## RESEARCH ARTICLE

# Nutritional Correlates of Koala Persistence in a Low-Density Population 

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Citation: Stalenberg E, Wallis IR, Cunningham RB, Allen C, Foley WJ (2014) Nutritional Correlates of Koala Persistence in a Low-Density Population. PLoS ONE 9(12): e113930. doi:10. 1371/journal.pone. 0113930

Editor: Elissa Z. Cameron, University of Tasmania, Australia

Received: December 16, 2013
Accepted: November 2, 2014
Published: December 3, 2014
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Funding: IW and WF received a grant from New South Wales (NSW) Department of Environment, Climate Change \& Water. The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Competing Interests: The authors have declared that no competing interests exist.


#### Abstract

It is widely postulated that nutritional factors drive bottom-up, resource-based patterns in herbivore ecology and distribution. There is, however, much controversy over the roles of different plant constituents and how these influence individual herbivores and herbivore populations. The density of koala (Phascolarctos cinereus) populations varies widely and many attribute population trends to variation in the nutritional quality of the eucalypt leaves of their diet, but there is little evidence to support this hypothesis. We used a nested design that involved sampling of trees at two spatial scales to investigate how leaf chemistry influences free-living koalas from a low-density population in south east New South Wales, Australia. Using koala faecal pellets as a proxy for koala visitation to trees, we found an interaction between toxins and nutrients in leaves at a small spatial scale, whereby koalas preferred trees with leaves of higher concentrations of available nitrogen but lower concentrations of sideroxylonals (secondary metabolites found exclusively in eucalypts) compared to neighbouring trees of the same species. We argue that taxonomic and phenotypic diversity is likely to be important when foraging in habitats of low nutritional quality in providing diet choice to tradeoff nutrients and toxins and minimise movement costs. Our findings suggest that immediate nutritional concerns are an important priority of folivores in low-quality habitats and imply that nutritional limitations play an important role in constraining folivore populations. We show that, with a careful experimental design, it is possible to make inferences about populations of herbivores that exist at extremely low densities and thus achieve a better understanding about how plant composition influences herbivore ecology and persistence.


## Introduction

It is widely postulated that nutritional factors drive bottom-up, resource-based patterns in herbivore ecology, distribution and abundance [1, $\underline{2}$ ]. The nutritional quality of leaves for herbivores is largely determined by leaf chemistry and is influenced by the complex interactions between the types and amounts of nutrients and toxic chemicals in leaves. Although it is clear that leaf chemistry impacts the feeding behaviour of captive herbivores [3-6], it is still unclear how free-living herbivores respond to variations in leaf chemistry. Leaf chemistry can vary at different spatial scales, from tree-to-tree variations between and among species [7] to larger-scale patches of high and low nutritional quality habitats across a landscape $[\underline{8}, \underline{9}]$. Foraging behaviours of animals are also scale-dependent, where folivores make small-scale decisions to choose desired individual trees and navigate at a larger scale between habitat patches [10, 11]. It is often assumed that factors that determine small-scale habitat choices will influence the larger scale movements and ecology of animals; however few studies have examined this question [12, 13].

Animals simultaneously need many different nutrients. Optimal foraging theory predicts that animals choose foods in order to maximise their intake of energy-rich substrates per unit time feeding [14, 15]. However recent studies using the Geometric Framework [6, 16, 17] suggests that animals aim for an intake target that meets their requirement for protein, while satisfying the requirements for energy and other vitamins and minerals in the process. Compared to the diets of carnivores, plant parts contain low concentrations of essential nutrients such as amino acids (measured as nitrogen, N ) and are simultaneously defended by a variety of potentially toxic plant secondary metabolites (PSMs). Toxic PSMs invoke metabolic costs either directly [ $\underline{5}, \underline{18}, \underline{19}]$ or indirectly such as by forming indigestible complexes with nutrients to reduce their availability [ $\underline{5}, 20$ ]. Tannins in particular can reduce the availability of protein to animals [21,22]. The use of tannin-blocking agents (such as polyethylene glycol 4000, PEG) with in vitro digestion of leaves has recently been suggested as a simple way to measure the proportion of the total foliar protein that an animal can digest, termed 'available nitrogen' or 'available N' [22-24]. Recent studies suggest available N could be an important factor limiting population densities of wild herbivores [25].

The ability of wild herbivores to tolerate, avoid or detoxify leaf chemicals while meeting their nutrient requirements is thought to ultimately determine their fitness [26]. Experimental studies of herbivores in captivity have revealed a wealth of information on the feeding behaviour of individual animals in response to specific leaf compounds. For example, no-choice feeding experiments of captive marsupial folivores have highlighted one group of toxic PSMs in eucalypts as particularly important feeding deterrents: the formylated phloroglucinol compounds (FPCs) [19, 27-32]. FPCs are present only in Eucalyptus species of the Symphyomyrtus subgenus [33], which is considered the preferred subgenus of our study organism, the koala (Phascolarctos cinereus) [34]. Captive animals will balance the toxic effects of PSMs like FPCs, terpenes and tannins against the
benefits of obtaining nutrients by choosing nutrient-rich foods [32], reducing intake [19, 35, 36], increasing time between feeding bouts [30, 37] and by mixing food sources containing toxins metabolised by different pathways [20, 29, 31]. It is largely unknown, however, to what extent free-living folivores behave similarly and the consequences for folivore populations [38].
The koala is an iconic eucalypt specialist and has a varying population status across its range in eastern Australia and so is an excellent study organism to investigate the bottom-up effects of nutritional factors. The koala persists largely in declining or stable, small and low-density populations in the north of its range in New South Wales and south east Queensland [39-42]; while in the south, such as in Victoria and on offshore islands, there are many translocated populations of koalas that now persist at such high densities that they are considered pests [43, 44]. Many attribute these regional population trends to variation in the nutritional quality of the eucalypt leaves of their diet [45-47], but there is little evidence supporting this hypothesis. The difficulties and costs associated with large-scale field studies and subsequent chemical analyses are major barriers to research on folivores [48] and cause most researchers to disregard complex leaf chemistries and intraspecific differences and instead use tree species composition to define nutritional quality [46, 49-51]. Research on free-living koalas and other folivores is largely undertaken on high-density herbivore populations in highernutrient areas [52, 53]. In contrast, conservation and management efforts are focused on low-density, small and declining herbivore populations, often in lownutrient areas [41, 44] and it is not known to what extent inferences drawn from previous research can be applied in these circumstances.
In this paper, we examine the influence of leaf chemistry on the distribution and ecology of a low-density population of koalas in south east New South Wales, Australia. We use koala faecal pellets as a proxy for visitation to trees. Using a nested experimental design, we sample trees at two spatial scales to investigate whether differences in leaf chemistry of neighbouring trees influence which trees koalas visit (within-plot), and whether differences in the leaf chemistry of trees in different areas influence which areas koalas visit (between-plot).
We hypothesise that:

1) (a) Koalas visit the trees with higher concentrations of foliar available N , leaf digestibility and (b) lower concentrations of FPCs when compared with leaves from a neighbouring tree;
2) (a) Koalas visit the trees with higher concentrations of foliar available N , leaf digestibility and (b) lower concentrations of FPCs when compared with leaves from a tree at a different plot.

Our findings will allow us to examine how the feeding behaviours shown by captive herbivores in short-term feeding experiments translate to the behaviour and ecology of free-living herbivores in low-nutrient habitats and provide insight into how natural variations in food quality limit wild herbivore populations.

