

# Modulation of leaf economic traits and trait relationships by climate 

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#### Abstract

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#### Abstract

Aim Our aim was to quantify climatic influences on key leaf traits and relationships at the global scale. This knowledge provides insight into how plants have adapted to different environmental pressures, and will lead to better calibration of future vegetation-climate models.

Location The data set represents vegetation from 175 sites around the world. Methods For more than 2500 vascular plant species, we compiled data on leaf mass per area (LMA), leaf life span (LL), nitrogen concentration $\left(\mathrm{N}_{\text {mass }}\right)$ and photosynthetic capacity ( $\mathrm{A}_{\text {mass }}$ ). Site climate was described with several standard indices. Correlation and regression analyses were used for quantifying relationships between single leaf traits and climate. Standardized major axis (SMA) analyses were used for assessing the effect of climate on bivariate relationships between leaf traits. Principal components analysis (PCA) was used to summarize multidimensional trait variation.

Results At hotter, drier and higher irradiance sites, (1) mean LMA and leaf N per area were higher; (2) average LL was shorter at a given LMA, or the increase in LL was less for a given increase in LMA (LL-LMA relationships became less positive); and (3) $A_{\text {mass }}$ was lower at a given $N_{\text {mass }}$, or the increase in $A_{\text {mass }}$ was less for a given increase in $\mathrm{N}_{\text {mass }}$. Considering all traits simultaneously, $18 \%$ of variation along the principal multivariate trait axis was explained by climate.

Main conclusions Trait-shifts with climate were of sufficient magnitude to have major implications for plant dry mass and nutrient economics, and represent substantial selective pressures associated with adaptation to different climatic regimes.


## Keywords

Irradiance, leaf mass per area, leaf life span, nitrogen, photosynthesis, plant strategies, rainfall, temperature.

## INTRODUCTION

Plant ecologists have long been interested in quantifying how leaf morphology and physiology vary with climate. For example, plants adapted to low rainfall tend to have thick, leathery leaves (Schimper, 1903; Maximov, 1929; Turner, 1994; Fonseca et al., 2000) and a high concentration of nitrogen per unit leaf area (Cunningham et al., 1999; Wright et al., 2001). Many plants growing in high irradiance habitats share these traits also (Niinemets, 2001). For some decades now, ecologists have also been aware that key leaf properties tend to show predictable relationships with one another. In particular, species with
high leaf mass per area (LMA) tend to have long average leaf life span (LL), low nutrient concentrations and slow maximum photosynthetic and dark respiration rates (Field \& Mooney, 1986; Reich et al., 1992, 1997; Turner, 1994; Enriquez et al., 1996; Diemer, 1998; Niinemets, 1999). Together, these traits form a spectrum of 'leaf economics' (Wright et al., 2004), running from species with potential for quick returns on investments of nutrients and dry mass in leaves (e.g. species with low LMA, such as many herbs, grasses and deciduous trees) to species with a slower potential rate of return in terms of carbon acquisition (e.g. many evergreen shrubs and trees with high LMA).

Quantifying correlations among leaf traits and how traits differ between growth forms and plant functional types (PFTs) not only gives insight into the selective pressures that have shaped the evolution of the world's vegetation, but is also crucial for reliable calibration of models designed to predict vegetation and productivity shifts with climate and land use change. Most vegetationclimate models represent the vegetation in any grid-square with a frequency distribution of PFTs. Each PFT is assigned a set of typical properties, often including leaf traits such as LMA (or its inverse, SLA), LL, leaf N concentration ( $\mathrm{N}_{\text {mass }}$ ) and photosynthetic rate. Modellers have begun using trait correlations from broad, comparative studies for assigning trait values. For example, the Lund-Potsdam-Jena Dynamic Global Vegetation Model (DGVM) (Sitch et al., 2003) calculates SLA for each PFT from an assigned LL value using the SLA -LL relationship reported by Reich et al. (1997), whereas the Ecosystem Demography model (Moorcroft et al., 2001) calculates both leaf N concentration and SLA from LL, again following Reich et al. (1997). Naturally, model output is considerably affected by the choice of trait values assigned to each PFT. In one of the few published sensitivity analyses that we are aware of, the relative importance of parameter variation for predicting annual net primary production (NPP) was assessed for the BIOME-BGC model (White et al., 2000). All biomes were strongly affected by variation in leaf and fine root C:N ratios. In addition, woody biomes were strongly affected by leaf traits such as the percentage of leaf N in Rubisco, maximum stomatal conductance, and SLA.

One issue in assigning relevant leaf trait values to PFTs is that the magnitude of variation within PFTs may be greater than the difference in trait-means among them (Wright et al., 2005). Another is that the relationships between key leaf traits may shift predictably with climate. For example, both regionally and globally, LL-LMA relationships tend to be shifted such that species from lower rainfall sites have shorter LL at a given LMA (Reich et al., 1999; Wright et al., 2002, 2004). And, among woody perennials from eastern Australia, species from lower rainfall sites achieve lower maximum photosynthetic rate $\left(\mathrm{A}_{\text {mass }}\right)$ at a given $\mathrm{N}_{\text {mass }}$ (Wright et al., 2001). We suggest that this sort of information should be incorporated into future vegetation-climate models.

