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A single evolutionary innovation drives the deep evolution of symbiotic N₂-fixation in angiosperms

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Symbiotic associations occur in every habitat on earth, but we know very little about their evolutionary histories. Current models of trait evolution cannot adequately reconstruct the deep history of symbiotic innovation, because they assume homogenous evolutionary processes across millions of years. Here we use a recently developed, heterogeneous and quantitative phylogenetic framework to study the origin of the symbiosis between angiosperms and nitrogen-fixing (N₂) bacterial symbionts housed in nodules. We compile the largest database of global nodulating plant species and reconstruct the symbiosis' evolution. We identify a single, cryptic evolutionary innovation driving symbiotic N₂-fixation evolution, followed by multiple gains and losses of the symbiosis, and the subsequent emergence of 'stable fixers' (clades extremely unlikely to lose the symbiosis). Originating over 100 MYA, this innovation suggests deep homology in symbiotic N₂-fixation. Identifying cryptic innovations on the tree of life is key to understanding the evolution of complex traits, including symbiotic partnerships.

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Sybiotic associations are among the most decisive drivers of ecological diversification, occurring in every aquatic and terrestrial habitat on earth^{1,2}. Molecular tools have allowed us to identify remarkable radiations of symbiotic partnerships across diverse ecological conditions^{3,4}, but it is unknown whether the regulatory mechanisms underlying such partnerships evolved repeatedly or are based on pre-existing ancestral pathways⁵. In general, traits arising from symbiotic partnerships require complex coordination between different species^{6,7} and are typically characterized by a diversity of types and symbiotic states.

This type of complex coordination is especially evident in the symbiosis between angiosperms and their N₂-fixing bacterial symbionts that has evolved in thousands of plant species^{8,9}. Although progress has been made in cataloguing the distinct morphologies and diverse microbial partnerships characterizing N₂-fixing symbioses^{6,10,11} and in the molecular mechanisms regulating the symbiosis in some plant species^{12–15}, it is unknown how all this novelty was generated. Such diversity and wide taxonomic distribution could suggest multiple, independent regulatory circuits that arose *de novo*. Alternatively, there may be a shared mechanism underlying the evolution of these interactions. The latter view is consistent with the ‘predisposition’ hypothesis, which asserts that about 100 million years ago (MYA) certain angiosperms (the so-called N₂-fixing clade) evolved a predisposition towards the evolution of nodulation^{8,9}. Such a shared mechanism is conceptually analogous to the deep homology among complex animal organs, for example, eyes or limbs that are based on highly conserved, underlying regulatory circuits⁵.

The concept of deep homology in the evolution of symbiotic N₂-fixation has important implications for the conservation of regulatory mechanisms and also for the ongoing attempts to transfer the capacity for nodulation to non-fixing crops, such as rice, wheat and maize^{16,17}. If there is no deep symbiotic homology, there are potentially multiple pathways towards achieving nodulation. However, if the phylogenetic history of the symbiosis does contain evidence of a deep homology, this predicts the existence of a single shared symbiotic trait among extant N₂-fixing angiosperms. A deeply conserved ‘symbiotic N₂-fixation’ pathway could then be identified using a cross-species comparative framework^{18,19}.

Qualitative reconstructions of the deep evolution of symbiotic N₂-fixation in early angiosperms^{8,9} as well as detailed phylogenetic analyses of symbiotic N₂-fixation evolution at lower taxonomic levels^{20–23} have greatly increased our understanding of N₂-fixation history and have helped to generate evolutionary scenarios similar to that of the N₂-fixation predisposition hypothesis^{8,9}. However, until now quantitative phylogenetic reconstruction of the deep evolutionary history of the N₂-fixing symbiosis has been difficult because of three main constraints. First, researchers were lacking a global angiosperm phylogeny with a comprehensive coverage of angiosperm diversity at the species level. Such species level detail is crucial because of the high number of losses and gains of the symbiosis within N₂-fixation families^{9,24}. This had prevented scientists from accurately mapping nodulation across extant plant species. Second, researchers have lacked a single, comprehensive database of global plant species capable of hosting N₂-fixing symbionts. Lastly, current models of trait evolution have largely assumed homogenous processes to occur across an entire phylogeny and have thus been unable to account for variation in evolutionary rates²⁵. This means that until recently, we have not been able to accurately detect subtle changes in rates of evolution or in ancestral symbiotic states over large phylogenies containing thousands of species. As a result, we have not yet been able to

provide an explicit and quantitative reconstruction of the major events driving the origin of symbiotic N₂-fixation.

