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# LETTER

# Balancing the costs of carbon gain and water transport: testing a new theoretical framework for plant functional ecology

# Abstract

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\*Correspondence: E-mail: colin.prentice@mq.edu.au A novel framework is presented for the analysis of ecophysiological field measurements and modelling. The hypothesis 'leaves minimise the summed unit costs of transpiration and carboxylation' predicts leaf-internal/ambient CO<sub>2</sub> ratios ( $c_i/c_a$ ) and slopes of maximum carboxylation rate ( $V_{cmax}$ ) or leaf nitrogen ( $N_{area}$ ) vs. stomatal conductance. Analysis of data on woody species from contrasting climates (cold-hot, dry-wet) yielded steeper slopes and lower mean  $c_i/c_a$  ratios at the dry or cold sites than at the wet or hot sites. High atmospheric vapour pressure deficit implies low  $c_i/c_a$  in dry climates. High water viscosity (more costly transport) and low photorespiration (less costly photosynthesis) imply low  $c_i/c_a$  in cold climates. Observed site-mean  $c_i/c_a$  shifts are predicted quantitatively for temperature contrasts (by photorespiration plus viscosity effects) and approximately for aridity contrasts. The theory explains the dependency of  $c_i/c_a$  ratios on temperature and vapour pressure deficit, and observed relationships of leaf  $\delta^{13}$ C and  $N_{area}$  to aridity.

# Keywords

Aridity, nitrogen, optimality, photosynthesis, plant functional traits, stable isotopes, stomatal conductance, temperature, transpiration, viscosity.

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# INTRODUCTION

Optimisation by natural selection is a powerful concept for generating testable hypotheses about organismal traits and their relationships to the environment (Givnish 1986; Mäkelä *et al.* 2002). We explore the consequences of a simple optimality criterion that provides a unifying explanation for the following observations on plants, all strongly supported in the literature:

• The relative conservatism of the ratio between leaf-internal  $(c_i)$  and ambient  $(c_a)$  mole fractions of CO<sub>2</sub> (Wong *et al.* 1979; Ehleringer & Cerling 1995). The ratio tends to vary by only about  $\pm 30\%$  (rates of gas exchange can vary through two orders of magnitude), and to be constant under variation of  $c_a$ , light and nutrient supply. This conservatism signifies tight regulation of the balance between carbon gain and water loss. We introduce the symbol  $\chi = c_i/c_a$  to simplify the notation later on.

• The decline of  $\chi$  with vapour pressure deficit (*D*). Previously assigned various mathematical forms (Leuning 1990; Oren *et al.* 1999; Medlyn *et al.* 2011), this decline is well described by  $\chi = \xi/(\xi + \sqrt{D})$  where  $\xi$  is a parameter related to the 'carbon cost of water' (Medlyn *et al.* 2011). Medlyn *et al.* (2011) refer to this parameter as  $g_1$ .

• The tendency demonstrated in many transect studies for the stable carbon isotope signature ( $\delta^{13}$ C) in the leaves of C<sub>3</sub> plants – a proxy for time-averaged values of  $\chi$  – to become less negative, indicating lower  $\chi$ , with increasing aridity (Stewart *et al.* 1995; Miller *et al.* 2001; Zheng & Shangguan 2007; Prentice *et al.* 2011).

• The tendency of leaf N per unit area  $(N_{\text{area}})$  in all plants to increase from wet to dry climates (Wright *et al.* 2003,

2005), implying that  $N_{\text{area}}$  increases as  $\chi$  declines (Prentice *et al.* 2011).

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A general microeconomic optimisation criterion concerns investments in two or more resources required to manufacture a product. Here, the product is photosynthate, and the resources are the photosynthetic apparatus (with costs assumed proportional to Rubisco carboxylation capacity, V<sub>cmax</sub>, at a standard temperature, and approximately proportional to  $N_{\text{area}}$ ) and the transpiration pathway (with costs assumed proportional to the maximal transpiration rate, E). Wright et al. (2003) proposed the existence of an optimum rate of investment in transpiration and photosynthetic capacity, dependent on the ratio of their costs, which would achieve a given rate of net assimilation at least total cost. This analogy requires that the resources are substitutable, e.g. that plants can compensate for high water costs in dry climates by keeping stomata relatively closed while increasing investment in photosynthetic capacity, maintaining a given level of carbon assimilation at reduced  $c_i$ . Wright *et al.* (2001) noted that this form of resource substitution constitutes a widespread, previously overlooked mechanism of drought tolerance in plants.

Wright *et al.* (2003) considered carbon assimilation as proportional to the product of two inputs, conceptualised as water and nitrogen. We extend their reasoning to make quantitative predictions of trade-offs between photosynthetic and water-transport parameters from the standard model of  $C_3$  photosynthesis (Farquhar *et al.* 1980) combined with plant water-relations theory. We use a graphical approach analogous to Wright *et al.* (2003) to analyse field data on photosynthesis, stomatal conductance and leaf traits from species in contrasting climates.