In order to understand better how site properties affect leaf traits and trait relationships at the global scale, we have drawn together trait information for more than 2500 vascular plant species from 175 sites around the world. The coverage of traits, species and sites is substantially greater than previous data compilations (Field \& Mooney, 1986; Schulze et al., 1994; Reich et al., 1997; Diemer, 1998; Niinemets, 2001), extends to all vegetated continents and represents a wide range of vegetation types. In previous papers, we summarized broad-scale patterns from the data set such as patterning of leaf traits and trait relationships according to growth form, plant functional type and sample size (Wright et al., 2005), and the patterning of LL-LMA relationships by site rainfall (Wright et al., 2004). Here we present a number of more comprehensive analyses concerning the effect of climate on leaf traits and leaf trait relationships. The traits considered were LMA, LL, leaf N concentration per unit leaf mass and area $\left(\mathrm{N}_{\text {mass }}, \mathrm{N}_{\text {area }}\right)$ and photosynthetic 'capacity' (measured
under ambient $\mathrm{CO}_{2}$ concentration, near-saturating light and relatively well watered conditions; $\mathrm{A}_{\text {mass }}, \mathrm{A}_{\text {area }}$ ). Site climate was described with standard indices: temperature, rainfall, global radiation, potential evapotranspiration and vapour pressure deficit.
We asked three types of questions:
(1) How do the leaf traits vary with climate, at the global scale? These relationships were quantified using (i) individual species at each site and (ii) site means as the unit of replication.
(2) To what extent are bivariate trait relationships modulated by climate?
(3) How much variation does climate explain along the first two principal component axes summarizing multivariate variation in LL, LMA, $\mathrm{N}_{\text {mass }}$ and $\mathrm{A}_{\text {mass }}$ ?
We report the effect of climate on only a subset of all the possible pairwise leaf trait relationships: those between LL and each of LMA and $\mathrm{A}_{\text {mass }}$, and those between photosynthetic capacity and each of LMA and leaf N concentration. The LL-LMA relationship is thought to reflect a trade-off, with lower LMA indicating greater potential for fast growth (more leaf area deployed for a given dry mass investment), but longer LL indicating longer duration of the revenue stream from that investment, and enhanced nutrient conservation (Escudero et al., 1992; Westoby et al., 1998; Eckstein et al., 1999; Aerts \& Chapin, 2000). The linkage between LL and $\mathrm{A}_{\text {mass }}$ has been emphasized in models seeking to understand the costs and benefits of different leaf phenologies, with $A_{\text {mass }}$ being a major determinant of the time taken to pay back the construction cost of a leaf (Kikuzawa, 1991; Poorter, 1994; Kikuzawa \& Ackerly, 1999; Givnish, 2002). Variations in both leaf structure and leaf N content have been shown to affect photosynthetic capacity (Field \& Mooney, 1986; Reich et al., 1998; Wright et al., 2001). Thus, each of these relationships is important for the dry mass and nutrient economics of vegetation. We also ran a subset of analyses for evergreen species considered on their own, and (less commonly) for deciduous species, these being commonly used PFTs. These results were then compared to those seen across the whole data set.

## METHODS

## Leaf and climate data

Data were compiled from both published and unpublished sources. A data set was considered suitable providing that it contained data for at least two leaf traits of interest for at least four species co-occurring in the field. Only site-based data sets were used; that is, those to which we could reasonably attach climate data. The total database consists of 2548 species/site combinations from 175 sites: 2021 different species in total, with 342 species occurring at more than one site. Data sources and the data set itself are available in online Appendices associated with Wright et al. (2004). Site mean annual temperature (MAT) ranged from $-16^{\circ} \mathrm{C}$ to $27.5^{\circ} \mathrm{C}$; mean annual rainfall ranged from 133 to 5300 mm per year. This covers most of the range of MAT-rainfall space in which higher plants are found (Whittaker, 1975).

Mean annual and monthly temperature and precipitation data were compiled for each site. For a small number of sites ( $<20$ ),

Table 1 Correlations ( $r$ and $P$ values) between climate variables assigned to each of the 175 sites. Abbreviations: MAT, mean annual temperature, VPD, vapour pressure deficit; PET, Penman-Monteith potential evapotranspiration; irradiance, daily mean global radiation

|  | MAT | VPD | PET | Irradiance |
| :--- | :--- | :--- | :--- | :--- |
| Rainfall | $0.34(<0.001)$ | $-0.05(0.474)$ | $0.03(0.697)$ | $-0.01(0.928)$ |
| MAT |  | $0.70(<0.001)$ | $0.81(<0.001)$ | $0.65(<0.001)$ |
| VPD |  |  | $0.77(<0.001)$ | $0.84(<0.001)$ |
| PET |  |  | $0.75(<0.001)$ |  |

climate data were available from the sites themselves. Otherwise, data were taken from the source publications from which leaf data were obtained (where given) or from the nearest weather stations, with temperature data scaled where necessary by an altitudinal lapse rate of $0.6^{\circ} \mathrm{C}$ per 100 m (Körner, 1999). Climate data were also extracted from a global, interpolated $0.5 \times 0.5^{\circ}$ data set containing monthly means (1961-90) for temperature, rainfall, water vapour pressure (VP) and global radiation (New et al., 1999). Temperature and rainfall from the global data set were used for sites where we were unable to obtain suitable weather station data ourselves. MAT and rainfall estimates from the global data set agreed closely with site-specific or nearbystation data in most cases, giving us confidence in the VP and irradiance estimates also. Neighbouring grid-squares in the global data set were explored for better-matching data for sites where the MAT and rainfall estimates differed by $>10 \%$ (mostly mountain sites). When a close match was found, VP and radiation data were taken from that grid-square. Otherwise, VP for mountain sites was scaled using an empirical formula expressing the exponential decrease of VP with altitude (Barry, 1981). Monthly means of vapour pressure deficit (VPD) were estimated as the difference between the saturation VP of air (at the monthly mean temperature) and VP taken from the global data set. Saturation VP was calculated using the Tetens formula (Campbell \& Norman, 1998). Irradiance data were not adjusted for altitude because increases in cloud cover with elevation tend to offset the increase in radiation that would be observed in clear air, though this may not always be true for high elevation sites in arid regions (Barry, 1981; Körner, 1999). Penman-Monteith potential evapotranspiration (PET) was also estimated for each site, sourced from a global $0.5 \times 0.5^{\circ}$ data set calculated for the period 1987-88 (Choudhury, 1997). The albedo and surface resistance constants used for calculating PET in this data set were for actively growing, well-watered grass, so PET should be thought of as a reference value rather than as accurately describing the evapotranspiration of the vegetation at each site. PET was estimated for the problematic mountain sites from a regression equation fitted to all other sites, considering PET as a function of MAT and annual rainfall ( $r^{2}=0.71$ ).

Climate variables were summed (rainfall) or averaged (other variables) across all months of the year, and across those months with mean temperature of $\geq 5^{\circ} \mathrm{C}$, giving an estimate of climate during the growth season. Results using yearly and growthseason climate indices were similar; hence for brevity, we only report results relating to yearly climate averages. Naturally, climate variables were cross-correlated to an extent. Across the 175 sites, VPD, PET and solar irradiance were more closely associated
with MAT than with mean annual rainfall (Table 1) although, clearly, both MAT and rainfall affect a property such as VPD.