## Methods

## Study site

We studied koalas in the forests between Bermagui and Tathra on the far south coast of New South Wales ( $36^{\circ} 26^{\prime} \mathrm{S}, 150^{\circ} 00 \mathrm{E}$ and $36^{\circ} 34^{\prime} \mathrm{S}, 149^{\circ} 55^{\prime} \mathrm{E}, 0-450$ metres above sea level). The site ('Bermagui-Mumbulla') is approximately 22000 hectares and includes National Parks, State Forests and private land. These dry, open sclerophyll forests are primarily on Ordovician metasediments with small areas of tertiary deposits and alluvial deposits in the river and valleys. Although once common, koalas are now considered to be locally rare [54, 55] and in the last 10 years have been recorded only in the northern hillside forests of the region [42].
The research was approved by the NSW Department of Primary Industries (Special Purpose Permit for Research R20/98) and authorized under the NSW National Parks and Wildlife Act 1974, s132c, (Scientific License 101079). Access and sample collection on private land was approved by the land owners.

## Spot Assessment Technique survey (SAT)

The site was initially surveyed for koala distribution between 2007 and 2009 using the Spot Assessment Technique (SAT) [56]. At every SAT plot, 30 neighbouring trees of any species over 150 mm diameter at 1.3 m (Diameter at Breast Height, DBH) were marked and then searched for two minutes for koala faecal pellets out to 1 m from the base of the tree. At completion of the SAT survey, 590 plots with 17700 trees had been surveyed for pellets in a random grid pattern across the site. Only 60 SAT plots contained koala faecal pellets, suggesting that about $10 \%$ of the site was occupied by koalas at the time of this initial SAT survey. Although clustered in places, these occupied plots were widely scattered.

## Leaf collection protocol

Trees were sampled for this study from October to November 2009. Using a nested experimental design (Figure 1), we randomly selected 20 SAT plots where koala faecal pellets had been found ('occupied' plots) and paired each of these with a plot within 1 km with similar tree species and elevation where no faecal pellets had been found ('unoccupied' plots). In the field at each occupied plot, we identified all 30 trees that were part of the initial SAT survey and identified those trees where koala faecal pellets had initially been found (visited trees) and trees where no pellets had been found (non-visited trees). From each visited tree, we collected 50 g of fully expanded, mature leaves without signs of insect infestation. We then collected leaves from two non-visited, neighbouring trees (i.e. no record of faecal pellets from the SAT plot) for each visited tree; the first was a tree of the same species, and the second from a different Eucalyptus subgenus (either Symphyomyrtus or Eucalyptus subgenus). To compare visited trees with nonvisited non-neighbouring trees, we collected leaves from trees at the paired unoccupied plot, again collecting from a tree of the same species and from one of


Figure 1. Schematic of nested sampling design with tree and plot categories. Experimental sampling design showing the tree and plot categories. At Occupied Plots, trees visited by koalas (A) were grouped with one nearby and similar tree that had not been visited (B) and with one nearby tree of a different subgenus (C). Then, at a matched Unoccupied Plot, leaves were collected from a tree of the same species (D) and one of a different subgenus $(E)$ to Category $A$ trees.
doi:10.1371/journal.pone.0113930.g001
the different Eucalyptus subgenus for each visited tree. Thereby, every visited tree was grouped with four non-visited trees: two from the same occupied plot and two from the paired unoccupied plot (Figure 1). We searched all sampled trees for koalas, koala faecal pellets and measured DBH. After assessing that no koalas were nearby and that no other fauna were likely to be disturbed, leaves were collected from tree branches using a 12 gauge shotgun (MIROKU Model 10), a 0.204 calibre Ruger rifle (KIMBER Provarmint), or secateurs mounted on a 6 m telescopic aluminium pole. We placed leaves in individual paper bags and stored them in portable freezers.

## Leaf chemical analysis

We determined the concentrations of total nitrogen (total N ), available nitrogen (available N ), (the ranked effect of both tannins and fibre on leaf nitrogen concentration [23]), in vitro dry matter digestibility (DMD, a proxy for many nutrients) and FPCs in leaf samples from all sampled trees ( $\mathrm{n}=310$ ).

Frozen leaf samples were freeze-dried and ground to pass a 1 mm sieve in a Cyclotec 1093 mill (Tecator, Sweden). We determined the concentrations of FPCs in all Symphyomyrtus samples $(\mathrm{n}=168)$ following the method of Wallis and Foley [57]. The FPCs were extracted by sonicating $20 \pm 2 \mathrm{mg}$ of freeze-dried, ground foliage with a known mass (ca 4.5 g ) of solvent ( $7 \%$ water in acetonitrile containing $0.1 \%$ trifluoroacetic acid and 0.30 g per litre of the internal standard 2ethylphenol) for five min. The mixture was filtered $(0.22 \mu \mathrm{~m})$ into an autosampler vial and then $15 \mu \mathrm{~L}$ was injected onto a Wakosil $250 \times 4 \mathrm{~nm}$ GL 3C18RS (SGE Analytical: Ringwood, Australia) column maintained at $37^{\circ} \mathrm{C}$ with a flow rate of $0.75 \mathrm{~mL} / \mathrm{min}$ on a Waters Alliance Model HPLC. The FPCs were eluted under gradient conditions with $0.1 \%$ TFA acid in acetonitrile (A) and $0.1 \%$ TFA in water (B) as follows: $60 \% \mathrm{~A} / 40 \%$ B for 5 min , linear gradient to $90 \%$ A $10 \%$ B at 60 min , held for 10 min and returned to starting conditions over 10 min . We
measured the peak response at 275 nm and calibrated the concentration with standards purified in the laboratory.

We selected a representative subset $(\mathrm{n}=167)$ from all the leaf samples using their near-infrared reflectance spectra (NIRS) to analyse using an in vitro procedure [58]. The in vitro procedure involved incubation with polyethylene glycol (PEG), a tannin-blocking agent, together with pepsin and cellulase to rank trees with respect to the availability of N . The difference in the available N of samples digested with and without PEG is considered to be the effect of tannins. Using this method, we determined total leaf N , available N (the ranked effect of tannins and indigestible components of the diet on N ), and in vitro DMD. We quantified the concentration of N in the original sample and the digested residues using the Dumas technique with a LECO TruSpec combustion N analyser (LECO Corporation, Michigan, USA) calibrated with EDTA. We calculated residual moisture by oven drying $\left(60^{\circ} \mathrm{C}\right) 20$ samples to a constant mass to express all results on a dry matter (DM) basis.

## Near Infrared Reflectance Spectroscopy

We obtained NIR spectra between 408-1093 nm, and between 1108-2493 nm of all 310 samples in duplicate using a scanning spectrophotometer with a spinning cup module (NIR System Model 6500, Foss, Silver Springs, Maryland, USA). We developed NIRS calibration equations from the in vitro subset ( $\mathrm{n}=167$ ) to predict the foliar chemistry of the remaining samples. We randomly selected 20 samples to independently validate our NIRS predictions. All calculations used NIRS 3, version 4.00 (WinISI Infrasoft International, Port Matilda, Pennsylvania, USA). For most calibrations, we applied mathematical transformations of standard normal variate and detrend to raw near-infrared spectra to reduce the influence of particle size. We then used modified partial least squares regression and partial least squares regression with various combinations of Savitzy-Golay spectralsmoothing functions until the most robust equations were developed for each variable [59]. Relationships between NIR predicted values and the validation set were investigated using simple linear regressions and Pearson's correlation.

## Analyses and modelling of tree visitation

We fitted linear mixed models to the foliar compounds we measured using the residual maximum likelihood algorithm in GenStat $12^{\text {th }}$ Edition (VSN International, Ltd. Oxford, UK). This algorithm incorporates the fixed and random terms in the highly-nested study design to produce unbiased estimates of variance components and thus reduce the chance of type 1 error [ $\underline{60}, \underline{61] . \mathrm{We}}$ checked residuals for normality at each stage of the analysis.