We resolve these three constraints by compiling the largest database of N₂-fixing angiosperms and then mapping this data set onto the most up-to-date phylogeny of global angiosperms (32,223 species)²⁶. We use a recent phylogenetic approach that permits among-lineage variation in the speed of character evolution²⁵ to infer rates of evolution and reconstruct ancestral states. Our aim is to map the evolution of symbiotic N₂-fixation over the deep evolutionary history (over 200 MYA) of global angiosperms and ask whether a single evolutionary event or multiple pathways lead towards the evolution of nodulation in flowering plants.

We find evidence of deep homology in the evolution of symbiotic N₂-fixation. We pinpoint on the phylogeny the emergence of a single, cryptic precursor shared by all extant angiosperms capable of hosting N₂-fixing symbionts, quantitatively confirming the N₂-fixation predisposition hypothesis⁸. We then reconstruct the evolutionary history of this symbiotic precursor and map its current distribution across extant angiosperms. Our comprehensive reconstruction allows us to (i) identify non-fixing plant species alive today that are likely to still retain the precursor, and thus represent interesting model systems for introducing N₂-fixation symbioses into crops and (ii) analyse the subsequent evolution of a symbiotic state we call ‘stable fixers’ (clades in which plants are extremely unlikely to lose symbiotic N₂-fixation). More generally, we suggest that large-scale quantitative phylogenetic reconstruction methods will emerge as a crucial tool to study the evolution of symbioses and complex traits.

Results

N₂-fixation data, plant phylogeny and trait reconstruction. After compiling a comprehensive N₂-fixation database of 9,156 angiosperm species, we identified 3,467 species that overlapped with the global angiosperms phylogeny²⁶. Using these species, we tested the simplest model of symbiosis evolution, which assumes (i) direct evolution in angiosperms of N₂ fixing and direct loss²⁷, and (ii) homogenous evolutionary processes across all branches analysed. This binary model was compared with a series of five ‘Hidden-Rate’ models²⁵ of increasing complexity that allowed for (i) heterogeneity in the speed of evolution and (ii) the possibility of intermediate steps before the origin of the trait itself. We used AICc (corrected Akaike Information Criterion) to determine which model best describes the character state distribution data. We did not assume any model structure *a priori*, but let the data drive model selection.

Evolution of N₂ fixing is preceded by a necessary precursor. The model that best explained the distribution of N₂-fixation (AICc weight 55.5%) was a heterogeneous rate model with a single and necessary intermediate state in the path towards nodulation (Supplementary Table 1, Supplementary Fig. 1). In modelling terms, this means a plant species needs to move to a different rate class before it can evolve an N₂-fixing character state (Methods). In biological terms, this intermediate state represents a precursor, an evolutionary innovation that must precede the evolution of a specific trait^{28–31}. Our model identified several other important characteristics of N₂-fixation ancestral states. First, a species that is in the precursor state is roughly 100 times more likely to evolve a functioning N₂-fixation state (0.91 transitions per 100 million lineage years) than a non-precursor is to evolve a precursor (0.01 transitions per 100 million lineage years). Second, the precursor state is relatively easily lost, as evidenced by a high rate of disappearance of this state

(1.25 transitions per 100 million lineage years). Third, our model identified a symbiotic state we call ‘stable fixer’ in which once acquired, an angiosperm lineage is extremely unlikely to lose the capacity for symbiotic N₂-fixation (0.02 transitions per 100 million lineage years versus 1.17 for regular N₂ fixers).

The symbiotic N₂-fixation precursor evolved only once. We mapped the likelihoods of being in each of the four symbiotic states (non-precursor, precursor, fixing and stable fixer) onto a time-scaled phylogenetic tree to identify the most important transitions in symbiotic N₂-fixation evolution (Fig. 1, Supplementary Data 1 for expanded version including species names). Our model unambiguously pinpoints the single origin of the precursor within the *Fabidae* (also known as Rosids I) slightly over 100 MYA and at the base of the four orders comprising the N₂-fixing clade (Fabales, Rosales, Cucurbitales and Fagales)^{8,9,32}, subsequently leading to multiple emergences of nodulation capacity. We calculated the expected numbers of the major

state transitions over our full phylogeny and confirmed the precursor state evolved only once (Table 1) in the ~200 million year angiosperm history.