Means of leaf traits were calculated for each species at a site where this was not already reported. Where traits were reported separately for sun leaves and shade leaves, sun-leaf data were used. If data were presented separately for recently matured and old leaves, recently matured leaves were used. That is, data for leaves closer to their 'peak' physiological stage were used where there was a choice (i.e. prior to significant age- or light-related decline in nutrient contents and photosynthetic capacity). Photosynthesis and leaf N source data were variously reported on a leaf mass or on a leaf area basis. Both formulations are of interest, and these were interconverted via LMA where this was reported as well.

## Data analysis

All leaf traits were approximately log-normally distributed across the data set, as were site rainfall and VPD. Accordingly, these variables were $\log _{10}$-transformed for all analyses. MAT, PET and global radiation were left untransformed because their distribution was approximately normal. Pearson correlation and ordinary least squares (OLS) regression were used for quantifying relationships between individual leaf traits and climate. Bivariate relationships between leaf traits were described with standardized major axis slopes (SMAs; also known as reduced major axis slopes, Sokal \& Rohlf, 1995) because our primary aim was to summarize relationships between trait-pairs rather than calculating predictive regression equations (although, see below). On $\log -\log$ axes, the SMA describes the best-fit 'scaling' (proportional) relationship between the traits. The effect of climate on SMA relationships was quantified by using the SMA analogue of standard analysis of covariance (ancova), as follows. Species were pooled into climate bands (see Tables $3,4 \& 5$ ) and an SMA was fitted to each band. Next, the resulting set of slopes was tested for heterogeneity. Where non-heterogeneity was demonstrated $(P>0.05)$, a common slope ( $b$ ) was estimated. Elevation differences between individual SMAs were then tested for by comparing the species-groups for differences in mean $Y^{\prime}$, where $Y^{\prime}$ is $Y$ transformed by the common slope (i.e. $Y^{\prime}=Y-b X$ ). Multiple comparisons of $Y^{\prime}$ were made using the Tukey-Kramer test when variance was homogeneous among groups and the Games-Howell test when variance was heterogeneous (Day \& Quinn, 1989). Both tests maintain an experimentwise significance level of 0.05 , hence no posthoc correction is needed. Homogeneity of variance among groups was assessed with Levene's test. SMA routines were run using the DOS-based
computer package (S)MATR (Falster et al., 2003). Further details of the statistical routines are described in the supporting documentation, available online at http://www.bio.mq.edu.au/ecology/ SMATR/.
While SMA analyses are appropriate for summarizing the relationship between two variables in terms of a single slope, OLS linear regression should be used if one wants to create equations for predicting one trait from one or more other traits (Sokal \& Rohlf, 1995; Draper \& Smith, 1998). Accordingly, the effect of climate on bivariate trait relationships was also assessed using multiple regression. There was close qualitative agreement between the main trends from the SMA and regression analyses; hence, for brevity, only SMA results are reported here.
Climate variables were treated as continuous variables in regression analyses but as ordinal variables in SMA analyses. Describing climate on a continuous scale is clearly the more desirable approach, but no SMA analogue of multiple regressions has yet been well described. Instead, principal components analysis (PCA) was used to reduce multivariate variation in LL, LMA, $\mathrm{N}_{\text {mass }}$ and $\mathrm{A}_{\text {mass }}$ down to two orthogonal axes, enabling the strength of correlation between climate variables and species scores along these axes to be assessed. A significant correlation between a climate variable and species' scores along the first axis (the principal axis, ' $\mathrm{PCAl}^{\prime}$ ') indicates that species shift along the axis with climate. Identifying correlated variation with scores along the second axis ('PCA2') is roughly analogous to identifying elevation shifts between SMAs in the bivariate case (strictly, it would be analogous to identifying group shifts along the standardized minor axis, rather than vertical 'elevation' shifts). Indeed, an SMA slope simply describes the slope of the principal axis from a PCA run on standardized bivariate data (i.e. based on the correlation rather than the covariance trait matrix; Sokal \& Rohlf, 1995). Other than SMA analyses, all statistical procedures were carried out with SPSS for Windows version 11.01. For PCA
analyses, species scores along PCA1 and PCA2 were calculated using the Anderson-Runin method, giving two sets of orthogonal scores, each with mean of $0, S D$ of 1 .

## RESULTS

## Patterning of leaf traits with climate

Leaf life span was positively correlated with each of MAT, rainfall, VPD, PET and irradiance (Table 2). Irradiance showed the strongest relationship, explaining $10 \%$ of variation in LL. The positive relationship between rainfall and LL was unexpected if anything, one would expect LL to be longer in species from drier sites. However, when either MAT or irradiance was controlled in a multiple regression, the effect of rainfall on LL became non-significant ( $P=0.451, P=0.196$, respectively). That is, the (weak) rainfall effect seen across all species was apparently the result of the cross-correlation of rainfall with other climate variables.
LMA increased with increasing site MAT and showed only a weak tendency to be higher at lower rainfall ( $r=-0.04$, $P=0.032$; Table 2). This was surprising because there have been many reports from smaller studies that LMA tends to be higher at drier sites. However, once variation in MAT was controlled in a multiple regression, LMA increased more strongly as rainfall decreased ( $P<0.001$ ), in line with previous findings. LMA was more strongly (positively) correlated with VPD, PET (both $r=0.38)$ or site irradiance ( $r=0.42$ ) than with either MAT or site rainfall alone.