We analysed each foliar compound individually by fitting Model (1) (below). This model incorporates all levels of nesting and spatial scale in the study design and therefore simultaneously investigates the relationships between leaf chemistry and koala visitation at the two spatial-scales. We fitted the model separately to
plants from each subgenus to compare the chemistry of visited trees to non-visited trees of the same species both within and between-plots. To identify which species contributed to the broader pattern, we used Model (1) with restriction on each species. Non-significant terms were sequentially dropped from the models to obtain simplified models with only significant fixed terms, determined using a Wald test of significance.

Terms used in the model of fixed effect included tree activity, tree category, plot category, subgenus, and plot activity. Tree (A-D) and plot category (occupied or unoccupied) terms are defined in Figure 1. The presence of faeces at the base of trees was a proxy for koala visitation and determined the tree and plot activity level. Tree activity number represented the number of times koala faecal pellets were found at the base of the tree (visited twice, once or not at all). Plot activity represented the relative koala activity at each plot. It was calculated as the percentage of trees searched at each site (out of 30 trees) that had faecal pellets. The random model included terms for the plot pair and tree group.

Model (1).
Response: Foliar compound
Fixed model: Constant + Plot activity + Plot type/Tree category + Tree activity + Subgenus

Random model: Plot pair/Plot type + Plot pair/Tree group
Foliar total N , available N and DMD concentrations approximated a normal distribution within all but one species: E. globoidea.

## Results

## Visitation to different tree species

Koalas visited 67 trees of 8 eucalypt species: E. longifolia, E. bosistoana, E. cypellocarpa, E. tricarpa from the Symphyomyrtus subgenus; and E. globoidea, E. muelleriana, E. agglomerata and E. sieberi from the Eucalyptus subgenus. They visited trees of the Symphyomyrtus subgenus more than they did the Eucalyptus subgenus (40 versus 27) even though the Eucalyptus subgenus comprised $58 \%$ of the eucalypt trees at the occupied plots. Koalas tended to visit the most common species at the occupied plots: E. longifolia (visited $n=24$ ), followed by the third most common species: E. globoidea (visited $\mathrm{n}=11$ ). They rarely visited $E$.
agglomerata (visited $\mathrm{n}=2$ ). We found fresh koala faecal pellets under six new trees and at 29 trees where pellets were found during the original SAT survey. We thus concluded that koalas revisited $43 \%$ of the trees they had visited previously. Three koalas were sighted during the SAT field work between 2007 and 2009 but none during leaf collection.

## Near-Infrared Reflectance Spectroscopy

The NIRS calibration equations developed for all compounds measured with the in vitro analysis had $\mathrm{R}^{2}$ values between 0.95 and 0.97 and 1-VR values between

Table 1. Description of modified partial least squares regression equations relating near infrared spectra of Eucalyptus leaves to analytical values ${ }^{\dagger}$.

| Constituent | $\mathbf{N}$ | Mean | SD | $\mathbf{R}^{2}$ | SECV | 1-VR | Scatter | Data processing |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Total N | 162 | 1.06 | 0.16 | 0.97 | 0.04 | 0.95 | SNV Detrend | 2441 |
| DMD with PEG | 160 | 64.60 | 9.8 | 0.95 | 3.1 | 0.90 | SNV Detrend | 2641 |
| DMD | 159 | 65.50 | 9.4 | 0.96 | 2.6 | 0.92 | None | 2441 |
| Available N with PEG | 160 | 0.84 | 0.15 | 0.95 | 0.05 | 0.90 | SNV Detrend | 2441 |
| Available N | 160 | 0.72 | 0.24 | 0.96 | 0.07 | 0.92 | SNV Detrend | 2641 |

${ }^{\dagger} \mathrm{N}$ number of samples used in the equation, $\mathrm{R}^{2}$ the coefficient of determination between the spectra and the analytical values, SECV the standard error of cross validation, 1-VR coefficient of determination of cross validation; Scatter: no scatter correction or "standard normal variate and detrend"; "Data processing" provides details of the derivation and smoothing functions applied. For example, "2,4,4,1" refers to using the second derivative, leaving a gap of four wavebands between calculated values, doing a first smoothing over four wavebands and then a second smoothing over one waveband.
doi:10.1371/journal.pone.0113930.t001
0.90 and 0.95 (Table 1). The predicted values were significantly correlated with analysed concentrations of the validation set ( $\mathrm{n}=20, \mathrm{P}<0.001$, Pearson's correlation coefficients for available $\mathrm{N}: 0.930$; $\mathrm{DMD}: 0.890$; available N in the presence of PEG: 0.954 ; DMD in the presence of PEG: 0.973 ; and total $\mathrm{N}: 0.962$ ).

## Effects of leaf chemistry on koala preference

The models revealed that koalas visited trees that had higher nutritional quality compared with a neighbouring tree of the same species (Tables 2 and 3). Koalas preferred trees of the Eucalyptus subgenus with higher concentrations of available $\mathrm{N}(16 \%$ higher, $\mathrm{P}=0.003)$ and higher $\mathrm{DMD}(4 \%$ higher, $\mathrm{P}=0.040)$ compared with concentrations in neighbouring conspecifics (Table 2, Figure 2), but were not influenced by the total N concentration in leaves. This effect was particularly evident among the E. sieberi trees visited by koalas, where the species-restricted model revealed a statistical significant difference between visited and non-visited trees $(\mathrm{P}=0.005, \mathrm{~N}=23,9$ visited). The Symphyomyrtus trees visited twice had foliage with significantly lower sideroxylonal concentrations compared with neighbouring conspecifics ( $41 \%$ lower, $\mathrm{P}=0.016$ ) (Table 3, Figure 3). Concentrations of the other FPCs, available N , total N and DMD were not significantly related to koala visitation to Symphyomyrtus trees, but the models suggested that the trees visited twice by koalas had lower total FPC and higher available N concentrations than did their neighbouring conspecifics ( $\mathrm{P}=0.077$ and 0.094 respectively).

Table 2. Summary of REML model results for statistically significant foliar attributes in trees of the subgenus Eucalyptus.

| Eucalyptus subgenus trees |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Foliar attribute | Predicted mean ( $\pm$ s.e.m. \% DM) of trees visited at least once | \% Difference of trees visited at least once to other categories | Wald statistic for fixed effects | d.f. | P-value ${ }^{\dagger}$ |
| Available N | 0.61 ( $\pm 0.03)$ | +16 | 9.93 | 1 | 0.003* |
| DMD | $62.79( \pm 1.28)$ | +4 | 4.53 | 1 | 0.040* |

${ }^{\dagger} \mathrm{P}$-values that were statistically significant at $\mathrm{P}<0.05$ are marked with asterisks.
doi:10.1371/journal.pone.0113930.t002

Table 3. Summary of REML model results for statistically significant foliar attributes in trees of the subgenus Symphyomyrtus.

| Symphyomyrtus trees |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Foliar attribute | Predicted mean ( $\pm$ s.e.m. mg/g DM) of trees visited twice | \% Difference of trees visited twice to other categories | Wald statistic for fixed effects | d.f. | P-value ${ }^{\dagger}$ |
| Sideroxylonals | $3.77( \pm 1.07)$ | -41 | 6.10 | 1 | 0.016* |
| Total FPCs | 22.80 ( $\pm 2.79)$ | -18 | 3.19 | 1 | 0.077 |
| Available N | $0.85( \pm 0.04)$ | +7 | 2.87 | 1 | 0.094 |

${ }^{\dagger} \mathrm{P}$-values that were statistically significant at $\mathrm{P}<0.05$ are marked with asterisks.
doi:10.1371/journal.pone.0113930.t003

The leaf chemistry of trees in occupied plots did not differ significantly from the leaf chemistry of conspecifics in unoccupied plots. Variations in leaf chemistry were not related to differences in plot activity (how many trees were visited by koalas at each plot) or plot type (visited or non-visited) in the REML modelling. Therefore, leaf chemistry explained why koalas visited particular trees, although did not explain why koalas visited different locations.