Symbiotic N₂-fixation has multiple origins and losses. Although there is one single precursor origin, we found ~8 subsequent origins of N₂-fixation itself (8.15 ± 2.47 s.d., over $N = 100$ alternative angiosperm phylogenies, Table 1), leading to the evolution of distinct symbiosis types in the angiosperms (most notably those involving rhizobial bacteria and those with actinorhizal *Frankia* sp.). The dramatic differences in infection modes, nodule forms, symbiont identity and resource control processes among N₂ fixers^{6,10,11} demonstrate that substantial diversification of nodulation types took place following the origin of the shared precursor. The N₂-fixation state has also been lost ~10 times (9.93 ± 2.80 s.d., $N = 100$), a frequency that is lower than that of precursor state loss, but which still indicates that nodulation capacity is vulnerable over evolutionary timescales.

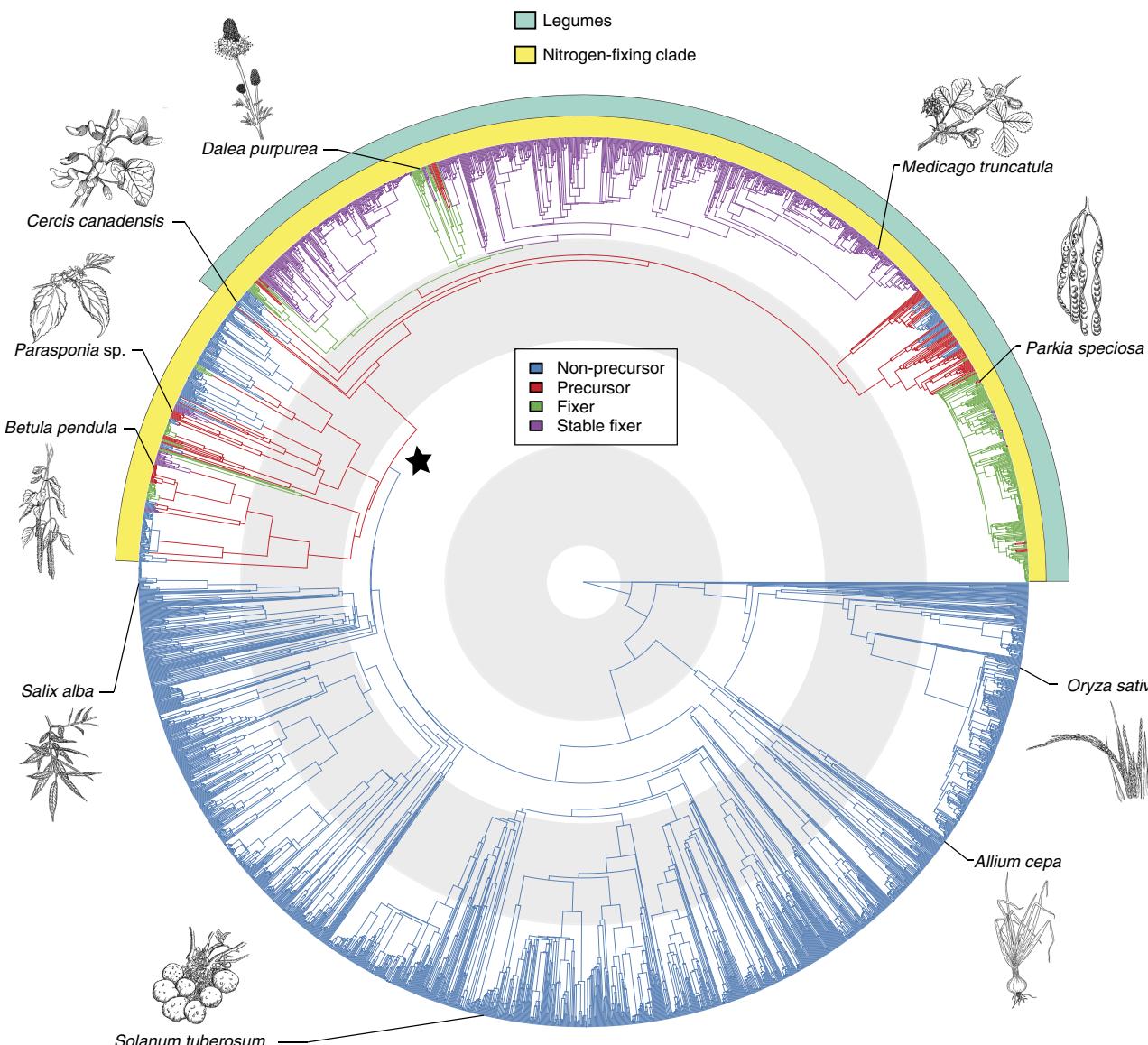


Figure 1 | Angiosperm phylogeny of 3,467 species showing reconstruction of node states. Branches are coloured according to the most probable state of their ancestral nodes. A star indicates precursor origin. Turquoise and yellow band indicate the legumes and the so-called nitrogen-fixing clade, which contains all known nodulating angiosperms^{8,9}. Grey and white concentric circles indicate periods of 50 million years from the present. The positions of some important angiosperms are indicated with drawings (illustrations by Floortje Bouwkamp).

The precursor was retained for more than 100 million years. Our quantitative ancestral state reconstructions allow us to trace the evolution of the precursor since its origin over 100 MYA. We found that once evolved, the precursor state is vulnerable to loss, with an estimated 16.71 separate losses (± 3.21 s.d., $N=100$, Table 1), including various times within the legumes (Fig. 1). This vulnerability suggests that the precursor itself does not confer a large fitness benefit; many lineages have lost the precursor and are unlikely to remain predisposed towards N₂-fixation. However, despite this vulnerability, our reconstruction reveals that the precursor has been maintained in some angiosperm species for over 100 million years to the current day (Fig. 1). For each of our analysed species, we then calculated the precise likelihood of still being in precursor state today (Supplementary Data 2). We find that an extraordinarily diverse range of species across the angiosperm phylogeny are still highly likely to contain the precursor (for a selected subset see Table 2). This includes some unexpected non-legumes: for example, in the Fagales, all species of *Betula*, *Corylus*, *Ostrya* and *Carpinus* have high likelihoods of remaining in the precursor state (Fig. 2).

