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# A functional–structural kiwifruit vine model integrating architecture, carbon dynamics and effects of the environment

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• **Background and Aims** Functional–structural modelling can be used to increase our understanding of how different aspects of plant structure and function interact, identify knowledge gaps and guide priorities for future experimentation. By integrating existing knowledge of the different aspects of the kiwifruit (*Actinidia deliciosa*) vine's architecture and physiology, our aim is to develop conceptual and mathematical hypotheses on several of the vine's features: (a) plasticity of the vine's architecture; (b) effects of organ position within the canopy on its size; (c) effects of environment and horticultural management on shoot growth, light distribution and organ size; and (d) role of carbon reserves in early shoot growth.

• **Methods** Using the L-system modelling platform, a functional–structural plant model of a kiwifruit vine was created that integrates architectural development, mechanistic modelling of carbon transport and allocation, and environmental and management effects on vine and fruit growth. The branching pattern was captured at the individual shoot level by modelling axillary shoot development using a discrete-time Markov chain. An existing carbon transport resistance model was extended to account for several source/sink components of individual plant elements. A quasi-Monte Carlo path-tracing algorithm was used to estimate the absorbed irradiance of each leaf.

• **Key Results** Several simulations were performed to illustrate the model's potential to reproduce the major features of the vine's behaviour. The model simulated vine growth responses that were qualitatively similar to those observed in experiments, including the plastic response of shoot growth to local carbon supply, the branching patterns of two *Actinidia* species, the effect of carbon limitation and topological distance on fruit size and the complex behaviour of sink competition for carbon.

• **Conclusions** The model is able to reproduce differences in vine and fruit growth arising from various experimental treatments. This implies it will be a valuable tool for refining our understanding of kiwifruit growth and for identifying strategies to improve production.

**Key words:** *Actinidia deliciosa*, kiwifruit, L-systems, plant architecture, carbon allocation, functional–structural plant model.

## INTRODUCTION

Kiwifruit (*Actinidia deliciosa*) originated from China, but was first grown commercially in New Zealand and has become the country's most important export horticultural crop (Ferguson and Bollard, 1990). The kiwifruit vine is characterized by vigorous growth and intense competition for carbohydrates between vegetative and reproductive components. Controlling the vegetative growth of the canopy and channeling carbohydrates into fruit is a major challenge for kiwifruit growers (Miller *et al.*, 2001; Thorp *et al.*, 2003). Traditionally, developing new training and pruning strategies to control canopy vigour and maximize production of high-quality fruit involves multiple field trials, which are costly and time consuming. Our long-term goal is to use functional–structural plant modelling for improving management techniques by exploring the vine's behaviour under hypothetical management practices in different environmental conditions (e.g. temperature and light). The aim of the research reported in

this paper was to develop a functional–structural kiwifruit vine model, incorporating existing knowledge on kiwifruit architecture and physiology, which can be used to guide future experimental work by increasing our understanding of how different aspects of the plant interact.

To this end, a model was developed that represents the following features of kiwifruit vine growth and function: (a) plasticity of kiwifruit architecture and, in particular, effects of genotype and temperature on shoot growth and shoot tip abortion (Foster *et al.*, 2007); (b) effects of management practices on shoot growth, light distribution within the canopy and fruit dry weight; (c) the role of reserves in the vine carbon dynamics; and (d) effects of fruit position within the canopy on its dry weight.

In earlier work, Buwalda (1991) constructed a process-based compartment model of the kiwifruit vine that included maintenance respiration, growth of organs, and synthesis and hydrolysis of carbon reserves, along with canopy net photosynthesis. The model's main focus was on the carbon economy of

the vine, including predicting the effects of plant–environment interactions; however, it had a number of simplifying assumptions: (a) a common pool of carbon; (b) no representation of 3-D structure and light distribution; and (c) the rate of photosynthesis was considered proportional to total leaf area. Although the model was able to reproduce several observed phenomena [such as resource-limited growth, depletion and regeneration of reserves, and root system turnover (Buwalda, 1991)], the common carbon pool model cannot adequately account for the architectural plasticity of the vine [as demonstrated for grapevine (Pallas *et al.*, 2010)] and the variations in fruit size caused by differences in local carbon supply within the vine (Tombesi *et al.*, 1993; Piller and Meekings, 1997). Thus, a process-based model is unable to reproduce fully the desired features of kiwifruit vine growth and development.

Greaves *et al.* (1999) investigated the importance of carbon reserve distribution in parent branches on axillary shoot growth. They modelled a single parent branch as a linked system of discrete elements, with each element comprised of a labile, reserve and structural pool. They considered carbon transport between the labile pools of connected elements, carbon synthesis and hydrolysis between reserve and labile pools, and the growth of shoots (not the parent branch itself) by movement of carbon from the labile pool into the structural pool. Output from their model showed general agreement with data from their own experiments on mature kiwifruit vines. Although this model is theoretically capable of meeting the features of the vine, it was designed for the sole purpose of investigating the effect of carbon reserves on early shoot growth (before the leaves become sources of carbon). Therefore, without substantial changes to the simple mechanism used to drive growth, it is unable to produce all the desired features of the vine's growth (Greaves *et al.*, 1999).

Greer *et al.* (2004) modelled canopy leaf area development and daily amount of carbon acquisition of kiwifruit vines from a mathematical model of shoot leaf area expansion and photosynthesis of individual leaves. They extended the shoot leaf area expansion model of Seleznyova and Greer (2001) by including architectural components (e.g. shoot type, node number and probability of budbreak), and used a rectangular hyperbolic function to model daily photosynthesis for leaves. Measurements of canopy leaf area development and rates of photosynthesis from vines grown in an orchard were in close agreement with the output from their model, and the estimated total carbon acquisition over the growing season was close to the measured biomass of the vine over that season. They concluded that their physiological model is scalable to whole vines but requires further development for carbon partitioning between individual organs. In other words, their model does not take into account the structure of the vine.

In order to integrate structure with carbon dynamics, functional–structural plant models (FSPMs) can be used. FSPMs are computational models that explicitly account for the 3-D architecture of a plant as it is governed by physiological processes and the environment (Sievänen *et al.*, 2000; Godin and Sinoquet, 2005; Vos *et al.*, 2007, 2010). The L-system modelling approach (Lindenmayer, 1968) is widely used to implement FSPMs (Fourcaud *et al.*, 2008; Vos *et al.*, 2010), as it can represent development, growth and carbon allocation

processes at the organ level, taking into account effects of organ position within the canopy (Prusinkiewicz *et al.*, 1997). Also, an L-system model can be interfaced with external models to incorporate environmental effects (Měch and Prusinkiewicz, 1996), such as light distribution (Cieslak *et al.*, 2008), and allows for interaction with the model as the simulation progresses: first, by user-driven modification of the numerical parameters in the model (Prusinkiewicz, 2004), and, secondly, by direct manipulation of the visual representation of the model on the computer screen (Prusinkiewicz *et al.*, 2007b).

In this paper, a functional–structural kiwifruit vine model is presented that integrates architectural development with mechanistic modelling of carbon transport and allocation. The model was implemented using the L-system-based modelling platform, L-studio (Prusinkiewicz *et al.*, 2000), in the L + C modelling language (Karwowski and Prusinkiewicz, 2003). The focus here is on the modelling concepts used to incorporate existing biological knowledge and hypotheses on kiwifruit architecture and physiology into the model. In order to demonstrate the model's capabilities and show its potential to reproduce the desired features of kiwifruit growth, the qualitative behaviour of the model is investigated through several simulations. The parameter values used in these simulations are either taken directly from existing experimental work or are fitted manually. Because of the complexity of the kiwifruit vine model, calibration and quantitative validation require the design of new experiments for parameter fitting, concentrating on just one particular aspect of the vine at a time [e.g. competition between reproductive and vegetative components (Minchin *et al.*, 2010)], and is beyond the scope of this paper. Nevertheless, a comparison is made between model output and observed data.

## METHODS: DESCRIPTION OF THE MODEL

The kiwifruit vine model combines aspects of the vine's architecture, carbon dynamics and the interactions between them (Fig. 1). For the architectural component, it includes a representation of individual organs and their topological connections, with rules for production of metamers (Cieslak *et al.*, 2007). For the carbon dynamics component, it includes carbon acquisition by leaves, transport throughout the plant, allocation and growth dependent on availability, and the role of carbon reserves (Cieslak *et al.*, 2010). The model accounts for exogenous factors, such as light distribution, temperature and horticultural manipulation (pruning and training), and other endogenous factors, such as shoot tip abortion and organ abscission. All of these aspects are detailed in the remainder of this section, and Tables 1 and 2 summarize the various parameters and variables of the model, respectively.

### *Aspect integration using L-systems*

L-systems (Prusinkiewicz *et al.*, 1997) are used to create a 3-D virtual plant representation (Room *et al.*, 1996) of the annual growth cycle of a managed mature kiwifruit vine (Sale and Lyford, 1990) (Fig. 2), and to integrate the aspects of this model at different spatial and temporal scales. At the beginning of each cycle, the structure consists of the main

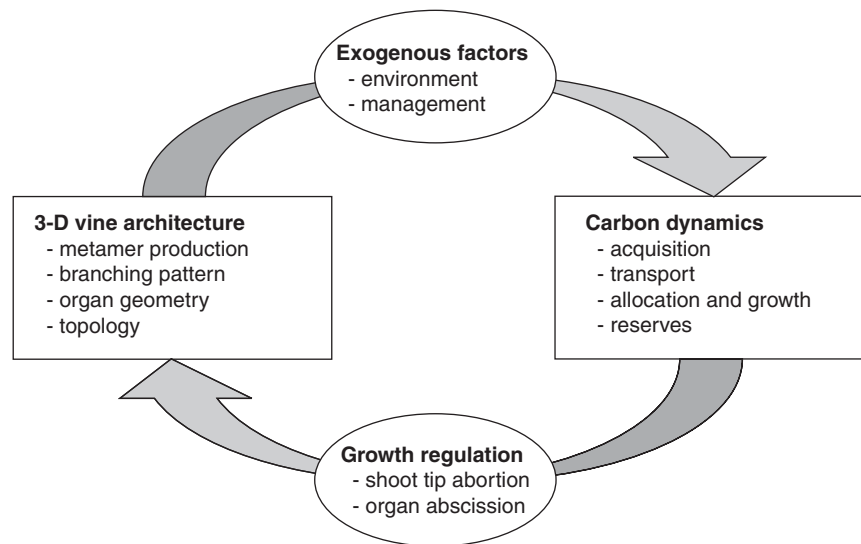


FIG. 1. Diagram of the kiwifruit vine model structure, showing the architectural and carbon dynamics aspects with the interactions between them.

trunk, two leaders and a specified number of canes trained on a support structure (Fig. 3). After budbreak and creation of the initial cluster of leaves, the appearance of new metamers on each shoot depends on environmental conditions and carbon availability. The simulation of shoot development and organ growth continues until the end of the annual growth cycle, when the fruit is ready for harvest. Since the simulation ends at this stage, the model does not currently take into account organ senescence, but nothing precludes including it if necessary.