## Comparisons of leaf chemistry between tree species

Species from the Eucalyptus subgenus had lower concentrations of available N in their leaves than did those from the Symphyomyrtus: however there was considerable between and within species variation. Total foliar N can be split into three components that show the ranked effect of tannins and fibre on N availability: available N , tannin-bound nitrogen and fibre-bound nitrogen (Figure 4). The leaves of two Symphyomyrtus species: E. bosistoana and


Figure 2. Available $\mathbf{N}$ concentrations in leaves from Eucalyptus subgenus trees in the REML model categories. Available N concentrations in the leaves of Eucalyptus subgenus trees in the three visitation categories used in the REML subgenus-specific model. Visited trees are trees that were visited by koalas, notvisited trees are neighbouring conspecifics from the same plot that were not visited by koalas, and unoccupied-plot trees are conspecifics from unoccupied plots. ${ }^{\text {a }}$ Significantly different from other categories ( $\mathrm{P}<0.05$ ).
doi:10.1371/journal.pone.0113930.g002


Figure 3. Sideroxylonal concentrations in leaves from Symphyomyrtus subgenus trees in the REML model categories. Sideroxylonal concentrations in the leaves of Symphyomyrtus subgenus trees in the four visitation categories used in the REML subgenus-specific model. The categories are trees that were visited twice by koalas (pellets found twice), trees that were visited once by koalas (pellets found once), neighbouring conspecifics from the same plot that were not visited, and conspecifics from unoccupied plots. ${ }^{\text {a }}$ Significantly different from other categories ( $\mathrm{P}<0.05$ ).
doi:10.1371/journal.pone.0113930.g003
E. cypellocarpa tended to have the highest available N , and the leaves of two Eucalyptus subgenus species: E. agglomerata and E. sieberi tended to have the lowest available N concentrations of the eight species. Eucalyptus tricarpa leaves tended to have higher concentrations of sideroxylonals and Eucalyptus cypellocarpa leaves had lower concentrations of sideroxylonals and total FPCs compared with the other Symphyomyrtus species (Figure 5).

## Discussion

Using a nested design that involved sampling at two spatial scales we show that koalas are influenced by an interaction between toxins and nutrients in leaves. Koalas visited trees with leaves containing higher available N and avoided trees with higher foliar sideroxylonal concentrations when compared with a neighbouring tree of the same species. This result supports hypotheses 1) (a) and (b) and suggests that koalas in low-nutrient habitats prioritise nutritional concerns when selecting individual eucalypt trees to visit. In contrast, the leaf chemistry of visited trees at occupied plots did not differ from that of paired trees at the unoccupied plot, suggesting that leaf chemistry did not influence the koalas at this broader spatial scale and refuting hypotheses 2) (a) and (b).

## Diet selection by free-living herbivores

The Bermagui-Mumbulla site encompasses typical eucalypt forests that contain a mixture of species from the two main eucalypt subgenera - Symphyomyrtus and


Tannin-bound
Available

Figure 4. Components of total foliar $\mathbf{N}$ concentration for the two subgenera and each species. The proportions of the three chemical components that make up total foliar N concentration (\% dry matter $\pm$ standard error of the mean, s.e.m.) in the two subgenera and in individual species. Total N is made up of the three components: proportion bound to indigestible fibre (shown in white), proportion bound to tannins (shown in grey) and the amount of N available to animals (available N , shown in black).
doi:10.1371/journal.pone.0113930.g004
Eucalyptus. Symphyomyrtus species have leaves that contain FPCs and high concentrations of these compounds are toxic to herbivores [62]. In contrast, species from the Eucalyptus subgenus do not produce FPCs but the leaves contain lower concentrations of available N and more indigestible material than do those of Symphyomyrtus. In both subgenera, leaf chemistry was highly variable among trees of the same species [33,48] and folivores may take advantage of this intraspecific variation to meet their nutritional requirements from the available trees [5, 19]. When visiting species from the Eucalyptus subgenus, koalas selected individual trees with higher foliar concentrations of available N and DMD, although not total N , when compared with a neighbouring tree of the same species. In contrast, variations in concentrations of a single FPC, sideroxylonal, determined visits by koalas to Symphyomyrtus trees.

Our results reveal a tradeoff between toxins and nutrients in diet choice. The consumption of leaves from trees containing lower concentrations of available N


Figure 5. Mean concentrations of total sideroxylonal and total FPC concentrations in the four Symphyomyrtus species. Mean concentrations ( $\pm$ s.e.m.) of total sideroxylonal and Total FPCs in the four Symphyomyrtus species. Part A. Total sideroxylonal concentrations; Part B. Total FPC concentrations.
doi:10.1371/journal.pone.0113930.g005
is driven by the avoidance of FPCs; while in turn, the consumption of leaves from trees with higher concentrations of available N is driven by the need to avoid consuming large quantities of gut-filling indigestible tissues before nutrient targets are met [63-65]. A series of studies on a free-living high-density population of koalas at Phillip Island in Victoria reveal a similar tradeoff between nutrients and toxins in koala feeding choices. Koala visitation to two tree species of the Symphyomyrtus subgenus was found to be related to low concentrations of total FPCs and higher total N concentrations [62, 66]. When feeding bouts were directly measured, researchers found that the koalas spent more time feeding in particular trees with higher concentrations of foliar available N when the concentration of FPCs was low, but had consistent short feeding bouts across different available N concentrations at high FPC concentrations [67]. The tradeoff between nutrients and toxins reflect the high protein and energy costs associated with detoxification and the limited capacity and efficiency of detoxification pathways [20, 68]. For example, the cost of detoxifying a single PSM, benzoate
(a common plant secondary metabolite) was found to be about $20 \%$ of the total digestible protein intake of common brushtail possums [69]. This is a dramatic tax on protein intake and suggests that higher concentrations of available N in Symphyomyrtus may assist koalas to defray these costs [67].

Herbivores are limited in their ability to meet nutritional goals by their gut capacity, food retention times and the capacity and efficiency of detoxification pathways [20]; as well as by their ability to move safely and efficiency through the landscape [70]. In most cases, few individual trees have leaves that meet all the nutritional needs of a folivore at once and so animals must either accept the costs of a sub-optimal diet or switch to another food source to meet nutrient targets and avoid or dilute the effect of toxins [20]. Koalas are larger and less mobile than many other arboreal folivores and are particularly vulnerable to predation when moving on the ground between trees [71]. In captive feeding experiments, foraging efficiency and overall intake was increased when generalist herbivores were given access to a range of plants with diverse leaf chemical profiles in a small area [31, 72, 73]. Koalas are dietary specialists, however we found substantial differences in the amounts and types of chemical compounds in leaves of neighbouring Eucalyptus trees, even between trees of the same species, and we predict that this diversity provides koalas with sufficient choice to allow them to select a suitable and varied diet while minimising movement costs. This taxonomic and phenotypic diversity of trees is likely to be particularly important in low-quality habitats because there may be great distances between richer resources and so folivores are compelled to make direct tradeoffs to address immediate concerns at a small-spatial scale [4].

