| 1 | Title: Modelling of lucerne (Medicago sativa L.) for livestock production in diverse environments.   |
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# 23 Highlights:

| 24 | 1. | The GRAZPLAN model for lucerne was further developed and comprehensively validated          |
|----|----|---|
| 25 | 2. | Changes in the overall representation of plant phenology ensured agreement between          |
| 26 |    | modelled and observed data for different genotypes types with varying winter activity       |
| 27 | 3. | The model is suitable for use with the spectrum of different genotypes, climates, soils and |
| 28 |    | farming systems based on lucerne in Australia.  |

#### 29 Abstract

30 A number of models exist to predict lucerne (Medicago sativa L.) dry matter production; however most 31 of these models do not adequately represent the ecophysiology of the species to predict daily growth 32 rates across the range of environments in which it is grown. Since it was developed in the late 1990s 33 the GRAZPLAN model has not been updated to reflect modern genotypes and has not been widely 34 validated across the range of climates and farming systems in which lucerne is grown in modern times. Therefore the capacity of GRAZPLAN pasture growth model to predict lucerne growth and 35 development was assessed. This was done by re-estimating values for some key parameters based on 36 information in the scientific literature. The improved GRAZPLAN model was also assessed for its 37 capacity to reflect differences in the growth and physiology of lucerne genotypes with different winter 38 39 activity. Modifications were made to GRAZPLAN to improve its capacity to reflect changes in 40 phenology due to environmental triggers such as short photoperiods, declining low temperatures, 41 defoliation and water stress. Changes were also made to the parameter governing the effect of vapour 42 pressure VPD on the biomass-transpiration ratio and therefore biomass accumulation. Other 43 developments included the representation of root development and partitioning of canopy structure, 44 notably the ratio of leaf to stem dry matter. Data from replicated field experiments across Australia 45 were identified for the purpose of model validation. These data were broadly representative of the range 46 of climate zones, soil types and farming systems in which lucerne is used for livestock grazing. 47 Validation of predicted lucerne growth rates was comprehensive due to the plentiful data. Across a 48 range of climate zones, soils and farming systems there was an overall improvement in the capacity to 49 simulate the pasture dry matter production, with a reduction in the mean prediction error of 0.33 and 50 the root mean square deviation of 9.6 kg/ha/d. Validation of other parts of the model was restricted 51 however as information relating to plant roots, soil water, plant morphology and phenology were 52 limited. This study has highlighted the predictive power, versatility and robust nature of GRAZPLAN to predict the growth, development and nutritive value of perennial species such as lucerne. 53

- 54 Keywords: Agroecosystems, grazing systems, farming systems, biophysical model, GRAZPLAN,
- 55 alfalfa

#### 56 1 Introduction

57 Lucerne (or alfalfa, Medicago sativa L.) is the most widely grown perennial pasture legume in the 58 world. In Australia, lucerne is used in a wide range of livestock and farming systems. It is grown in 59 areas ranging from cool temperate to subtropical areas for both intensive and extensive agriculture in 60 both dryland and irrigated settings. It is commonly grazed, or cut and conserved as hay or silage. It is 61 also often integrated into crop-livestock systems as a ley phase in cropping rotations to control weeds 62 and disease (Dalal et al. 2004), to augment soil nitrogen and carbon stocks (Angus and Peoples 2012), and to improve soil structure (Hanley et al. 1964) and water infiltration (McCallum et al. 2004). Lucerne 63 is also grown in order to capitalise on summer rainfall to produce quality forage; it also alleviates 64 waterlogging (McCallum et al. 2004) and de-waters the soil profile (e.g. Dolling 2001) making it an 65 66 important tool in combating secondary soil salinity.

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68 A wide range of germplasm options from different genotypes are available to match different 69 combinations of farming systems, climate and soil type. Available genotypes vary in their winter 70 growth activity (the inverse of which is known as fall dormancy) from winter inactive to highly winter 71 active (Humphries et al. 2004). Farmers choose genotypes based on the desired availability of forage, persistence and tolerance to defoliation. Compared to regions in the northern hemisphere that 72 73 experience extreme cold periods, the growing season of lucerne in Australian farming systems is 74 commonly longer and stands may be defoliated more frequently, and most of the year round in many 75 areas (Lodge 1991).

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The exact nature of the physiological differences between lucerne genotypes with differing winter activity is not well understood. For example various authors have found that more winter-active genotypes do not initiate the inactivity (or dormancy) process as early as winter-inactive genotypes (Bula *et al.* 1956; Shih *et al.* 1967; Paquin and Pelletier 1980). Brown *et al.* (2005) suggested that the rate of leaf emergence also showed genotype dependency, possibly in relation to assimilate supply. However the actual differences in terms of ecophysiology such as the initiation or termination of dormancy are not clear from the literature and the actual effects might be complicated by genotype by
environment interactions.

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In Australia, the proportion of land sown to lucerne is increasing (Donald *et al.* 2012) with expansion from 3.2 M ha in 2006 to 7.5 M ha considered realistic in the medium term (Robertson 2006). Mathematical modelling has an important role to achieve this expansion, because it offers the opportunity to understand the productivity of lucerne, especially in highly variable climates, and allows farmers and their advisors to confidently plan to maximise the benefits to farm operations with consideration of the business risks. These types of models need to be developed on sound principles, and thoroughly validated.

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94 The ability to accurately predict responses in the growth and nutritive value of lucerne to environmental 95 variations is of primary importance in modelling production from grazing systems (Brown et al. 2012). 96 The responses of perennial forages such as lucerne to environmental conditions are, however, more 97 challenging to predict than for annuals due to the activity of the perennial organs (Teixeira et al. 2009). 98 In particular this involves the need to represent the dynamics of assimilate storage and mobilisation in 99 the perennial reserve organs in response to environmental conditions (photoperiod and temperature) 100 experienced by plants during the year (Teixeira et al. 2010); hence it is important to take a biophysical 101 approach. The interactions between lucerne and its environment are complex (Christian 1977). Often 102 interactions due to changing temperature, moisture stress, nutrient status and/or light, as well as the 103 length of grazing period, influence plant phenology and physiology which in turn have an effect on 104 lucerne biomass quantity and quality (Lodge 1991). The interactions among growing conditions, 105 defoliation patterns and winter growth characteristics influence the relationship between flowering 106 stage and the partitioning of assimilates. A number of attempts have been made to express dormancy 107 in lucerne models (Fick 1984; Kanneganti et al. 1998; Moot et al. 2001; Chen et al. 2008; Teixeira et 108 al. 2009; Pembleton et al. 2011), however while they were effective in replicating biomass dynamics 109 for a given dataset they were not physiologically robust and therefore it is difficult to confidently

transfer the parameter sets across diverse combinations of climate and different farming systems in other locations. As in Australian farming systems defoliation through cutting or set stocking/rotational grazing can occur all year round, in predictive models there needs to be careful consideration of the links between plant physiology, phenology and the plant's environment.

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115 Despite extensive research conducted worldwide contributing much to the collective knowledge of the 116 ecophysiology of lucerne, the ability to accurately model lucerne plant physiology across the diverse 117 spectrum of environments, and genotypes remains underdeveloped. Simulating the growth and 118 development of lucerne which occurs largely as a result of dormancy and the ecophysiology of the 119 lucerne plant (i.e. physiological responses to its environment) (Brown et al. 2005; Teixeira et al. 2009) 120 are significant challenges and several areas remain elusive for modelling. These include accurately 121 predicting lucerne phenology (such as the initiation of reproductive growth and flowering), particularly 122 in autumn; and its acquisition and use of below-ground reserves; capturing differences between 123 genotypes with different levels of winter activity; and predicting changes through the year in the 124 nutritive value of lucerne. A number of models predict lucerne growth, such as CropSyst (Stöckle et 125 al. 2003), APSIM (Robertson et al. 2002) and ALSIM (Fick 1984). These biophysical models of plantsoil-climate dynamics represent carbon assimilation, partitioning and utilization (Fick and Onstad 1988; 126 127 Robertson et al. 2002) to simulate growth, development and N accumulation in response to temperature, 128 photoperiod, soil water and N supply and were developed primarily for lucerne stands under cutting 129 management. None of these models represent different genotypes, nor defoliations of lucerne stands 130 by grazing animals which is the most common management system in Australia.

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This study aimed to review and revise the lucerne parameter set for lucerne in the GRAZPLAN model of pasture growth (Moore *et al.* 1997) to improve its ability to predict growth rate; and validate the predictions of the model set against experimental data from different agro-ecological areas within Australia. In particular we attempted to model the differences in winter growth activity between genotypes; and to formally test the model in Mediterranean environments, with temperate and summer-

dominant rainfall. This required updating the model to better represent seasonal phenology, biomass
partitioning, leaf:stem ratio, nutritive value *etc*. Previous versions of GRAZPLAN (and APSIM,
Robertson *et al.* 2002) were based on the semi winter–active cultivar, Hunter River, which has been
largely superseded by other options and so the model was updated to include the full range of genotypes
available to farmers.