The allocation of carbon to various sinks is computed with a time step of 0.1 d (selected as a compromise between the accuracy and speed of the computation), whereas the light distribution in the canopy is only calculated at daily time steps. In principle, the time steps could be the same for both of these aspects; however, calculating light distribution at the organ level is computationally intensive at the required precision, and the accuracy of the numerical method used to compute carbon allocation is limited by the size of the time step (a daily time step would lead to a large approximation error). To combine these aspects at different time scales, the average daily amount of carbon acquired by each leaf is calculated once per day, and then the amount is distributed to the leaves uniformly over the entire day (using a time step of 0.1 d).

#### Shoot development and vine architecture

Axillary shoots develop from mature first-order axillary buds on the cane. Their structure, as described by Walton *et al.* (1997), is as follows: nodes 1–4 have second-order axillary buds; nodes 5–12 have axillary meristems that differentiate into inflorescences and flowers; and nodes 13 onwards have axillary meristems that produce next season's axillary buds. The first four nodes are subtended by bud scales, while nodes from 5 up are subtended by leaf primordia. The transition from pre-formed to neoformed nodes usually occurs between node 15 and 25, with all kiwifruit buds

resuming organogenesis during budbreak (Foster *et al.*, 2007). Not all pre-formed organs expand during shoot development, as the shoot apex can abort at any stage. The likelihood of axillary meristem differentiation into flowers is dependent on many factors, such as node number along the shoot and application of chemical agents (Walton and Fowke, 1993). Second-order axillary buds only develop if the apical meristem of the first-order axillary bud is damaged (Walton, 1996).

Each individual axillary bud and its potential shoot are modelled by a discrete-time Markov chain (Taylor and Karlin, 1998), with three states: dormant, growing and aborted (shown in Fig. 4). The time between state transitions in the Markov chain corresponds to the rate of metamer appearance on the axillary shoot and is determined by phyllochron, which is the time interval between the appearance of successive leaves. At the start of the season, each axillary bud is in a dormant state, with a transition probability for budbreak,  $p_{bb}(n, m)$ , defined as a function of the developmental step,  $n$ , nodal position on the parent cane,  $m$ , and of the bud's orientation on the cane [so only buds on the topside of the cane will produce a shoot (Snowball and Considine, 1986)]. Modelling the effect of bud position along the parent cane is based on a theoretical probability of latent bud obtained (in tabulated form) by fitting a hidden semi-Markov model (HSMC) to architectural data (Seleznyova *et al.*, 2002: fig. 12A). It was assumed that all buds can break at  $n = 0$ , with probability  $p_{bb}(0, m)$  set by a user-defined function and the bud's orientation on the cane (1 for buds on the topside and 0 for the underside). The buds that break will produce an axillary shoot, and any remaining buds will stay dormant, with  $p_{bb}(n, m) = 0$  when  $n > 0$ . An axillary shoot produced after budbreak will continue growing with a specified probability of shoot development [denoted by  $p_{sd}(n, m)$ ], otherwise the shoot will abort growth.

The non-stationary transition probability,  $p_{sd}(n, m)$ , is modulated by several factors. First, there is an associated vigour (growth potential) with each shoot, e.g. a very vigorous

TABLE 1. The model parameters (by order of appearance in the text): symbols, definitions, units and values used in the simulations

Symbol	Definition	Value and units	Reference
<b>Shoot development</b>			
$p_{bb}(n, m)$	Probability of budbreak by node on parent cane	Empirical function (dimensionless)	Seleznova <i>et al.</i> (2002)
$p_{sd}(n, m)$	Probability of shoot development by node on parent cane	See eqn (1) (dimensionless)	
$c_{min}$	Carbon concentration threshold for shoot development	0.01 g C m <sup>-3</sup>	
$P(T)$	Phyllochron as function of temperature	Fig. 5 (days)	Morgan <i>et al.</i> (1985)
$T$	Temperature over time	Empirical function (°C)	Greer <i>et al.</i> (2004)
$\theta$	Leaf phyllotaxis angle	144°	Ferguson (1990)
$\phi$	Leaf inclination angle	33°	Morgan and McNaughton (1991)
$c_{min,flower}$	Carbon concentration threshold for flower abortion	0.01 g C m <sup>-3</sup>	
<b>Photosynthesis</b>			
$P_{max}$	Maximum photosynthetic rate	15.2 µmol CO <sub>2</sub> m <sup>-2</sup> s <sup>-1</sup>	Greer <i>et al.</i> (2004)
$\varphi_{app}$	Apparent photon yield	0.039 mol CO <sub>2</sub> mol <sup>-1</sup>	Greer <i>et al.</i> (2004)
$D$	Maximum potential photon flux density above the canopy	1300 µmol PAR m <sup>-2</sup> s <sup>-1</sup>	Greer <i>et al.</i> (2004)
<b>Leaf growth</b>			
$q_{leaf}$	Sink priority for leaf growth	0.01 g C m <sup>-3</sup>	
$\tau_{leaf}(T)$	Duration of rapid leaf growth	Fig. 5 (days)	Seleznova and Halligan (2006)
$B(n)$	Leaf growth parameter	Fig. 7 (g C)	Seleznova and Greer (unpubl. res.)
$L$	Specific leaf area	3.69e-6 m <sup>2</sup> g <sup>-1</sup> C	Seleznova and Greer (unpubl. res.)
<b>Internode growth</b>			
$\rho$	Internode volumetric density	1.89e-7 g C m <sup>-3</sup>	Seleznova and Greer (unpubl. res.)
$q_{inde,pri}$	Sink priority for internode elongation	0.01 g C m <sup>-3</sup>	
$q_{inde,sec}$	Sink priority for internode thickening	0.05 g C m <sup>-3</sup>	
$\tau_{inde}(T)$	Duration of rapid internode growth	$\tau_{leaf}(T)/2$ (days)	Seleznova (unpubl. res.)
$k_{sec}$	Long-term internode thickening rate	0.003 (dimensionless)	
$k_{logistic}$	Rapid initial internode thickening rate	0.28 (dimensionless)	
<b>Internode flow resistance</b>			
$k_{\Omega}$	Transport resistance coefficient	0.025 s m <sup>-3</sup>	
<b>Fibrous root growth</b>			
$q_{root}$	Sink priority for fibrous root growth	30 g C m <sup>-3</sup>	
$k_{prgr}$	Potential fibrous root growth rate	0.003 g C g <sup>-1</sup> C d <sup>-1</sup>	Buwalda (1991)
$T_{prgr}$	Root growth temperature response coefficient	$\ln(2)/10$ (dimensionless)	Buwalda (1991)
<b>Fruit growth</b>			
$q_{fruit}$	Sink priority for fruit growth	30 g C m <sup>-3</sup>	
$S_{fmax}$	Maximum potential final fruit size	14.5 g C	
$k_1, k_2, k_3$	Fruit growth parameters	0.02 d <sup>-1</sup> , 22.21 g <sup>-2</sup> C, 0.64 g C	Gandar <i>et al.</i> (1996)
<b>Maintenance respiration</b>			
$q_{rsp,i}$	Sink priority for maintenance respiration of organ type $i$ (leaf, internode, roots, fruit)	1e-4 g C m <sup>-3</sup>	
$m_{leaf}$	Leaf maintenance respiration coefficient	8.06e-3 g C g <sup>-1</sup> C d <sup>-1</sup>	Walton and Fowke (1995)
$m_{inde}$	Internode maintenance respiration coefficient	5.27e-3 g C g <sup>-1</sup> C d <sup>-1</sup>	Walton and Fowke (1995)
$m_{root}$	Root maintenance respiration coefficient	1.84e-3 g C g <sup>-1</sup> C d <sup>-1</sup>	Walton and Fowke (1995)
$m_{fruit}$	Fruit maintenance respiration coefficient	1.43 g C g <sup>-1</sup> C d <sup>-1</sup>	Walton and Fowke (1995)
$T_{rsp,i}$	Respiration temperature response coefficient for organ type $i$	$\ln(2)/10$ (dimensionless)	Buwalda (1991)
$c_{min,abs}$	Carbon concentration threshold for organ abscission due to insufficient supply for maintenance	0.01 g C m <sup>-3</sup>	



Leaf carbon supply			
$\sigma$	Constant for converting units of $P_{\text{gross}}$ to $\text{g C m}^{-2} \text{d}^{-1}$	$1.04 \text{ g C s } \mu\text{mol}^{-1} \text{CO}_2 \text{d}^{-1}$	Calculated
$q_{\text{sc}}$	Leaf carbon supply rate	$1.0 \text{ g C m}^{-3}$	
Carbon reserves			
$s_{\text{max,inde}}$	Maximum starch content per unit of structural carbon in an internode	$0.06 \text{ g starch g}^{-1} \text{C}$	Smith <i>et al.</i> (1992)
$s_{\text{max,roots}}$	Maximum starch content per unit of structural carbon in roots	$0.22 \text{ g starch g}^{-1} \text{C}$	Smith <i>et al.</i> (1992)
$q_{\text{syn}}$	Sink priority for starch synthesis	$0.1 \text{ g C m}^{-3}$	
$q_{\text{hyd}}$	Reserve carbon supply rate	$1.0 \text{ g C m}^{-3}$	
$k_{\text{sto}}$	Starch synthesis rate	$0.1 \text{ d}^{-1}$	
$k_{\text{hyd}}$	Starch hydrolysis rate	$1.0 \text{ d}^{-1}$	

The symbol  $n$  represents the developmental step, which corresponds to the number of nodes on a shoot, and  $m$  represents node number on a parent cane. A reference is provided for some parameter values, while the remainder were set manually and must be calibrated.

kiwifruit shoot can have a final length of 4.54 m compared with a mean final shoot length ( $\pm$  s.e.) of  $0.71 \pm 0.06$  m on the vine (Snowball, 1997). The kiwifruit vine conforms to Champagnat's architectural model (Hallé *et al.*, 1978), so that vigorous shoots are most likely to develop in the central region of the parent cane (Seleznova *et al.*, 2002). This is captured in the model by a function,  $v(m)$ , which modulates a shoot's vigour depending on its position along the parent cane, where  $0 \leq v(m) < 1$ . In the current paper,  $v(m)$  is defined in a graphical form using the function editor in L-studio (Prusinkiewicz, 2004) to be increasing from zero at the basal node to one at nodes 18–25, and then decreasing to zero at the apical node. Secondly, there is an intrinsic variation in the shoot vigour emerging during budbreak, as the variation in the number of neoformed metamers in a bud increases through successive stages of budbreak (Foster *et al.*, 2007). This variation is captured in the model by randomizing the vigour using a normally distributed random variable,  $V$ , with mean 0.95 and s.d. 0.24, estimated according to data collected by Foster *et al.* (2007). The third factor modulating shoot development is that a shoot will abort growth with different probabilities during any of three developmental stages (Foster *et al.*, 2007): opening of the initial cluster of leaves ( $p_0$ ), expansion of the pre-formed metamers ( $p_1$ ), and expansion of the neoformed metamers ( $p_2$ ). The values of these probabilities are dependent on the *Actinidia* species, and must be fitted from experimental data, as was done by Foster *et al.* (2007).