## Habitat quality influences herbivore populations

Demonstrating the link between nutritional constraints and population processes in wild herbivores remains a challenging but essential task. A major difficulty is the lack of a common currency and methodology in which to measure plant nutritional quality [38]. Ecologists have sought to define nutritional quality using a variety of metrics such as soil fertility [9, 74], leaf protein concentrations [9, 46], and a ratio of leaf protein to fibre concentrations [75]. These simple metrics and ratios fail to adequately capture the complex plant chemistries in the food of mammalian herbivores, in particular the effect of tannins on the availability of protein [22]. In contrast, available N accounts for the multivariate nature of herbivore nutrition and so is a more appropriate method to describe food quality from an herbivore's perspective [22, 23].

Our study allowed us to make inferences about the role of leaf chemistry in influencing low-density herbivore populations and thus contributes to our understanding of how nutrition regulates populations of herbivorous mammals. Our foliar available N assays support the view that Bermagui-Mumbulla is of lower nutritional quality than other parts of the koala's range. The occupied plots were dominated by the species of the Eucalyptus subgenus that contain lower concentrations of available N. Eucalyptus longifolia was the dominant species of
the Symphyomyrtus subgenus and showed only moderate available N values. Trees from the subgenus Eucalyptus visited by koalas had leaves with mean available N concentrations of $0.61 \pm 0.03 \%$ DM. In contrast, trees of the Symphyomyrtus subgenus that were visited had mean foliar available N concentrations of $0.85 \pm 0.04 \% \mathrm{DM}$. In comparison, Marsh and colleagues [67] found that trees visited by koalas at Phillip Island had available N concentrations above 1.15\% DM. Small differences in foliar available N in trees available to wild folivores have been shown to have significant impacts on population dynamics and reproduction. For example, common brushtail possums (Trichosurus vulpecula) inhabiting home ranges with low average concentrations of available N had lower reproductive success and slower growing offspring than did possums occupying home ranges with higher nutritional quality [25]. Similarly, McArt and colleagues [76] reported lower fecundity and twinning rates in moose where the available N concentrations of summer food was lower. The biomass of folivorous primate communities in Africa and Asia can been largely explained by the ratio of leaf protein-to-fibre [75, 77-79] but recent evidence suggests that tannins also play an important regulating role for folivorous primates [ $\underline{22}, \underline{80}$ ].

## Mechanisms regulating population expansion

The degree to which habitats will limit herbivore populations is determined by the overall quality and diversity of the trees available [4]. Animals in low-quality forests may be unable to obtain the necessary nutrients for population expansion, whereas low-diversity forests limit an herbivore's ability to select foods with different chemical profiles to achieve a varied diet. Digestion and PSM detoxification of low-quality leaf diets consumes more time, energy and nutrients when compared to a leaf diet that is rich in nutrients and low in fibre and toxins [5] and this additional time, energy and nutrients would otherwise be allocated to other activities such as social interaction and reproduction [81, 82]. Nutritionally stressed animals reduce activity and mobility which in turn compels animals to choose nearby resources that are more accessible, even if these accessible resources are of sub-optimal nutritional quality [ $\underline{4}, \underline{12}, \underline{83}]$. Low reproductive output and lower levels of activity increase vulnerability to both ongoing and stochastic threats and suggests a mechanism by which herbivore population dynamics are driven by bottom-up factors. Lunney and colleagues modelled population dynamics in two koala populations in north east NSW and found that small changes in mortality and fertility rates, in particular the death of one breeding female, had a major impact on population viability [ $\underline{71,84 \text { ]. }}$

Koalas were once common throughout south eastern Australia but a range of factors, particularly hunting for pelts and the clearing of the more fertile lands for agriculture, drastically reduced koala numbers and relegated surviving animals to forests of lower soil fertility in many regions, including in the far south coast region of NSW [ $\underline{41}, \underline{44}, \underline{85}]$. Multiple threats continue to impact on koalas including habitat loss, degradation and fragmentation from logging, land clearing, roads and infrastructure [ $\underline{42}, \underline{47}, \underline{55}, \underline{86}]$ as well as environmental impacts from fire
and climate change (particularly drought and heatwaves) [46, 87]. Our findings suggest that immediate nutritional concerns are an important priority of south coast koalas making them particularly vulnerable to a range of threats, which in turn implies that nutritional limitations have played a role in constraining koala ecology and populations in the forests of the region. However, as there were no differences in leaf chemistry between trees at occupied and unoccupied plots and because koalas have disappeared from areas where they were once known to persist [42], it is possible that the low-density koala population may spread to parts of the forest not currently occupied if existing threats are controlled.

## Faecal pellets as a proxy of koala visitation

The extremely low density of the Bermagui-Mumbulla koala population (only three koalas seen during the extensive fieldwork) means that koala faecal pellets provide the sole clue of their distribution and habitat use. Faecal pellet surveys have been widely employed to investigate herbivore habitat use, ecology and population distribution in a range of species [88, 89]. Research on browsers in boreal forests of Sweden and in tropical forests of India, have found strong relationships between browse intensity, browse preference and habitat selection and the location and frequency of faecal pellets [ $\underline{90-92] .}$

Koala faecal pellets surveys have been employed as a proxy for a range of purposes from surveys of koala abundance and population distribution [93, 94] to developing habitat categorisation for conservation management [46, 50, 56, 95]. Koala faecal pellets have also been widely used to infer habitat and feed tree preferences [56, $\underline{96}, \underline{97}$ ], however their reliability to draw nutritional inferences is still in debate [98]. Koalas are known to visit unpalatable trees, such as Callitris glaucophylla in north western NSW, for non-dietary purposes such as thermoregulation [99, 100]. As a result, all studies that record koala tree visitation or use a proxy for feeding such as pellets, rather than observe feeding directly, are likely to include trees that koalas have not fed from. Marsh and colleagues [67] fitted radio and audio-telemetry collars to wild koalas to continuously monitor and quantify feeding activity. They found that koalas ate from $75 \%$ of the eucalypt trees they visited and confirmed the nutritional findings of Moore and Foley [62] from the same site whom recorded only koala visitation rather than feeding events. By restricting our study to eucalypts over 15 cm DBH, we ensured that all trees searched for pellets might be considered palatable to koalas. Koalas feed for only 0.9 to 4.7 hours per 24 hours [ $19, \underline{101}, \underline{102}$ ], of which $75 \%$ occurs at night [67], and deposit pellets continuously over 24 h . However peak deposition times have been found to coincide with peaks in feeding activity [67, 103], thereby increasing the reliability of pellets as indicators of feeding.

A second disadvantage of faecal pellets is that environmental heterogeneity may impact on rates of pellet decay and can lead to false negative results whereby pellets decay and disappear from some trees faster than others [103]. We accounted for this issue by searching our trees twice [98]; first in the initial SAT survey (method described by Phillips and Callaghan [56]), and second during leaf
collection. Many trees at Bermagui-Mumbulla had pellets during both these surveys which indicated that koalas had visited them more than once and show a fidelity to these trees. Koalas elsewhere establish stable home ranges and revisit trees that they have marked with their sternal scent gland [101, 104]. Thus, in spite of the disadvantages of using faecal pellets as a proxy for visitation and feeding, a careful statistical design accounts for this potential source of error and allows the identification and differentiation of trees that are important koala habitat resources and to discover vital ecological and nutritional information for the management of cryptic and vulnerable koala populations.