Cowan & Farguhar (1977) introduced an optimisation hypothesis for stomatal behaviour. Their hypothesis is equivalent to maximising  $(A - \lambda E)$  where A is net carbon assimilation and  $\lambda$  is an 'exchange rate' between carbon and water. Biochemical properties of leaves, and hydraulic properties of stems, were assumed fixed over the time scale of interest (principally the diurnal cycle), although  $\lambda$  could vary more slowly. The general solution to this optimisation is complex (Arneth et al. 2002; Konrad et al. 2008; Katul et al. 2010); tractable approximations have been proposed (Katul et al. 2010; Medlyn et al. 2011). However, as noted in a pioneering analysis by Givnish (1986), the Cowan-Farguhar optimality hypothesis is incomplete because it does not account for the (competing) costs of maintaining both water flow and photosynthetic capacity. Following Wright et al. (2003), we propose an optimal balance of investments in both functions. Remarkably, we predict a relationship between  $\gamma$  and D mathematically identical to that of Medlyn et al. (2011). But its single parameter (here called  $\xi$ ) has a subtly different interpretation, based on the *relative* costs of maintaining a transpiration pathway capable of delivering water at a rate E, and leaf proteins capable of delivering photosynthate at a rate  $V_{\rm cmax}$ . These costs can be expressed in terms of traits, and are expected to vary across environments. We examine how relationships among  $V_{\rm cmax}$ ,  $N_{\rm area}$  and  $g_{\rm s}$  vary across environments, and provide a coherent, quantitative interpretation of these variations.

# MATERIALS AND METHODS

#### Data

Data were field measurements on all abundant woody dicots (trees if present, and shrubs) at four sites in eastern Australia (Table 1). Latitude ranges from 18°S to 42°S; mean annual temperatures (MAT) from 10.4 and 22.6 °C; longitude over 5° (coastal to interior) and mean annual precipitation (MAP) from 396 to 1133 mm. The sites were paired as follows. A 'cold' high-latitude site in Tasmania was contrasted with a 'hot' low-latitude site in Queensland. The Queensland site has higher rainfall but similar climatic moisture index  $MI = P/E_q$ , where P is MAP and  $E_q$  is equilibrium evapotranspiration (calculated as in Gallego-Sala *et al.* 2010. See Appendix S1 for definitions of hydroclimatic variables). At intermediate latitudes, in New South Wales, a 'wet' coastal site was contrasted with a 'dry' inland site. These sites have intermedi-

ate temperature (MAT 17 to  $18^{\circ}$ C) between the cold and hot sites; but the wet site has a much higher *MI*, and the dry site a much lower *MI*, than either the cold or the hot site.

Net photosynthesis  $(A_{sat})$  and stomatal conductance  $(g_s)$  were measured simultaneously in the field at saturating light intensity (800 to 1500  $\mu$ mol m<sup>-1</sup> s<sup>-1</sup>, depending on the ambient light intensity) and temperatures close to ambient, using either a LiCor 6400 (Tasmania, Queensland) or a CIRAS-1 PP (New South Wales) infra-red gas analysis system. Measurements were made on freshly cut, sun-exposed branches. Fieldwork was scheduled so that ambient temperatures were similar regardless of site. CO<sub>2</sub> concentration, vapour pressure deficit and measurement temperatures were held within narrow ranges (388-402 ppm, 1.8-2.1 kPa, 23.0-27.0 °C). Four to seven replicate measurements per species were made, on different individuals. Leaf samples were analysed for specific leaf area (SLA), N by mass (converted to  $N_{\text{area}}$  using SLA) and  $\delta^{13}$ C. Carboxylation capacity at 25 °C (V<sub>cmax</sub>[25]) was calculated using the Farquhar et al. (1980) model, assuming that Asat is Rubisco-limited (Kattge et al. 2009) and applying the temperature dependency of V<sub>cmax</sub> from Bernacchi et al. (2003, 2009). Day respiration was estimated by  $R_d = 0.01 V_{\text{cmax}}$ .  $V_{\text{cmax}}[25]$  is expected to be more closely related to nitrogen investment than  $V_{\rm cmax}$  at ambient temperature, but the differences were slight because measurement temperatures were close (within  $\pm 2^{\circ}$ ) to 25 °C.

*MI* (Table 1) is used as an (inverse) index of general climatic aridity. Note that lower *P* and/or higher  $E_q$  both imply increasing limitation on ecosystem-level evapotranspiration,  $E_a$ , which in turn is a principal driver of *D* on large spatial and temporal scales (McNaughton & Jarvis 1991; Raupach 2000). An alternative measure of climatic aridity is the Cramer-Prentice  $\alpha$  (Table 1), a standardised estimate of  $E_a/E_q$  (Gallego-Sala *et al.* 2010).  $\alpha$  is related to *MI* by the Budyko framework for water *vs.* energy controls of catchment water balance (Wang *et al.* 2012). For quantitative analysis of aridity effects on  $\chi$ , we use  $\Delta E = E_q - E_a = E_q (1 - \alpha)$  as a proxy for the long-term effective value of *D*. Appendix S1 explains the rationale for our choice of hydroclimatic variables, and the relationships among them.

#### Graphical and statistical analyses

All species sampled were included except two  $C_4$  species (*Atriplex stipitata* and *Triodia scariosa*) and two species of *Exocarpus* (*E. aphyllus* and *E. cupressiformis*). The latter are

**Table 1** Site locations and climates: mean annual precipitation (MAP); mean annual temperature (MAT); and moisture index (MI), Cramer-Prentice  $\alpha$ , equilibrium evapotranspiration (E<sub>q</sub>) and incident photosynthetically active radiation during the growing season (PAR<sub>0</sub>) all based on annual mean climate values and calculated as in Gallego-Sala *et al.* (2010). Primary data (monthly means of precipitation, temperature and incident shortwave radiation) were obtained from ANU climatologies at 0.05° resolution (M. Hutchinson, personal communication 2012) for 1970–2010

Sites	Location	MAP (mm)	MAT(° C)	MI	α	E <sub>q</sub> (mm)	$PAR_0 \pmod{m^{-2}}$
'cold'	42.387°S 147.048°E	540	10.4	0.68	0.72	799	9484
'hot'	18.295°S 145.492°E	1066	21.6	0.70	0.64	1515	13869
'wet'	33.680°S 151.148°E	1133	17.3	1.00	0.92	1138	11604
'dry'	32.976°S 146.156E	396	17.9	0.31	0.36	1289	11487

leafless, with photosynthetic stems, and were extreme outliers in the relationship between  $V_{\rm cmax}[25]$  and  $N_{\rm area}$ . The analysis included 14 species from the cold site, 17 from the hot site, and 35 each from the wet and the dry site (Table 2). Twentysix species were classified as N-fixers based on available information. This category consists mainly of Fabaceae but also includes two actinorhizal *Allocasuarina* species and one cycad (*Macrozamia communis*), which has a cyanobacterial symbiont.