Evergreen and deciduous species showed rather different patterns in LL and LMA with rainfall and MAT. Along a gradient of decreasing MAT, both LL and LMA increased in evergreens but decreased in deciduous species, with this difference more pronounced in LL than in LMA (Figs 1a,b). Along a gradient of

Table 2 Global correlations between leaf traits and site climate. Two sets of results are reported: (1) correlations between site climate and individual species trait values ('Species'); and (2) correlations between site climate and site mean trait values ('Sites'). Leaf traits for individual species were $\log _{10}$-transformed before analysis, and before site means were calculated. Site rainfall and vapour pressure deficit (VPD) were also $\log _{10}$-transformed. $n$ : sample sizes for Species and Sites analyses, respectively

|  |  | MAT |  | Rainfall |  | VPD |  | PET |  | Irradiance |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Species | Sites | Species | Sites | Species | Sites | Species | Sites | Species | Sites |
| LL | $r$ | 0.29 | 0.22 | 0.17 | 0.18 | 0.26 | 0.18 | 0.19 | 0.14 | 0.32 | 0.28 |
| ( $n=749,55$ ) | $P$ | < 0.001 | 0.109 | < 0.001 | 0.178 | < 0.001 | 0.195 | < 0.001 | 0.319 | < 0.001 | 0.038 |
| LMA | $r$ | 0.31 | 0.28 | -0.04 | -0.25 | 0.38 | 0.50 | 0.38 | 0.44 | 0.42 | 0.57 |
| ( $n=2370,163$ ) | $P$ | < 0.001 | < 0.001 | 0.032 | 0.001 | $<0.001$ | $<0.001$ | < 0.001 | < 0.001 | < 0.001 | < 0.001 |
| $\mathrm{N}_{\text {mass }}$ | $r$ | -0.21 | -0.22 | 0.01 | 0.14 | -0.27 | -0.33 | -0.25 | -0.29 | -0.33 | -0.44 |
| ( $n=2061,145$ ) | P | $<0.001$ | 0.008 | 0.689 | 0.093 | $<0.001$ | <0.001 | $<0.001$ | <0.001 | < 0.001 | <0.001 |
| $\mathrm{N}_{\text {area }}$ | $r$ | 0.12 | 0.06 | -0.21 | -0.46 | 0.20 | 0.27 | 0.22 | 0.25 | 0.21 | 0.25 |
| ( $n=1975,144$ ) | $P$ | < 0.001 | 0.449 | < 0.001 | < 0.001 | $<0.001$ | 0.001 | < 0.001 | 0.002 | < 0.001 | 0.003 |
| $\mathrm{A}_{\text {mass }}$ | $r$ | -0.18 | -0.07 | -0.13 | -0.32 | -0.17 | -0.16 | -0.07 | 0.05 | -0.20 | -0.18 |
| ( $n=770,65$ ) | $P$ | <0.001 | 0.566 | < 0.001 | 0.009 | < 0.001 | 0.213 | 0.056 | 0.714 | < 0.001 | 0.143 |
| $\mathrm{A}_{\text {area }}$ | $r$ | -0.08 | -0.04 | -0.34 | -0.52 | 0.09 | 0.10 | 0.12 | 0.20 | 0.03 | 0.07 |
| ( $n=824,72$ ) | $P$ | 0.020 | 0.744 | < 0.001 | < 0.001 | 0.010 | 0.398 | 0.001 | 0.100 | 0.453 | 0.575 |

Figure 1 Relationships between leaf life span (LL) and leaf mass per area (LMA) with each of MAT and annual rainfall for evergreen (open circles) and deciduous (filled circles) shrubs and trees. Linear regression lines are shown for illustrative purposes even when not statistically significant. (a) Log LL vs. MAT. Evergreen: $b=-0.01, r^{2}=0.10, P<0.001, n=363$. Deciduous: $b=0.01, r^{2}=0.42, P<0.001$, $n=157$. (b) Log LMA vs. MAT. Evergreen: $b=-0.01, r^{2}=0.02, P<0.001, n=894$. Deciduous: $b=0.01, r^{2}=0.08, P<0.001$, $n=522$. (c) Log LL vs. $\log$ rainfall. Evergreen: $b=0.05, r^{2}=0.003, P=0.330, n=363$. Deciduous: $b=0.22, r^{2}=0.08, P<0.001, n=157$. (d) Log LMA vs. $\log$ rainfall. Evergreen: $b=-0.41$, $r^{2}=0.22, P<0.001, n=894$. Deciduous: $b=0.03, r^{2}=0.002, P=0.322, n=522$.

decreasing rainfall, mean LMA increased sharply in evergreens, whereas no trend was evident in LL (Figs 1c,d). Along the same gradient, both LL and LMA decreased slightly among deciduous species.
$\mathrm{N}_{\text {mass }}$ showed no trend with rainfall, but decreased with increasing MAT, VPD, PET or irradiance (Table 2). $\mathrm{Na}_{\text {area }}$ tended to show the opposite pattern, being higher at higher MAT, VPD, PET or irradiance, and higher at lower rainfall. $\mathrm{N}_{\text {area }}$ is the product of $\mathrm{N}_{\text {mass }}$ and LMA. Therefore, it must have been the underlying trends in LMA rather than $\mathrm{N}_{\text {mass }}$ that led to higher $\mathrm{N}_{\text {area }}$ at hotter/drier/higher irradiance sites. $\mathrm{N}_{\text {area }}$ increased with irradiance with rainfall held constant, and increased with decreasing rainfall at any given level of irradiance (Fig. 2). That is, the rainfall and irradiance effects were independent of each other.
$\mathrm{A}_{\text {mass }}$ decreased with increasing MAT, rainfall, VPD, PET (marginally) or irradiance. Whereas $\mathrm{A}_{\text {area }}$ decreased with increasing MAT (weakly) and rainfall (more strongly), it was positively correlated with VPD and PET. $A_{\text {area }}$ is the product of $A_{\text {mass }}$ and LMA; therefore, it must have been underlying trends in LMA rather than in $A_{\text {mass }}$ that drove the positive $\mathrm{A}_{\text {area }}-\mathrm{VPD}$ and $\mathrm{A}_{\text {area }}$-PET relationships.