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#### 143 2 Materials and Methods

#### 144 **2.1 The GRAZPLAN model**

145 The GRAZPLAN simulation model of grazed temperate grasslands (Moore et al. 1997) is a biomass-146 based, multi-species model that operates at a daily time step and that is designed to capture the dynamics 147 of both perennial and annual plant species. The model includes equations for the phenological cycles of various classes of perennial and annual plants, including representation of reduced winter activity 148 149 caused by cold conditions or by drought; capture of light, water and soil nutrients; assimilation and 150 respiration; the allocation of net assimilate to the production of leaves, stems, roots and seeds, including 151 the influence of phenological stage on allocation; relocation of below-ground reserves to new shoot growth; the dynamics of forage nutritive value; and the death, fall, decomposition and disappearance of 152 dead biomass. It has been specifically designed to interact with a model of selectively grazing livestock 153 154 (Freer et al., 1997). The GRAZPLAN models, and decision support tools based on it, are used widely within Australia for purposes of research (e.g. Cayley et al. 1998; Moore et al. 2014) and also in 155 156 decision support for producers (Donnelly et al. 2002 and references therein; Warn et al. 2006). In this study, the GRAZPLAN grassland model has been used in conjunction with the APSIM soil water, soil 157 158 nutrient cycling and surface residue models (Holzworth et al. 2014).

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Defoliation by either grazing or cutting is represented in the GRAZPLAN model. Defoliation by cutting removes shoots above a nominated height; the relative distribution of leaf and stem over the height profile is modelled, so that cut herbage can contain a higher proportion of leaf than the stand as a whole. 163 Shoot biomass is divided into age cohorts of regularly decreasing dry matter digestibility (DMD) and 164 the declines in digestibility of living leaves and stems due physiological senescence, and of dead 165 herbage due to microbial decomposition, are modelled as functions of temperature and (for dead herbage) moisture status. Grazing is controlled by the animal module of GRAZPLAN (Freer et al. 166 167 1997). Briefly, all forage above a livestock-specific height is aggregated into 6 equally-spaced digestibility classes; animals are assumed to select higher digestibility classes preferentially over those 168 of lower digestibility, and to be able to digest the latter more rapidly and so to consume more of them 169 170 (Freer et al. 1997); and total consumption of forage in each digestibility class is allocated pro rata to 171 the species and plant parts of which it is comprised (Moore et al. 1997).

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# 2.2 Revision of the GRAZPLAN genotypic parameters for lucerne

#### 2.2.1 Allocation of growth between roots, leaves and stems

175 Khaiti and Lemaire (1992) found that the seasonal variations in potential shoot production of lucerne 176 were not determined by changes in the radiation use efficiency for the production of total biomass, but 177 by the annual pattern of assimilate partitioning between roots and shoots. The seasonality in shoot 178 production which is characteristic of lucerne – and which partly determines its pattern of forage supply 179 - is therefore largely driven by differences in assimilation partitioning throughout the year. Teixeira *et* 180 al. (2008) found that fractional partitioning of dry matter to roots increased from near zero in winter 181 and early spring to more than 0.45 in autumn (i.e. the period of reduced shoot growth). The latter figure 182 corresponds to a root:shoot ratio of approximately 0.8, so the parameter giving the "target" root:shoot 183 ratio during vegetative growth was decreased to this value; the target ratio after flowering was set to 184 0.3.

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186 Modelling experimental data sets in which leaf and stem biomass were separated highlighted that the 187 original parameter set underestimated the leaf fraction. This is of importance as the leaf fraction is arguably the single most important determinant of value for livestock production. This problem wasaddressed in the following ways:

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• The parameters governing allocation to leaf as a proportion of shoot allocation during vegetative growth were increased to a fixed value of 0.80 (in the original parameter set, this value ranged between 0.25-0.70 depending on the degree of shading) based on the work of Teixeira et al. (2008) who found that the fractional partitioning of dry matter to roots increased from near zero in winter and early spring (reproductive growth) to more than 0.45 in autumn (i.e. the period of reduced activity). The latter figure corresponds to a root:shoot ratio of approximately 0.8,

197 The parameters affecting the phenology (KV3, KV5, KV6), specifically the transition from 198 vegetative to reproductive stages were taken from field data reported by Moot et al. (2001), Brown 199 et al. (2005), Zahid (2009) and Teixeira et al. (2011). The canopy morphology profile of the sward 200 was adjusted so that there would be a better representation of the sward in response to selective 201 grazing. The upper layers of the sward have a higher proportion of leaf (Woodward and Sheehy 202 1979), so that samples of herbage obtained by cutting to heights above ground level have a higher 203 proportion of leaf than the pre-cutting sward as a whole. Consequently, the "morphology" 204 parameter K<sub>M01</sub>, which describes the variation of the leaf:shoot mass ratio with height, was fitted by least-squares minimisation to the data of Woodward and Sheehy (1979), resulting in a value of 205 206 -0.30 (which implies that there is a height below which all herbage is composed of stem),

Leaf:stem ratio in lucerne is reduced by high temperature (Carter and Sheaffer (1983). This effect
 is captured in the GRAZPLAN model through the link between phenology and allocation between
 stem and leaf: higher temperatures lead to more rapid initiation of reproductive growth and
 flowering, and assimilate is redirected from roots to stems during the reproductive phenological
 stage (see equation 36 of Moore et al. (1997).

213 Changes were also made to the parameter governing the effect of VPD on the biomass-transpiration 214 ratio. This influences biomass accumulation under low  $CO_2$  conditions when stomata are closed. The 215 model was found to fit the experimental data better if the parameter setting the temperature above which 216 photosynthesis proceeds at its maximum rate was increased to  $18^{\circ}C$ .

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# 2.2.2 Extension of the rooting front

The rate at which the rooting front of a newly-sown lucerne stand develops (called the extraction front velocity or EFV) is important in determining the length of time a lucerne stand takes to exploit this soil water resource. In the GRAZPLAN model, the EFV is modelled as a function of soil bulk density, sand content, soil moisture content and thermal time. EFV increases with decreasing bulk density and with increasing sand content, both of which imply the presence of larger soil pores into which roots can penetrate.

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Data presented by Dolling et al. (2005a) for 9 locations in Western Australia were used to estimate the 226 227 parameters of the existing EFV sub-model, because only this data set included both a range of soil types and measurements of the soil attributes necessary to estimate EFV using the GRAZPLAN model 228 229 equation. Rather than use the average EFVs over the whole soil profile presented by Dolling et al. (2005a), EFVs for the B horizons were estimated by linear regression of the data presented in their 230 231 Figure 3. This was done to control the effects of soil moisture and temperature on EFV: the experimental conditions in the Dolling et al. experiment made it likely that there would always be soil moisture 232 233 available at the base of the rooting front, and temperatures in the subsoils would not vary greatly from 234 the long-term mean, allowing the measured EFVs in mm/d to be converted to the values in mm/°C.d 235 that are predicted by the model equation.

236

The 4 parameters ( $K_{R2}$  to  $K_{R8}$ ) for the effect of bulk density and sand content on EFV (Appendix A) were fitted to the measured EFVs by the method of least squares. Figure 1a compares the fitted and estimated EFVs, and Figure 1b shows the fitted relationship between EFV and bulk density for soils
with a range of sand contents. The RMSE was 0.41 mm/day for the Dolling et al. (2005a) data.

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# 2.2.3 Representing different winter activity types

243 A period of reduced winter activity or sometimes referred to as "dormancy" is a distinctive characteristic 244 of the annual growth cycle of lucerne. Reduced winter activity relates to a collection of processes that 245 enable the plant to survive during the onset of stressful times of the year and that manifest as a slowing 246 of shoots growth. For lucerne, during this period the plant continues active photosynthesis but 247 transitions from partitioning assimilates and activity to below-ground rather than above-ground 248 structures (Christian 1977). Lucerne genotypes can be rated for their winter activity according to the extent of shoot elongation in winter. Plants are cut at the end of autumn and their productivity, canopy 249 250 height and leaf:stem ratio 4 weeks later are used to assign a winter activity rating. For the purposes of GRAZPLAN genotypes with rating between 1 and 11 have been classed into four groups: winter 251 252 inactive (WI, activity rating 1-3), semi-winter active (SWA, rating 4-5), winter-active (rating 6-7) and highly winter active (8-11)(Humphries et al. 2004). 253

254

Attempts to parameterise the existing model for the initiation of reduced activity were unsuccessful, and so this part of the phenology submodel was re-specified. A lagged mean temperature is defined as:

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258 
$$T_{lag}(t) = T_{mean}/K_{V30} + T_{lag}(t-1) \ge (1-1/K_{V30})$$

259



261

262 
$$RAMP(T_{lag}, K_{V26}, K_{V27}) + RAMP(DL, K_{V28}, K_{V29}) \ge 1$$

263

The same equation controls both the start and end of the period of reduced activity. When reduced activity is no longer enforced, the phenological cycle recommences at the start of vegetative growth. This submodel treats reduced activity as an enforced rather than induced partial dormancy, i.e. it ends shortly after environmental conditions become suitable for growth. This assumption is supported by the experimental evidence of McKenzie *et al.* (1988).

269

270 The equations describing the start and end of reduced winter activity were modified to use 5 new 271 parameters (see Appendix A). The literature is unclear whether these triggers vary according to winter 272 activity rating, but similar values have been concluded from experiments in different environments and 273 with different genotypes (Major et al. 1991; Brown et al. 2005; Sim 2014). What is known, however, 274 is that winter-inactive genotypes partition greater amounts of reserves to the taproot and consequently 275 have a greater reduction in shoot growth than winter-active genotypes (Hodgson 1964; Teuber and 276 Brick 1988). The modified GRAZPLAN model was therefore parameterised upon the premise that 277 differences in dormancy of lucerne genotypes are best described as differences in the *intensity* of 278 dormancy rather than differences in its *duration*.

279

The parameters of the new equation are taken to be the same for all genotypes, so that the simulated duration of reduced activity in a given environment will also be the same. (It was not possible to test this assumption using the available experimental datasets, but the available evidence provides little support for an alternative parameterization). Differences in winter activity classes are instead assumed to be due to two physiological differences:

• More winter-active genotypes undergo a relatively smaller reduction in meristematic function during the period of reduced winter activity (represented by  $K_{MR1}$ , the maximum relative growth rate of shoots during the "winter-inactive" phenological stage). This results in a lower root:shoot ratio during the winter, i.e. proportionately less investment of assimilate into the perennial organs, in more winter-active genotypes.