According to the three shoot development factors given above, the non-stationary transition probability, which changes with developmental step  $n$  (equivalent to the number of nodes in the developing shoot), is defined as

$$p_{\text{sd}}(n, m) = \min[v(m) \times V, 1] \times \begin{cases} 1 & n \leq N_0 \\ 1 - p_0 & n = N_0 + 1 \\ 1 - p_1 & N_0 + 1 < n \leq 18 \\ 1 - p_2 & n > 18 \end{cases} \quad (1)$$

where  $N_0$  is the number of nodes in the initial cluster, and it is assumed there are 18 pre-formed nodes in all buds. The value of  $N_0$  is generated per shoot from a binomial distribution with a mean of 5.7 and an s.d. of 2.1, which are taken directly from the architectural analysis by Seleznova *et al.* (2002) of short axillary shoots that terminated after opening of the initial cluster. Finally, regardless of the value of  $p_{\text{sd}}(n, m)$ , the shoot will abort when the carbon supply is low (Piller *et al.*, 1998; Greaves *et al.*, 1999), i.e. when the carbon concentration at the shoot tip falls below a certain threshold  $c_{\text{min}}$ .

In kiwifruit, phyllochron responds non-linearly to temperature (Morgan *et al.*, 1985; Seleznova and Halligan, 2006) (see Fig. 5). Therefore, the growing degree-days concept for modelling leaf appearance cannot be applied, as it can only be used in the case of a linear response. In our model, the rate of metamer appearance is governed by a phyllochron index defined as

$$\frac{dn_P}{dt} = \frac{1}{P(T)} \quad (2)$$

TABLE 2. The state variables used in the model, with symbols, definitions and units given in order of appearance in the text

Symbol	Definition	Initial value with units
$n_p$	Phyllochron index	0 (dimensionless)
$P_{\text{gross}}$	Leaf photosynthetic rate	$0 \mu\text{mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$
$I$	Absorbed photosynthetic photon flux density per leaf	$0 \mu\text{mol PAR m}^{-2} \text{ s}^{-1}$
$c$	Carbon concentration in transport pathway for each sink/source	$0 \text{ g C m}^{-3}$
Leaf growth		
$s_{\text{leaf}}$	Leaf sink size (structural carbon)	$3.69\text{e-}4 \text{ g C}$
$\alpha_{\text{leaf}}$	Leaf developmental age	Fig. 7 (dimensionless)
$A_{\text{leaf}}$	Leaf area	$(L \cdot s_{\text{leaf}}) \text{ m}^2$
Internode growth		
$V$	Internode volume	$(\pi r^2 l) \text{ m}^3$
$l$	Internode length	(empirical function) m
$r$	Internode radius	$1.5\text{e-}3 \text{ m}$
$\alpha_{\text{inde}}$	Internode developmental age	$-6/\tau_{\text{inde}}(T)$ (dimensionless)
$s_{\text{inde}}$	Internode sink size (structural carbon)	$(\rho \cdot V) \text{ g C}$
$\Omega$	Internode resistance along transport pathway	Eqn (14) $\text{s m}^{-3}$
Fibrous root growth		
$s_{\text{root}}$	Fibrous root sink size (structural carbon)	$4779 \text{ g C}$
Fruit growth		
$s_{\text{fruit}}$	Fruit sink size (structural carbon)	$0.1 \text{ g C}$
Maintenance respiration		
$M_{\text{rsp}}$	Amount of carbon required to meet maintenance respiration	Eqn (17) $\text{g C}$
Leaf carbon supply		
$s_{\text{src}}$	Acquired carbon in a leaf	$0 \text{ g C}$
Carbon reserves		
$s_{\text{res,inde}}$	Carbon reserves in an internode	$(s_{\text{inde}} \cdot s_{\text{max,inde}}) \text{ g C}$
$s_{\text{res,roots}}$	Carbon reserves in roots	$(s_{\text{root}} \cdot s_{\text{max,roots}}) \text{ g C}$

Some initial values are given explicitly, and the remainder are set according to calculation.

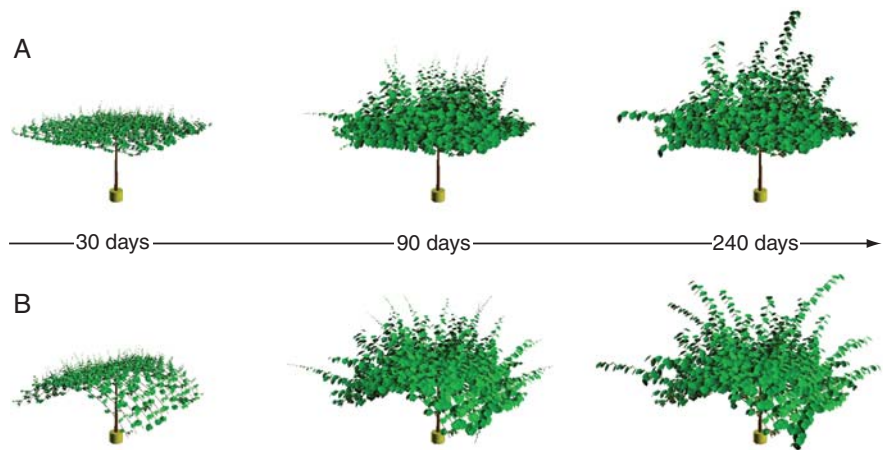


FIG. 2. A 3-D visualization of the kiwifruit vine (*A. deliciosa*) over one season's growth shown at the following times: 30, 90 and 240 d after budbreak. The vine was trained on a pergola support structure (A) and a T-bar support structure (B).

where  $P(T)$  is phyllochron as a function of average daily temperature,  $T$ , and the integer part of  $n_p$  corresponds to the developmental step at time  $t$ ,  $n = \text{int}(n_p)$ . The form of  $1/P(T)$  is defined by the user; we used the empirical function given in Fig. 5. Eqn (2) is numerically integrated using the explicit Euler method (Press *et al.*, 1992), with step size 0.1 and  $n_p$  initially set to zero. Thus, a new leaf appears when  $n_p$  increases by one, but this is subject to the probability of shoot development,  $p_{\text{sd}}(n, m)$ , given above. As the leaves appear, they are arranged in a spiral phyllotaxis of 2/5

(Ferguson, 1990) (the angle between successive leaves is  $\theta = 144^\circ$ ) and have an inclination angle of  $\phi = 33^\circ$  (Morgan and McNaughton, 1991). The production of flowers and ultimately fruit on the axillary shoot is dependent on node number (as given in the description of first-order axillary bud above), so there are potentially eight reproductive meristems in the axillary bud (Hopping, 1990). Not all of these meristems develop into flowers, and the details of the mechanisms that control flower bud abortion/evocation are not fully known (Hopping,

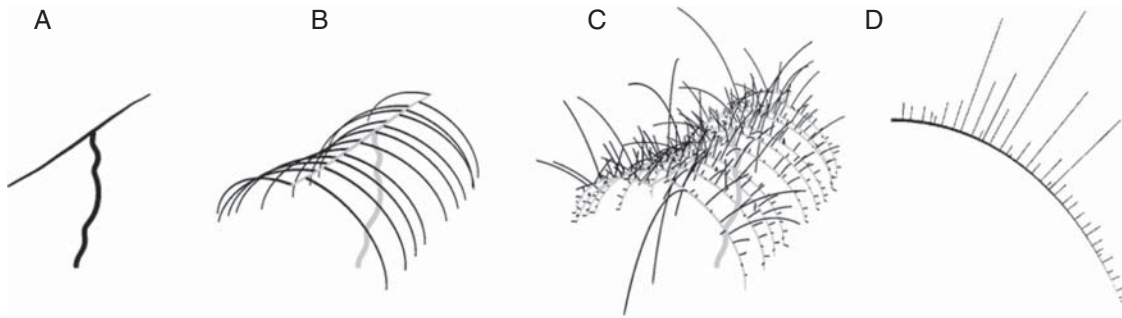


FIG. 3. Schematic of a mature kiwifruit vine trained on a T-bar support structure. In a standard management scheme, a single trunk is maintained with two horizontally trained relay axes, called leaders, in opposite directions along a support structure (A). New relay axes from these leaders are left to bend under their own weight and eventually tied down to support structures, which are called replacement or parent canes (B). The axillary shoots that grow from these parent canes (C) will produce the fruit. Generally, the parent canes are replaced with one of the vigorous axillary shoots during winter pruning, bringing the vine back to a similar form at the beginning of each season (B). In this kiwifruit vine model, the permanent structure (B) is assumed to be present at the start of the simulation, but the branching pattern of the axillary shoots on a parent cane (D) is a result of the simulation.

1990; Walton and Fowke, 1993; Snelgar *et al.*, 2007). For this reason, flower production is modelled as a binomial process with the probability of an axillary bud switching physiologically from vegetative to reproductive dependent on node number. For nodes 5–12, this probability is set according to data collected by Walton and Fowke (1993), while for the remaining nodes it is set to zero. Every flower on the shoot is capable of setting and developing into a fruit (Hopping, 1990). The model takes into account the effect of local carbon supply, so a flower will abort if the carbon supply is too low, i.e. if the carbon concentration at the flower's point of attachment to the transport pathway is below a threshold,  $C_{\min, \text{flower}}$  it aborts. This captures the suggestion proposed by Walton and Fowke (1993) that increased supply of metabolites reduces flower abortion. Also, the model assumes successful pollination of all the flowers.

#### Canopy light distribution and photosynthesis

To study the effects of canopy structure on light distribution and to estimate carbon acquisition through photosynthesis, the kiwifruit vine model is interfaced with a light environment model using the open L-system formalism (Měch and Prusinkiewicz, 1996). The light environment model estimates the amount of absorbed irradiance for each leaf in the canopy using a quasi-Monte Carlo path-tracing algorithm (Cieslak *et al.*, 2008). It approximates the incoming light from the sky based on the CIE standard clear sky or overcast sky models (CIE-110, 1994), parameterized by the day of year, time of day and geographical location.