A substantial proportion of the total variation among species in their leaf traits tends to occur between coexisting species (Poorter \& De Jong, 1999; Wright et al., 2004). One consequence of this is that the trait-climate relationships were in many cases stronger when site means were considered as replicates rather than individual species (Table 2). For example, rainfall explained $6 \%$ of variation in site-mean LMA vs. $0.2 \%$ at the species-level, whereas irradiance explained $33 \%$ of variation in site-mean LMA vs. $18 \%$ at the species-level. Notable exceptions were leaf life span and photosynthetic capacity, for which most trait-


Figure 2 Leaf N per area $\left(\mathrm{N}_{\text {area }} ; \mathrm{g} \mathrm{m}^{-2}\right)$ increases as a function of increasing irradiance and decreasing annual rainfall ( mm year ${ }^{-1}$ ). The best-fit plane from the following multiple regression is shown: $\log \mathrm{N}_{\text {area }}=0.0015$ irradiance $-0.182 \log$ rainfall +0.563 (all coefficients $P<0.001$, model $r^{2}=0.11, n=1975$ ). Data from 144 sites.
climate correlations were of similar or weaker strength (correlation $r$ ) when considered for sites rather than species. With the much lower sample sizes for site-based analyses, relationships with similar $r$ values were statistically non-significant (Table 2).

## Modulation of leaf trait relationships by climate

## Leaflife span-LMA relationships

Leaf life span and LMA were positively correlated, both across all species $\left(r^{2}=0.43, n=678\right)$ and within each growth form (Wright et al., 2005). SMAs fitted within rainfall bands did not differ in slope (test for SMA heterogeneity, $P=0.970$ ) but they did differ clearly in elevation, such that the average leaf life span achieved at a given LMA was shorter at lower rainfall (Fig. 3a). At grand mean LMA ( $104 \mathrm{~g} / \mathrm{m}^{2}$ ), mean LL was 8 -fold higher in the wettest than in the driest rainfall class (Table 3). The slope of LLLMA relationships became flatter with increasing MAT, VPD, PET or site irradiance, dropping from log-log slopes of 2.3 or more in the lowest MAT, VPD, PET or irradiance classes to 1.3 or

Table 3 Comparisons of LL-LMA relationships for species pooled into five rainfall classes. Classes were defined along a log-scale because rainfall was log-normally distributed. SMAs were deemed non-heterogeneous ( $P=0.970$ ), but clear elevation (intercept) differences were apparent, with shorter LL at a given LMA at drier sites. Multiple comparisons of SMA elevations all $P<0.015$, except $600-1200$ vs. $1200-2400 \mathrm{~mm}$ rainfall classes, $P=0.181$

| Rainfall <br> $(\mathrm{mm})$ | $n$ | $r^{2}$ | Slope (95\% CIs) | LL (month) at mean <br> LMA $\left(104 \mathrm{~g} / \mathrm{m}^{2}\right)$ |
| :--- | ---: | :---: | :---: | :---: |
| $150-300$ | 10 | 0.81 | $1.75(1.24-2.47)$ | 2.8 |
| $300-600$ | 138 | 0.51 | $1.71(1.52-1.93)$ | 6.4 |
| $600-1200$ | 322 | 0.48 | $1.65(1.53-1.79)$ | 8.2 |
| $1200-2400$ | 146 | 0.38 | $1.74(1.53-1.98)$ | 9.6 |
| $2400-4800$ | 62 | 0.50 | $1.69(1.41-2.03)$ | 23.6 |



Figure 3 Modulation of leaf life span-LMA relationships by climate. Individual standardized major axis slopes are shown for species pooled into (a) rainfall classes and (b) MAT classes. Climate classes and associated statistics are given in Tables 3 and 4.

Table 4 Trends in LL-LMA and $A_{\text {mass }}-\mathrm{N}_{\text {mass }}$ relationships for species grouped into climate classes. Data shown are the SMA slope and $95 \%$ confidence interval (CI), coefficient of determination $\left(r^{2}\right)$ and sample size. Climate classes are $\log _{10}$-classes in the case of VPD, and arithmetic classes for the other variables

|  | Climate band | LL-LMA |  |  | $\mathrm{A}_{\text {mass }}-\mathrm{N}_{\text {mass }}$ |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | SMA (95\% CIs) | $r^{2}$ | $n$ | SMA (95\% CIs) | $r^{2}$ | $n$ |
| MAT ( ${ }^{\circ} \mathrm{C}$ ) | -10-0 | 2.3 (2.0, 2.6) | 0.61 | 114 | 2.0 (1.7, 2.2) | 0.75 | 65 |
|  | 0-10 | $1.9(1.7,2.2)$ | 0.49 | 157 | $2.1(1.9,2.4)$ | 0.41 | 178 |
|  | 10-20 | $1.4(1.3,1.5)$ | 0.46 | 269 | $1.7(1.6,1.8)$ | 0.60 | 348 |
|  | 20-30 | 1.3 (1.1, 1.6) | 0.09 | 138 | 1.3 (1.1, 1.5) | 0.30 | 121 |
| VPD (kPa) | 0.1-0.2 | 2.3 (2.0, 2.6) | 0.57 | 104 | $1.9(1.7,2.2)$ | 0.86 | 40 |
|  | 0.2-0.4 | $1.9(1.7,2.0)$ | 0.64 | 158 | $1.7(1.5,1.8)$ | 0.56 | 184 |
|  | 0.4-0.8 | $2.0(1.8,2.1)$ | 0.29 | 297 | $1.7(1.6,1.8)$ | 0.50 | 353 |
|  | 0.8-1.6 | 1.1 (0.92, 1.2) | 0.49 | 119 | $1.6(1.4,1.8)$ | 0.47 | 135 |
| $\operatorname{PET}\left(\mathrm{mm} \mathrm{y}^{-1}\right)$ | 200-500 | 2.5 (2.2, 2.9) | 0.56 | 89 | $2.0(1.6,2.5)$ | 0.69 | 25 |
|  | 500-800 | 2.0 (1.8, 2.3) | 0.67 | 93 | $2.0(1.8,2.3)$ | 0.60 | 116 |
|  | 800-1100 | 2.3 (2.0, 2.5) | 0.49 | 183 | $1.9(1.7,2.1)$ | 0.52 | 214 |
|  | 1100-1400 | 1.3 (1.1, 1.4) | 0.45 | 225 | $1.6(1.5,1.8)$ | 0.57 | 282 |
|  | 1400-1700 | 0.83 (0.67, 1.0) | 0.09 | 88 | $1.4(1.1,1.6)$ | 0.36 | 75 |
| Irradiance ( $\mathrm{W} \mathrm{m}^{-2}$ ) | 60-90 | 2.6 (2.2, 3.0) | 0.54 | 86 | $2.0(1.6,2.5)$ | 0.69 | 25 |
|  | 90-120 | 2.0 (1.7, 2.3) | 0.62 | 63 | 2.3 (2.0, 2.7) | 0.71 | 50 |
|  | 120-150 | $1.9(1.7,2.1)$ | 0.45 | 184 | $1.9(1.7,2.1)$ | 0.45 | 221 |
|  | 150-180 | 1.3 (1.2, 1.5) | 0.25 | 267 | $1.7(1.6,1.8)$ | 0.53 | 337 |
|  | 180-210 | 1.3 (1.1, 1.5) | 0.55 | 78 | 1.4 (1.2, 1.6) | 0.58 | 79 |