The precursor finding is robust to sources of uncertainty. We confirmed that our main conclusion of a shared, single symbiotic N₂-fixation precursor was robust to three sources of uncertainty. First, to verify that potential errors in our N₂-fixation database would not affect our main conclusions, we re-ran our best model and the binary model (Supplementary Table 1) while randomly discarding subsets of N₂-fixation data. Even when we discarded up to 75% of the data points, our best model consistently performed better than the binary model (Supplementary Fig. 2) and

confirmed the emergence of a precursor in 98% of the model reruns. This is an important confirmation that our conclusions are not dependent on particular influential data points. Second, to address phylogenetic uncertainty in the underlying angiosperm phylogeny, we repeated our analyses over 100 alternative bootstrapped versions of the angiosperm phylogeny^{26,33} and concluded that the evolutionary scenario including a necessary and single precursor was consistently recovered. We reached this conclusion because we found that for these 100 alternative phylogenies (i) the single precursor model consistently performed better than the binary model (Supplementary Fig. 3), (ii) state transition rate estimates were highly similar (Supplementary Fig. 4), (iii) a very similar mapping of ancestral states to the angiosperm phylogeny was obtained (Supplementary Fig. 5) and (iv) similar numbers of evolutionary events were found (Table 1). Lastly, we examined the second best reconstruction model (AICc weight of 42.9%, Supplementary Table 1) to test whether the precursor still emerged at the same point. Under this model, we confirmed there was also a necessary initial transition to a precursor state before evolution of symbiotic N₂-fixation (Supplementary Fig. 6) and phylogenetic mapping pinpointed this transition to the exact same origin (Supplementary Fig. 7). These observations further strengthen our conclusion of a precursor being crucial to the evolution of symbiotic N₂-fixation.

Symbiotic N₂-fixation is very stable in some clades. Our quantitative phylogenetic framework identified a symbiotic state we call the stable fixers (Supplementary Fig. 1). We catalogued 850 species that are more than 90% likely to be in this symbiotic state (see Table 2 for a subset of probable stable fixers). Our model suggests that this symbiotic fixing state has over 24 separate origins (24.53 ± 4.79 s.d., $N=100$) and not a single expected loss (0.19 ± 4.99 s.d., $N=100$), despite evolving over 50 MYA (Fig. 1, Table 1). In our second best model (see above), we also observe stable fixers (specifically in the *Papilioideae*), regular N₂ fixers and additionally a third category in which symbiotic N₂-fixation is moderately stable (0.44 transitions per 100 million years compared with 0.02 for stable fixers and 1.79 for regular fixers under that model; Supplementary Fig. 6). Mapping of this second best model to our phylogeny reveals that the moderately stable fixing state, found for example in the *Mimosoideae* and in non-legume angiosperms associated with the actinorhizal N₂-fixing symbionts, requires an intermediate precursor (Supplementary Fig. 7).