Relationships examined (within and across sites) were  $V_{\rm cmax}[25] vs. N_{\rm area}, V_{\rm cmax}$  and  $N_{\rm area} vs. g_{\rm s}$ , the normalised values  $V_{\rm cmax}/A_{\rm sat}$  and  $N_{\rm area}/A_{\rm sat}$  vs.  $g_{\rm s}/A_{\rm sat}$  (the rationale for these comparisons is described below),  $\delta^{13}C vs. \chi$ ,  $N_{\rm area} vs. \delta^{13}C$ , and  $N_{\rm area}$  and  $\delta^{13}C vs.$  MI. All  $g_{\rm s}$  values are given as conductances to CO<sub>2</sub>. Statistical analyses were carried out using SMATR, which fits standardised major axis slopes – suitable when the choice of the 'x' or 'y' variable is not predetermined (Warton *et al.* 2006). Non-significant intercepts were set to zero.

#### Hypothesis and approach

We hypothesised that plants minimise  $Cost = a.E/A + b.V_{cmax}/A$  where *a* is the (carbon) cost of maintaining the transpiration stream required to support assimilation at a rate *A* under normal daytime conditions, and *b* is the cost of maintaining photosynthetic proteins at the level required to support assimilation at the same rate.  $V_{cmax}$ , *E* and *A* here are molar flux densities (mol CO<sub>2</sub> or H<sub>2</sub>O per unit leaf area and time). Note that whereas both *E* and *A* can vary rapidly (minutes), *Cost* expresses the maintenance requirements for the *capacities* for maximum rates of transpiration and photosynthesis. These vary much less rapidly (weeks to months).

Previous analyses have often focused on predicting  $g_s$ , but it is conceptually simpler to predict  $\chi$ . The two are related by Fick's law,  $g_s = (A/c_a)/(1 - \chi)$ . a.E/A and  $b.V_{cmax}/A$  represent the 'unit costs' of transpiration and carboxylation respectively. They respond in opposite ways to a change in  $\chi$ , leading as we will show to the existence of a minimum in *Cost* that depends on the relative magnitudes of *a* and *b*.

### THEORETICAL ANALYSIS

### Principles

A value of  $\chi$  that satisfies the optimisation criterion ( $\chi_o$ ) must satisfy the following:

$$a.\partial(E/A)/\partial\chi + b.(V_{cmax}/A)/\partial\chi = 0 \tag{1}$$

Given that  $E = 1.6g_s D$  and  $A = g_s c_a(1 - \chi)$ , and assuming that  $A >> R_d$  (day respiration) and  $c_i >> \Gamma^*$  (the photorespiratory compensation point), it is shown below that the optimum is obtained for  $\chi = \chi_o$  where

$$\chi_o = \xi / (\xi + \sqrt{D}) \tag{2}$$

and  $\xi = \sqrt{(bK/1.6a)}$ , where K is the Michaelis–Menten coefficient for Rubisco-limited photosynthesis at a pO<sub>2</sub> of 21 kPa.

By applying Fick's law to both transpiration and assimilation, we obtain

$$E/A = 1.6(D/c_a)/(1-\chi)$$
(3)

and from Farquhar et al. (1980) for Rubisco-limited photo-synthesis,

$$V_{cmax}/A = (\chi + K/c_a)/\chi \tag{4}$$

The derivatives are

$$\partial(E/A)/\partial\chi = 1.6(D/c_a)/(1-\chi)^2$$
(5)

and

$$\partial (V_{cmax}/A)/\partial \chi = -K/\chi^2 c_a.$$
(6)

Therefore, if eqn (1) holds then

$$1.6(aD/c_a)/(1-\chi)^2 = bK/\chi^2 c_a$$
(7)

which on re-arrangement yields eqn (2). The turning point is a minimum, as both second derivatives are positive.

This simple derivation, to our knowledge, has not been published before. Relaxing the assumption that  $c_i \gg \Gamma^*$  yields a small correction to eqn (2):

$$\chi_o = \Gamma^* / c_a + (1 - \Gamma^* / c_a) \xi / (\xi + \sqrt{D})$$
(8)

where  $\xi = \sqrt{[b(\mathbf{K} + \Gamma^*)/1.6a]}$ . This solution should be more accurate than eqn (2) at low  $c_i$ . For simplicity, however, we use eqn (2) henceforward.

# The interpretation of costs

Various predictions follow from eqn (2) by equating the cost of photosynthesis with the respiration required to maintain carboxylation capacity, and the cost of transpiration with the respiration required to maintain the transpiration pathway, over a timeframe of months to years and potentially including more and less favourable periods for growth. For simplicity we consider only these maintenance costs. We do not consider root costs, assumed to be common to both functions.

We can then express b as the ratio of total (24-h) leaf maintenance respiration to  $V_{\rm cmax}$ . This is probably a relatively conservative quantity (Reich *et al.* 1998) but it will be several times larger than the ratio  $R_d/V_{\rm cmax}$  measured during daytime, because mitochondrial respiration continues in the dark, and is partly inhibited in the light.