less in the hottest/driest/highest irradiance classes (Table 4; MAT effect depicted in Fig. 3b). The same climate-related trends were seen among evergreen species as for the full data set (details not shown), indicating that the all-species trends were not being driven by differences between evergreens and other functional groups (e.g. grasses, herbs, deciduous trees and shrubs).

## $L L-A_{\text {mass }}$ relationships

Longer leaf life span was associated with lower $\mathrm{A}_{\text {mass }}$, both across all species ( $r^{2}=0.69, n=512$ ) and within each major growth form (Wright et al., 2005). Overall, there was relatively little effect of site climate on SMAs describing LL- $\mathrm{A}_{\text {mass }}$ relationships. Neither VPD, PET nor irradiance had any clear effect (details not shown). SMAs fitted within rainfall bands were nonheterogeneous ( $P=0.097$ ), but the only significant differences in SMA elevation were between the highest rainfall class and all other classes (all significantly lower, $P<0.001$; all other comparisons $P>0.1$ ). SMAs fitted within MAT classes did not differ in slope $(P=0.407)$ but did differ in elevation, with longer LL at a given $\mathrm{A}_{\text {mass }}$ in the two warmest classes than in the two coldest classes (all $P<0.02$ ). However, no elevation difference was observed within each of these pairs of MAT classes (both $P>0.095$ ). Comparisons made among evergreen species yielded similar results to the all-species analyses, except that there was no MAT effect on LL- LMA relationships for evergreens (details not shown).

## $A_{\text {mass }}-L M A$ relationships

$\mathrm{A}_{\text {mass }}$ and LMA were negatively correlated, both across all species ( $r^{2}=0.50, n=764$ ) and within each growth form (Wright et al., 2005). There was no effect of site rainfall on SMA slopes ( $P=0.108$ ); rather, their elevation was clearly higher at drier sites, with mean $\mathrm{A}_{\text {mass }}$ around threefold higher at the driest sites than at the wettest, at a given LMA (Fig. 4a; Table 5). There was no clear patterning of $\mathrm{A}_{\text {mass }}$-LMA relationships with respect to other climate variables: SMAs fitted within climate bands were significantly heterogeneous in all cases, but without clear trends.

Table 5 Comparisons of $\mathrm{A}_{\text {mass }}-$ LMA relationships for species pooled into five rainfall $\log$-classes. SMAs were deemed non-heterogeneous ( $P=0.108$ ), but clear elevation (intercept) differences were apparent, with higher $\mathrm{A}_{\text {mass }}$ at a given LMA at drier sites. Multiple comparisons of SMA elevations all $P<0.010$ with the following exceptions: $600-1200 \mathrm{~mm}$ class vs. the two lowest rainfall classes, both $P>0.10$; comparison between the two lowest rainfall classes, $P=0.091$; comparison between the $300-600$ vs. $1200-2400 \mathrm{~mm}$ classes, $P=0.058$

| Rainfall <br> $(\mathrm{mm})$ | $n$ | $r^{2}$ | Slope $(95 \% \mathrm{CIs})$ | $\mathrm{A}_{\text {mass }}\left(\mathrm{nmol} \mathrm{g} \mathrm{g} \mathrm{s}^{-1}\right)$ at <br> mean LMA $\left(103 \mathrm{~g} / \mathrm{m}^{2}\right)$ |
| :--- | ---: | ---: | ---: | :--- |
| $150-300$ | 9 | 0.85 | $-1.4(-2.0,-1.0)$ | 169 |
| $300-600$ | 121 | 0.58 | $-1.3(-1.5,-1.2)$ | 106 |
| $600-1200$ | 339 | 0.58 | $-1.2(-1.3,-1.1)$ | 109 |
| $1200-2400$ | 201 | 0.39 | $-1.5(-1.6,-1.3)$ | 90 |
| $2400-4800$ | 89 | 0.46 | $-1.2(-1.4,-1.1)$ | 56 |

## Photosynthesis-leaf $N$ relationships

$\mathrm{A}_{\text {mass }}$ and $\mathrm{N}_{\text {mass }}$ were positively correlated, both across all species ( $r^{2}=0.53, n=712$ ) and within each growth form (Wright et al., 2005). Clear climate-related trends were observed for this traitpair, with SMAs becoming flatter with increasing MAT, PET or irradiance. These shifts were quite substantial, with $\mathrm{A}_{\text {mass }}$ increasing to the square of $\mathrm{N}_{\text {mass }}$ in the coldest/least arid climate bands ( $\log -\log$ slopes of $c .2$ ), dropping down to slopes of $c .1 .4$ in the hottest/driest/highest irradiance regions (Table 4; MAT effect depicted in Fig. 4b). By contrast, there was no clear effect of VPD on either SMA slope or elevation.

Photosynthetic capacity and leaf N were more weakly related on a leaf area than on a leaf mass basis (correlations across all species, $r^{2}=0.13$ vs. 0.53 ; Wright et al., 2005). There was no clear effect from any of the climate variables on either SMA slopes or elevations for this trait-pair (details not shown).