Gross photosynthesis for each leaf is estimated using a light response curve. The following rectangular hyperbolic function is used (Greer *et al.*, 2004)

$$P_{\text{gross}} = P_{\text{max}} [\tanh(I \cdot \varphi_{\text{app}} / P_{\text{max}})] \quad (3)$$

where  $P_{\text{max}} = 15.2 \mu\text{mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  is the maximum rate of photosynthesis,  $\varphi_{\text{app}} = 0.039 \text{ mol CO}_2 \text{ mol}^{-1} \text{ PAR}$  is the apparent photon yield and  $I$  ( $\mu\text{mol PAR m}^{-2} \text{ s}^{-1}$ ) is the photon flux density absorbed by the leaf (determined by the light environment model), with the potential maximum at the top of the canopy assumed to be  $D = 1300 \mu\text{mol PAR}$

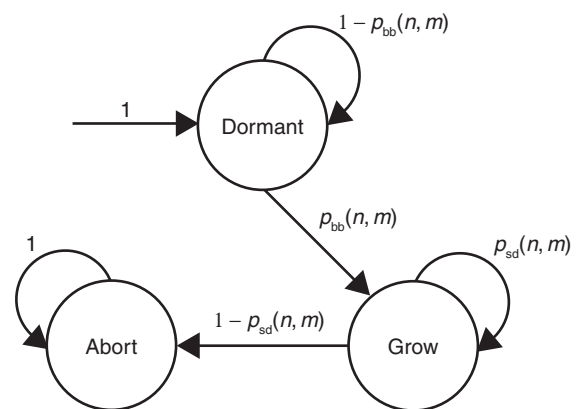


FIG. 4. The Markov chain representation of axillary shoot growth. The probability of budbreak is given by  $p_{\text{bb}}(n, m)$ . The probability of shoot development is given by  $p_{\text{sd}}(n, m)$  and is modulated by initial bud vigour, positional effects along the cane and resource availability. From Cieslak *et al.* (2010), © 2010 IEEE.

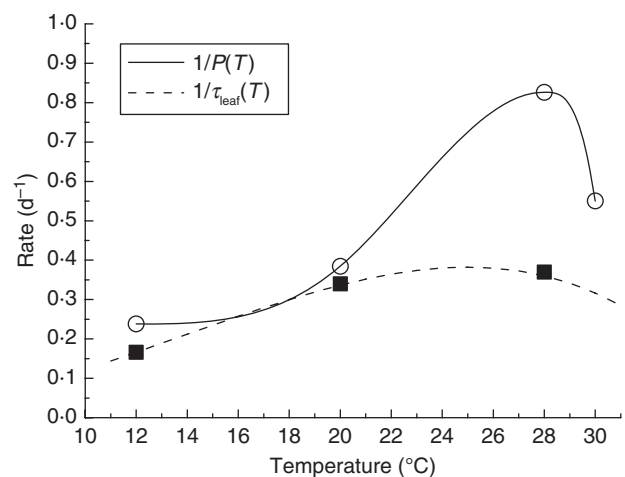


FIG. 5. The rate of kiwifruit leaf appearance (solid line) and specific leaf growth rate (dashed line) as a function of temperature. The functions are fitted to data (squares, circles), collected by Seleznyova and Halligan (2006) and Morgan *et al.* (1985). From Cieslak *et al.* (2010), © 2010 IEEE.

$\text{m}^{-2} \text{s}^{-1}$ , approximated in midsummer (Greer *et al.*, 2004). The effect of temperature on the light response curve is not currently included in the model, as Laing (1985) has noted minimal variation in photosynthetic rate for temperatures in the range 10–25 °C. Consequently, application of the current model is limited to this temperature range.

#### Carbon dynamics

Prusinkiewicz *et al.* (2007a) presented an algorithm for simulating the acquisition, transport and partitioning of carbon within a plant based on an analogy between pressure-driven flow and current flow in an electric circuit, originally developed in the functional–structural peach tree model, L-PEACH (Allen *et al.*, 2005). The essence of this carbon transport resistance allocation model (herein referred to as C-TRAM) is to compute the concentration and flow of carbon throughout the plant based on the resistances between sink/source elements and within each element. Their compact L-system implementation shows the benefit of L-system-based models; as the structure develops, the system of equations (in this case, controlling the flow of carbon throughout the plant) is automatically expanded. The semi-implicit Euler method (Press *et al.*, 1992) was used to solve the equations representing flow of carbon, which was essential to avoid the limitation of the explicit Euler method for solving stiff equations. As the system of equations may be non-linear, the Newton–Raphson method was used to find a solution iteratively through linearization (Press *et al.*, 1992).

In C-TRAM, each metamer was modelled as a conduit element, representing an internode, with a single sink or source element attached at its distal end, representing a lateral organ such as a fruit or a leaf. We extended this approach, so that for each plant organ (e.g. internode, leaf, fruit and roots) several source/sink elements are defined to take into account growth, maintenance, reserve dynamics and, in the case of leaves, carbon acquisition. Specifically, the extension uses multiscale modelling to apply one set of L-system rules representing plant development at the organ scale and another set of rules representing carbon dynamics at the sink/source scale. The advantage of this multiscale approach is that the L-system rules implementing C-TRAM can be applied to all sinks/sources at one scale without modification of the original underlying method for solving the non-linear system of equations. Otherwise, only linear responses to carbon limitation can be considered, as in the latest version of L-PEACH (Lopez *et al.*, 2008), or the Newton–Raphson method must be applied twice: first at the organ scale to determine carbon allocation to different sinks within each organ, and then at the whole-plant scale. All that remains now is to define the equations for influx of carbon into the different sink types and outflow of carbon from sources.

#### Influx into organ growth sinks

C-TRAM allows for the mechanistic modelling of effects of carbon limitation on organ growth via appropriate definition of the functional forms of growth rates for different sink types. The growth rate is determined by the influx of carbon into

the sink, depending on its intrinsic potential growth rate and the carbon concentration outside the organ in the transport pathway. This growth rate is modulated by two functions, as given by the following equation

$$\frac{ds_i}{dt} = f(q_i, c) \times G_{\max}(\dots) \quad (4)$$

where  $s_i$  is the size (structural carbon) of the sink of type  $i$ ,  $ds_i/dt$  is the change in sink size,  $f(q_i, c)$  is a non-linear resource-limiting function of carbon concentration,  $c$ , outside the sink in the transport pathway that depends on sink type, and  $G_{\max}(\dots)$  is a maximum potential growth rate that depends on environmental factors (e.g. temperature) and the organ's intrinsic properties. The form of the resource-limiting function  $f(q_i, c)$  is the same for all sink types and is defined by

$$f(q_i, c) = \frac{c}{q_i + c} \quad (5)$$

where  $q_i$  can be interpreted as a sink priority parameter (given the same carbon concentration in the vicinity of the sink, a low value of  $q_i$  indicates a higher carbon influx into the sink). This function captures the complex behaviours that are likely to occur for different sink types in a hierarchical arrangement (Wardlaw, 1990). If carbon concentration outside the sink is high, the carbon flux into the sink is at or near saturation, but, when the concentration is low, the carbon flux of individual sinks falls with different rates depending on the type. Although the form of this resource-limiting function is similar to the Michaelis–Menten equation derived for enzyme kinetics (Thornley and Johnson, 1990) and used to model sink unloading by Minchin *et al.* (1993), its application is different. In our model, eqn (5) is used in a more phenomenological sense to represent the aggregated sink responses, with the parameter  $q_i$  controlling sink priority dependent on sink type.

The form of the function  $G_{\max}(\dots)$  depends on the sink type, and will be described next for vegetative and reproductive components of the vine.

#### Vegetative growth

Leaf and internode growth under carbon limitation is modelled using two state variables as proposed by Seleznyova (2008): sink size,  $s_i$ , and developmental age,  $\alpha_i$ , where  $i$  is the type (leaf or internode). The developmental age variable eliminates the need for specifying an organ's potential final size, so that organ size is only determined by its initial state at the time of appearance,  $s_{i,0}$  and  $\alpha_{i,0}$ , and duration of rapid growth,  $\tau_i$ , which is centred around the time of maximum growth  $t_0$  (i.e. it is the time period when most of the growth occurs) (Seleznyova and Greer, 2001). Developmental age extends the thermal time concept by accounting for the various effects of the environment on the duration of growth (not only temperature), and it can be applied when the response is non-linear (Seleznyova, 2008). In this model, the developmental age of a leaf or an internode is used to determine the organ's non-linear growth response to temperature, which is not possible using



the thermal time (degree-days) concept (Seleznyova and Halligan, 2006).

Developmental age relates time to temperature via a direct relationship (as temperature increases/decreases internal ageing increases/decreases), and the change in developmental age of an organ over time is modulated by the organ's specific growth rate, which is inversely related to the duration of growth. More precisely, it is governed by the following equation (Seleznyova, 2008)

$$\frac{d\alpha_i}{dt} = \frac{1}{\tau_i(T)} \quad (6)$$

where  $\tau_i(T)$  is now a function of temperature. Before describing the specific equations for modelling kiwifruit leaf and internode growth, let us consider how the developmental age variable can be used as input into a growth function.

Simple logistic-type growth can be modelled as a relative growth rate by

$$\frac{ds}{dt} = \frac{1}{\tau} s \Gamma(\alpha), \quad (7)$$

where  $s$  is the size of the organ,  $1/\tau$  is the specific growth rate, and  $\Gamma(\alpha)$ , the growth function, is defined as (Seleznyova, 2008)

$$\Gamma(\alpha) = \frac{1}{1 + e^\alpha}. \quad (8)$$

Note that these variables are used to explain the concept and are not part of the kiwifruit vine model. By numerically integrating eqn (7) using the explicit Euler method for different initial values of developmental age, we can examine the differences in resulting final sizes. Figure 6 shows the size of an organ with respect to its developmental age. The first solution is used as a control, with  $\tau = 3$ , and initial values  $\alpha(0) = -3$

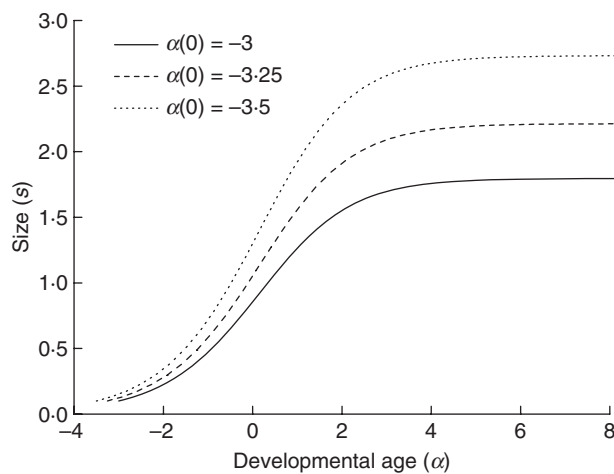


FIG. 6. The change in size of an organ with respect to its developmental age for different initial values of developmental age:  $\alpha(0) = -3$ ,  $\alpha(0) = -3.25$  and  $\alpha(0) = -3.5$ . Given the same initial size,  $s(0) = 0.1$ , the resulting final size of the organ is different irrespective of  $\alpha$ , the duration of rapid growth. If the initial developmental age is decreased (given that the time of maximum growth is when  $\alpha = 0$ ), the final size increases.

and  $s(0) = 0.1$ . The developmental age is fixed to zero ( $\alpha = 0$ ) at the time of maximum expansion  $t_0$ , which is why it is initially negative (Seleznyova, 2008). In the remaining two solutions, only the initial value of developmental age was changed:  $\alpha(0) = -3.25$  and  $\alpha(0) = -3.5$ , respectively. The final sizes were  $s(t_F) = 1.8$ ,  $s(t_F) = 2.2$  and  $s(t_F) = 2.7$ , respectively, where  $t_F$  is the final simulation time. Assuming the initial sizes are the same, decreasing the initial developmental age,  $\alpha(0)$ , causes an increase in final size, and increasing  $\alpha(0)$  causes a decrease in final size, irrespective of the duration of rapid growth,  $\tau$ . It is precisely this characteristic of the developmental age variable that allows organ growth to be modelled without specifying final size.