Table 1 | Number of evolutionary events: origins and losses of precursor, fixing and stable fixing states.

| Transition | Best phylogeny | s.d. | Median |
|-----------------------|----------------|------|--------|
| Gain of precursor | 1.01 | 0.65 | 1.01 |
| Loss of precursor | 16.71 | 3.21 | 19.91 |
| Gain of fixing | 8.15 | 2.47 | 6.60 |
| Loss of fixing | 9.93 | 2.80 | 10.57 |
| Gain of stable fixing | 24.53 | 4.79 | 20.17 |
| Loss of stable fixing | 0.19 | 4.99 | 2.02 |

The number of transitions among states as inferred under best phylogeny of angiosperms, along with the s.d. and median values of the event numbers over all 100 alternative angiosperm phylogenies.

Table 2 | Phylogenetically diverse subset of probable extant precursors and stable fixers.

| Precursor species (non-fixing) | % | Stable fixing species | % |
|--|------|---|-------|
| <i>Acacia eriocarpa*</i> (Mimosoideae) | 97.1 | <i>Trifolium pratense*</i> (Papilioideae) | 100.0 |
| <i>Trema orientalis</i> (Cannabaceae) | 91.6 | <i>Lupinus luteus*</i> (Papilioideae) | 99.8 |
| <i>Mora excelsa*</i> (Caesalpinoideae) | 89.8 | <i>Baptisia australis*</i> (Papilioideae) | 98.7 |
| <i>Parkia speciosa*</i> (Mimosoideae) | 85.0 | <i>Pultenaea flexilis*</i> (Papilioideae) | 98.6 |
| <i>Betula pendula</i> (Betulaceae) | 80.7 | <i>Dalbergia melanoxylon*</i> (Papilioideae) | 95.4 |
| <i>Vouacapoua macropetala*</i> (Caesalpinoideae) | 73.2 | <i>Swartzia simplex*</i> (Papilioideae) | 83.5 |
| <i>Cladrastis sikokiana*</i> (Papilioideae) | 67.5 | <i>Coriaria myrtifolia</i> (Coriariaceae) | 82.2 |
| <i>Celtis occidentalis</i> (Cannabaceae) | 62.7 | <i>Elaeagnus pungens</i> (Elaeagnaceae) | 73.3 |
| <i>Nissolia schottii*</i> (Papilioideae) | 60.0 | <i>Casuarina cunninghamiana</i> (Casuarinaceae) | 68.3 |
| <i>Ziziphus mucronata</i> (Rhamnaceae) | 54.9 | <i>Myrica gale</i> (Myricaceae) | 55.8 |
| <i>Gleditsia triacanthos*</i> (Caesalpinoideae) | 54.3 | <i>Leucaena pulverulenta*</i> (Mimosoideae) | 53.1 |

A phylogenetically diverse, but otherwise random, subset of probable extant precursors and stable fixers to illustrate their wide distributions across the N₂-fixing clade. The corrected likelihoods (in %) of being an extant precursor or stable fixer are indicated. Families are indicated within parentheses. Legumes are indicated with asterisks. Within the legume family, subfamilies are within parentheses. See Supplementary Data 2 for precursor and stable-fixing likelihoods for all 3,467 species analysed.