## Conclusions

This study showed that, with a careful experimental design, it is possible to make inferences about populations of herbivores that exist at extremely low densities and thus achieve a better understanding of how nutrition influences herbivore ecology and persistence. We identified a significant tradeoff between nutrients and toxins in the selection of individual trees at a small-spatial scale and found that available N was the key to understanding the selection of some trees. We argue that taxonomic and phenotypic diversity is likely to be important when foraging in habitats of low nutritional quality providing diet choice to tradeoff nutrients and toxins and minimise movement costs. Our findings support the assertion that immediate nutritional concerns are an important priority of folivores in lowquality habitats and imply that nutritional limitations play an important role in constraining folivore populations.

## Acknowledgments

The authors are especially grateful to Michael Saxon from the NSW Office of Environment and Heritage for his help in logistics, field work and local support and providing access to the SAT data. We would like to thank Rob Summers, Grant Brewer and Peter Kambouris and various helpers that were involved in the leaf collection field work. We also wish to thank the Forest Corporation of NSW (State Forests) and National Parks and Wildlife Service for providing permission to carry out the leaf collection. We are grateful to all residents in Bega Valley Shire and Narooma for permitting us to work on or near their property and supporting our study. The work was funded by a grant from NSW Office of Environment and Heritage to IRW and WJF.

## Author Contributions

Conceived and designed the experiments: ES RC WF IW CA. Performed the experiments: ES CA. Analyzed the data: ES RC IW. Contributed reagents/ materials/analysis tools: ES RC WF IW CA. Wrote the paper: ES RC WF IW CA.