As kiwifruit leaf growth rate is characterized by logistic-type growth (Seleznyova and Greer, 2001), the leaf sink size,  $s_{\text{leaf}}$ , is modelled according to a maximum potential relative growth rate derived from data (Seleznyova, 2008). The following equation is used to capture the change in leaf size [with  $G_{\text{max}}(\dots)$  given as the second term on the right-hand side of the equation],

$$\frac{ds_{\text{leaf}}}{dt} = f(q_{\text{leaf}}, c) \left( \frac{\Gamma(\alpha_{\text{leaf}})[s_{\text{leaf}} - B(n)]}{\tau_{\text{leaf}}(T)} \right) \quad (9)$$

where  $B(n)$  is a coefficient that controls the initial growth rate of the leaf by node number  $n$  (see Fig. 7), and  $\Gamma(\alpha_{\text{leaf}})$  is defined as before in eqn (8). The  $B(n)$  coefficient is necessary to include positional effects on leaf size, because a leaf's initial size at time of appearance,  $s_{\text{leaf},0}$ , is the same for all leaves. In addition, the specific growth rate,  $1/\tau_{\text{leaf}}(T)$  is included in this equation to set a leaf's maximum relative growth rate. Figure 5 shows the value of  $1/\tau_{\text{leaf}}(T)$ , which is an empirical function defined by the user. The initial developmental age for an organ can be determined from data as described by Seleznyova (2008). Figure 7 shows this value,  $\alpha_{\text{leaf},0}$ , for kiwifruit leaves by node number. Together with the  $\tau_{\text{leaf}}$  parameter, the initial developmental age determines the duration of the exponential expansion phase of the leaf. Lastly, leaf area,  $A_{\text{leaf}}$ , is approximated from leaf sink size

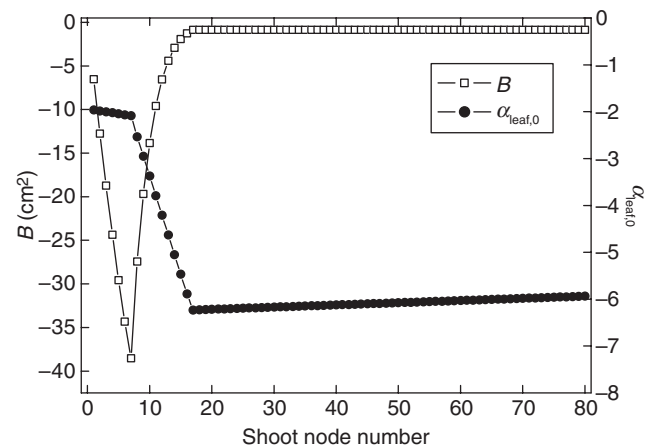


FIG. 7. The initial leaf developmental age,  $\alpha_{\text{leaf},0}$ , and leaf growth parameter,  $B$ , by node number. The values are fitted from data collected by Seleznyova and Greer (Plant & Food Research, Palmerston North, New Zealand, unpubl. res.). From Cieslak et al. (2010), © 2010 IEEE.

according to the equation  $A_{\text{leaf}} = Ls_{\text{leaf}}$ , where  $L$  is the specific leaf area ( $\text{m}^2 \text{g}^{-1} \text{C}$ ) and is assumed to be constant.

Internode growth rate is characterized by its increasing volume due to expansion of cells and formation of new phloem and xylem (Pallardy, 2008). The internode sink size is proportional to internode volume,  $s_{\text{inde}} = \rho V$ , where  $\rho$  is volumetric density (assumed to be constant) and  $V$  is internode volume, and can be described by growth rates for radial and axial components separately. Thus, based on preliminary observations, internode elongation is described by a relative growth rate (as for a leaf, but with  $B = 0$ ), and thickening is given in two parts: short-term logistic expansion for young internodes, and long-term radial expansion that is proportional to the internode's surface area. In practice, the length,  $l$ , and radius,  $r$ , are governed by the following two equations:

$$\frac{dl}{dt} = f(q_{\text{inde}, \text{pri}}, c) \left( \frac{\Gamma(\alpha_{\text{inde}})l}{\tau_{\text{inde}}(T)} \right) \quad (10)$$

and

$$\frac{dr}{dt} = f(q_{\text{inde}, \text{sec}}, c) \left( \frac{k_{\text{sec}} + k_{\text{logistic}} \Gamma(\alpha_{\text{inde}})r}{\tau_{\text{inde}}(T)} \right) \quad (11)$$

where  $q_{\text{inde}, \text{pri}}$  and  $q_{\text{inde}, \text{sec}}$  are parameters controlling sink priority of primary and secondary growth, respectively, and both  $k_{\text{sec}}$  and  $k_{\text{logistic}}$  are thickening growth rate parameters. The former regulates long-term radial growth and the latter regulates a rapid initial growth. The value of  $\tau_{\text{inde}}(T)$  for internodes is half that of leaves (Seleznyova, Plant & Food Research, Palmerston North, New Zealand, unpubl. res.). The initial developmental age for internodes is  $\alpha_{\text{inde}, 0} = -3.64$ , initial length depends on node number and is defined in tabulated form based on shoot growth data analysis, and initial radius is set to  $1.5\text{e-}3 \text{ m}$  (Seleznyova and Greer, Plant & Food Research, Palmerston North, New Zealand, unpubl. data). Now, the two equations above can be combined to get the change in internode sink size, given by

$$\frac{ds_{\text{inde}}}{dt} = \rho \frac{dV}{dt} = \pi r^2 \rho \frac{dl}{dt} + 2\pi r l \rho \frac{dr}{dt} \quad (12)$$

This equation can be rewritten in terms of carbon units only, as the following

$$\begin{aligned} \frac{ds_{\text{inde}}}{dt} = & f(q_{\text{inde}, \text{pri}}, c) \left( \frac{\Gamma(\alpha_{\text{inde}})s_{\text{inde}}}{\tau_{\text{inde}}(T)} \right) + f(q_{\text{inde}, \text{sec}}, c) \\ & \times \left( \frac{k_{\text{sec}}A\rho + k_{\text{logistic}}\Gamma(\alpha_{\text{inde}})s_{\text{inde}}}{\tau_{\text{inde}}(T)} \right) \end{aligned} \quad (13)$$

where  $A = 2\pi rl$  is the internode's surface area.

Resistance along the transport pathway,  $\Omega$ , is directly proportional to the length of the internode, and inversely proportional to its circumference, as the phloem is a layer near the surface of the internode. Assuming the thickness of the layer is constant and much smaller than the internode's

radius, it is given by the following equation

$$\Omega = k_{\Omega} \frac{l}{2\pi r} \quad (14)$$

where  $k_{\Omega}$  is a coefficient that includes the phloem's thickness,  $l$  is internode length and  $r$  is its radius.

Root growth is modelled according to the method proposed by Buwalda (1991), where only the growth of fibrous roots is considered, because, in a mature kiwifruit vine, growth of structural roots is negligible (Buwalda, 1993) and it is speculated that fibrous roots turn over within 1 year (Buwalda and Hutton, 1988). The relative elongation rate of fibrous roots in late summer, the peak period of growth (Buwalda and Hutton, 1988), is assumed to represent potential growth rate. Then, the change in root sink size is modelled as a relative growth rate that responds to changes in temperature, and is given by

$$\frac{ds_{\text{root}}}{dt} = f(q_{\text{root}}, c) k_{\text{prgr}} s_{\text{root}} e^{T_{\text{prgr}}(T-20)} \quad (15)$$

where  $k_{\text{prgr}}$  is a parameter representing the potential root growth rate for the peak period of growth in late summer, and  $T_{\text{prgr}}$  is a parameter controlling the response of root growth to temperature (Buwalda, 1991). A value of  $0.003 \text{ g C g}^{-1} \text{ C d}^{-1}$  for  $k_{\text{prgr}}$  at  $20^\circ \text{C}$  was reported by Buwalda and Hutton (1988). The temperature response coefficient is assumed to double the growth rate for every  $10^\circ \text{C}$  increase in temperature, as proposed by Buwalda (1991).

#### Fruit growth

Kiwifruit growth rate is characterized by a double-sigmoid curve, where the growth rate is more rapid in the first phase than in the second phase (Davison, 1990). In accordance with this characteristic, the change in fruit sink size is modelled as a relative growth rate by the following equation

$$\begin{aligned} \frac{ds_{\text{fruit}}}{dt} = & f(q_{\text{fruit}}, c) k_1 s_{\text{fruit}} \left( 1 - \frac{s_{\text{fruit}}}{s_{\text{fmax}}} \right) \\ & \times [1 + k_2(s_{\text{fruit}} - k_3)^2] \end{aligned} \quad (16)$$

where the form of the potential growth rate, identified as  $G_{\text{max}}(\dots)$  in eqn (4), is the one proposed by Gandar *et al.* (1996) for change in fruit weight over time. The parameter  $s_{\text{fmax}}$  gives the maximum size of the fruit, and  $k_1$ ,  $k_2$ , and  $k_3$  are parameters that are fitted to data (Gandar *et al.*, 1996). These parameters are necessary to capture the bimodal relationship between growth rate and size in kiwifruit. The shape of the peaks (points of inflection on the growth rate) is determined by  $k_1$  and  $k_2$ , and the trough in between them is determined by  $k_3$  (Gandar *et al.*, 1996). Compared with the model for vegetative growth (described above), the fruit growth model is currently constrained by the specification of the maximum potential fruit size and by the exclusion of temperature effects. Addressing this limitation is challenging as it is difficult to show a consistent effect of temperature on kiwifruit growth in the field; nevertheless, progress is being made (Snelgar *et al.*, 2005; Bebbington *et al.*, 2009).

### Maintenance respiration

The carbon demand required to meet maintenance respiration,  $M_{\text{rsp}}$ , of a specific organ is defined by the total biomass of that organ and the ambient temperature. It is modelled as the influx of carbon into a maintenance sink by the following equation (Buwalda, 1991)

$$M_{\text{rsp}} = f(q_{\text{rsp},i}, c) s_i m_i e^{T_{\text{rsp},i}(T-20)} \quad (17)$$

where  $q_{\text{rsp},i}$  is the sink priority for organ type  $i$ ,  $s_i$  is current sink size (corresponding to structural carbon),  $m_i$  is a maintenance coefficient for organ type  $i$ ,  $T_{\text{rsp},i}$  is a temperature response coefficient, and  $T$  is the temperature. Grossman and DeJong (1994) give values of  $m_i$  for various plant organs in peach, which may also be used for kiwifruit (Walton and Fowke, 1995). The temperature-dependent parameter is set so that the respiration rate doubles for every 10 °C increase in temperature. Finally, insufficient supply of carbon for maintenance respiration results in organ abscission, when the carbon concentration at the organ's point of attachment to the transport pathway falls below the threshold  $c_{\text{min,abs}}$ . This value must be set through optimization.