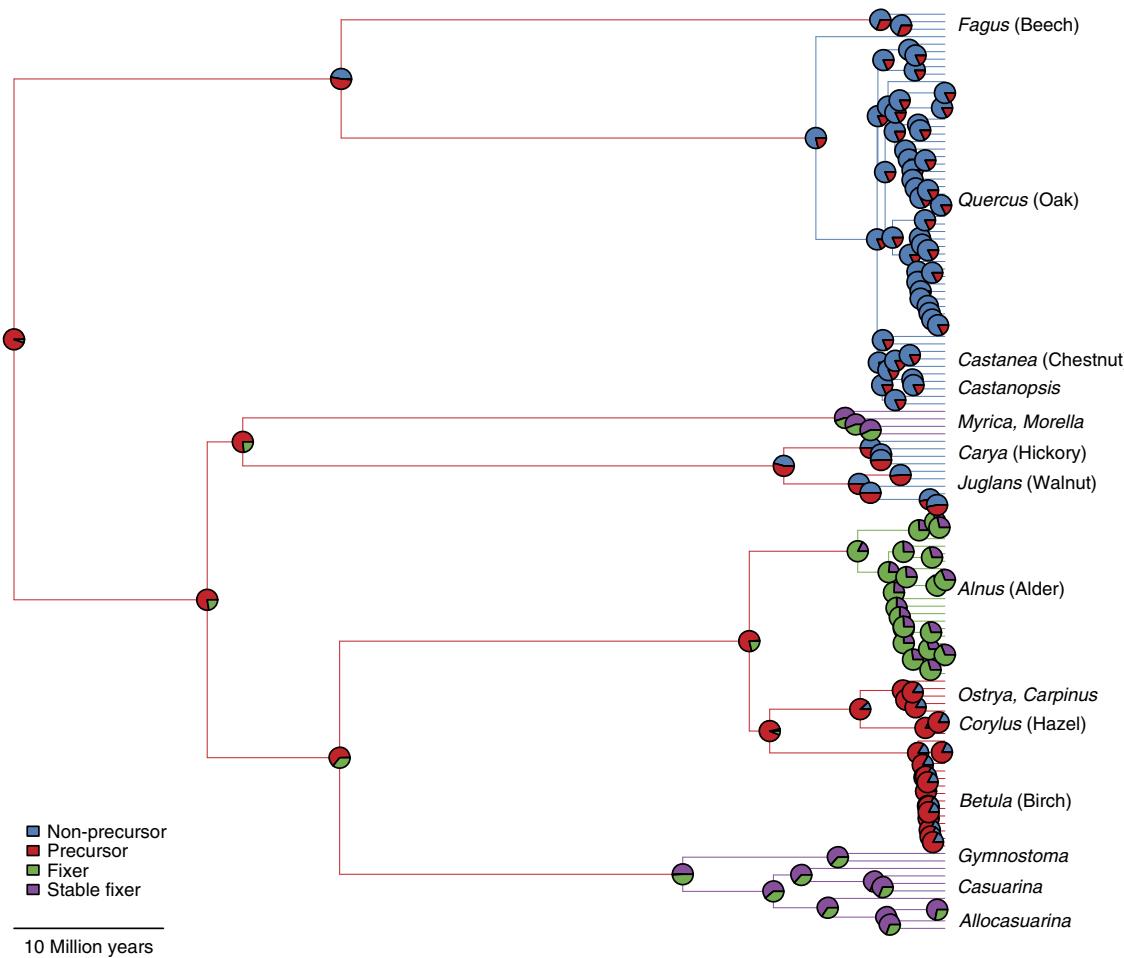


Figure 2 | Symbiotic states in the order Fagales. Pie charts indicate the likelihoods of a node being in each of four symbiotic states. Tree is labelled with genus names and associated common names. The Fagales clade highlights a range of potential transitions, including precursor loss (*Fagus*, *Quercus*, *Castanea*, *Castanopsis*), gain of fixing (*Alnus* etc) origins of stable fixing (*Allocasuarina*, *Myrica* and so on) as well as current precursor species (*Corylus*, *Betula* and etc).

Discussion

Our quantitative phylogenetic analysis demonstrates how symbiotic N₂-fixation evolution was driven by a single and necessary evolutionary innovation. We show that in some clades this innovation was lost; in others, it laid the foundation for the emergence of a hugely successful class of nutrient symbioses that transformed the earth's biogeochemistry^{34–36}. These findings quantitatively confirm a shared predisposition underlying the evolution of all angiosperm symbiotic N₂-fixation⁸. The single origin of this innovation implies a deep homology in symbiotic evolution, analogous to deep homology in complex organismal traits such as animal eyes and limbs⁵. The implication is that one basic regulatory circuit can produce a range of novel (co)evolutionary adaptations, not only to diverse ecological demands but also to divergent symbiotic partners.