• More winter-active genotypes remobilize root reserves more rapidly into aboveground tissue when conditions are suitable, such as after defoliation and at the commencement of reproductive growth.

The parameter values describing these differences in winter activity were derived by trial-and-error calibration to the spring and summer experimental data sets, especially those with frequent defoliation (see  $K_{MR1}$ ,  $K_{TL1}$ ,  $K_{TL2}$  in Appendix A). It is possible that other factors may vary between genotypes such as the temperature and photoperiod triggers relating to the period of winter inactivity, however as yet these are not well enough defined experimentally to specify differentially in the model.

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A complete listing of the GRAZPLAN parameter set for lucerne is given in Appendix A.

299

## 300 **2.3 Selection of experimental data sets for testing**

301 Because the GRAZPLAN models are applied across a wide range of environments, the first criterion 302 for selection of the available databases for model validation was to obtain experimental datasets that 303 gave reasonable coverage of this environmental diversity within the grazing regions of Australia. 304 Datasets were therefore collated from around Australia, covering the range of climates, soil types and 305 farming systems in which lucerne is used throughout the continent. Experiments covering longer spans 306 of time were preferentially chosen because they allow the model to be tested against a greater range of 307 temperature and moisture conditions. A range of datasets with desirable characteristics were sourced 308 and a final set of 7 experiments was chosen based on the availability of adequate site characterisation 309 in terms of soil properties and local meteorological conditions during the experiment, the length of 310 record, whether shoot biomass accumulation was recorded at for least 10 intervals, the inclusion of a 311 number of genotypes (differing in their winter activity) in the experiment, as well as the availability of 312 data other than shoot production (e.g. chemical composition of the shoot material, leaf: shoot proportion, 313 root data, soil water dynamics etc.). The locations of the selected experimental data sets are shown in 314 Figure 1 and the experiments are summarised in Table 1.

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316

# 6 2.4 Simulation of the experimental data sets

317 Simulations of each experiment were constructed using the GRAZPLAN pasture and livestock models

318 (Freer *et al.* 1997; Moore *et al.* 1997) linked to the APSIM soil water and soil nutrient cycling models

(Holzworth *et al.* 2014) by using the AusFarm software (version 1.4.8). Weather data (precipitation,
maximum and minimum air temperature, vapour pressure deficit, solar radiation) were obtained from
official local (or onsite experimental) weather stations where possible; otherwise a Patched Point dataset
for the closest climate station was extracted from the SILO data base (Jeffrey *et al.* 2001).

323

Soil physical and chemical attributes were taken from on-site measurements where available; otherwise 324 325 soil attributes were acquired for the most suitable soils using detailed information in databases such as 326 APSoil (Dalgliesh et al. 2009) based on advice from local experts. Soil attributes for the Forth and 327 Cranbrook sites were taken from the modelling study of Ojeda et al. (2016), which also used the APSIM 328 soil water balance model. Local soil data for some sites such as the Tamworth experiments in particular 329 were limited, which introduces uncertainty into model predictions from the outset. Where not available 330 from records or local experts, the maximum rooting depth of each species was set based on soil physical 331 properties (e.g. bulk density).

332

Details of management practices such as sowing, fertiliser use, grazing, cutting and weed control were extracted from publications relating to each experiment (Table 1) and reproduced using the management-rule system available in AusFarm (Moore 2014). Where descriptions of management activities were incomplete, they were inferred based on the authors' and local experts' knowledge of the same or similar systems. Information on cutting heights and the durations and stocking densities in periods of grazing was frequently not reported.

339

The initial conditions of the soils at the time of sowing of the lucerne were not recorded for any of the experiments used for validation. In order to reduce this potentially large source of uncertainty in soil moisture, carbon and nitrogen pools, each simulation was run for a period prior to the commencement (i.e. sowing) of each experiment. In a number of cases the pre-experimental management of the sites was not fully reported; pre-experimental conditions for these experiments were modelled based on the

advice of local experts and typically a fallow period with regular weed control was simulated prior tosowing of the lucerne.

347

In order to realistically represent the experiments, simulations consisted of mixed swards rather than monocultures, even though the botanical composition, or total content of species other than lucerne, was only recorded or reported for a minority of sampling dates. In most cases this meant the inclusion of a winter grass, forb (such as a broadleaf weed) and sometimes (if reported) an annual legume and summer grass. All species except lucerne were sown in the simulations prior to the start of the fallow period.

354

355 The experiments were defoliated in various ways, following the management reported in the papers describing them. Defoliation techniques included grazing, cutting, others were grazed followed by 356 357 cutting the residual biomass to a set height. Grazing or cutting activities were carried out using the 358 corresponding events in the GRAZPLAN model. The dates of defoliation were defined in the datasets. 359 Cutting events were modelled using the corresponding event in the GRAZPLAN model, with a best-360 available estimate of the cutting height used. Mown biomass was either removed from the plot or 361 retained, as reported for each experiment. Grazing was often reported as 'crash grazing', i.e. sheep 362 grazed the experimental plots at a high stocking density until herbage mass was reduced to a low level. 363 This residual biomass was reported following estimates for experiments as a whole but not measured. 364 In these experiments, the length of each modelled post-harvest grazing period depended on the 365 availability of forage. In other cases the number of sheep was adjusted according to the pre-grazing 366 biomass so that animals were on the plots for a set period of time.

367

In some of the experiments, the height to which biomass samples were cut was not the same as the height to which plots were subsequently mown. The actual sampling height was taken into account when recording biomass values for comparison with measured data, including the differentials in leaf

371 proportion in the sampled biomass and the un-sampled residual. Details of the phenology at defoliation 372 were not often recorded or reported however.

373

374 For each data set and sampling interval, pasture growth rate (PGR, kg/ha/d) was calculated for the 375 period from completion of cutting or grazing to the next herbage sampling date. This was denoted 376 "actual" PGR. The modelled PGR for the same period was also calculated and the two values compared 377 for each time interval.

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#### Results 379 3

#### 380

# 3.1 Simulation of experimental data sets

381 Model predictions for a selected winter activity class were compared against the corresponding data 382 from each of the 7 experiments. A winter-active or highly winter-active genotype has been selected in 383 each case as a reference as these genotypes are widely suited to Australian farming systems. Predictions 384 are then are summarised over different seasons, for one genotype at each location compared to the 385 experimental data (Figure 3) showing that the strength of the model predictions vary with season and with location. 386

387

388 Model predictions for lucerne stands at Forth and Cranbrook locations in Tasmania captured the 389 seasonal patterns of pasture growth satisfactorily over the 6 site-years at these two locations, with root 390 mean square deviations (RMSD) for PGR of 21 kg/ha/d at Forth and 16 kg/ha/d at Cranbrook. At both locations, the regression of actual PGR compared to modelled PGR was not significantly different from 391 the 1:1 line. Overall, the model adequately reflected the high growth rates in summer. At both sites 392 393 there was there was no consistent relationship between the residuals and seasonality. As these two locations there was no difference in the average prediction residuals between the four genotypes, but 394 395 there were stronger  $R^2$  for the SWA and WA genotypes.

396 At Hamilton the RMSD for PGR at 21 kg/ha/d was similar to the Tasmania sites, but with the model 397 significantly over predicting daily PGR. The predictions were strongest for the SWA, followed by WA 398 and then HWA. The model's predictions for the Hamilton dataset do not show systematic errors at 399 particular seasons of year however were weaker for winter growth. Importantly the model successfully 400 captures the high spring growth rates in the Hamilton data set. For the Cootamundra experiment there 401 was only moderate (although statistically significant) agreement between actual and modelled PGR 402 values, with a RMSD of 19 kg/ha/d. There was no distinguishable pattern in the model deviations due 403 to seasonality.

404

405 Lucerne growth rates in Boschma experiment at Tamworth experiments were the best predicted with 406 an RMSD of 13 kg/ha/d. The relationship between predicted and actual growth rates did not depart 407 significantly from the 1:1 line overall, but autumn growth rates were over-predicted. While the 408 GRAZPLAN model succeeded in representing periods of low lucerne growth and the subsequent 409 recovery in the Lodge experiment, the quantitative performance of the model in this experiment was the poorest of the 7 data sets with a RMSD of 13 kg/ha/d but a low R<sup>2</sup> of 3% that was non-significant. 410 411 As the soil properties of the Lodge experiment were unknown it has been omitted from further 412 summaries of overall measures of model performance and further discussion.

413

The changes in lucerne growth rate over time were well predicted at the low rainfall site at Quarading with a RMSD of 5.9. The correlation between actual and predicted growth rates was moderately high  $(R^2 \text{ of } 56.6\%)$  and the relationship between actual and modelled growth rates was close to the 1:1 line with a slight under prediction overall. There was no apparent relationship between the time of year and the residuals in the model's predictions.

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Figure 4 summarises the overall patterns of lucerne growth in the datasets from 6 locations/experiments and also the modelled patterns of growth rate over the same periods of time and calculated in the same way (i.e. allocating growth in each defoliation interval by assuming that the rate of growth over each 423 cutting interval was constant). While the model over- and under-predicts growth rates in each season, 424 the only consistent bias in these average growth rates is a tendency for the model to over-predict autumn 425 growth rates. In the other seasons, the model over-predicts for some experiments and under-predicts 426 for others. When summarised across seasons and experiments, model captures most of the variation in 427 the seasonal *patterns* of lucerne growth (data not shown). The model explains 84.5% of the variation 428 across seasons and experiments, with an overall RMSD of only 9 kg/ha/d.