We can also relate the carbon cost of transpiration to E. Neglecting capacitance and gravitational effects, E equals the rate of flow of water through the stem according to Darcy's law (Whitehead 1998):

$$E = v_{H.} \Delta \Psi k_s \rho_w / \eta h \tag{9}$$

where  $v_H$  is the Huber value (the ratio of sapwood area to the leaf area it supplies),  $\Delta \Psi$  (Pa) the typical daytime water potential difference between the soil and the leaf,  $k_s$  (m<sup>2</sup>) sapwood permeability (a wood property independent of the properties of water: see Reid *et al.* 2005 for definitions),  $\rho_w$  (mol m<sup>-3</sup>) the density of water,  $\eta$  (Pa s) the viscosity of water, and h (m) the mean path length (approximately the mean

## Table 2 Species analysed

Sites	Genus_species	Family	Nitrogen- fixing specie
'Cold'	Acacia dealbata	Mimosaceae	Yes
	Aotus ericoides	Fabaceae	Yes
	Banksia marginata	Proteaceae	No
	Bossiaea cinerea	Fabaceae	Yes
	Cassinia aculeata	Asteraceae	No
	Daviesia latifolia	Fabaceae	Yes
	Epacris impressa	Epacridaceae	No
	Eucalyptus pauciflora	Myrtaceae	No
	Eucalyptus rubida	Myrtaceae	No
	Eucalyptus tenuiramis	Myrtaceae	No
	Leucopogon ericoides	Epacridaceae	No
	Leucopogon virgatus	Epacridaceae Proteaceae	No No
	Persoonia juniperina		
Hot'	Pultenaea juniperina Acacia flavescens	Fabaceae	Yes Yes
пог		Mimosaceae Mimosaceae	Yes
	Acacia leptostachya Allocasuarina torulosa	Casuarinaceae	Yes
	Bursaria incana		No
		Pittosporaceae	No
	Corymbia citriodora Corymbia intermedia	Myrtaceae	No
	-	Myrtaceae	No
	Corymbia trachyphloia Eucalyptus portuensis	Myrtaceae Myrtaceae	No
	Gastrolobium	Fabaceae	Yes
	grandiflorum	Fabaceae	1 68
	Grevillea glauca	Proteaceae	No
	Grevillea parallela	Proteaceae	No
	Lophostemon	Myrtaceae	No
	suaveolens	Wryntaccac	110
	Persoonia falcata	Proteaceae	No
	Petalostigma pubescens	Picrodendraceae	No
	Planchonia careya	Lecythidaceae	No
	Pogonolobus reticulatus	Rubiaceae	No
	Xylomelum scottianum	Proteaceae	No
Wet'	Acacia floribunda	Fabaceae	Yes
Wet	Astrotricha floccosa	Araliaceae	No
	Correa reflexa	Rutaceae	No
	Dodonaea triquetra	Sapindaceae	No
	Eucalyptus paniculata	Myrtaceae	No
	Eucalyptus umbra	Myrtaceae	No
	Lasiopetalum	Malvaceae	No
	ferrugineum		110
	Leptospermum	Myrtaceae	No
	polygalifolium		
	Lomatia silaifolia	Proteaceae	No
	Macrozamia communis	Zamiaceae	Yes
	Persoonia linearis	Proteaceae	No
	Pomaderris ferruginea	Rhamnaceae	No
	Pultenaea daphnoides	Fabaceae	Yes
	Pultenaea flexilis	Fabaceae	Yes
	Syncarpia glomulifera	Myrtaceae	No
	Synoum glandulosum	Meliaceae	No
	Xylomelum pyriforme	Proteaceae	No
	Allocasuarina sp	Casuarinaceae	Yes
	Acacia suaveolens	Fabaceae	Yes
	Banksia marginata	Proteaceae	No
	Boronia ledifolia	Rutaceae	No
	Corymbia gummifera	Myrtaceae	No
	Eriostemon australasius	Rutaceae	No
	Eucalyptus haemostoma	Myrtaceae	No
	Gompholobium	Fabaceae	Yes
	glabratum		

#### Table 2 (continued)

Sites	Genus species	Family	Nitrogen- fixing specie
'Wet'		-	
wei	Grevillea buxifolia	Proteaceae	No No
	Grevillea speciosa	Proteaceae Proteaceae	No
	Hakea dactyloides		No
	Hakea teretifolia	Proteaceae	110
	Hibbertia bracteata	Dilleniaceae	No
	Lambertia formosa	Proteaceae	No
	Leptospermum trinervium	Myrtaceae	No
	Persoonia levis	Proteaceae	No
	Phyllota phylicoides	Fabaceae	Yes
	Pimelea linifolia	Thymelaeaceae	No
Dry'	Acacia doratoxylon	Fabaceae	Yes
	Acacia oswaldii	Fabaceae	Yes
	Callitris glaucophylla	Cupressaceae	No
	Dodonaea viscosa ssp angustissima	Sapindaceae	No
	Dodonaea viscosa ssp cuneata	Sapindaceae	No
	Dodonaea viscosa ssp spatulata	Sapindaceae	No
	Eremophila mitchelli	Myoporaceae	No
	Eucalyptus intertexta	Myrtaceae	No
	Geijera parviflora	Rutaceae	No
	Hakea tephrosperma	Proteaceae	No
	Pimelea microcephala	Thymelaeaceae	No
	Senna artemisioides var 11ft	Fabaceae	Yes
	Senna artemisioides var 3lft	Fabaceae	Yes
	Solanum ferocissium	Solanaceae	No
	Spartothamnella puberula	Lamiaceae	No
	Acacia colletioides	Fabaceae	Yes
	Acacia havilandiorum	Fabaceae	Yes
	Acacia wilhelmiana	Fabaceae	Yes
	Bertya cunninghamii	Euphorbiaceae	No
	Beyeria opaca	Euphorbiaceae	No
	Brachychiton populneus	Malvaceae	No
	Cassinia laevis	Asteraceae	No
	Eremophila deserti	Myoporaceae	No
	Eremophila glabra	Myoporaceae	No
	Eucalyptus dumosa	Myrtaceae	No
	•	Myrtaceae	No
	Eucalyptus socialis	Fabaceae	Yes
	Eutaxia microphylla Grevillea anethifolia		No
		Proteaceae	
	Melaleuca uncinata	Myrtaceae	No
	Micromyrtus sessilis	Myrtaceae	No
	Olearia decurrens	Asteraceae	No
	Olearia pimelioides	Asteraceae	No
	Philotheca difformis	Rutaceae	No
	Santalum acuminatum	Santalaceae	No
	Bossiaea walkeri	Fabaceae	Yes