## References

1. Hunter MD, Price PW (1992) Playing chutes and ladders - heterogeneity and the relative roles of bottom-up and top-down forces in natural communities. Ecology 73: 724-732.
2. Hairston NG, Smith FE, Slobodkin LB (1960) Community structure, population control, and competition. Am Nat 94: 421-425.
3. Behmer ST (2009) Insect herbivore nutrient regulation. Annu Rev Entomol 54: 165-187.
4. Iason G, Villalba JJ (2006) Behavioral strategies of mammal herbivores against plant secondary metabolites: the avoidance-tolerance continuum. J Chem Ecol 32: 1115-1132.
5. Dearing MD, Foley WJ, McLean S (2005) The influence of plant secondary metabolites on the nutritional ecology of herbivorous terrestrial vertebrates. Annu Rev Ecol Evol Syst 36: 169-189.
6. Simpson SJ, Sibly RM, Lee KP, Behmer ST, Raubenheimer D (2004) Optimal foraging when regulating intake of multiple nutrients. Anim Behav 68: 1299-1311.
7. Moore BD, Lawler IR, Wallis IR, Beale CM, Foley WJ (2010) Palatability mapping: a koala's eye view of spatial variation in habitat quality. Ecology 91: 3165-3176.
8. Andrew RL, Peakall R, Wallis IR, Foley WJ (2007) Spatial distribution of defense chemicals and markers and the maintenance of chemical variation. Ecology 88: 716-728.
9. Braithwaite LW, Turner J, Kelly J (1984) Studies on the arboreal marsupial fauna of eucalypt forests being harvested for woodpulp at Eden, NSW 3. Relationships between faunal densities, eucalypt occurrence and foliage nutrients, and soil parent materials. Aust Wildl Res 11: 41-48.
10. Garber PA (1989) Role of spatial memory in primate foraging patterns - Saguinus mystax and Saguinus fuscicollis. Am J Primatol 19: 203-216.
11. Laca EA, Sokolow S, Galli JR, Cangiano CA (2010) Allometry and spatial scales of foraging in mammalian herbivores. Ecol Lett 13: 311-320.
12. Searle KR, Hobbs NT, Gordon IJ (2007) It's the "foodscape", not the landscape: Using foraging behavior to make functional assessments of landscape condition. Isr J Ecol Evol 53: 297-316.
13. Prins H, van Langeveld $F$ (2008) Assembling a diet from different places. In: Prins H, van Langeveld $F$, editors. Resource ecology: spatial and temporal dynamics of foraging. Dordrecht: Springer. pp. 129-155.
14. Schoener T (1971) Theory of feeding strategies. Annu Rev Ecol Syst 2: 369-404.
15. Stephens D, Krebs J (1986) Foraging theory. Princeton: Princeton University Press.
16. Raubenheimer D, Simpson SJ, Mayntz D (2009) Nutrition, ecology and nutritional ecology: toward an integrated framework. Func Ecol 23: 4-16.
17. Simpson SJ, Raubenheimer D (1995) The geometric analysis of feeding and nutrition - a users guide. J Insect Physiol 41: 545-553.
18. Provenza FD (1996) Acquired aversions as the basis for varied diets of ruminants foraging on rangelands. J Anim Sci 74: 2010-2020.
19. Marsh KJ, Wallis IR, Foley WJ (2007) Behavioural contributions to the regulated intake of plant secondary metabolites in koalas. Oecologia 154: 283-290.
20. Freeland WJ, Janzen DH (1974) Strategies in herbivory by mammals - role of plant secondary compounds. Am Nat 108: 269-289.
21. Robbins CT, Hanley TA, Hagerman AE, Hjeljord O, Baker DL, et al. (1987) Role of tannins in defending plants against ruminants: reduction in protein availability. Ecology 68: 98-107.
22. Wallis IR, Edwards MJ, Windley H, Krockenberger AK, Felton A, et al. (2012) Food for folivores: nutritional explanations linking diets to population density. Oecologia 169: 281-291.
23. DeGabriel JL, Wallis IR, Moore BD, Foley WJ (2008) A simple, integrative assay to quantify nutritional quality of browses for herbivores. Oecologia 156: 107-116.
24. Felton AM, Felton A, Raubenheimer D, Simpson SJ, Foley WJ, et al. (2009) Protein content of diets dictates the daily energy intake of a free-ranging primate. Behav Ecol 20: 685-690.
25. DeGabriel J, Moore B, Foley W, Johnson C (2009) The effects of plant defensive chemistry on nutrient availability predict reproductive success in a mammal. Ecology 90: 711-719.
26. Simpson SJ, Raubenheimer D, Charleston MA, Clissold FJ (2010) Modelling nutritional interactions: from individuals to communities. Trends Ecol Evol 25: 53-60.
27. Marsh KJ, Foley WJ, Cowling A, Wallis IR (2003) Differential susceptibility to Eucalyptus secondary compounds explains feeding by the common ringtail (Pseudocheirus peregrinus) and common brushtail possum (Trichosurus vulpecula). J Comp Physiol B 173: 69-78.
28. Foley W, Lawler I, Moore B, Marsh K, Wallis I (2004) Diet selection in marsupial folivores of Eucalyptus: the role of plant secondary metabolites. In: Goldingay R, Jackson S, editors. The Biology of Australian Possums and Gliders. Chipping Norton: Surrey Beatty and Sons. pp. 207-221.
29. Marsh KJ, Wallis IR, Foley WJ (2005) Detoxification rates constrain feeding in common brushtail possums (Trichosurus vulpecula). Ecology 86: 2946-2954.
30. Wiggins NL, Marsh KJ, Wallis IR, Foley WJ, McArthur C (2006) Sideroxylonal in Eucalyptus foliage influences foraging behaviour of an arboreal folivore. Oecologia 147: 272-279.
31. Marsh KJ, Wallis IR, McLean S, Sorensen JS, Foley WJ (2006) Conflicting demands on detoxification pathways influence how common brushtail possums choose their diets. Ecology 87: 2103-2112.
32. Moore BD, Foley WJ, Wallis IR, Cowling A, Handasyde KA (2005) Eucalyptus foliar chemistry explains selective feeding by koalas. Biol Lett 1: 64-67.
33. Eschler BM, Pass DM, Willis R, Foley WJ (2000) Distribution of foliar formylated phloroglucinol derivatives amongst Eucalyptus species. Biochem Syst Ecol 28: 813-824.
34. Moore B, Wallis I, Marsh K, Foley W (2004) The role of nutrition in the conservation of the marsupial folivores of eucalypt forests. In: Lunney D, editor. Conservation of Australia's Forest Fauna. 2 ed. Mosman, NSW: Royal Zoological Society of New South Wales. pp. 549-575.
35. Alm Bergvall U, Leimar O (2005) Plant secondary compounds and the frequency of food types affect food choice by mammalian herbivores. Ecology 86: 2450-2460.
36. Marsh KJ, Wallis IR, Foley WJ (2003) The effect of inactivating tannins on the intake of Eucalyptus foliage by a specialist Eucalyptus folivore (Pseudocheirus peregrinus) and a generalist herbivore (Trichosurus vulpecula). Aust J Zool 51: 31-42.
37. Wiggins NL, McArthur C, McLean S, Boyle R (2003) Effects of two plant secondary metabolites, cineole and gallic acid, on nightly feeding patterns of the common brushtail possum. J Chem Ecol 29: 1447-1464.
38. DeGabriel JL, Moore BD, Ganzhorn JU, Stolter C, Wallis IR, et al. (2014) Translating nutritional ecology from the laboratory to the field: milestones in linking plant chemistry to population regulation in mammalian browser. Oikos 123: 298-308.
39. Melzer A, Lamb D (1994) Low density populations of the koala (Phascolarctos cinereus) in central Queensland. Proc R Soc Queensland 104: 89-93.
40. Sullivan BJ, Norris WM, Baxter GS (2003) Low-density koala (Phascolarctos cinereus) populations in the mulgalands of south-west Queensland. II. Distribution and diet. Wildl Res 30: 331-338.
41. Lunney D, Crowther MS, Shannon I, Bryant JV (2009) Combining a map-based public survey with an estimation of site occupancy to determine the recent and changing distribution of the koala in New South Wales. Wildl Res 36: 262-273.
42. Lunney D, Stalenberg E, Santika T, Rhodes JR (2014) Extinction in Eden: identifying the role of climate change in the decline of the koala in south-eastern NSW. Wildl Res 41: 22-34.
43. Masters P, Duka T, Berris S, Moss G (2004) Koalas on Kangaroo Island: from introduction to pest status in less than a century. Wildl Res 31: 267-272.
44. Menkhorst $\mathbf{P}$ (2006) Hunted, marooned, re-introduced, contracepted: a history of Koala management in Victoria. In: Lunney D, Munn A, Meikle W, editors. Too Close for Comfort: Contentious Issues in HumanWildlife Encounters. Mosman: Royal Zoological Society of New South Wales. pp. 73-92.
45. Phillips $\mathbf{S}$ (2000) Population trends and the koala conservation debate. Conserv Biol 14: 650-659.
46. Callaghan J, McAlpine C, Thompson J, Mitchell D, Bowen M, et al. (2011) Ranking and mapping koala habitat quality for conservation planning on the basis of indirect evidence of tree-species use: a case study of Noosa Shire, south-eastern Queensland. Wildl Res 38: 89-102.
47. Reed PC, Lunney D (1990) Habitat loss, the key problem for the long-term survival of koalas in New South Wales. In: Lunney D, Urquhart CA, Reed P, editors. Koala Summit: Managing Koalas in New South Wales. Sydney: NSW National Parks and Wildlife Service. pp. 9-31.
48. Foley WJ, Mcllwee A, Lawler I, Aragones L, Woolnough AP, et al. (1998) Ecological applications of near infrared reflectance spectroscopy - A tool for rapid, cost-effective prediction of the composition of plant and animal tissues and aspects of animal performance. Oecologia 116: 293-305.
49. Rhodes JR, McAlpine CA, Zuur AF, Smith GM, leno EN (2009) GLMM applied on the spatial distribution of koalas in a fragmented landscape. In: Zuur AF, leno EN, Walker N, Saveliev AA, Smith GM, editors. Mixed effects models and extensions in ecology with R. New York: Springer pp. 469-492.
50. Rhodes JR, Callaghan JG, McAlpine CA, De Jong C, Bowen ME, et al. (2008) Regional variation in habitat-occupancy thresholds: a warning for conservation planning. J Appl Ecol 45: 549-557.
51. Ellis WAH, Melzer A, Carrick FN, Hasegawa M (2002) Tree use, diet and home range of the koala (Phascolarctos cinereus) at Blair Athol, central Queensland. Wildl Res 29: 303-311.