429

430 The capacity of the new parameter set to predict differences between winter activity was relatively 431 modest. Overall, the new parameters were quite successful at describing the differences between the 432 cultivars in the Tasmanian experiments, but predicted an advantage for winter-active genotypes at Tamworth that was not reflected in the experimental results. At Hamilton, the lower overall production 433 434 of semi-winter active genotypes relative to highly winter active genotypes was correctly predicted 435 (although underestimated) but the large measured difference between winter active and highly winter 436 active genotypes was not captured by the model. Given the non-linear response between winter activity 437 rating and total production in this experiment, it appears that some other factor not accounted for in the 438 model – perhaps disease – may have influenced the production of the winter-active cultivar (SARDI 7). 439

157

## 440 **3.2 Long-term behaviour of modelled lucerne stands**

The new lucerne parameter set was used to simulate long-term patterns of growth rate in permanent, dryland lucerne monocultures grazed by sheep. This was done in order to assess the plausibility of the modelled growth over the long term. Eight cutting dates at regular intervals of 45 days were used, with the first cut on 1 September so that the winter cutting interval was slightly longer than the other seven. Simulations were run from 1 January 1970 and average growth rates for cutting intervals that ended in the 40 years from 1972-2011 were summarised.

447

Long-term average pasture growth in these plausibility-simulations was high (Figure 5), reflecting the lax grazing regime, lack of weed competition and the ready supply of N to the lucerne through biological 450 fixation. The main feature of the growth rate patterns presented in Figure 5, however, is the high451 variability in lucerne growth rates between years (except at Forth, even under dryland conditions).

452

The modelled median lucerne growth rates follow a similar seasonal pattern to the corresponding experimental datasets at Forth, Cootamundra and Tamworth. At Hamilton, however, the long-term simulation has a higher summer than spring growth rate, and at Quairading a permanent lucerne stand utilises any stored soil water within 3-4 years and is predicted to grow very little over summer thereafter, unlike the lucerne ley pastures in the Quairading experiment (Dolling *et al.* 2005b; Latta and Lyons 2006). This exhaustion of stored water reserves has previously been identified by various authors (e.g. Dolling *et al.* 2011).

460

#### 461 **4 Discussion**

The model successfully predicts lucerne growth at locations where it grows and is grazed all year round. 462 We have shown that using the new version of GRAZPLAN this is possible for a range of genotypes. 463 464 The modelling approach used was contingent on phenology; although none of the datasets used 465 contained records of plant phenology at a number of different stages during the experiments. However, the methods used mean that the tests of the new GRAZPLAN model parameters are particularly rigorous 466 467 by the standards of grassland model validation studies. First, the model has been tested across a wide 468 range of contrasting environments. Second, considerable effort has been made to base the soil descriptions and weather data on locally-measured values. Third, by using the management logic 469 470 available in the AusFarm software, the actual experimental management has been mimicked as closely 471 as possible, taking the individual features of each experiment into account. These have been effective 472 to ensure the model is robust and can be used for grazing and cutting systems across a wide range of 473 Australian conditions.

474

We have also increased the rigour of our validations by assessing the GRAZPLAN model's performance from its predictions of growth rate, rather than from predictions of harvested biomass. In 477 grazing experiments, biomass measurements are auto-correlated, and so it is easier to predict them to a 478 given level of accuracy than it is for growth rates. In cutting trials such as those used here (i.e. locations 479 at Hamilton, Tamworth and the 2 Tasmanian sites), the harvested biomass is the product of the average 480 growth rate (which must be predicted by a model) and the interval between cuts (which is known in 481 advance of the model run). If there is variation in the cutting intervals, therefore, the correlations 482 between predicted and actual growth rate can be expected to be lower than those between predicted and 483 actual yield.

484

#### 4.1 Predictions of lucerne growth rate over short intervals

485 Mean prediction errors (MPE, i.e. the ratio of the RMSD to the mean value) of PGR ranged from 0.26 486 at Forth to 0.74 for the Cootamundra experiment. The average MPE across sites was 0.52. The same 487 datasets were modelled using the original parameter sets. The original parameter set had two genotypes 488 'semi winter dormant' and 'winter active' which were used for the datasets of winter inactive and semi 489 winter active, and winter active and highly winter active genotype respectively. When the same sites 490 were modelled with the original parameter set, the average MPE across sites was 0.854; the new 491 parameter set and dormancy equations resulted in a reduction of MPE at all of the locations and an 492 overall improvement in RMSD of 9.6 kg/ha/d.

493

494 To place this into context, it is useful to compare it to other studies. One of the only multi-site studies 495 involving lucerne was reported by Ojeda et al. (2016). We reinterpreted the production data from Figure 496 8 in Ojeda et al. (2016) and calculated the growth rates based on available dry matter above the reported 497 30 mm cutting height. Comparing the results for the winter-active genotype at the Cranbrook site, the 498 MPEs were the same. For the high producing site at Forth our results had a lower MPE than those in 499 Ojeda et al. (2016) for the winter dormant genotype reported -0.30 compared to 0.44. Although the 500 Tamworth and Hamilton locations had similar latitudes to those at Rafaela and Balcarce, because of the 501 differences in rainfall and other factors, comparisons are not meaningful. Two further pasture model 502 validation studies that addressed a comparable number of sites and predicted PGR rather than biomass 503 were those conducted by Barrett et al. (2005) and Cullen et al. (2008). Barrett et al. (2005) used the 504 GrazeGro model to simulate perennial ryegrass pastures in cutting trials at five European locations; they 505 included nine site-years (compared with 21 site-years in our analysis). Barrett *et al.* (2005) obtained 506 mean prediction errors ranging from 0.20 to 0.76, with an overall MPE of 0.45. In the study by Cullen 507 *et al.* (2008) across 10 sites (predominantly perennial ryegrass), the mean MPE of the EcoMod grassland 508 model was 0.36.

509

510 While Barrett et al. (2005) and Cullen et al. (2008) were able to predict perennial ryegrass growth with MPEs lower than obtained in our lucerne modelling, in general they were representing much more 511 512 productive environments. (The exception was the Forth site which was highly productive.) The mean 513 measured PGR in Barrett et al. (2005) was 50 kg/ha/d, compared with 33 kg/ha/d across our 7 data sets. 514 While the mean PGR in datasets of Cullen et al (2008) was 36 kg/ha/d, the productivity range across 515 their sites was much smaller than in this study (their average total PGR ranged from 8.9 to 21.6 t/ha/year 516 compared 4.5 t/ha in the Dolling data set to 25.7 t/ha/year in the Forth data set). Because relative 517 measurement errors increase as yields decrease, MPE of any model can be expected to be higher in less-518 productive environments. Average PGR for the five southern Australian lucerne experiments was 43 519 kg/ha/d and the MPE over these experiments was 0.47, which is very close to the value obtained by 520 Barrett et al. (2005). It also should be noted that the GrazeGro study used only data sets with established 521 grasslands, unlike the present experiments, and that perennial ryegrass is the most intensively-522 researched grassland species.

523

In their validation of APSIM-Lucerne, Robertson *et al.* (2002) used a single experiment at Lawes, Queensland over 2 years. The MPE for pasture growth rate in that simulation was 0.48 (from analysis of their Figure 7). Because the Lawes experiment was irrigated and growth rates were high, this result is best compared with the MPE of 0.26 obtained here for Forth. Moot *et al.* (2015) improved the representation of a semi-winter active genotype in a cool temperate environment by calibrating APSIM to intensive measurements of above and below ground biomass. These changes improved the RMSD in their study from 53% to 38% for shoot biomass and 29% to 18% of the mean for roots. In their case the site was irrigated and the soil had no physical or chemical impediments to plant growth (Sim 2014).
Our results were not as favourable however our sites included settings and climates, many of which
were challenging for plant growth and included factors (i.e. soil constraints) which might not
represented in GRAZPLAN or APSIM.

535

In a number of the validation simulations, the early growth of the lucerne stand was not well simulated. 536 537 Although this can be viewed as being of less importance over the life of the plant, lucerne is increasingly 538 been assessed for its potential role in short term leys and is often undersown with a cover crop so it is important to correctly assess the early growth. Sim et al. (2015) reported that the regrowth phase 539 540 consistently reached reproductive development faster than the seedling phase. Another reason for the 541 disparity is that the GRAZPLAN model represents sowing according to the mass of seed sown, and 542 assumes 100% seed viability. This assumption is likely to be inaccurate for lucerne. In the Quairading 543 experiment, for example, 5 kg/ha of seed was sown; at a mean seed weight of 1.7 mg, this corresponds to nearly 300 seeds/m<sup>2</sup> sown, but only 38 plants/m<sup>2</sup> established. It may be necessary to redefine this in 544 545 the model to specify sowing events in terms of the numbers of plants establishing, as in the APSIM 546 crop growth models (including APSIM-Lucerne).

547

548

#### 4.2 Predictions of lucerne growth rate patterns across sites and seasons

We are not aware of any other similar published evaluations of different genotypes of lucerne across different environments. Apart from the study by Ojeda *et al.* (2016) it is rare in literature that lucerne has been tested across such a range of diverse locations. In the present study the inclusion of the two lower-rainfall sites at Quairading and Cootamundra, and both winter and summer rainfall environments, means that a full evaluation of the sites where lucerne is grown has been carried out.

