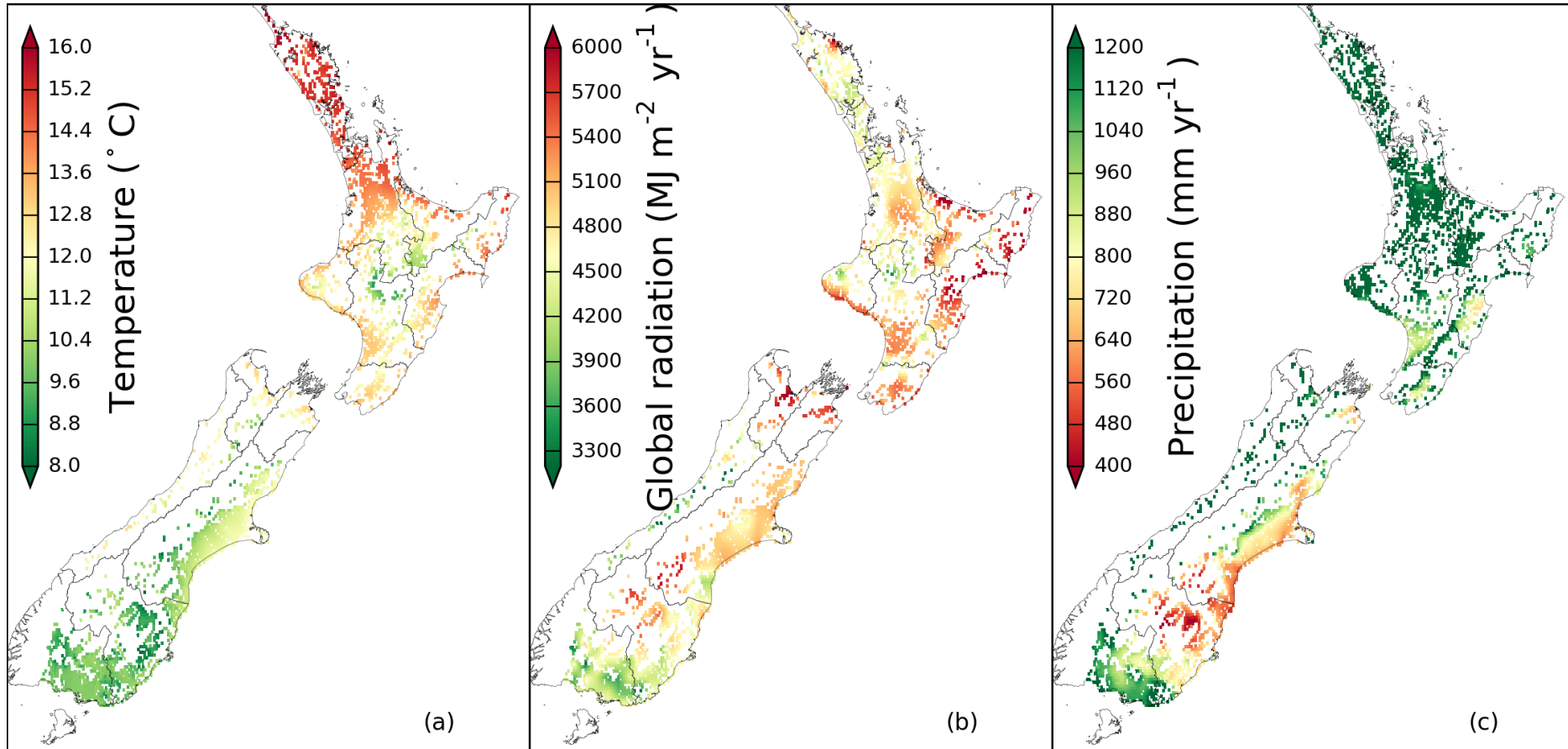
Slides from Edmar Teixeira

<https://atlas.powerplant.dev.pfr.co.nz/>

From point- to landscape-scale simulations ...