How do such complex traits evolve? Recent work on microbial genomes in an experimental evolution context has revealed three evolutionary stages of innovation: potentiation, actualization and refinement^{37,38}. In the potentiating stage, one or multiple mutations arise, which enable the future evolution of the trait, but do not yet result in actual phenotypic changes. In our reconstruction, this step is analogous to the emergence of the N₂-fixation precursor. Next, the actualizing mutation or mutations enable the emergence of the phenotype, often still in a rudimentary form. In our case, the multiple origins of

N₂-fixation states represent different actualizing mutations, producing various origins and diversity in N₂-fixation types. Lastly, the stable fixers we identify in our model could represent multiple, probably distinct, refinement stages in which additional mutations are further fine-tuned and more efficiently expressed^{37,38}.

Linking these evolutionary stages to genetic changes in angiosperms over deep time is a major task. The identity of the N₂-fixation precursor itself is among the greatest mysteries in the evolution of plant symbioses^{8,9} and of mutualisms in general. Despite great progress in understanding the molecular details of the nodulation machinery^{12–15,39,40}, an underlying precursor mechanism has yet to be confirmed. Unfortunately we lack the 'frozen fossil records'⁴¹ used in microbiology that enable relatively easy identification of these types of mutations found in experimental evolution scenarios. It is well appreciated that the molecular machinery regulating interactions with N₂-fixing bacteria greatly overlaps with the pathway mediating the more ancient fungal mycorrhizal symbiosis^{6,42,43}. Given these similarities, the precursor may represent a modification to this pathway, with key shared steps mediating interactions with N₂-fixing bacterial partners as well as fungi. For example, the well-characterized SymRK protein has been identified as a candidate^{44,42}, but a non-N₂-fixing clade version can likewise mediate symbiotic function¹⁵, suggesting it is unlikely to

represent the precursor. Our analyses show that the precursor is very likely to be retained for over 100 MYA to the current day in some species (Figs 1 and 2, Table 2 and Supplementary Data 2). This suggests that any genetic modification represented by the precursor would not have had a major negative fitness impact. Rather, it is likely to have had some other fitness benefit before facilitating angiosperm nodulation, for example, modifications enabling discrimination of pathogenic bacteria from (free-living) N₂ fixers.

In principle, the biological correlate of the cryptic precursor we have identified could be environmental in nature²⁵, for example, facilitated by a shift in climate. However, an environmental factor would be shared by the many extant angiosperm lineages at the time of precursor evolution (~100 MYA) and would be expected to recur multiple times across the phylogeny, resulting in multiple independent precursor events. Instead, we identified only one singular event leading to the precursor state, despite a cumulative ~53 billion lineage years of evolution in our phylogeny. This lends support to the hypothesis that the transition represents a complex change in an underlying genetic or morphological trait specific to this lineage, but more evidence is needed.

Quantitative phylogenetic reconstructions can substantially aid in the ongoing search for the N₂-fixation precursor. Every plant species in our analysis has a likelihood of being in a particular symbiotic state (see Supplementary Data 2). This allows us to pinpoint previously unidentified precursor plant species alive today that are very likely to still retain the precursor. Candidate pathways in phylogenetically diverse species (see Table 2) can be catalogued and mapped onto the symbiotic N₂-fixing phylogenetic tree (Fig. 1) to test for overlap. The ancient single origin of the precursor means it is deeply homologous across the N₂-fixing clade⁵, suggesting this highly conserved pathway could be identified using a cross-species comparative framework^{18,19}. Overlapping symbiotic machinery (for example, signalling pathways, receptors) should be studied over as large a phylogenetically range of precursor species as possible (Table 2). This should include various legume genera (for example, *Nissolia*, *Parkia*, *Mora*), but also non-legumes such as those in the Cannabaceae (for example, *Celtis*, *Trema*) and members of the Fagales (Fig. 2). These distantly related species should share relatively few traits in addition to the true precursor, simplifying the search. In contrast, most current nodulation model species (*Medicago truncatula*, *Glycine max* and *Lotus japonicus*) have a high likelihood (>99%) of being stable fixers (Supplementary Data 2). Although they can also contain the precursor, their relatively high taxonomic similarity gives a limited view of N₂-fixation evolution and they are likely to share many traits in addition to the 100-MYA precursor, confusing the search. Species in the N₂-fixing clade predicted to have lost the precursor should be included as negative controls in this comparative framework.