554

555 The performance of GRAZPLAN is encouraging when the effects of the environmental conditions are 556 averaged over the long term and the time frame of comparisons is extended from single cutting intervals 557 to entire seasons (i.e. 3 months; Figure 6). Nonetheless, there are some features of our results where the 558 model could do better. The general over-prediction of growth rates in autumn is presumably due to the 559 either the intensity of water limitation not being accurately modelled overall or an incomplete 560 description of the below ground assimilate partitioning.

561

Interestingly Cullen *et al.* (2008) found the highest deviations from predicted growth rates were in also in autumn (and summer in their case). In reality in the Australian context, lucerne stands are commonly used opportunistically, to maximise animal productivity, depending on rainfall and the feed supply from other pastures (Lodge 1991). Therefore being able to confidently predict lucerne growth over short intervals in warm environments where water supply is variable, as well as in crop-livestock farming systems and in dry environments where access to soil water is important as these are where lucerne is widely grown.

569

570 There is a tendency for the model to under-predict total lucerne production in maritime environments 571 (Forth, Hamilton) and to over-predict it in continental environments (Tamworth, Quairading). This may 572 be related to the term in the growth rate equation that limits growth due to stomatal closure under high 573 vapour pressure deficits. For consistency with APSIM crop growth models (so that they can be linked 574 with GRAZPLAN) VPD in the GRAZPLAN model is calculated from air temperature by assuming that 575 dew point temperature equals the minimum temperature (Bristow 1992). This assumption does not 576 hold in all environments (e.g. Tanner and Sinclair 1983) and it may be that a more accurate approach 577 to estimating VPDs would allow this error in the model to be corrected (Brown et al. 2012).

578

At some sites (e.g. Tamworth), the model over-predicted lucerne growth in the final year of the dataset after a drought period. (A similar phenomenon can be seen in the results of Ojeda et al (2016).) It is possible that plant disease, or reductions in plant density over and above self-thinning, were reducing the measured growth rates in these experiments. Neither process is represented explicitly by either the GRAZPLAN or the APSIM lucerne models; indeed the representation of stress-related plant deaths is an area of weakness in all biophysical crop and grassland models.

586

## 4.3 Seasonal growth patterns and differences between winter activity types

587 The capacity of GRAZPLAN to predict differences between genotypes with differing winter activity 588 was relatively modest. In environments where lucerne grows all year phenology and reduced winter 589 activity cannot just be represented by simple functions for the accumulation of thermal time, and 590 genotype differences show up as differences in winter growth rather than in survival. Variation in, for example the sequential emergence of leaves on the main stem between cultivars supports the notion that 591 592 differences in genotypes need to be considered when parameterising lucerne models (Moot et al. 2015). 593 We have implemented an approach to represent the dormancy of different lucerne genotypes based on 594 environmental triggers of photoperiod and temperature. This has also been attempted by Pembleton et 595 al. (2011) and Ojeda et al. (2016) however the approach we have used seems more robust across 596 different climates than locally calibrated values. More detailed studies on ecophysiology as it relates 597 to genotypes will improve these parameter values further. For example, which physiological 598 characteristics vary with genotype - such as to whether the temperature and photoperiod triggers relating 599 to the period of reduced winter activity - is largely unknown, as often modelling studies are conducted 600 on a limited number of genotypes in one location (e.g. Moot et al. 2015).

601

It has been suggested that in the case of cold acclimation, the specific rate of change in photoperiod may be the critical factor for triggering the response rather than a specific photoperiod per se (Castonguay *et al.* 2006). The assumptions embedded in the new parameterisation of the phenology of lucerne, and in the responses of shoot growth and relocation to the period of reduced winter activity represent a hypothesis about this physiological basis that could profitably be explicitly tested.

607

The model was found to fit the experimental data better if the parameter setting the temperature above which photosynthesis proceeds at its maximum rate was increased to  $18.0 \text{ }^{\circ}\text{C}$  from  $15.0 \text{ }^{\circ}\text{C}$  (Brown *et al.* 2006). This response was only detectable because the model was tested across environments with a

611 range of winter temperatures. This is a specific requirement that can be addressed by more rigorous612 testing through experimental work.

613

614 Overall, the new parameters were quite successful at describing the differences between the genotypes 615 at the cool temperate locations in the Tasmanian experiments, but predicted an advantage for winter-616 active genotypes Tamworth that was not reflected in the experimental results (Figure 4). At Hamilton, the lower overall production of semi-winter active genotypes relative to highly winter active genotypes 617 618 was correctly predicted (although underestimated), but the large measured difference between winter 619 active and highly winter active genotypes was not captured by the model. Given the non-linear response 620 between winter activity rating and total production in this experiment, it appears that other factors not 621 accounted for in the model - namely poor establishment (Li et al. 2010) - have influenced the 622 production of the winter-active cultivar (SARDI 7).

623

624 An area of uncertainty concerns the growth, development and functioning of lucerne roots. The model development for improved prediction of EFV is an initial step and the predictions can be rigorously 625 626 assessed through experimental work in the field or in controlled environments. The EFV used in the 627 currently modelling is derived from stands of mature plants. EFV may vary with plant maturity (Sim 628 2014) and the use of one number only as in our modelling may contribute to an underestimation of soil 629 water extraction during the early stages of the plant's life. However to date, very few datasets are 630 available to enable the development of widely applicable physiological principles for the inclusion into 631 modelling frameworks. Additionally it is unclear if the EFV is genotype dependent, or is regulated 632 more by the supply of assimilate than by meristematic activity (the latter is implicitly assumed by the temperature-dependent function used in the model). 633

634

**6**25

## 635 **4.4 Differences between winter activity types in lucerne**

In this study we have successfully attempted to explicitly represent genotype differences, which is nota capability of most other lucerne models. This however is an area that requires further experimental

638 information before model development can continue. We were surprised to discover that, despite 639 numerous chamber and glasshouse studies, the physiological basis of the environmental triggers for 640 winter-activity differences in lucerne remains essentially unknown. The assumptions we have embedded in the new parameterisation of the phenology of lucerne, and in the responses of shoot growth 641 642 and relocation to the period of reduced winter activity represent a hypothesis about this physiological basis that could profitably be explicitly tested. In particular, our hypothesis that winter activity expresses 643 644 the intensity, rather than the duration, of the dormancy mechanism should be amenable to experimental investigation. 645

646

647 Our attempt to represent the differences between the winter-activity types was only partially successful. 648 Our current model correctly predicts that winter-active genotypes will have higher production in 649 southern Australia, but the apparent advantage of winter-inactive types in northern NSW (Tamworth 650 experiments) was not reproduced. Examination of the winter-active vs. winter-inactive genotype 651 comparison, however, suggests that the model is predicting a south-north gradient in the differential 652 between genotypes, albeit a gradient of smaller magnitude than the experimental datasets suggest. We 653 therefore conclude that although the set of parameters for different winter activity types of lucerne is 654 satisfactory in the new version, that further work on this aspect of the lucerne model will be needed.

655

656 In general, comprehensive experiments investigating the interactions between genotype, different 657 environments/climates and management have not been conducted for lucerne in Australia and therefore 658 the interactions remain not well understood. If model testing and validation are to continue a number 659 of key datasets are required. For the Australian context, in particular quantitative information data on the nutritive characteristics of the harvested forage is lacking. At the least this would include 660 digestibility and crude protein for different genotypes, at different phenostages and at different levels 661 of water stress. Most of the datasets used in the model development and validation only involved one 662 component, for example above ground biomass. Datasets that include the simultaneously assessment 663 of different parts of the model are extremely helpful. For example, herbage mass, soil water, phenology, 664

665 rooting depth and soil water gathered in a complimentary way would be incredibly valuable. A study involving a range of genotypes, in a range of climate zones, for seedling and regrowth growth, across a 666 number of years, combined with this auxiliary data would be the definitive dataset. The datasets used 667 in this study did not contain root data which was a short coming. Datasets that enable better calibration 668 669 of the dynamics of the rooting front and changes in root respiration across seasons are other areas that 670 may potentially improve dynamics in above ground biomass (e.g. Moot et al. 2015). Root EFV can vary throughout the life of the plant and better information could improve the accuracy of water supply 671 and demand especially during the early stages of growth (Sim 2014). Root turnover rate may also be 672 influenced by changes in photoperiod (Moot et al. 2015). More experimental information on both these 673 674 would help to better represent the seasonal changes in below underground biomass dynamics however 675 and it is unclear as to if there are differences between genotypes.

676

#### 677 5 Conclusion

If lucerne is to be more widely adopted, it will be important that landholders maximise the benefits 678 679 (usually as a part of a diverse feedbase) to their livestock enterprises, as well as optimizing the benefits 680 and minimizing the costs of lucerne phases to subsequent crops. This study has improved the 681 representation of different lucerne genotypes in terms of important physiological processes that affect 682 phenology, transpiration, root development and biomass partitioning which in turn improve the 683 prediction of nutritive value and thereby livestock production potential. This study has quantified the 684 particular strengths of the re-parameterized GRAZPLAN model for predicting plant growth rates. Weaknesses relate to differences in the ecophysiology between genotypes and transpiration in warm 685 686 and moist environments. The GRAZPLAN pasture growth model is robust and has been configured to 687 model lucerne, both in grazing and in mixed farming systems but there are a number of areas where the 688 performance of the model is known to be in need of improvement and with further testing against data 689 sets that contain information about the nutritive value of harvested herbage and below ground biomass 690 would be particularly useful.

691

# 692 **6** Acknowledgements

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- 694 from Plant and Food Research (New Zealand) for his helpful discussions along the way.