Two C4 species (Atriplex stipitata and Triodia scariosa) and two species of Exocarpus (E. aphyllus and E. cupressiformis) were excluded from the analysis.

foliage height). The Huber value enters here because Darcy's law describes total water flow through a stem of given area, whereas transpiration is expressed as the water flow per unit leaf area. The leaf-specific maintenance respiration cost of the sapwood, assuming a paraboloid stem, is

$$R_s = v_H r_s h \rho_s / 2 \tag{10}$$

where  $r_s$  is the sapwood specific respiration rate (s<sup>-1</sup>) and  $\rho_s$ (mol m<sup>-3</sup>) sapwood density. The maintenance cost of sapwood per unit transpiration is given by the following:

$$a = R_s / E = r_s h^2 \rho_s \eta / 2\Delta \Psi k_s \rho_w \tag{11}$$

This expression does not allow for the effect of the tapering of xylem elements, which would result in  $k_s$  decreasing with height and potentially reduce the dependence of *a* on height from quadratic to linear: see Becker *et al.* (2000), McCulloh *et al.* (2003, 2009).

#### Key implications of the theory

Equation (2) describes a dependence of  $\chi_o$  on aridity through D. Other things being equal, a drier atmosphere implies a lower  $\chi_o$  – because high D increases water flow through the plant, with no benefit in carbon gain. At very high D some plants show a decline in water flow, but this is necessarily accompanied by a further reduction in  $\chi$ . Thus, we predict that  $\chi$  should increase with *MI*, if temperature is held constant. (Temperature effects are considered below.) Equation (11) further suggests how plants in dry environments might counter this direct effect of aridity by lowering a, thereby increasing  $\xi$ . These include reduced height, and maintaining a constant  $\Delta \Psi$  even at low soil water potential; both of which can be considered adaptations to drought.

Equations (2) and (11) also imply responses of  $\xi$  to temperature. K in eqn (2) increases steeply with temperature (Bernacchi et al. 2009), from 196 ppm at 10 °C to 1094 ppm at 30 °C. Other things being equal, this effect should lead to increased  $\chi_{0}$ at higher temperature. Among the terms contributing to a, it is unlikely that the specific respiration rate of sapwood  $(r_s)$  over the growing season would be greater in a warmer environment, because of the ubiquitous thermal acclimation of basal respiration rates (Atkin & Tjoelker 2003). The term in eqn (11) expected to change most steeply with temperature is the viscosity of water ( $\eta$ ) (Roderick & Berry 2001), 1.31 mPa s at 10 °C but only 0.798 mPa s at 30 °C. This response should increase  $\xi$ , and thereby increase  $\chi_o$ , with increasing temperature. Thus, the temperature dependencies of both K and  $\eta$  lead to the prediction that  $\chi$  should increase with temperature, if MI is held constant.

# Graphical representations of data

Using  $N_{\text{area}}$  as an index of investment in photosynthetic capacity and  $g_s$  for water transport, Wright *et al.* (2003) observed that isopleths of *A* in  $N_{\text{area}}$ - $g_s$  space would be hyperbolas; and that for any pair of cost values for water and N, the least-cost investment strategy would be where the tangent to the curve has a slope equal to the ratio of these costs. This prediction was supported by field measurements from sites differing in aridity. Within a site, different species showed widely ranging values of  $N_{\text{area}}$  and  $g_s$  that nevertheless fell around a line corresponding to proportionality. The slope of this line was greater in drier sites, as expected when investment in water becomes more costly relative to investment in N.

The analogous representation in the Farquhar *et al.* (1980) model framework is in  $V_{\text{cmax}}$ - $g_s$  space. Using the eqn for Rubisco-limited photosynthesis together with Fick's law, it can be shown that the constant of proportionality between  $V_{\text{cmax}}$  and

 $g_s$  is a function only of  $\chi$ ,  $c_a$  and K; and that for any given value of K, if both  $V_{cmax}$  and  $g_s$  are normalised by A (hereafter V and G), then the relationship between them collapses to a *single* hyperbola (see Appendix S2). The optimality theory above predicts *steeper slopes* of  $V_{cmax}$  with respect to  $g_s$ , and *higher values of* V (with correspondingly lower values of G) as the costs of transpiration increase relative to those of photosynthesis.

## Sensitivity coefficients

Sensitivity coefficients (*S*) for  $\chi_o$  with respect to different variables can be obtained by differentiation of eqn (2). Sensitivity coefficients represent the ratio of fractional change in one variable (here  $\chi_o$ ) to fractional change in another variable (*x*):  $S = (x/\chi_o) \ \partial \chi_o / \partial x$ . For an increment  $\Delta x$  with respect to a reference value *x*, the increment  $\Delta \chi_o$  with respect to the corresponding reference value  $\chi_o$  can be approximated by

$$\Delta \chi_o \approx S(\chi_o/x) \Delta x \tag{12}$$

The sensitivity coefficients are  $-(1 - \chi_o)/2$  for *a* and *D*, and  $(1 - \chi_o)/2$  for *b* and *K*. This approach makes it possible to predict effects of *relative* changes in factors affecting any of the terms influencing  $\chi_o$ , without knowing their absolute values.