### Carbon acquisition

The carbon acquired through photosynthesis and stored in a leaf is modelled as a source of size  $s_{\text{src}}$ . Carbon is loaded from the source into the transport pathway dependent on the carbon concentration outside the leaf,  $c$ , and is assumed to involve active transport (Cannell and Dewar, 1994). Therefore, the amount of carbon the leaf will acquire and store, and then supply into the transport pathway is modelled by

$$\frac{ds_{\text{src}}}{dt} = P_{\text{gross}} \sigma (s_{\text{leaf}} - s_{\text{src}}) L - g(q_{\text{src}}, c) s_{\text{src}} \quad (18)$$

where the first term captures carbon acquisition through photosynthesis limited by overloading, with the constant  $\sigma = 1.04$  used to convert  $P_{\text{gross}}$  from units of  $\mu\text{mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  to  $\text{g C m}^{-2} \text{ d}^{-1}$ , and  $g(q_{\text{src}}, c)$  is a resource-limiting function, which is currently defined as

$$g(q_{\text{src}}, c) = 1 - \frac{c}{q_{\text{src}} + c} \quad (19)$$

Parameter  $q_{\text{src}}$  sets the carbon supply rate so that the leaf maintains a high carbon concentration outside itself in the transport pathway (Cannell and Dewar, 1994). There is a maximum amount of carbon a leaf can store based on its current size, i.e. if  $s_{\text{src}}$  approaches a state of saturation (when  $s_{\text{leaf}} = s_{\text{src}}$ ), carbon acquisition by the leaf is reduced because it is unable to store more carbon.

### Reserve dynamics

Carbon reserves, in internodes and roots, are modelled as an active competing sink driving starch synthesis (Cannell and Dewar, 1994; Daudet et al., 2002). The rate of starch synthesis depends on organ size, but may be limited by overloading.

Remobilization of stored carbon is proportional to the amount of starch in the organ. The change in size of the storage sink is given by the following equation

$$\begin{aligned} \frac{ds_{\text{res},i}}{dt} = & f(q_{\text{syn}}, c) (s_i s_{\text{max},i} - s_{\text{res},i}) k_{\text{syn}} \\ & - g(q_{\text{hyd}}, c) s_{\text{res},i} k_{\text{hyd}} \end{aligned} \quad (20)$$

where  $i$  is organ type (internode or roots). The first half of the equation limits carbon storage owing to starch overloading and the organ storage capacity, which is proportional to the current organ structural biomass,  $s_i$ , and maximum starch content per unit of structural carbon,  $s_{\text{max},i}$ , for organ  $i$  (internodes or roots). The other half governs carbon remobilization depending on the amount of stored carbon. The two parameters  $k_{\text{syn}}$  and  $k_{\text{hyd}}$  control the rate of starch synthesis and hydrolysis, respectively. Maximum starch content,  $s_{\text{max},i}$ , was calculated from the reported budbreak starch concentration of 0.06 g starch  $\text{g}^{-1}$  dry weight for internodes and 0.22 g starch  $\text{g}^{-1}$  dry weight for roots (Smith et al., 1992).

## RESULTS: MODEL SIMULATIONS

In order to demonstrate the capability of the kiwifruit vine model to produce the vine's growth features and simulate experimental scenarios, several simulations were performed. The first simulation is of the branching patterns of *A. deliciosa* and *A. chinensis* observed by Snowball (1997) and Seleznyova et al. (2002), which highlights the performance of the architectural component of the model. The second simulation emphasizes the role of relative distances between sinks and sources based on the whole cane defoliation experiments of Tombesi et al. (1993). In the last two simulations, the effect of local carbon supply on early shoot growth is shown by manipulating carbon reserves for isolated shoots and for competing adjacent shoots on the basis of experiments performed by Piller et al. (1998) and Greaves et al. (1999), respectively. The parameters of the model are set manually according to experimental data or from observations (see Table 1).

Since the focus of these simulations is only on showing the capabilities of the model, the effect of temperature was excluded so that parameters dependent on temperature could be kept constant, with  $P = 2.9 \text{ d}$ ,  $\tau_{\text{inde}} = 2.77 \text{ d}$ ,  $\tau_{\text{leaf}} = 5.53 \text{ d}$ , while the remaining parameters were set as given in Table 1. The initial values for state variables were set as given in Table 2. The light model was set to simulate the PAR domain for a clear sky averaged over the entire day, with the absorbance ratio of the leaves set to 78 % (Greer and Laing, 1992).

Simulation of the entire vine over one growing season (240 d) with 28 canes and 392 shoots (totalling 6370 metamers) took about 57 min on a notebook PC with a 1.73 GHz processor and 2 GB of memory. During this simulation, computation of the light distribution within the canopy took about 18 min using 262 144 light path samples. Also, the final number of sinks and sources was 71 500. As the L-system simulator, *lpfg*, automatically handles addition/removal of the model's components (organs and sinks/sources), there is



no theoretical restriction on the maximum number; the only limit is set by the computer's capacity.

*Branching pattern: distributions of shoot node number and axillary shoot types*

An illustration of the model's architectural component, without the effects of resource limitation, is necessary to provide a basis for further simulation of the entire vine. The model calculates the final number of nodes for each axillary shoot and the probability distributions of axillary shoot types along the cane. This model output can be directly compared with biological data, which can be used to calibrate the architectural parameters of the model manually.

Snowball (1997) collected data for the seasonal cycle of shoot development for ten *Actinidia* species, which were pruned to standard commercial practice on a T-bar support structure. Among other things, she calculated the frequency distribution of shoot node number for *A. deliciosa* and *A. chinensis* vines. To calibrate the model parameters manually and compare the model output with these data, a simulation of axillary shoot growth from parent canes was performed for a female vine of both species. The architectural parameters were identical for each of these simulations, except for the probabilities of growth cessation, which differed between *A. deliciosa* and *A. chinensis* as follows:  $p_0$  for cessation after opening of the initial cluster (0.02 vs. 0.35),  $p_1$  for cessation after expansion of pre-formed metamers (0.005 vs. 0.1) and  $p_2$  for cessation after expansion of neoformed metamers (0.09 vs. 0.01), where values given in parentheses are for *A. deliciosa* and *A. chinensis*, respectively. All three parameters have been shown to be species dependent by Foster et al. (2007).

Figure 8A gives the frequency distribution of node numbers for a simulation of shoots growing on 28 canes each for the two female *Actinidia* vines. Table 3 gives the mean number of nodes ( $\pm$  s.e.) per shoot, the median number and the maximum number for both species, along with the values reported by Snowball (1997) for comparison. The similarity of the values suggests that the probabilities for growth cessation are reasonably set.

Seleznova et al. (2002) collected architectural data on 2-year-old branches of an unpruned *A. chinensis* vine and calculated probability distributions of different shoot types along the parent cane. Kiwifruit axillary shoot types were classified as short, medium and long (based on architectural analysis). Short and medium shoots produce only pre-formed leaves and are called terminated shoots, while long shoots are non-terminating and have leaves arising from neoformed primordia.

To demonstrate the capability of the model to produce the branching pattern observed by Seleznova et al. (2002) on 2-year-old branches of *A. chinensis*, a simulation of axillary shoot growth from an unpruned parent cane was performed. The difference from the previous simulation was that the number of nodes on the parent cane was much larger (80 nodes vs. 30 nodes for a pruned cane). This meant that, relative to the previous simulation, the vigour function,  $v(m)$ , had to account for the extra nodes, but otherwise the parameters were kept the same. Figure 8B gives the model output and corresponding data (Seleznova et al., 2002: fig. 12) for probability distributions of different axillary shoot types grown

from long parent canes of the *A. chinensis* vine. As in the previous simulation, the model parameters were set manually and the probability of budbreak along the parent cane was empirically set using a tabulated output of an HSMC model fitted to architectural data (Seleznova et al., 2002: fig. 12A).

*Influence of distance between sink and source*

Tombesi et al. (1993) investigated the effects of different source–sink ratios on fruit growth and quality by defoliating *A. deliciosa* vines with varying intensity. Four treatments were applied: shoots on two, four, eight and 16 canes from 28–30 canes per vine were defoliated over the growing season, starting 48 d after budbreak. To show the effect that source proximity has on fruit, they recorded the average fruit weight on the defoliated and undefoliated canes. The results showed a statistically significant difference in fruit weight between treatments with  $\geq 4$  defoliated canes and the undefoliated canes.

This defoliation treatment was simulated using the kiwifruit model. The same parameters were used as in the simulation of axillary shoot growth of the *A. deliciosa* vine, but axillary shoots on selected canes were defoliated 48 d after budbreak. Tombesi et al. (1993) did not report which canes were defoliated in their experiments, so, for this simulation, canes were chosen for defoliation starting at the apical end of each leader, i.e. for the first treatment (two canes per vine), the most distal canes from the main trunk on each leader were selected for defoliation. For the second treatment (four canes per vine), the very next cane following the most distal one on each leader was also selected for defoliation. In subsequent treatments (eight and 16 canes per vine), pairs of canes on opposite sides of a leader were selected for defoliation, always ensuring that one pair of undefoliated canes existed between defoliated canes.

Figure 9 shows the predicted average fruit carbon content for undefoliated and defoliated canes for all four treatments and for a vine without any defoliation. It shows both the model output and the observed data, which were estimated from the average fruit fresh weight reported by Tombesi et al. (1993). These estimates were calculated using a 15 % dry matter content found by Tombesi et al. (1993) (there were no significant differences in percentage dry matter between treatments) and a conversion factor of 45 % g C g<sup>-1</sup> dry weight. The model reproduces the considerable difference in fruit carbon content between the two types of canes, especially for high levels of defoliation.