## Assessing patterning by climate in multivariate trait space

Principal components analysis was used to reduce multivariate variation in LL, LMA, $\mathrm{N}_{\text {mass }}$ and $\mathrm{A}_{\text {mass }}$ down to two orthogonal

Figure 4 Modulation of $\mathrm{A}_{\text {mass }}-\mathrm{LMA}$ and $\mathrm{A}_{\text {mass }}-\mathrm{N}_{\text {mass }}$ relationships by climate. Climate classes and associated statistics are given in Tables 4 and 5. (a) $A_{\text {mass }}$ vs. LMA, with individual SMA slopes shown for species pooled into rainfall classes. (b) $\mathrm{A}_{\text {mass }}$ vs. $\mathrm{N}_{\text {mass }}$, with individual SMA slopes shown for species pooled into MAT classes.

axes, PCA1 and PCA2. All four traits were known for 492 species from 39 sites. PCA1 explained $84.4 \%$ of total trait variation among these species, PCA2 a further $10.2 \%$. PCA1 was positively correlated with LL and LMA and negatively correlated with $\mathrm{A}_{\text {mass }}$ and $\mathrm{N}_{\text {mass }}$ (thus PCA1 represented the 'leaf economics spectrum'; Wright et al., 2004). The set of species scores along PCA1 was positively correlated (all $P \leq 0.001$ ) with each of irradiance $(r=0.32)$, VPD $(r=0.31)$, MAT $(r=0.23)$ and PET $(r=0.17)$, and negatively correlated with rainfall ( $r=-0.10 ; P=0.028$ ). The only climate variable significantly correlated with PCA2 was rainfall ( $r=0.10, P=0.027$ ). In other words, up to $10 \%$ of the spread $\left(0.32^{2}\right)$ of species along the primary axis of variation was associated with individual climate variables, whereas very little of the spread along the second axis was related to climate. Together, MAT, rainfall, PET and irradiance explained $18 \%$ of variation along PCA1 (multiple regression analysis; details not shown).

Climate correlations with PCA1 were almost identical when the analysis was rerun for the same group of species but with just LMA, $\mathrm{A}_{\text {mass }}$ and LL (i.e. $\mathrm{N}_{\text {mass }}$ was excluded). In this analysis, PCA2 was strongly, positively correlated with rainfall ( $r=0.44, P<0.001$ ) and more weakly associated with MAT ( $r=0.14, P=0.003$ ), VPD and PET (both $r=-0.12, P=0.010$ ). That is, once $\mathrm{N}_{\text {mass }}$ was added to the analysis, the amount of variation orthogonal to the primary axis that was explained by climate became much less.

Rerunning both of these analyses for evergreen species only ( $n=247$ for these four traits), climate explained a similar proportion of variation along PCA1 but substantially more variation along PCA2, particularly by site rainfall (details not shown). That is, climate-related patterning of multivariate trait relationships along PCA1 was not simply due to sorting of growth forms or PFTs across climate gradients, whereas to some degree, the scatter in the orthogonal axis PCA2 was masked by sorting of PFTs.

## DISCUSSION

The geographical coverage of our data set is broad, extending to all vegetated continents. For traits such as leaf N and LMA, we now have data for almost $1 \%$ of vascular plants. For traits such as photosynthetic capacity or leaf life span, we have considerably fewer data (c. 750 species), and we have very few data for any leaf traits from large areas such as central and northern Africa, Russia, China and Canada. Nonetheless, the coverage of traits, species and sites is considerably greater than previous data compilations. This enabled us to (1) confirm and generalize to global scale some previously reported relationships between leaf traits and climate; and (2) report a number of novel results, especially concerning the modulation of leaf trait relationships by climate.

## Relationships between individual leaf traits and climate

Ecologists have long recognized that species inhabiting arid and semiarid regions tend to have leathery, high LMA leaves (e.g. Maximov, 1929). Construction cost per unit leaf mass varies relatively little between species (Villar \& Merino, 2001); hence, building high LMA leaves is more costly per unit leaf area. Leaf
traits associated with high LMA (e.g. thick leaf blade; small, thick-walled cells) have been interpreted as adaptations that allow continued leaf function under very dry conditions, or at least postpone leaf death, at least in evergreen species. However, at the global scale, we found that LMA was only very weakly related to rainfall; it was not until variation in MAT was controlled that the expected negative relationship between LMA and rainfall was observed. This appeared to reflect the fact that both LMA and MAT, and MAT and rainfall, were positively correlated. For these relationships, the trends seen among evergreen trees and shrubs differed from those seen among deciduous species: among evergreens LMA was negatively correlated with both MAT and rainfall, whereas among deciduous species LMA increased with MAT and showed no relationship to rainfall. The LMA-MAT trend in deciduous species can be best understood as relating to leaf life span: growing season length decreases with decreasing MAT, hence, on average, LL does too.
The strongest correlation between any single climate variable and either LL or LMA was with site irradiance (see also Niinemets, 2001). The LMA trend also drove a trend of increasing $\mathrm{N}_{\text {area }}$ with irradiance. High $\mathrm{N}_{\text {area }}$ in species from high irradiance sites is generally thought to allow plants to take advantage of the high light for photosynthesis, without significant internal self-shading of chloroplasts (Mooney et al., 1978; Cunningham et al., 1999; Farquhar et al., 2002).

Many high irradiance regions are also arid. However, across the 175 sites in this study, the two variables were unrelated because there were a number of cold sites that have both low rainfall and low irradiance. Indeed, considering only the 127 sites with MAT $>10^{\circ} \mathrm{C}$, rainfall and irradiance were negatively correlated ( $r^{2}=0.16, P<0.001$ ). On average, $\mathrm{N}_{\text {area }}$ decreased with increasing rainfall, this effect being independent of that with irradiance. High $\mathrm{N}_{\text {area }}$ has previously been described as an adaptation to low rainfall: in shrubs and trees from both Australia and the USA, high $\mathrm{N}_{\text {area }}$ in low rainfall species has been linked to greater $\mathrm{CO}_{2}$ drawdown during photosynthesis, leading to more economic use of water for carbon fixation (Wright et al., 2001, 2003). In the eastern Australian low rainfall species, high $\mathrm{N}_{\text {area }}$ was also associated with generally softer leaf tissue which, in turn, was argued to lead to the observed trend of shorter leaf life span at a given LMA with decreasing rainfall (Wright \& Westoby, 2002). Here we have demonstrated a similar pattern in LL-LMA relationships with rainfall, at the global scale. In addition, we found that the slope of LL-LMA relationships became flatter with increasing site MAT, VPD, PET and irradiance.