# 695 Appendix A

696 Table 1. GRAZPLAN pasture parameters for lucerne. Parameters in **bold** have their definition changed, or are new, since

697 previously published in Moore et al. (1997). Previous (prev.) parameter values for lucerne are given in square brackets. NR =

698 the parameter is not required to represent lucerne.

| Parameter                    | Value | Units | Meaning   |  |  |  |  |  |
|------------------------------|-------|-------|---|--|--|--|--|--|
| grass                        | FALSE |       | TRUE for grasses  |  |  |  |  |  |
| legume                       | TRUE  |       | TRUE for legumes  |  |  |  |  |  |
| annual                       | FALSE |       | TRUE for annuals, FALSE for perennials  |  |  |  |  |  |
| isc4                         | FALSE |       | TRUE if the species has the C <sub>4</sub> photosynthetic pathway                             |  |  |  |  |  |
| longday                      | FALSE |       | TRUE if long days required to induce reproductive growth                                      |  |  |  |  |  |
| Kv3j                         | 1.0   | °C    | Base temperature for degree-day computations [prev. 5.0]                                      |  |  |  |  |  |
| Kv4j                         | NR    | hr    | Day length for commencement of reproductive growth [prev. 12.0]                               |  |  |  |  |  |
| Kv5j                         | 350   | °d    | Degree-day sum for commencement of reproductive growth [prev. not                             |  |  |  |  |  |
|                              |       |       | implemented]  |  |  |  |  |  |
| K <sub>V6j</sub>             | 600   | °d    | Degree-day sum for commencement of flowering <sup>2</sup> [prev.: 100]                        |  |  |  |  |  |
| <b>K</b> <i>V</i> 7 <i>j</i> | NR    | d     | Maximum length of flowering period  |  |  |  |  |  |
| Kv8j                         | NR    | d     | Effect of soil moisture stress on flowering duration  |  |  |  |  |  |
| <b>K</b> V9j                 | NR    | °d    | Degree-day sum beyond which the reproductive phenostage ends <sup>3</sup> [prev. 2900]        |  |  |  |  |  |
| <b>K</b> V10j                | 0.25  | 0-1   | Value of the soil moisture growth-limiting factor that defines "drought" for the              |  |  |  |  |  |
|                              |       |       | senescence calculations <sup>3</sup>  |  |  |  |  |  |
| <b>K</b> V15j                | 0.5   | 0-1   | Reduction in the rate of development due to water stress in pre-flowering,                    |  |  |  |  |  |
|                              |       |       | reproductive plants [prev. 0]   |  |  |  |  |  |
| $K_{V20j}$                   | 15.0  | d     | Length of the drought period required to induce senescence (i.e. end reproductive             |  |  |  |  |  |
|                              |       |       | growth) when DD(j)= KV9j <sup>4</sup>   |  |  |  |  |  |
| <b>K</b> V21j                | NR    | °d    | Value of DD(j) at which senescence occurs in the absence of drought <sup>4</sup> [prev. 5000] |  |  |  |  |  |
| Kv22j                        | 0.0   | 0-1   | Upper margin of phenology-sensitive horizon during vegetative growth <sup>5</sup>             |  |  |  |  |  |
| <b>K</b> <sub>V23j</sub>     | 1.0   | 0-1   | Thermal time (as fraction of K(V,6)) for upper margin of phenology-sensitive                  |  |  |  |  |  |
|                              |       |       | horizon to reach top of sward <sup>5</sup>  |  |  |  |  |  |
| Kv24j                        | 0.5   | 0-1   | Final lower boundary of phenology-sensitive horizon <sup>5</sup>                              |  |  |  |  |  |
| <b>K</b> V25j                | 0.0   | 0-1   | Height of removal for reset of phenology (as fraction of lower boundary of                    |  |  |  |  |  |
|                              |       |       | phenology-sensitive horizon) <sup>5</sup>   |  |  |  |  |  |

| Parameter               | Value  | Units    | Meaning   |
|-------------------------|--------|----------|---|
| Kv26j                   | 0.0    | °C       | Lagged mean temperature below which reduced winter activity always ensues <sup>6</sup>        |
| K <sub>V27j</sub>       | 13.0   | °C       | Lagged mean temperature above which dormancy is not promoted <sup>6</sup>                     |
| Kv28j                   | 8.0    | hour     | Day length below which dormancy always ensues <sup>7</sup>                                    |
| Kv29j                   | 14.0   | hour     | Day length above which dormancy is not promoted <sup>6</sup>                                  |
| Kv30j                   | 5      | day      | Lag period for computing mean temperatures <sup>6</sup>                                       |
| $K_{I1j}$               | 0.0260 | m²/g     | Reference specific leaf area (ratio of leaf area index to leaf weight)                        |
| K12j                    | 0.0040 | m²/g     | Reference specific stem area <sup>8</sup> [prev. 0.0065]                                      |
| K <sub>I3j</sub>        | 13.5   | MJ/m²/d  | Curvature factor for effect of light on specific area   |
| $K_{I4j}$               | 15     | °C       | Temperature threshold for maximal specific area   |
| <i>K</i> 15 <i>j</i>    | 0.6    | 0-1      | Relative specific area at 0 °C  |
| K16j                    | 0.12   | -        | Relative decrease in specific leaf area at twice reference (CO <sub>2</sub> )                 |
| <b>K</b> 17j            | 0.80   | 0-1      | Apparent light extinction coefficient under ungrazed conditions <sup>9</sup> [previously 0.5] |
| K18j                    | 0.80   | 0-1      | Apparent extinction coefficient under heavily grazed conditions <sup>9</sup> [previously 0.6] |
| <i>K</i> <sub>19j</sub> | 0.80   | 0-1      | Apparent extinction coefficient of standing dead  |
| $K_{I10j}$              | 1.00   | 0-1      | Apparent extinction coefficient of litter   |
| $K_{WU1j}$              | 0.35   | 0-1      | Available soil water threshold for growth limitation  |
| Kwu2j                   | 1.0    | 0-1      | Proportion of any transpiration deficit that can be recovered from moist layers               |
| $K_{WU5j}$              | 150    | s/m      | Reference leaf stomatal resistance at 350 ppm CO <sub>2</sub>                                 |
| $K_{WU6j}$              | 0.5    | -        | Relative change in leaf stomatal resistance at 700 ppm CO <sub>2</sub>                        |
| $K_{RU1j}$              | 2.35   | g/MJ     | Radiation use efficiency (gross assimilation) under reference conditions                      |
| K <sub>RU2j</sub>       | 99.9   | MJ/m²/hr | Effect of radiation intensity on radiation use efficiency                                     |
| K <sub>RU3j</sub>       | 0.6    | 0-1      | Relative photosynthetic efficiency of stems   |
| $K_{RU4j}$              | 16.0   | ppm      | CO <sub>2</sub> compensation point at 0°C   |
| $K_{RU5j}$              | 35.0   | Ppm      | CO <sub>2</sub> compensation point at 20°C  |
| K <sub>RU6j</sub>       | 55.0   | °C       | Maximum temperature for CO <sub>2</sub> compensation function                                 |
| $K_{BT1j}$              | 15.0   | kPa g/kg | Biomass-transpiration coefficient   |
| $K_{T1j}$               | 6.0    | °C       | Mean daytime temperature for 5% of maximum gross assimilation rate (NB not mean               |
|                         |        |          | temperature for day and night)  |
| $K_{T2j}$               | 18.0   | °C       | Mean daytime temperature for 95% of maximum gross assimilation rate <sup>8</sup> [prev.       |
|                         |        |          | 15.0]   |
| $K_{W1j}$               | 0.70   | 0-1      | Transpiration ratio below which assimilation rate decreases                                   |
| $K_{WL1j}$              | 0.85   | 0-1      | WFPS threshold for waterlogging   |