*Competition for carbon reserves in shoot growth*

Early shoot growth in kiwifruit relies significantly on reserves, because carbon acquisition by leaves is insufficient at that stage (Greer et al., 2003). To test the sensitivity of shoot growth to reserves, Piller et al. (1998) performed girdling experiments on parent canes to manipulate the amount of resources available to the shoot. In one of the experiments, a single shoot was isolated within a girdled section of a parent cane 2 weeks after budbreak by removing all other shoots within the section. Three treatments were applied: a girdle 1, 30 or 100 cm away from the shoot towards the cane's base, with a 1 cm girdle beyond the shoot towards the cane's tip



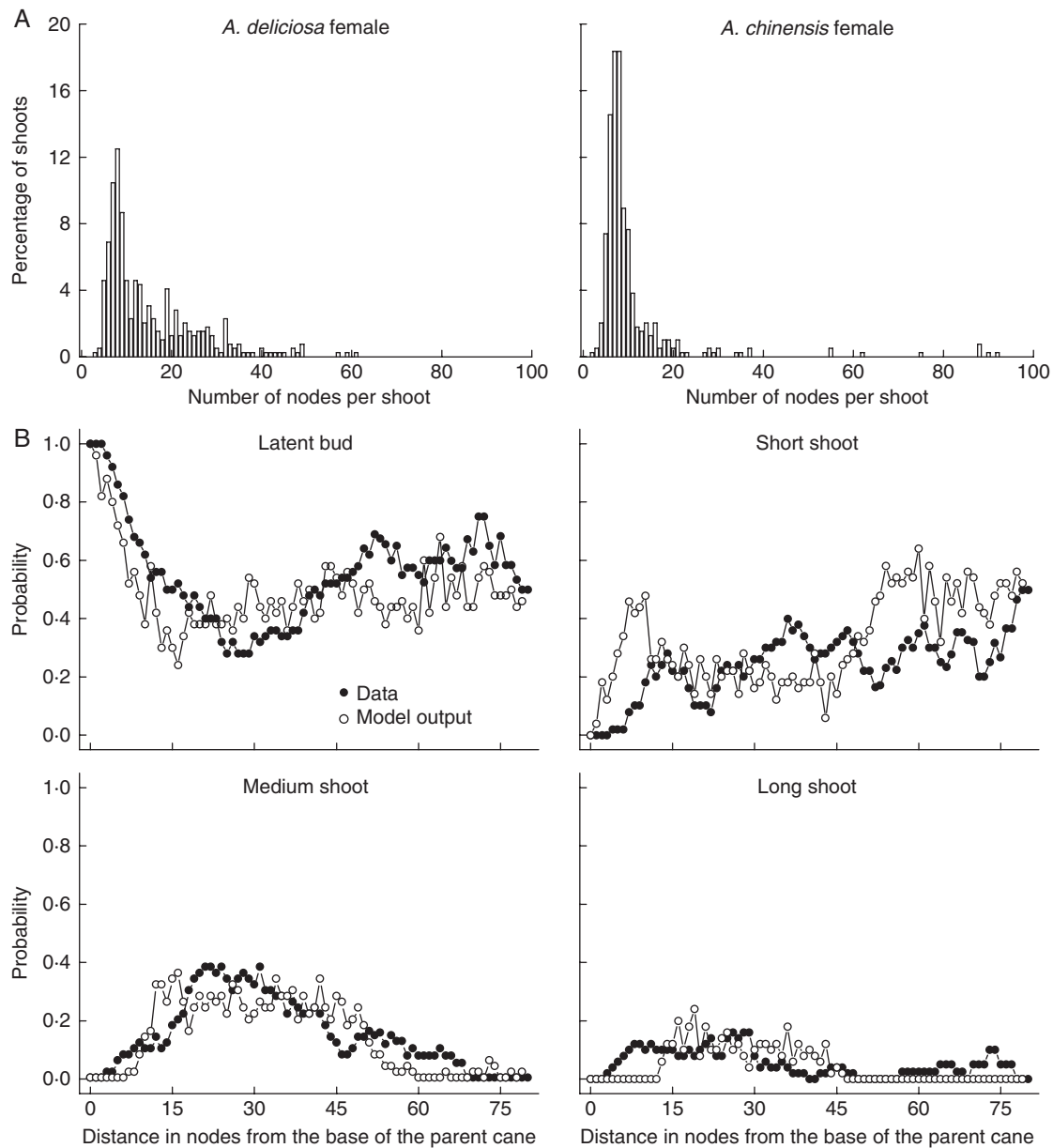


FIG. 8. Model output for simulation of the kiwifruit branching pattern: (A) the final node number distribution of shoots growing from 28 canes (each) of two different species of *Actinidia* vines, and (B) the probability distributions of axillary shoot types for long parent shoots of *A. chinensis*. In the latter, the filled symbols are from data (Seleznyova *et al.*, 2002) and open symbols are from model output.

in each case, resulting in 2, 31 and 101 cm total lengths of the girdled section of cane attached to the shoot. These experiments can be replicated using the kiwifruit model on a computer by simulating shoot growth from a girdled cane.

For each girdling treatment, 50 simulations of shoot growth were performed (see Fig. 10). The only difference between the three sets of simulations was the length of the parent cane, i.e. the amount of carbon available to a growing shoot was manipulated by changing the parent cane's length. Each shoot was assigned the same vigour, so the probability of growth cessation was only modulated by resource availability.

Figure 10 shows the distribution of node number per shoot generated from the simulations. For the 2 cm cane, the mean node number is  $5.92 \pm 0.2$  s.e. For the 31 cm cane, the

mean is  $18.18 \pm 2.9$ , and for the 101 cm cane the mean is  $27.76 \pm 2.4$ . Piller *et al.* (1998) reported that shoots with a 2 cm girdle section were significantly shorter than controls. The shoots in the 31 cm girdle section were not significantly different from controls, but the shoots in the 100 cm girdle section were longer and showed a significant increase in growth rates 8 weeks after budbreak. Although a direct comparison between shoot lengths from the data and node number distributions from the model is not feasible, qualitatively the model is able to simulate the effect of carbon reserves on shoot growth; growth is directly proportional to the amount of reserves available.

Greaves *et al.* (1999) investigated the effect of carbon reserve distribution in parent canes on axillary shoot growth.

TABLE 3. Statistical properties of final shoot node number distributions for two *Actinidia* species: *A. deliciosa* and *A. chinensis*

	<i>A. deliciosa</i>	<i>A. chinensis</i>
Data		
Mean $\pm$ s.e.	15 $\pm$ 0.6	11 $\pm$ 0.9
Maximum	56	97
Median	13	7
Model		
Mean $\pm$ s.e.	15.19 $\pm$ 0.52	10.77 $\pm$ 0.58
Maximum	61	92
Median	11	8

The mean with s.e., maximum and median number of nodes as reported by Snowball (1997) are given, and can be compared with model output.

One of their experiments showed how growth of adjacent shoots is affected during the time of reserve dependence (when net photosynthesis is smaller than supply from reserves). In this experiment, pairs of shoots were isolated by applying two girdling treatments to parent canes 1 week after budbreak. The two treatments differed by the location of the shoots in the girdled section: (1) central location, the shoots were in the middle of the cane (30 cm of cane on either side of the shoots); and (2) apical location, the shoots were located towards the apical end of the cane (54 cm of cane before the basal shoot and 6 cm after the apical shoot). They found that for both treatments the shoot nearest the apical end of the cane had significantly less growth than the basal shoot, with no significant effect resulting from the location of the pair (i.e. central or apical) within the girdled section.

The functional–structural kiwifruit vine model presented here was used to simulate this experiment as well. All the parameters were kept the same as in the previous simulation of individual shoot growth from a girdled cane. For this simulation two identical shoots were placed 15 cm apart on a 60 cm section of cane. The vigour of each shoot was set to the same value so that the only difference between the

shoots was the radius of the cane section it was growing from, i.e. the amount of locally available reserves. Canes were treated as a sequence of eight internodes with length set to 7.5 cm and radius set to 0.7 cm for the base internode, which reduced linearly to 0.05 cm for the last internode.

Figure 11 shows the amount of structural carbon in vegetative components of the two simulated shoots. On the centrally located shoot pair, growth of the apical shoot was slowed down by competition for reserves from the basal shoot. The simulation of an offset shoot pair showed a similar effect, but the difference was larger. Greaves *et al.* (1999) reported a significant difference in length of the shoot pair for both the centrally located and offset shoots, with the basal shoot being about 33 cm longer 20 d after girdling in both cases.

## DISCUSSION

A number of plant models are based on the ‘common pool theory’ (Buwalda, 1991; Letort *et al.*, 2008), which does not account for topological distances between sinks and sources of carbon. While useful for some purposes, the application of this theory is not always possible, as some studies have shown that topological distances play an important role in carbon allocation (Lacointe, 2000). In kiwifruit, for example, Tombesi *et al.* (1993) have shown the importance of source–sink distance for fruit weight, budbreak and flower differentiation when carbon availability is reduced. Moreover, studies indicate that early kiwifruit shoot development (before anthesis) is particularly sensitive to local carbon supply (Piller and Meekings, 1997), and there is a highly plastic developmental response to trophic competition in fruiting shoots (Greer *et al.*, 2003). Based on experimental data, Pallas *et al.* (2010) have shown the inadequacy of the common pool theory for modelling this type of plastic response in grapevine development, and suggested that a more suitable approach should include the topological distance between sources and sinks. Our model satisfies this requirement, and is suitable for modelling the types of responses seen in kiwifruit and grapevine.

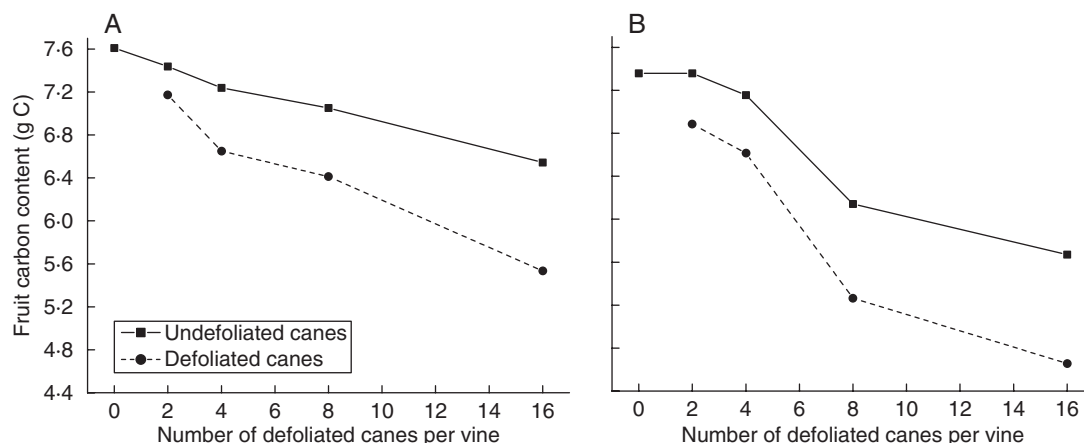


FIG. 9. (A) Model output for a simulation of defoliation treatments, showing the effect on fruit carbon content for defoliated and undefoliated canes, and (B) estimated average fruit carbon content for the experimental defoliation treatments by Tombesi *et al.* (1993), assuming 15 % dry matter and 45 % g C per g dry weight.