NZ climate + climate change data (NIWA, ~5 km)



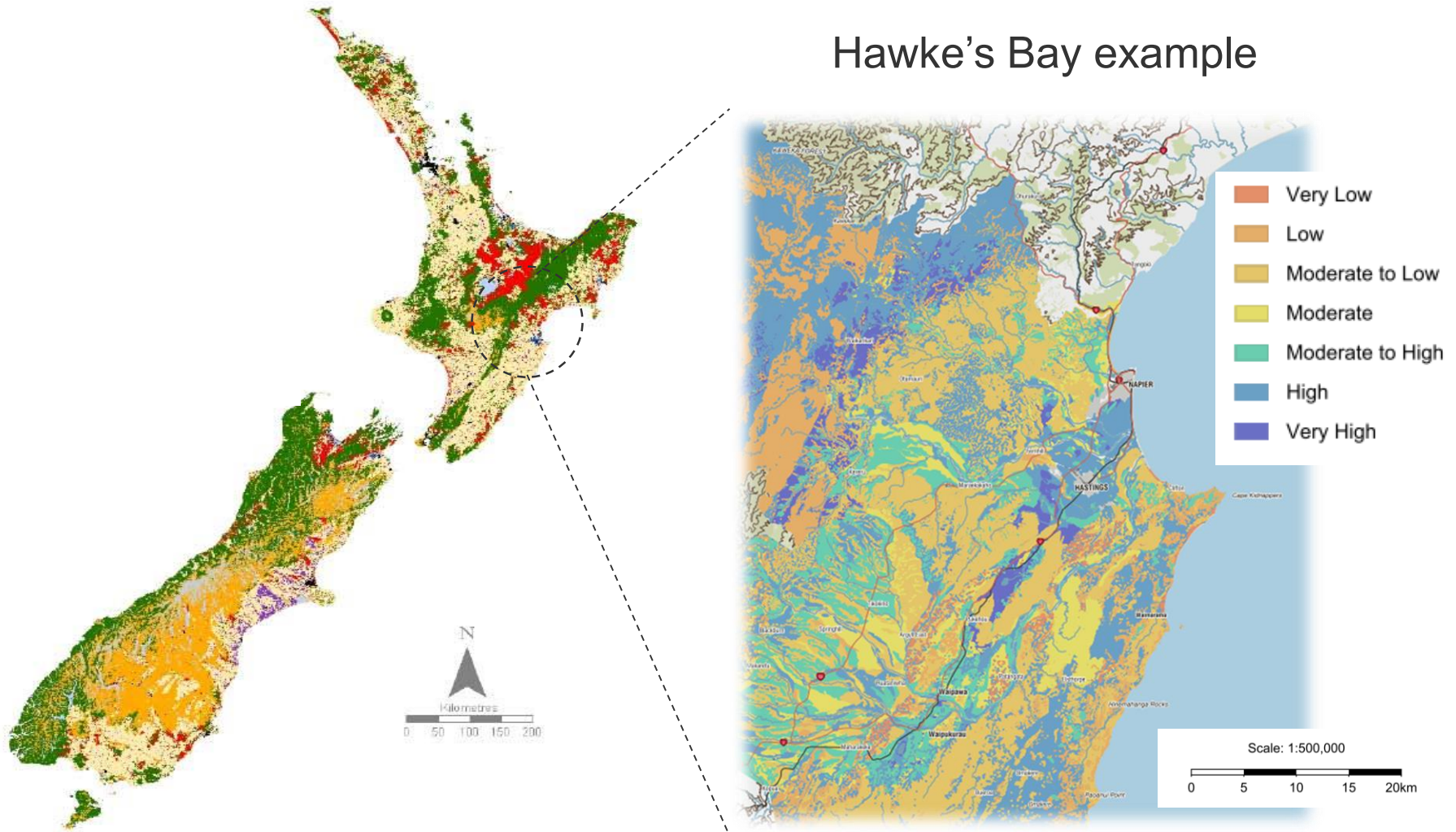
Source: ERA dataset NIWA VCSN (www.niwa.co.nz)

Filtered by arable lands ~1.5 k 5 km grid-cells (<https://iris.scinfo.org.nz/>)

NZ soil dataset (MW-Landcare S-map)



Hawke's Bay example



ATLAS development in Plant and Food Discovery Science (2017 – 2019)