| Parameter                   | Value   | Units             | Meaning   |   |                                |                                    |  |  |  |  |
|-----------------------------|---------|-------------------|---|---|--------------------------------|------------------------------------|--|--|--|--|
| K <sub>WL2j</sub>           | 23.0    | -                 | Curvature of growth limitation by waterlogging  |   |                                |                                    |  |  |  |  |
| K <sub>MR1j</sub> *         | cvv     | /d                | Maximum relative growth rate of shoots during reduced winter activity <sup>10</sup>                         |   |                                |                                    |  |  |  |  |
| $K_{TL1i}^{\dagger}$        | cvv     | -                 | Threshold growth-limiting factor for translocation from belowground reserves <sup>10</sup>                  |   |                                |                                    |  |  |  |  |
|                             |         |                   | [prev. called <u>K<sub>U1j</sub>]</u>   |   |                                |                                    |  |  |  |  |
| <b>K</b> tl.2i <sup>‡</sup> | cvv     | /d                | Relative rate of translocation from belowground reserves <sup>9</sup> [prev. called $\underline{K_{U2i}}$ ] |   |                                |                                    |  |  |  |  |
| 2                           |         |                   | Constant  | Genotype Kyp: V                                   |                                |                                    |  |  |  |  |
|                             |         |                   | Genotype  | KMR1  | KTL1                           | KTL2                               |  |  |  |  |
|                             |         |                   |   | (g/g/d)   | (g/g/d)                        | (g/g/d)                            |  |  |  |  |
|                             |         |                   | Highly winter active  | 0.020   | 0.30                           | 0.05                               |  |  |  |  |
|                             |         |                   | Winter active   | 0.010   | 0.30                           | 0.04                               |  |  |  |  |
|                             |         |                   | Semi-winter active  | 0.005   | 0.40                           | 0.03                               |  |  |  |  |
|                             |         |                   | Winter inactive   | 0.000   | 0.40                           | 0.02                               |  |  |  |  |
| $K_{RE1j}$                  | 0.3     | g/g/d             | Maintenance respiration rate a  | at 10 °C (g DM/g N                                | /d)                            |                                    |  |  |  |  |
| $K_{RE2j}$                  | 1.8     | -                 | Q10 factor for maintenance re   | espiration  |                                |                                    |  |  |  |  |
| K <sub>RE3j</sub>           | 0.20    | 0-1               | Reduction in maintenance res  | piration in summer-                               | or winter-inactive             | e plants <sup>11</sup> [prev. 1.0] |  |  |  |  |
| $K_{RE4j}$                  | 0.25    | g/g               | Growth respiration rate   |   |                                |                                    |  |  |  |  |
| <b>K</b> A1j                | 0.80    | -                 | Target root:shoot ratio during vegetative growth <sup>8</sup> [prev. 1.2]                                   |   |                                |                                    |  |  |  |  |
| KA2j                        | 0.30    | -                 | Target root:shoot ratio during reproductive growth <sup>8</sup> [prev. 0.8]                                 |   |                                |                                    |  |  |  |  |
| KA4j                        | 0.80    | 0-1               | Maximum value of the ratio (leaf allocation):(shoot allocation) <sup>8</sup> [prev. 0.7]                    |   |                                |                                    |  |  |  |  |
| <b>K</b> A5j                | 0.80    | 0-1               | Minimum value of the ratio (leaf allocation):(shoot allocation) <sup>8</sup> [prev. 0.25]                   |   |                                |                                    |  |  |  |  |
| <b>К</b> м01j               | -0.3    | -                 | Parameter governing height  | Parameter governing height distribution of leaves |                                |                                    |  |  |  |  |
| $K_{R1j}$                   | 3000    | mm                | Maximum rooting depth unde  | er optimal soil cond                              | itions                         |                                    |  |  |  |  |
| $K_{R2j}$                   | 0.65    | mm/°d             | Maximum rate of root front  | extension <sup>8</sup> [prev. 2                   | 2.0]                           |                                    |  |  |  |  |
| $K_{R3j}$                   | 0.0     | °C                | Base temperature for root from  | nt extension                                      |                                |                                    |  |  |  |  |
| $K_{R4j}$                   | 0.25    | 0-1               | ASW below which root exten  | sion is reduced                                   |                                |                                    |  |  |  |  |
| <b>K</b> R5j                | 1.95    | Mg/m <sup>3</sup> | Threshold bulk density for a  | reduced root exten                                | sion in 100% san               | d <sup>11</sup> [prev. 1.4]        |  |  |  |  |
| $K_{R6j}$                   | -0.65   | Mg/m <sup>3</sup> | Threshold bulk density for a  | reduced root exten                                | sion in 0% sand <sup>1</sup>   | <sup>1</sup> [prev. 1.2]           |  |  |  |  |
| <b>K</b> <sub>R7j</sub>     | 1.20    | m³/Mg             | Rate of decrease in root exte   | ension with increas                               | sing bulk density <sup>1</sup> | <sup>11</sup> [prev. 2.0]          |  |  |  |  |
| K <sub>R8j</sub>            | 0.15    | 0-1               | Minimum value of the bulk   | density effect on r                               | oot extension <sup>11</sup> [p | orev. 0.1]                         |  |  |  |  |
| $K_{R9j}$                   | 85      | m/g               | Specific root length  |   |                                |                                    |  |  |  |  |
| $K_{R10j}$                  | 0.00022 | m                 | Average radius of effective roots   |   |                                |                                    |  |  |  |  |
| $K_{D1j}$                   | 800     | °d                | Thermal age at which death of shoots commences  |   |                                |                                    |  |  |  |  |

| Parameter              | Value  | Units        | Meaning  |  |  |  |  |  |
|------------------------|--------|--------------|--|--|--|--|--|--|
| K <sub>D2j</sub>       | 0.005  | /°d          | Background death rate of old shoots in seedlings & established plants                  |  |  |  |  |  |
| $K_{D3j}$              | 0.003  | /°d          | Additional death rate of all shoots in senescing plants                                |  |  |  |  |  |
| $K_{D4j}$              | -4.0   | °C           | Temperature for 5% mortality at the first frost (formerly $K_{D2j}$ )                  |  |  |  |  |  |
| $K_{D5j}$              | -11.0  | °C           | Temperature for 95% mortality at the first frost (formerly $K_{D3j}$ )                 |  |  |  |  |  |
| <b>K</b> D6j           | 1.0    | °C           | Frost-hardening factor (formerly <i>K</i> <sub>D4j</sub> )                             |  |  |  |  |  |
| $K_{D7j}$              | -      | 0-1          | Value of the seedling stress index at which seedling mortality commences               |  |  |  |  |  |
|                        |        |              | (formerly K <sub>Z1j</sub> )   |  |  |  |  |  |
| $K_{D8j}$              | -      | 0-1          | Value of the seedling stress index for 100% seedling mortality (formerly Kz2j)         |  |  |  |  |  |
| $K_{DR2j}$             | 0.0025 | /d           | Specific root loss rate at 10°C  |  |  |  |  |  |
| K <sub>DR3j</sub>      |        | g/g          | Recovery rate of mass from dying roots   |  |  |  |  |  |
| K <sub>DR4j</sub>      | 1.5    | -            | Q10 for root aging and loss  |  |  |  |  |  |
| $K_{F1,leaf,j}$        | 0.003  | /d           | Fall of standing dead: reference rate for leaf   |  |  |  |  |  |
| KF1,stem,j             | 0.001  | /d           | Fall of standing dead: reference rate for stem   |  |  |  |  |  |
| $K_{F2j}$              | 40     | -            | Fall of standing dead: maximum relative effect of precipitation                        |  |  |  |  |  |
| $K_{F3j}$              | 10     | /mm          | Fall of standing dead: curvature of precipitation effect                               |  |  |  |  |  |
| $K_{F4j}$              | 30     | /kg animal/d | Fall of standing dead: trampling effect  |  |  |  |  |  |
| KBR1j,leaf             | 0.10   | /d           | Background specific rate of breakdown of leaf litter                                   |  |  |  |  |  |
| K <sub>BR1j,stem</sub> | 0.02   | /d           | Background specific rate of breakdown of stem litter                                   |  |  |  |  |  |
| K <sub>BR2j</sub>      | 10     | -            | Litter breakdown: trampling effect   |  |  |  |  |  |
| K <sub>BR3j</sub>      | 0.02   | /d           | Specific rate of incorporation under dry soil conditions                               |  |  |  |  |  |
| $K_{BR4j}$             | 0.05   | /d           | Specific rate of incorporation under wet soil conditions                               |  |  |  |  |  |
| $K_{Q1,leaf,j}$        | 0.85   | g/g          | Average digestibility of newly-produced leaf <sup>12</sup> [prev. 0.8]                 |  |  |  |  |  |
| $K_{Q2,leaf,j}$        | 0.75   | g/g          | Minimum digestibility of green leaf during vegetative growth <sup>12</sup> [prev. 0.7] |  |  |  |  |  |
| KQ3,leaf.j             | 0.70   | g/g          | Minimum digestibility of green leaf during reproductive growth                         |  |  |  |  |  |
| $K_{Q4j}$              | 300    | °d           | Thermal time during which green leaf maintains its digestibility                       |  |  |  |  |  |
| $K_{Q5,leaf,j}$        | 0.006  | /°d          | Rate parameter for decline of DMD of green leaf  |  |  |  |  |  |
| $K_{Q6,leaf,j}$        | 4      | °C           | Base temperature for maturation- senescence of green tissue                            |  |  |  |  |  |
| KQ1,stem,j             | 0.85   | g/g          | Average digestibility of newly-produced stem <sup>12</sup> [prev. 0.8]                 |  |  |  |  |  |
| KQ2,stem,j             | 0.70   | g/g          | Minimum digestibility of green stem during vegetative growth <sup>12</sup> [prev. 0.6] |  |  |  |  |  |
| KQ3,stem,j             | 0.45   | g/g          | Minimum digestibility of green stem during reproductive growth                         |  |  |  |  |  |
| $K_{Q5,stem,j}$        | 0.002  | /°d          | Rate parameter for decline of DMD of green stem <sup>12</sup> [prev. 0.004]            |  |  |  |  |  |
| $K_{Q6j}$              | 4.0    | °C           | Base temperature for maturation & senescence of green tissue                           |  |  |  |  |  |