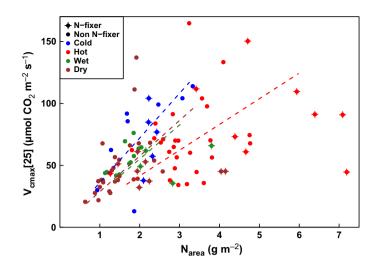
# EMPIRICAL RESULTS

Approximate proportionality between  $V_{\rm cmax}[25]$  and  $N_{\rm area}$  can be seen in Fig. 1. The relationship across all sites is weaker than in some studies (e.g. Kattge *et al.* 2009) because the data include species from a wider range of environments. Niinemets *et al.* (2009) showed a comparable scatter. In pairwise comparisons, the slope of the  $V_{\rm cmax}$ - $N_{\rm area}$  relationship at the dry site is shallower (P < 0.05) than the slopes at all of the other sites. Thus, more N is required to support a given  $V_{\rm cmax}$ at the dry site. The slope at the hot site is also shallower (P < 0.05) than the slope at the cold site. Other pairwise differences are non-significant.

Some N-fixing species have exceptionally high  $N_{\text{area}}$  for a given  $V_{\text{cmax}}$ , but others do not. The *overall* slope (across all sites) for N-fixers is slightly greater than that for non-N-fixers (P < 0.05), but the data do not suggest a general pattern of 'luxury consumption' or storage of N by N-fixers.

Within each site, species also show approximate proportionality between  $V_{\rm cmax}$  and  $g_{\rm s}$ , but the slopes vary between sites. The cold site shows a steeper slope than the warm site (Fig. 2a: P < 0.01), and the dry site shows a steeper slope than the wet site (Fig. 2b: P < 0.01). There was no significant difference between the slopes of the cold and the dry site, or the hot and the wet site. These findings agree with our predictions that  $\chi$  should increase towards both warmer and wetter climates. Results obtained using  $V_{\rm cmax}$ [25] instead of  $V_{\rm cmax}$ were closely similar and all the statistical statements applying to the one variable also apply to the other.

The plots for  $N_{\text{area}}$  vs.  $g_s$  (Fig. 2c, d) show a similar pattern of differences between sites to the plots for  $V_{\text{cmax}}$  vs.  $g_s$ , with one anomaly: the  $N_{\text{area}}$ - $g_s$  slopes between the dry and wet sites



**Fig. 1** Relationships between carboxylation capacity at 25 °C ( $V_{\text{cmax}}$ [25]) and nitrogen per unit leaf area ( $N_{\text{area}}$ ), colour-coded by sites: cold = blue, hot = red, wet = green, dry = brown. N-fixing species are identified by crosses.

differ about threefold, while the  $V_{\rm cmax}$ - $g_{\rm s}$  slopes differ only about twofold. In pairwise comparisons, the pattern of differences is the same for  $N_{\rm area}$  as for  $V_{\rm cmax}$ , except that the  $N_{\rm area}$  $g_{\rm s}$  relationship is shallower (P < 0.05) at the dry site than at the cold site. This difference is to be expected, given the lower ratio of to  $V_{\rm cmax}$  to  $N_{\rm area}$  at the dry site (Fig. 1). The same data after normalisation by A collapse on to a single hyperbola (Fig. 3). Equation (Appendix S2.2) is exact – the scatter is due to small variations in measurement temperatures affecting K. This curve is analogous to the equiproduction functions in Wright *et al.* (2003). Different positions along the curve correspond to different  $\chi$  values, or equivalently, different combinations of  $V_{\rm cmax}$  and  $g_{\rm s}$  that yield the same assimilation rate. The species-mean values for each site are separated as our hypothesis predicts. The cold and dry sites both have higher mean values of  $V_{\rm cmax}/A$ , and lower mean values of  $g_{\rm s}/A$ , than the other two sites. The same contrasts are shown in the measured  $\chi$  values (Fig. 3, inset). On average, species at the dry and cold sites have lower  $\chi$  than species at the wet and hot sites.

To compare these differences with predictions of the change in  $\chi_o$  between sites we applied eqn (12), summing the estimated effects of increments above and below the mid-point of temperature (for the cold-hot comparison) or  $\Delta E$  (for the drywet comparison) (Appendix S3). Moving from the wet site to the dry site yielded  $\Delta \chi_o \approx -0.186$ . The observed difference between mean  $\chi$  values is -0.155. This is only 17% less than the prediction, but the difference is significant (P < 0.002), suggesting that some mitigation mechanism (e.g. lower stature) may be allowing plants at the dry site to maintain more open stomata than they could otherwise.

For the cold-hot comparison, moving from the hot site to the cold site yielded  $\Delta \chi_o \approx -0.112$  from the temperature effect on K, and -0.034 from the temperature effect on  $\eta$ . In other words, the predicted effect of temperature on  $\chi$  due to Rubisco kinetics is three times larger than the effect of viscosity.