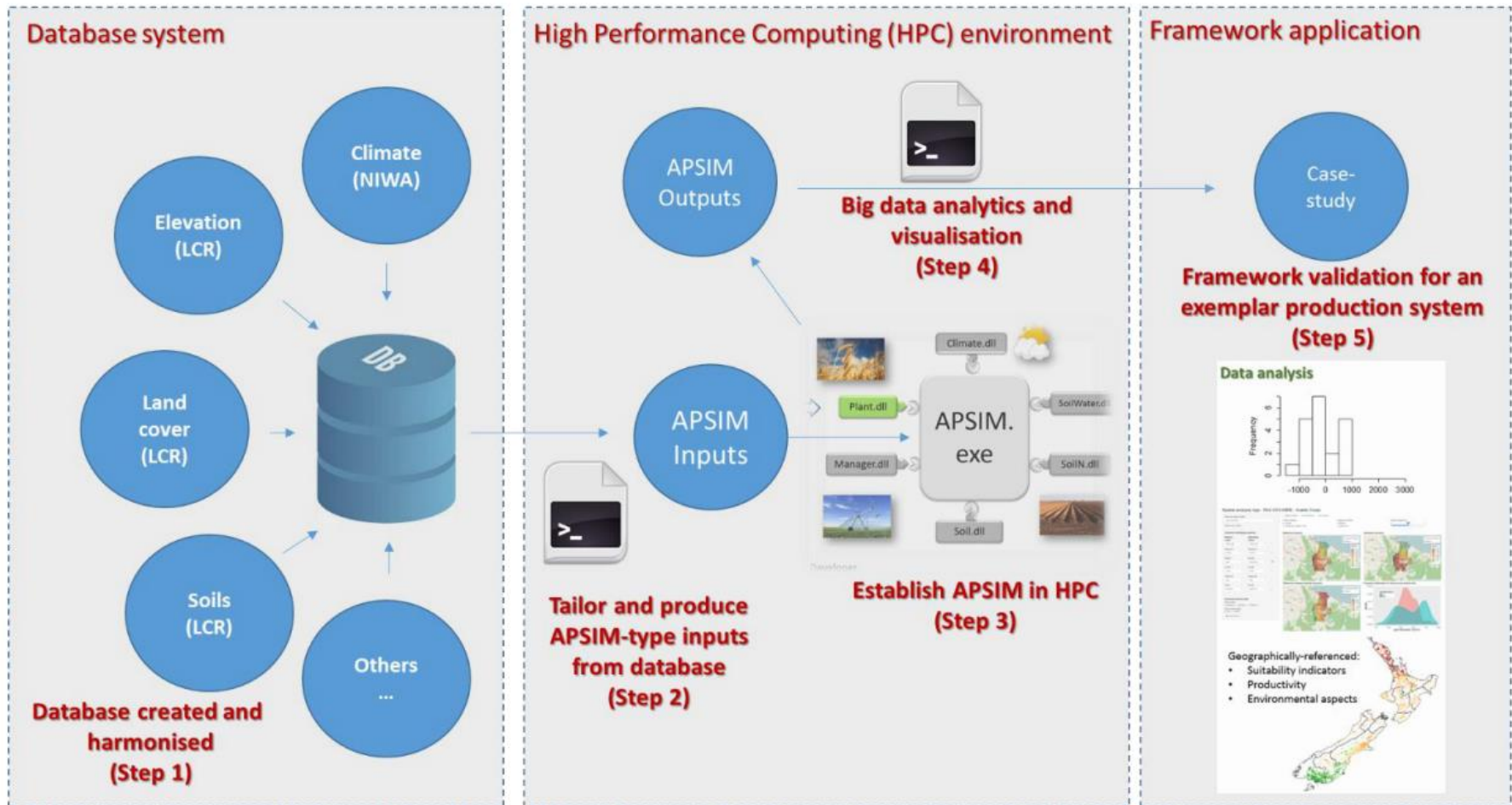


Figure 1 Schematic representation of components to be developed at each critical step (CS).

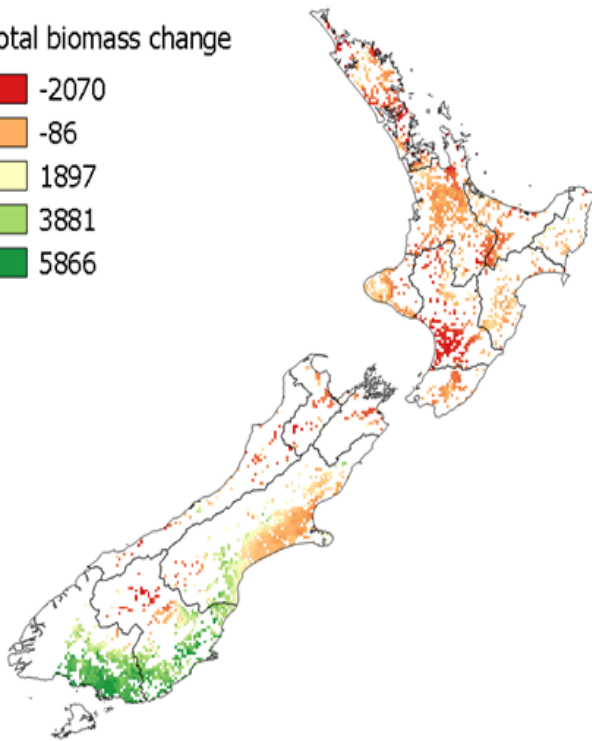
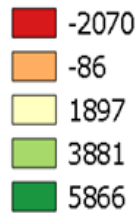
Impact of climate change scenarios