52. Van Horne B (1983) Density as a misleading indicator of habitat quality. J Wildl Manag 47: 893-901.
53. Gaillard JM, Hebblewhite M, Loison A, Fuller M, Powell R, et al. (2010) Habitat-performance relationships: finding the right metric at a given spatial scale. Philos Trans R Soc B-Biol Sci 365: 22552265.
54. Lunney D, Esson C, Moon C, Ellis M, Matthews A (1997) A community-based survey of the koala, Phascolarctos cinereus, in the Eden region of South-eastern New South Wales. Wild Res 24: 111-128.
55. Lunney D, Leary $\mathbf{T}$ (1988) The impact on native mammals of land-use changes and exotic species in the Bega district, New-South-Wales, since settlement. Aust J Ecol 13: 67-92.
56. Phillips SJ, Callaghan J (2011) The Spot Assessment Technique: a tool for determining localised levels of habitat use by Koalas Phascolarctos cinereus. Aust Zool 35: 774-780.
57. Wallis IR, Foley WJ (2005) The rapid determination of sideroxylonals in Eucalyptus foliage by extraction with sonication followed by HPLC. Phytochem Anal 16: 49-54.
58. DeGabriel JL, Moore BD, Marsh KJ, Foley WJ (2010) The effect of plant secondary metabolites on the interplay between the internal and external environments of marsupial folivores. Chemoecology 20: 97108.
59. Anon (1995) Standard practices for infrared multivariate quantitative analysis (Designation E1655-94). Washington DC: American Society for Testing and Materials.
60. Moore BD, Wallis IR, Pala-Paul J, Brophy JJ, Willis RH, et al. (2004) Antiherbivore chemistry of Eucalyptus - Cues and deterrents for marsupial folivores. J Chem Ecol 30: 1743-1769.
61. Smyth GK, Verbyla AP (1996) A conditional likelihood approach to REML in generalized linear model. J R Stat Soc Series B Stat Methodol 58: 565-572.
62. Moore BD, Foley WJ (2005) Tree use by koalas in a chemically complex landscape. Nature 435: 488490.
63. Foley WJ, Cork SJ (1992) Use of fibrous diets by small herbivores - How far can the rules be bent? Trends Ecol Evol 7: 159-162.
64. Cork SJ, Hume ID, Dawson TJ (1983) Digestion and metabolism of a natural foliar diet (Eucalyptus punctata) by an arboreal marsupial, the koala (Phascolarctos cinereus). J Comp Physiol 153: 181-190.
65. Cork SJ, Sanson GD (1991) Digestion and nutrition in the koala: a review. In: Lee AK, Handasyde, K.A and Sanson, G.D, editor. Biology of the koala. pp. 129-144.
66. Moore B (2004) Chemical determinants of diet and habitat quality in the koala (Phascolactos cinereus) Goldfuss [PhD]. Canberra: Australian National University.
67. Marsh KJ, Moore BD, Wallis IR, Foley WJ (2014) Feeding rates of a mammalian browser confirm the predictions of a "foodscape" model of its habitat. Oecologia 174: 873-882.
68. Marsh KJ, Wallis IR, Andrew RL, Foley WJ (2006) The detoxification limitation hypothesis: Where did it come from and where is it going? J Chem Ecol 32: 1247-1266.
69. Au J, Wallis IR, Ford KJ, Foley WJ (2013) Whole body protein turnover as an estimate of costs of detoxification of secondary metabolites in a browsing mammal. J Comp Physiol B 183: 993-1003.
70. Searle KR, Stokes CJ, Gordon IJ (2008) When foraging and fear meet: using foraging hierarchies to inform assessments of landscapes of fear. Behav Ecol 19: 475-482.
71. Lunney D, Gresser S, O'Neill LE, Matthews A, Rhodes JR (2007) The impact of fire and dogs on koalas at Port Stephens, New South Wales, using population viability analysis. Pac Conserv Biol 13: 189-201.
72. Wiggins NL, McArthur C, Davies NW (2006) Diet switching in a generalist mammalian folivore: fundamental to maximising intake. Oecologia 147: 650-657.
73. Wiggins NL, McArthur C, Davies NW, McLean S (2006) Spatial scale of the patchiness of plant poisons: A critical influence on foraging efficiency. Ecology 87: 2236-2243.
74. Jones PD, Demarais S, Strickland BK, Edwards SL (2008) Soil region effects on white-tailed deer forage protein content. Southeast Nat 7: 595-606.
75. Chapman CA, Chapman LJ, Naughton-Treves L, Lawes MJ, McDowell LR (2004) Predicting folivorous primate abundance: Validation of a nutritional model. Am J Primatol 62: 55-69.
76. McArt SH, Spalinger DE, Collins WB, Schoen ER, Stevenson T, et al. (2009) Summer dietary nitrogen availability as a potential bottom-up constraint on moose in south-central Alaska. Ecology 90: 1400-1411.
77. Chapman CA, Chapman LJ, Bjorndal KA, Onderdonk DA (2002) Application of protein-to-fiber ratios to predict colobine abundance on different spatial scales. Int J Primatol 23: 283-310.
78. Ganzhorn JU (1992) Leaf chemistry and the biomass of folivorous primates in tropical forests - test of a hypothesis. Oecologia 91: 540-547.
79. Simmen B, Tarnaud L, Hladik A (2012) Leaf nutritional quality as a predictor of primate biomass: further evidence of an ecological anomaly within prosimian communities in Madagascar. J Trop Ecol 28: 141151.
80. Felton AM, Felton A, Lindenmayer DB, Foley WJ (2009) Nutritional goals of wild primates. Func Ecol 23: 70-78.
81. Krockenberger $\mathbf{A}$ (2003) Meeting the energy demands of reproduction in female koalas, Phascolarctos cinereus: evidence for energetic compensation. J Comp Physiol B 173: 531-540.
82. Speakman JR (2008) The physiological costs of reproduction in small mammals. Philos Trans R Soc BBiol Sci 363: 375-398.
83. Hengeveld G, van Langeveld F, Groen T, de Knegt H (2009) Optimal foraging for multiple resources in several food species. Am Nat 174: 102-110.
84. Lunney D, O'Neill L, Matthews A, Sherwin WB (2002) Modelling mammalian extinction and forecasting recovery: koalas at Iluka (NSW, Australia). Biol Conserv 106: 101-113.
85. Reed PC, Lunney D, Walker P (1990) A 1986-1987 survey of the koala Phascolarctos cinereus (Goldfuss) in New South Wales and an ecological interpretation of its distribution. In: Lee AK, Handasyde KA, Sanson GD, editors. Biology of the Koala. Sydney: Surrey Beatty \& Sons. pp. 55-74.
86. Lunney D, Matthews A (2002) Ecological changes to forests in the Eden region of New South Wales. In: Dargavel J, Gaughwin D, Libbis B, editors. Australia's Ever-Changing Forests V: Proceedings of the Fifth National Conference on Australian Forest History. Canberra: Centre for Resource and Environmental Studies, Australian National University. pp. 289-310.
87. Lunney D, Moon C (1988) An ecological view of the history of logging and fire in Mumbulla State Forest on the South Coast of New South Wales. In: Frawley KJ, Semple NM, editors. Australia's Ever Changing Forests: Proceedings of the First National Conference on Australian Forest History. Canberra: Department of Geography and Oceanography, Australian Defence Force Academy. pp. 23-61.
88. Putman RJ (1984) Facts from feces. Mamm Rev 14: 79-97.
89. Wilson GJ, Delahay RJ (2001) A review of methods to estimate the abundance of terrestrial carnivores using field signs and observation. Wildl Res 28: 151-164.
90. Ahrestani FS, Heitkonig IMA, Prins HHT (2012) Diet and habitat-niche relationships within an assemblage of large herbivores in a seasonal tropical forest. J Trop Ecol 28: 385-394.
91. Mansson J, Andren H, Sand H (2011) Can pellet counts be used to accurately describe winter habitat selection by moose Alces alces? Eur J Wildl Res 57: 1017-1023.
92. Hegland SJ, Lilleeng MS, Moe SR (2013) Old-growth forest floor richness increases with red deer herbivory intensity. For Ecol Manage 310: 267-274.
93. McGregor DC, Kerr SE, Krockenberger AK (2013) The distribution and abundance of an island population of koalas (Phascolarctos cinereus) in the far north of their geographic range. PLoS One 8: e59713.
94. Sullivan BJ, Baxter GS, Lisle AT (2002) Low-density koala (Phascolarctos cinereus) populations in the mulgalands of south-west Queensland. I. Faecal pellet sampling protocol. Wildl Res 29: 455-462.
95. Ellis WAH, Melzer A, Bercovitch FB (2009) Spatiotemporal dynamics of habitat use by koalas: the checkerboard model. Behav Ecol Sociobiol 63: 1181-1188.
96. Phillips S, Callaghan J (2000) Tree species preferences of koalas (Phascolarctos cinereus) in the Campbelltown area south-west of Sydney, New South Wales. Wildl Res 27: 509-516.
97. Sullivan BJ, Baxter GS, Lisle AT (2003) Low-density koala (Phascolarctos cinereus) populations in the mulgalands of south-west Queensland. III. Broad-scale patterns of habitat use. Wildl Res 30: 583-591.
98. Ellis W, FitzGibbon S, Melzer A, Wilson R, Johnston S, et al. (2013) Koala habitat use and population density: using field data to test the assumptions of ecological models. Aust Mammal 35: 160-165.
99. Crowther MS, Lunney D, Lemon J, Stalenberg E, Wheeler R, et al. (2013) Climate-mediated habitat selection in an arboreal folivore. Ecography 37: 336-343.
100. Briscoe NJ, Handasyde KA, Griffiths SR, Porter WP, Krockenberger A, et al. (2014) Tree-hugging koalas demonstrate a novel thermoregulatory mechanism for arboreal mammals. Biol Lett 10: 20140235.
101. Mitchell $\mathbf{P}$ (1990) The home ranges and social activity of koalas - a quantitative analysis. In: Lee AK, Handasyde KA, Sanson GD, editors. Biology of the koala. Sydney: Surrey Beatty \& Sons. pp. 171-187.
102. Nagy KA, Martin RW (1985) Field metabolic-rate, water flux, food-consumption and time budget of koalas, Phascolarctos cinereus (Marsupialia, Phascolarctidae) in Victoria. Aust J Zool 33: 655-665.
103. Ellis WAH, Sullivan BJ, Lisle AT, Carrick FN (1998) The spatial and temporal distribution of koala faecal pellets. Wildl Res 25: 663-668.
104. Matthews A, Lunney D, Gresser S, Maitz W (2007) Tree use by koalas (Phascolarctos cinereus) after fire in remnant coastal forest. Wild Res 34: 84-93.