| Parameter                | Value | Units  | Meaning  |
|--------------------------|-------|--------|--|
| K <sub>Ylj</sub>         | 0.024 | /d     | Reference rate of microbial decomposition of digestible DM                                     |
| $K_{Y2j}$                | 4.7   | -      | Factor for temperature response of decomposition   |
| Күзј                     | 32    | °C     | Factor for temperature response of decomposition   |
| $K_{Y4j}$                | 0.05  | -      | Minimum value of the moisture factor for standing dead   |
| $K_{Y5j}$                | 7     | g/g    | Maximum moisture content of standing dead  |
| $K_{Y6j}$                | -0.2  | -      | ASW for 5% of maximum decomposition  |
| $K_{Y7j}$                | 0.85  | -      | ASW for 95% of maximum decomposition   |
| $K_{Y8j}$                | 0.125 | 0-1    | Relative rate of decomposition of indigestible DM  |
| K <sub>NU1N,leaf,j</sub> | 0.060 | g/g    | Maximum content of N in green leaf at maximum DMD  |
| K <sub>NU2N,leaf,j</sub> | 0.030 | g/g    | Minimum content of N in green leaf at maximum DMD  |
| $K_{NU3N,leaf,j}$        | 0.026 | g/g    | Minimum content of N in green leaf at midpoint DMD   |
| $K_{NU4N,leaf,j}$        | 0.022 | g/g    | Minimum content of N in green leaf at minimum DMD  |
| $K_{NU5,leaf,j}$         | 0.1   | -      | Relative decrease in leaf N content (per unit leaf area) at twice reference (CO <sub>2</sub> ) |
| $K_{NU1N,leaf,j}$        | 0.040 | g/g    | Maximum content of N in green stem at maximum DMD  |
| $K_{NU2N,leaf,j}$        | 0.030 | g/g    | Minimum content of N in green stem at maximum DMD  |
| $K_{NU3N,leaf,j}$        | 0.022 | g/g    | Minimum content of N in green stem at midpoint DMD   |
| $K_{NU4N,leaf,j}$        | 0.015 | g/g    | Minimum content of N in green stem at minimum DMD  |
| $K_{NU5,leaf,j}$         | 0.0   | -      | Relative decrease in stem N content (per unit mass) at twice reference (CO <sub>2</sub> )      |
| K <sub>NU1N,root,j</sub> | 0.015 | g/g    | Maximum content of N in live root  |
| KNU2N,root,j             | 0.015 | g/g    | Minimum content of N in live root  |
| KNU5,root,j              | 0.0   | -      | Relative decrease in root N content (per unit mass) at twice reference (CO2)                   |
| $K_{FX1j}$               | 0.20  | 0-1    | N-fixation: relative depth of nodulation   |
| K <sub>FX2j</sub>        | 0.15  | 0-1    | N-fixation: nodulation at depth:nodulation at surface  |
| K FX3j                   | 0.85  | 0-1    | N-fixation: ASW for maximum fixation rate  |
| K FX4j                   | 30    | mg/l   | N-fixation: solution NO <sub>3</sub> conc. for maximum fixation rate                           |
| K FX5j                   | 90    | mg/l   | N-fixation: solution NO <sub>3</sub> conc. for suppression of fixation                         |
| KUE1,NO3,j               | 1.0   | -      | Uptake effectiveness parameter for nitrate   |
| K UE1,NH4,j              | 1.0   | -      | Uptake effectiveness parameter for ammonium  |
| K <sub>RL1Nj</sub>       | 0.33  | /d     | Relocation rate parameter for element $e$ ( $e$ =N, P, S)                                      |
| <i>K</i> <sub>AA1j</sub> | 1.2   | mol/kg | Ash alkalinity of newly-grown leaves   |
| K <sub>AA2j</sub>        | 1.2   | mol/kg | Ash alkalinity of newly-grown stems  |
| K <sub>AA3i</sub>        | 0.6   | mol/kg | Ash alkalinity of newly-grown roots  |

| Parameter  | Value | Units  | Meaning   |
|------------|-------|--------|---|
|            |       |        |   |
| $K_{AA4j}$ | 1.2   | mol/kg | Ash alkalinity of newly-grown seeds   |
|            |       |        |   |
| $K_{AA5j}$ | 4.5   | -      | pH below which no cation uptake takes place                                     |
|            |       |        |   |
| Каабј      | 5.0   | -      | pH above which maximal cation uptake takes place                                |
|            |       |        |   |
| $K_{HRj}$  | 1.6   | -      | "Height ratio": also governs the size of the ungrazeable portion of the pasture |
|            |       |        |   |
| $K_{SFj}$  | 0.0   | -      | Parameter controlling the relationship between DMD and relative nutritive value |

- 699 \*Parameter  $K_{MR1}$  is the maximum relative growth rate of shoots during the reduced winter activity phenological stage;
- 700 parameter  $^{\dagger}K_{TL1}$  is the threshold value of growth-limiting factors above which translocation from below-ground reserves takes
- 701 place;  ${}^{\ddagger}K_{TL2}$  is the proportion of effective root mass that can be re-mobilized above ground in a single day if both environmental
- conditions are suitable and the current root:shoot ratio is above a target level set by the phenological stage. Paramaters with
- 703 NI value are not implemented in the current version.
- <sup>1</sup> adjusted following Moot *et al.* (2001) and Brown *et al.* (2005)
- 705  $^2$  fitted to data in Zahid (2009)
- <sup>3</sup> based on reanalysis of data presented in Halim *et al.* (1989) and Hattendorf *et al.* (1988)
- 707 <sup>4,5,6</sup> from parameter fitting across all the datasets
- 708 <sup>7</sup> based on reanalysis of data presented in Schonhorst *et al.* (1957)
- 709 <sup>8</sup> based on Teixeira (2007)
- 710 <sup>9,10</sup> from parameter fitting across all the datasets
- 711 <sup>11</sup> based on reanalysis of data presented in Dolling *et al.* (2005a)
- 712 <sup>12</sup> fitted data based on Hayes *et al.* (2010) from Cootamundra

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Figure 1. (left) Observed vs fitted root extraction front velocities for B horizons in the data set of Dolling *et al.* (2005a). The8751:1 line is shown and the relationship is significant (R<sup>2</sup>=0.97, p=0.02) (right) Fitted response of root extraction front velocity876to bulk density and sand content in the layer containing the current rooting depth, on a (summer) day where 20° C.d of thermal877time accrues.





Figure 2. Locations of the experimental data sets that were used for testing and developing the lucerne parameter set for the GRAZPLAN pasture model. Climate zonation is based on the season of highest rainfall in each area and use the median annual rainfall (based on the 100 year period from 1900 to 1999) and seasonal incidence (the ratio of the median rainfall over the period November to April to the period May to October) to identify these six major zones (Data source: Commonwealth of Australia, Bureau of Meteorology 2005). Gatton was used in long-term simulations to examine patterns of growth.



Figure 3. Average daily growth rate (kg/ha/d) of lucerne modelled with GRAZPLAN (open) and experimental data (grey) over four seasons for various locations throughout Australia. Seasons are: winter (Win), spring (Spr), summer (Sum) and autumn (Aut); genotypes are WD (winter dormant), SWA (semi-winter active), WA (winter active), HWA (highly winter active). Note: Tamworth is the Boschma data set; Lodge dataset is not shown.



Figure 4. Actual and predicted (modelled) harvested daily pasture growth rates (PGR, kg/ha/d) for winter-active lucerne
growing at various locations. In the actual-vs-model chart, a 1:1 relationship is shown as a solid line and the regression of
actual on modelled PGR is shown as a segmented line. Note: the Tamworth dataset shown is from Boschma, the Lodge dataset
is not shown.



- 908 Figure 5. Modelled, long term (over 40 year period) daily pasture growth rates (kg/ha/d) of four winter activity types of lucerne
- 909 in contrasting rainfed environments (boxes show the 25<sup>th</sup> and 75<sup>th</sup> percentile; whiskers show the maximum and minimum).
- 910 The furthest left-hand charts show modelled daily pasture growth rate for winter-active lucerne. Inset is the long-term average
- 911 (LTA) annual pasture growth (t/ha/y) and their variability (standard deviation). The remaining columns show the difference
- 912 between pasture growth rates of other winter activity types of lucerne relative to the winter-active genotype.



915 Figure 6. Actual vs modelled average seasonal growth rates in each of the 7 experiments. A 1:1 relationship is shown as a

916 solid line and the regression of actual on modelled PGR is shown as a segmented line.

- 918 Table 2. Details of experimental datasets used in the evaluation of the new GRAZPLAN parameters for lucerne (Climate
- 919 summaries are for 1950-2013.) The Cootamundra experiment was the only one with forage nutritive value; both Cootamundra
- 920 and Quairading also had soil water information. Soil descriptions are based on the Australian soil classification system (Isbell
- 921 2002).

| Location         | Latitude | Average    | Average  | e Soil             |    | Ger | notyp | e  | Key references    |
|------------------|----------|------------|----------|--------------------|----|-----|-------|----|-------------------|
| (descriptor)     |          | temperatur | Rainfall |                    |    | Cla | asses | *  |                   |
|                  |          | e (°C)     | (mm)     |                    | WD | SWA | WA    | HW | A                 |
| Forth            | 41°20'S  | 12.1       | 975      | Red Ferrosol       | Х  | X   | X     | X  | Pembleton et al.  |
|                  |          |            |          |                    |    |     |       |    | 2010              |
| Cranbrook        | 42°01'S  | 12.9       | 632      | Red Ferrosol       | X  | Х   | X     | X  | Pembleton et al.  |
|                  |          |            |          |                    |    |     |       |    | 2010              |
| Tamworth         |          |            |          | Brown Chromosol    | X  |     |       | X  | Li et al. 2010    |
| (Boschma)        | 31°15'S  | 16.7       | 678      |                    |    |     |       |    |                   |
| Tamworth (Lodge) |          |            |          | Brown Chromosol    | X  | Х   | X     | X  | Lodge 1985        |
| Hamilton         | 37°84'S  | 13.1       | 681      | Brown Chromosol    |    | X   | X     | X  | Li et al. 2010    |
| Cootamundra      | 34°40'S  | 15.3       | 572      | Yellow Dermosol    |    |     | X     |    | Hayes et al. 2010 |
| Quairading       | 32°02'S  | 17.6       | 366      | Gravelly pale deep |    |     | X     |    | Dolling et al.    |
|                  |          |            |          | sand               |    |     |       |    | 2005b             |
|                  |          |            |          |                    |    |     |       |    | Latta and Lyons   |
|                  |          |            |          |                    |    |     |       |    | 2006              |
|                  |          |            |          |                    |    |     |       |    |                   |

922 \*Genotype classes were winter dormant (WD), semi-winter active (SWA), winter active (WA) and highly winter

923 active (HWA).

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