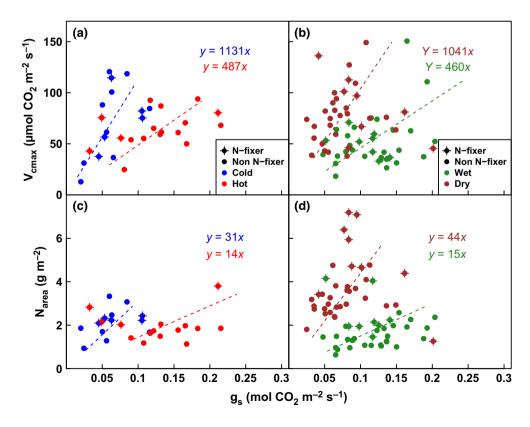
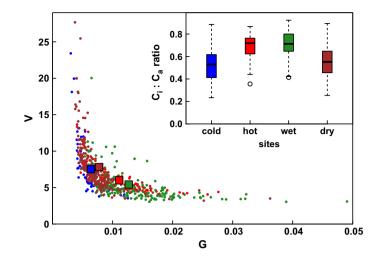


Fig. 2 Relationships between carboxylation capacity ( $V_{cmax}$ ) and stomatal conductance to CO<sub>2</sub> ( $g_s$ ) in (a) cold vs. hot sites and (b) wet vs. dry sites; (c), (d) corresponding relationships between nitrogen per unit leaf area ( $N_{area}$ ) and  $g_s$ . Colours are as in Fig. 1. N-fixing species are identified by crosses.



**Fig. 3** Demonstration of the 'unit production' function, which represents a trade-off between carboxylation capacity  $(V = V_{cmax}/A)$ and transpiration  $(G = g_s/A)$ . Colours as Fig. 1. Large squares denote values of V and G averaged over all species within each of the four sites. The inset shows box-and-whisker plots (mean, upper and lower quartiles, and minimum and maximum values) for the measured  $c_i/c_a$  values, similarly averaged over all species within each of the sites.

However, neither effect alone is sufficient to explain the observed difference between mean  $\chi$  values (-0.154). The predicted effect via K is significantly (P < 0.05) smaller than this observed difference. However, the sum of predicted effects via K and  $\eta$  combined (-0.146) is statistically indistinguishable from the observed difference.

Our hypothesis further predicts that  $\delta^{13}$ C (because of its relation to time-averaged  $\chi$ ) and  $N_{area}$  (because of its relation to  $V_{cmax}[25]$ ) should covary, and each should be related to temperature and water availability. Fig. 4a, b show relationships of  $\delta^{13}$ C to  $\chi$ , and  $N_{area}$  to  $\delta^{13}$ C, in the complete data set. The slope for  $N_{area}$  vs.  $\delta^{13}$ C is slightly steeper (P < 0.05) for N-fixers. The slope for  $\delta^{13}$ C vs.  $\chi$  is indistinguishable between N-fixers and non-N-fixers. Both  $N_{area}$  and  $\delta^{13}$ C values at each site show systematic shifts, in the expected direction, with MI (Figs 4c, d).  $N_{area}$  shows a slightly steeper increase (P < 0.01) with MI in N-fixers, while the response of  $\delta^{13}$ C is indistinguishable between N-fixers.

Multiple regressions using mean annual precipitation and temperature as predictors of  $N_{\rm area}$  and  $\delta^{13}$ C showed significant additional effects of temperature (P < 0.001: data not shown). However, in multiple regressions using MI and mean annual temperature as predictors,  $N_{\rm area}$  showed no significant additional effect of temperature, while  $\delta^{13}$ C

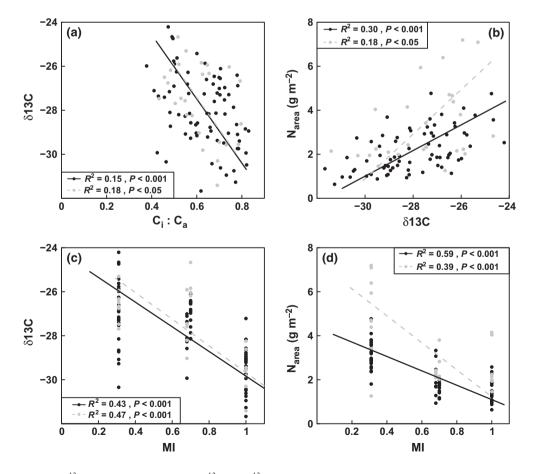


Fig. 4 Relationships between (a)  $\delta^{13}C$  and  $c_i/c_a$ , (b)  $N_{\text{area}}$  and  $\delta^{13}C$ , (c)  $\delta^{13}C$  and (d)  $N_{\text{area}}$  on the climatic moisture index (MI). Separate regressions are shown for N-fixing species (grey) and others (black).

showed a barely significant additional effects of temperature (P < 0.05). These findings suggest that MI adequately captures the response of  $N_{\rm area}$  and the major part of the response of  $\delta^{13}$ C to climate, including both temperature and water availability effects.

# DISCUSSION

# The predictability of environmental trends in leaf traits

The optimality hypothesis presented here provides a unifying explanation for the relative constancy of  $\chi$  under a range of conditions, its quantitative variation with temperature and water availability, and the emergent responses of  $N_{\rm area}$  and  $\delta^{13}$ C to climate.

Our theoretical analysis and empirical results support the prediction of Wright *et al.* (2003) that high  $V_{\rm cmax}$  and  $N_{\rm area}$  in arid environments represent an adaptation to drought. Large investment in photosynthetic capacity allows a given assimilation rate to be maintained with lower stomatal conductance and reduced water loss. Reduced  $\chi$  towards dry environments is predicted by eqn (2). The observed reduction in mean  $\chi$  across species is slightly smaller than predicted, suggesting involvement of plant-level mechanisms that could lower the cost of transpiration as described by eqn (11).