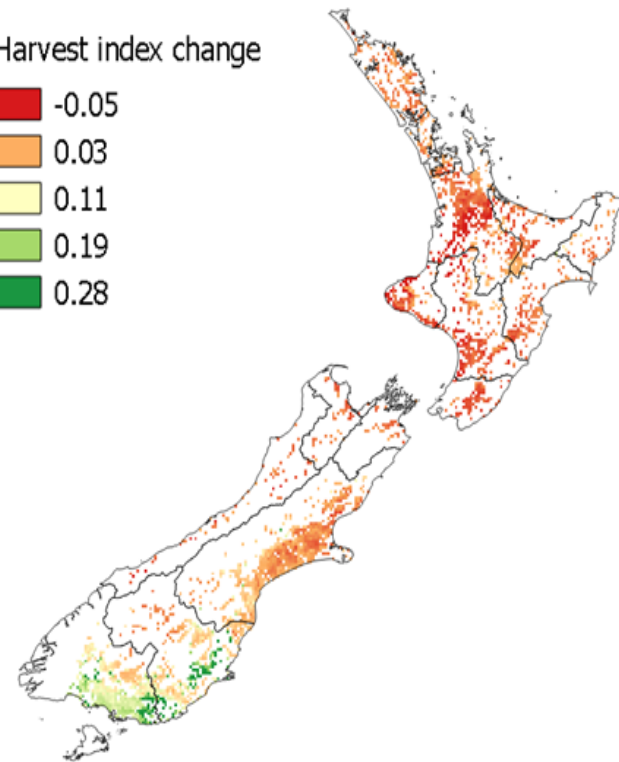
Silage biomass (kg/ha)

Harvest Index (fractional)

Total biomass change



Harvest index change



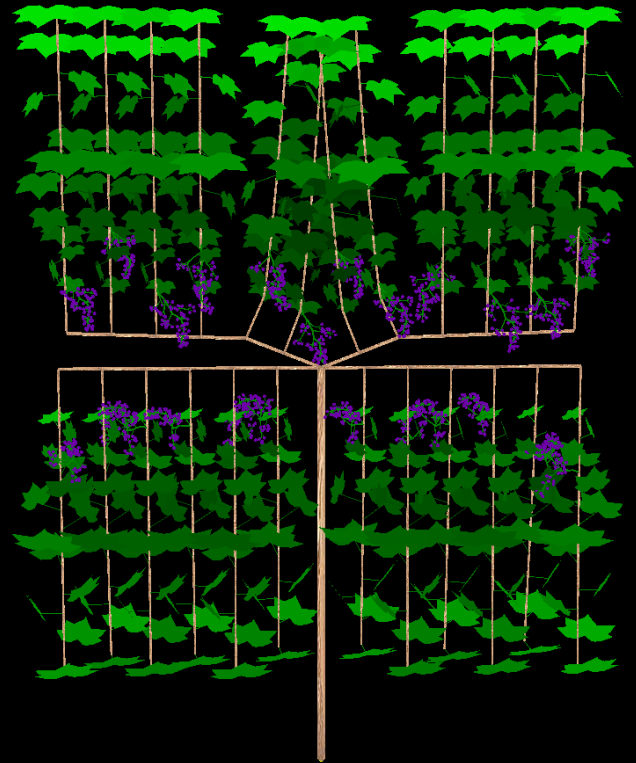
New opportunities for this area of research

- » Integrating disease risk models with phenology and yield predictions
- » Develop predictions of yield, and risk under climate change scenarios
- » Identify future suitability for grapevine production in NZ
- » Quantifying effects of carbon and water status on yield formation (whole-vine structural functional model)
- » Quantifying effects of yield and phenology on ripening dynamics (berry growth model)

Geneva double
curtain



Scott Henry



Thank you

Rob Agnew, Marc Greven, Mike Trought, Amber Parker, Fang Gou, Linlin Yang, Victoria Raw, Sue Neal, Steve Green, Rémi Fraysse, Damian Martin, Hamish Brown

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