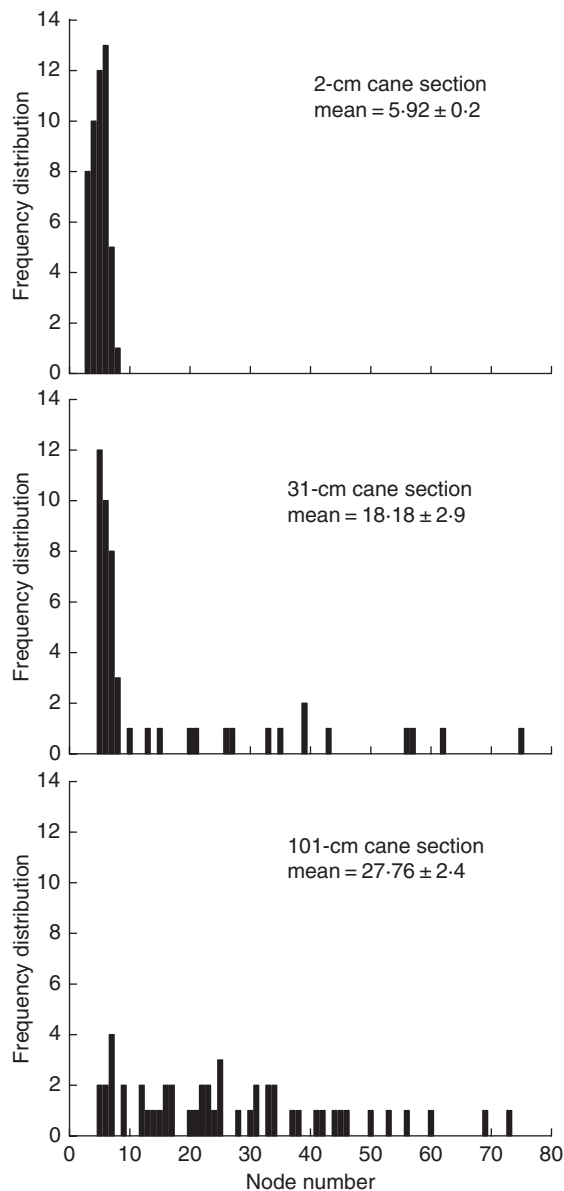


FIG. 10. The node number distribution for simulation of kiwifruit shoots grown under three cane-girdling treatments, with the mean number of nodes  $\pm$  s.e. For each simulation, a single shoot was grown within a girdled section of cane of length 2, 31 or 101 cm. From Cieslak *et al.* (2010), © 2010 IEEE.

#### Plasticity of kiwifruit architecture

A new aspect of the kiwifruit model is the inclusion of the plastic response of shoot growth cessation to local carbon supply. The model of shoot development was integrated with the carbon dynamics model to include effects of carbon availability on metamer production. This method is similar to the one used by Mathieu *et al.* (2008), except that, instead of a single variable (source–sink ratio) controlling production of all metamers on the plant, in the current model the fate of each apex is determined by carbon availability in its immediate vicinity. Owing to this method, simulations of shoots growing from three different levels of available reserves

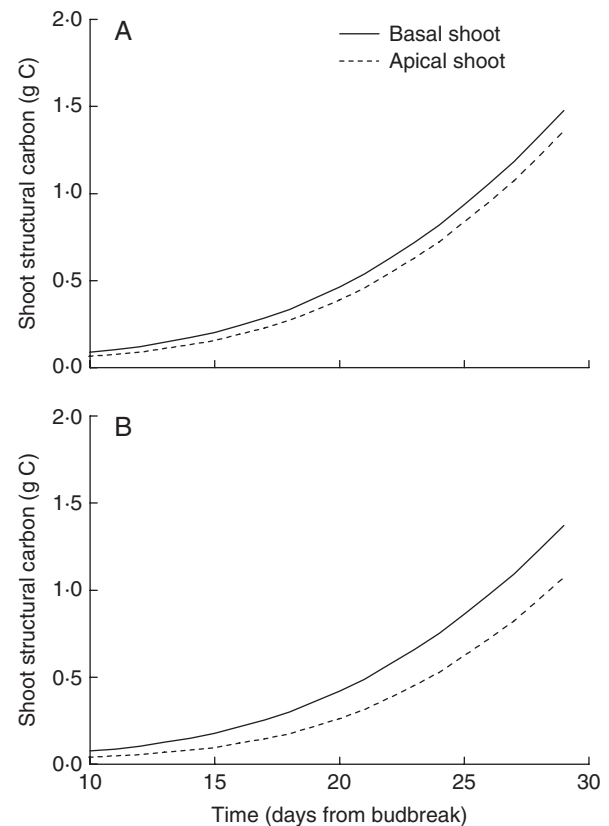


FIG. 11. Model output of the amount of structural carbon in vegetative components of a pair of identical shoots growing from a 60 cm long section of a girdled cane in two locations: (A) in the centre of the cane, and (B) offset to the apical end. In both cases, the shoots were 15 cm apart.

reproduced the expected response of shoots to local carbon supply. Thus, the model reproduces the effect of resource availability on shoot growth, and is capable of producing the observed patterns, such as those reported by Piller *et al.* (1998).

Another aspect of the model is the inclusion of the vine's architectural plasticity as determined by species. The branching pattern of the vine is an emergent property of the model, with the number of metamers on a shoot not pre-determined but resulting from the simulation. This is based on the assumption that branching pattern emerges from the overall vigour of the parent cane and the likelihood of shoot tip abortion during axillary bud outgrowth, which is species specific. Using this feature, the shoot growth of two female *Actinidia* vines was simulated by manually calibrating model parameters according to data collected by Snowball (1997: fig. 2) for the same species, resulting in a qualitatively similar final node number distribution. Simulated distributions of axillary shoot types along parent canes for *A. chinensis* were similar to those observed by Seleznyova *et al.* (2002). However, adjustment of the vigour function was required to improve representation of positional effects on branching. In the future, the architectural parameters could be modified to compare model output further with data for other *Actinidia* species (Snowball, 1997; Foster *et al.*, 2007) or for effects of rootstocks on shoot growth (Clearwater *et al.*, 2006).

In this kiwifruit vine model, the fate of an axillary shoot (whether it remains dormant, or develops into a short, medium or long shoot) is captured at the individual shoot level by modelling the physical state of the shoot apical meristem, so the distributions of different shoot types along the parent cane and node number distributions for axillary shoots are emergent properties of the model. The model differs from that of the peach tree model, L-PEACH (Lopez *et al.*, 2008), and the apple tree model, MAppleT (Costes *et al.*, 2008), where the branching patterns are modelled at a parent shoot level by specifying branching zones along the parent shoots based on experimental data, resulting in the fates of axillary shoots being largely pre-determined by the branching zones they belong to. This approach would be too restrictive for modelling shoot growth in kiwifruit, because axillary bud fate is highly plastic and depends on environmental conditions and horticultural manipulations (Clearwater *et al.*, 2006; Foster *et al.*, 2007).

#### *Effects of horticultural manipulation*

Orchard management practices for improving fruit size and quality may involve changing the leaf–fruit ratio on the vine by optimizing leaf distribution and fruit exposure (Tombesi *et al.*, 1993). The effects of reduced carbon availability and topological distance, however, incur limits on these sink–source manipulations. The experimental result of Tombesi *et al.* (1993) showed the limitations of this management practice; when carbon availability in the vine is low, sinks, such as fruit, take advantage of proximity to sources. In the model presented here, this effect was taken into account through the use of a transport resistance model of carbon allocation (C-TRAM), and the model was able to reproduce the reduction in fruit size as observed by Tombesi *et al.* (1993: fig. 1) for whole cane defoliation treatments (Fig. 9). Even with the limited knowledge of the mechanisms underlying transport resistance in plants, our basic assumption that carbon flow through an internode is modulated by the length and surface area of this internode was enough to reproduce the effect of source proximity on fruit size. Being able to reproduce this kind of result demonstrates the model's capability to increase our understanding of transport resistance between sink and source, and to simulate some vine management practices.

Although only the effects of distance on major sinks, under reduced carbon availability, were considered in the present model, other sinks, such as buds during flower evocation, are also affected by distance to sources during competition for carbon (Tombesi *et al.*, 1993). Including this effect in the model will be important for further study of management practices over multiple years, since it means a possible reduction in flowers for next season's growth.

#### *Sink competition*

The kiwifruit vine model uses a mechanistic approach to modelling sink competition and growth under resource limitation. It is general enough to take into account non-linear growth responses to temperature and carbon availability, and organ growth rates for vegetative components of the vine are specified without final sizes. Some models are based on the

proportional allocation of resources to sinks independent of the level of availability (Buwalda, 1991; Letort *et al.*, 2008); however, experimental data suggest this is not always the case, as there is a hierarchy of sinks based on competitive ability to attract limited resources (Wardlaw, 1990; Minchin *et al.*, 1993). Our model is capable of capturing the complex behaviour of sink competition for carbon, because the fraction of carbon allocated to a sink depends on its type and the carbon concentration outside the sink at its point of attachment to the transport pathway.

Due to this approach, the simulation of competition for carbon reserves between adjacent shoots (Fig. 11) showed the capability of the model to produce the observed difference in the growth rate of the two shoots (Greaves *et al.*, 1999: table 2), but, it predicted a larger difference in structural carbon for the shoot pair located towards the apical end of the cane. A simulation model that Greaves *et al.* (1999) created to investigate the importance of carbon reserve distribution in a single cane on axillary shoot growth similarly predicted a larger difference in the shoot pair located at the apical end of the cane. There was a suggestion from their data that a larger difference does occur, though a more thorough experiment would need to be done to confirm this (Greaves *et al.*, 1999).

#### *Internode secondary growth*

An additional feature of the current model, which was not illustrated in this paper, is the mechanistic approach to modelling internode thickening. Secondary growth of internodes is often represented using the pipe model (Shinozaki *et al.*, 1964) as a teleonomic approach (Thornley, 1999). In the alternative model used here, long-term secondary growth is based on an absolute growth rate proportional to internode surface area [similar to the model of Deleuze and Houllier (1997) and to the model of Thornley (1999)]. This is a mechanistic approach because only the local carbon supply and intrinsic properties of each internode define secondary growth.

#### *Conclusions and future work*

The functional–structural kiwifruit vine model described herein has been successful in integrating existing knowledge on the architecture and carbon dynamics of a managed and mature vine with effects of the environment. As illustrated by several simulations, it is able to simulate vine growth responses qualitatively similar to those observed in biological experiments, demonstrating its ability to mimic features of the vine's growth and function. Our approach was to formulate mechanistic hypotheses for modelling growth at an organ level that would lead to output consistent with biological data at the plant level. This resulted in a model that is primed for calibration and quantitative evaluation, meeting our objectives of developing a robust kiwifruit vine model that allows for *in silico* experiments testing our hypotheses of the behaviour of the real plant. In the long term, the model will help in finding and testing new horticultural management techniques, especially for new cultivars where the



techniques have not yet been established and the genotype growth habit may be largely unknown.

At this stage the model parameters were set manually, but, in the future, the model needs to be calibrated with appropriate data and evaluated against existing experimental results. Such data will come from experiments similar to those performed by Minchin *et al.* (2010) on sink behaviour during limited carbon supply. Then, the model will be used for identifying knowledge gaps and designing experiments for obtaining the data essential for further model calibration and for performing a sensitivity analysis. Once the kiwifruit vine model is calibrated, it will be studied in a systematic manner by simulating the kiwifruit vine's development, and performing experiments that predict the behaviour of the system under the influence of various parameters.

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