## Modulation of trait relationships by site climate

The climate-related shifts in leaf trait relationships were quite substantial. While there was no difference in LL-LMA relationship slope with rainfall (with a common $\log -\log$ slope of 1.7 , $95 \%$ CIS, 1.6-1.8), at a given LMA mean LL was 8 -fold shorter at the lowest rainfall sites than at the highest rainfall sites. A different type of trend was seen with the other climate variables: with increasing MAT, VPD, PET or irradiance, LL-LMA relationships became flatter, dropping from slopes of 2.3 or more in the lowest

MAT, VPD, PET or irradiance classes to 1.3 or less in the hottest/ driest/highest irradiance classes. For a twofold increase in LMA, this translates into a c. 5 -fold increase in LL at the coldest sites vs. a 2.5 -fold increase in LL at the hottest sites. Similarly, the slope of $\mathrm{A}_{\text {mass }}-\mathrm{N}_{\text {mass }}$ relationships tended to become flatter with increasing MAT, VPD, PET or irradiance, dropping from slopes of $c .2$ down to c. 1.4 across the set of climate bands. Presumably, LL-LMA and $\mathrm{A}_{\text {mass }}-\mathrm{N}_{\text {mass }}$ shifts of this magnitude (in either slope elevation or slope) must have important consequences for the dry mass and nutrient economics of plants, and reflect adaptation or plant responses to substantial selective pressures.

All else being equal, a $\operatorname{logLL}-\log L M A$ slope $>1$ (e.g. Table 3) implies that the 'light capture area-months' (leaf area $\times$ duration) per gram leaf of high LMA species was greater than for low LMA species. If this is translated directly into a fitness benefit, it might lead to a runaway selection for ever increasing LMA and LL. So why does this not happen? Suggested reasons favouring low LMA, short LL species sufficiently to counteract the slopes being > 1 (Westoby et al., 2000), include: (1) a compound-interest effect (Harper, 1989), whereby low LMA species fix more carbon earlier, with reinvestment of this carbon in new leaves then generating more total growth; (2) reduced revenue from older leaves as a result of overshading by both surrounding vegetation and the plant itself; (3) reduced revenue from older leaves, as a result of damage from herbivores and the accumulation of algae, fungi, debris, etc. on the leaf surface; and (4) the risk that the plant will no longer be alive to benefit. But would any of these factors vary systematically with MAT, VPD, PET or irradiance, providing a prospective explanation for the trends in LL-LMA slopes that we observed? It is likely that both the pace of overshading and the accumulation of fungi and algae on leaf surfaces would be lower in drier environments, where growth is generally slower for all species. However, we are not aware of any direct measurements comparing the relative importance of these possible factors, so we are limited to conjecture at this stage.

## Coordination of multiple leaf traits

All else being equal, the downwards shift in LL with decreasing rainfall (at a given LMA) would lead to lower lifetime carbon gain per unit leaf area. Yet with decreasing rainfall, we also observed a concomitant upwards shift in $\mathrm{A}_{\text {mass }}$ (again, at a given LMA) which, all else being equal, should lead to higher lifetime carbon gain per unit leaf area. Comparing species from the highest with those from the lowest rainfall classes, the 8 -fold shift in LL would be likely, on the face of it, to override the 3-fold $A_{\text {mass }}$ shift. But $\mathrm{A}_{\text {mass }}$ describes the photosynthetic rate achievable by relatively young leaves, under high light and well-watered conditions, rather than the average photosynthetic rate over the lifetime of a leaf. If low rainfall species have a slower age-related decline in photosynthetic rates as a result of less self-shading (via their generally more open canopies), this could at least partially offset the downwards shift in leaf life span. Further investigation of these sorts of trends would require a combination of detailed field measurements and modelling of architecture and carbon gain at the canopy-level (Naumburg et al., 2001).

To develop realistic models, we need to understand better the way plants coordinate multiple leaf traits (Shipley \& Lechowicz, 2000; Givnish, 2002). Were the slope shifts in LL-LMA and $\mathrm{A}_{\text {mass }}-$ $\mathrm{N}_{\text {mass }}$ relationships expressions of the same underlying factors or of pressures? What about the elevation shifts with rainfall in LLLMA and $\mathrm{A}_{\text {mass }}-$ LMA relationships? Considering three or more traits at a time, we found that individual climate variables explained a similar amount of variation along the first multivariate principal component axis whether or not $\mathrm{N}_{\text {mass }}$ was included in the analysis. By contrast, climate explained considerably less variation along the second principal component once $\mathrm{N}_{\text {mass }}$ was added to the analysis after LL, LMA and $\mathrm{A}_{\text {mass }}$. This observation builds on those of Reich et al. (1997), who found that differences in the slope or elevation of leaf trait relationships between biomes largely disappeared with the addition of additional leaf traits as covariates to the regression models used in that study. That is, shifts in one trait relationship may counteract shifts in one or more other trait-pairs, leading to little apparent effect of climate once several leaf traits are considered.

## CONCLUSIONS

Here we have reported a number of very broad relationships between leaf traits and climate, and climate-related trends in the relationships among leaf traits. Of the trait relationships examined here, that between $L L$ and $A_{\text {mass }}$ showed the least modulation by climate, probably reflecting the fact that this trait-pair was also the most tightly correlated, considered across all species. But the climate-related trends in other trait-pairs were of sufficient size to strongly influence predictions of how vegetation and ecosystem function will be affected by climate change. Still, scaling up from leaf-level to the level of whole canopies or forests remains a significant challenge. For example, leaf trait relationships may also be modified by soil nutrients (Wright et al., 2001; Niinemets \& Kull, 2003), and relatively little is known about the extent to which relationships among key root or whole-plant traits are affected by site factors. Further, matching trait data with information on the relative abundance of species and with ecosystem properties such as rates of nutrient cycling through communities (Garnier et al., 2004) not only represents an exciting challenge, but is also the sort of information that will greatly enhance future vegetation-climate models.

## ACKNOWLEDGEMENTS

We thank the many researchers who generously provided additional information about their study sites and published data. This study was partially supported by grants from the Australian Research Council and from the US National Science Foundation (NSF/DEB 9411972, 0080382 and NSF 0128958).

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