The data also support our prediction of reduced  $\chi$  in cold climates. The dependence of  $\chi$  on K follows from the expression for  $\xi$  in eqn (2). Equation (11) also predicts an increase in *a* due to the greater viscosity of colder water. The predicted enzymatic effect is about threefold larger than the viscosity effect, but both are needed to explain the data.

It might have been expected that the increase in temperature from the cold to the hot site would be accompanied by increased *D*. But the two sites have similar MI values, and the change in  $\chi$  is opposite to what would be predicted from increased *D*. From eqn (2), increased *D* with temperature should cause a *reduction* in  $\chi$  from the cold to the hot site. We observe an increase.

A 'trade-off' or 'complementarity' between the marginal nitrogen and water use efficiencies of photosynthesis  $(\partial A/\partial N)$ , approximately proportional to  $\partial A/\partial V_{cmax}$ , and  $\partial A/\partial E$ ) is inevitable even for an individual plant over a short period, because of their opposite responses to  $\chi$  (Field 1983; Farquhar *et al.* 2002). Palmroth *et al.* (2013) demonstrated this trade-off for *Pinus taeda* leaves grown under ambient and elevated  $c_a$ . They showed that leaves have higher efficiencies at high  $c_a$ , but that for each value of  $c_a$  they are disposed along a gradient characterised by a negative relationship between marginal nitrogen and water use efficiencies. Our analyses further show that the preferred  $\chi$  values shift in a predictable way along this gradient.

The proportionality between  $V_{\rm cmax}$  and  $N_{\rm area}$  is not constant. In particular, more N is apparently required to support a given level of  $V_{\rm cmax}$  in the dry climate. Prentice *et al.* (2011) found that the increase of  $N_{\rm area}$  with aridity along the North East China Transect was steeper than expected given only the modest observed increase in PAR (photosynthetically active radiation) along the transect, and observed changes in  $\delta^{13}$ C. A requirement for extra N could arise due to greater investment in structural N in the thicker (low SLA) leaves characteristic of arid sites, and/or to reduced mesophyll conductance (Niinemets *et al.* 1998) under drought conditions (Zhou *et al.* 2013). Low mesophyll conductance would mean that the standard gasexchange measurement of  $V_{\rm cmax}$  yields an underestimate of Rubisco activity. We do not have data to distinguish these possibilities. However, our finding of elevated  $V_{\rm cmax}$  with disproportionately elevated N in the dry environment is consistent with the idea that wild plants compensate for the decline in apparent  $V_{\rm cmax}$  – shown in drying experiments (Manzoni *et al.* 2011; Zhou *et al.* 2013) – by further increasing their investment in leaf N.

# **Optimisation criteria**

Medlyn *et al.* (2011) showed that the Cowan-Farquhar optimality criterion is well approximated *for electron transportlimited photosynthesis* by eqn (2), but with  $\xi = \sqrt{(3\Gamma^*/1.6\lambda)}$ . Equation (2) is independent of  $c_a$ . The same criterion applied to Rubisco-limited photosynthesis (Katul *et al.* 2010) yields a related function, including the same dependence on  $\sqrt{D}$ (apparently a robust prediction from different approaches), but with an additional dependence on  $c_a$  (Medlyn *et al.* 2013). Our approach provides an alternative derivation of the formula of Medlyn *et al.* (2011), extending its applicability to Rubisco-limited photosynthesis.

It cannot be assumed *a priori* that any plant- or leaf-level property is optimised, not least because the optimisation criterion is unknown. Alternative criteria could be supposed to be consistent with maximising reproductive fitness. However, our results show that the hypothesis proposed by Wright *et al.* (2003) can be applied in a standard ecophysiological modelling framework, yielding a robust, consistent and quantitative biological interpretation of a range of observed trait relationships.

# Towards a comprehensive approach to trait data analysis and vegetation modelling

The present generation of large-scale vegetation models treats ecophysiological properties of plants simplistically (Prentice & Cowling 2013). Models neglect the diversity of trait combinations that co-exist (Wright et al. 2004; Maire et al. 2012). For example, values of  $V_{\rm cmax}$  are usually imputed to a plant functional type (PFT), as a single value or a single-valued function of environmental variables (Haxeltine & Prentice 1996). A new theoretical framework is needed to assimilate into models the information now available on the variation, interrelationships and environmental dependencies of plant traits. Our hypothesis provides an essential element, by predicting environmental influences on the covariation of  $g_s$  and  $V_{cmax}$ . It provides a way to link the key model variables  $V_{\rm cmax}$ ,  $N_{\rm area}$ and  $\gamma$ , and suggests analyses to investigate whether the relationships among them vary as predicted with wood hydraulic properties and environmental variables.

The value of  $\chi$  predicted by eqn (2) is independent of actual values of  $V_{\rm cmax}$  or  $g_{\rm s}$ . However,  $V_{\rm cmax}$  and the Huber value ( $v_H$ ) are necessarily linked (Katul *et al.* 2003) due to the steady-state flow constraint, eqn (9). It seems likely that different species range along a spectrum from low carboxylation capacity and small Huber values (and/or poorly conductive

sapwood), to high carboxylation capacity and large Huber values (and/or highly conductive sapwood), while always satisfying the optimisation criterion. This idea is supported by large variation among species in Huber values, and in xylem hydraulic properties (Gleason *et al.* 2012). Large, co-ordinated variations in  $V_{\rm cmax}$ ,  $g_{\rm s}$  and A are seen within sites (Fig. 2) and may represent a spectrum of plant hydraulics, which could be modelled as continuous variation within PFTs.

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# STATEMENT OF AUTHORSHIP

ICP developed the theoretical analysis and wrote the first draft; ND carried out the graphical and statistical analyses; SMG and IJW provided field and laboratory measurements; all authors contributed to the interpretation of the results and the final manuscript.

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