A second key question arising from our analysis involves the underlying nature of the stable fixing symbiotic state. In biological terms, stable fixers are likely to be characterized by evolutionary innovations that have substantially increased symbiosis stability, not necessarily increased fixation rates. For example, the evolution of stable fixing in the *Papilionoideae* (~52 MYA) is predicated by a whole-genome duplication ~58 MYA⁴⁴. Whole-genome duplication potentially provided redundant copies of genes important in N₂-fixation regulation, thereby reducing the risk of loss^{45,46}. In contrast to the precursor, stable fixing species do not appear to share a single biological correlate. This is evidenced by ~24 origins of stable fixing under our best model (Fig. 1 and Table 1).

Under our second best model (Supplementary Table 1), the stable fixer concept is more complicated, because two symbiotic

states of stable fixing are predicted to have emerged (Supplementary Fig. 6). One of these states matches the stable fixers as described in our best model (Supplementary Fig. 1): this stable fixing state simply evolves from a regular fixing phenotype and is found mainly in the *Papilionoideae*. The additional (less stable) symbiotic state called a moderate fixer arising from our second best model, maps to both the *Mimosoideae* and actinorhizal fixers (Supplementary Fig. 7) and requires a second, non-fixing precursor state before symbiotic N₂-fixing phenotypes arise (Supplementary Fig. 6). Under such an evolutionary scenario, this can be conceptualized as a second ‘potentiating’ mutation before ‘actualization’ in the moderate fixers. Studying potential genetic correlates of stable fixing for our best (Supplementary Fig. 1) and second best (Supplementary Fig. 6) model scenarios is important but challenging, because we do not expect there to be a single form of stable fixing. In contrast to the precursor, we anticipate multiple types of stable fixing, driven by multiple different mutations.

Phylogenetic reconstruction allows us to pinpoint when the crucial modifications in the evolution of symbiotic N₂-fixation occurred and to identify a range of symbiotic states, including current precursors and previously unidentified stable fixers. This type of reconstruction is beneficial for the long-standing goal of transferring N₂-fixation into non-fixing crops, such as cereals^{16,17}. We found, for example, that none of the major cereal grains are among the precursor species (Fig. 1 and Supplementary Data 2), suggesting that modifying them for symbiosis with N₂-fixing bacteria will be difficult until the specific precursor machinery is described. In contrast, a more obtainable goal may be to re-wire the symbiosis into species already primed with the precursor. *Carpinus sp.* (hornbeam) is an important timber crop with a 78.6–79.5% likelihood of retaining the precursor, whereas *Parkia speciosa* (bitterbean) is an important food crop in Asia and has a 85.0% likelihood of containing the precursor.

More generally, the use of large-scale quantitative phylogenetic frameworks can help researchers identify deep homologies across divergent organisms, but also in relationships between organisms. We show that such frameworks²⁵ can help pinpoint the emergence of the major evolutionary stages of innovation (potentiation, actualization and refinement)^{37,38} in the deep history of complex traits. Our work provides a clear example of the importance of cryptic putative precursors in the evolution of mutualistic partnerships and advocates for quantitative approaches to uncovering critical intermediate steps in (symbiotic) complex trait evolution.

Methods

Compiling a comprehensive N₂-fixation database. To compile our database of current angiosperm symbiotic N₂-fixation status, we used three main sources. First, we digitized data from the two most comprehensive volumes on legume nodulation^{24,47}. Second, we obtained data from the TRY initiative that categorized plants based on confirmed N₂-fixation status⁴⁸. Our third data source was the Germplasm Resources Information Network (GRIN) database of the United States Department of Agriculture⁴⁹. We supplemented these sources with data from the primary literature, focusing on taxa that were less represented in other databases. Plant species names were checked and inaccuracies resolved using the Taxonomic Name Resolution Service v3.1 (ref. 50) and, if necessary, manually verified using The Plant List⁵¹.

The four data sources were then combined into a single database (9,156 species). In case of conflicts among data sources, we used the following preference order: primary literature > Legume volumes > TRY > GRIN. A total of 3,467 species overlapped with our angiosperm phylogeny and were analysed in detail. We pruned the full angiosperm phylogeny to these overlapping species for our analyses. We took care to manually evaluate as many potential errors in these data and in the plant species names as possible. Data for the species analysed for this paper can be found in the Supplementary Data 2. This file contains all data used to construct models, the sources for these data, as well as the corrected state likelihoods for each species as inferred under the best model. The full data set of 9,156 species, including species not analysed in this study, has been archived at

Dryad (<http://doi.org/10.5061/dryad.05k14>). Full references to the various data sources can be found in Supplementary Table 2.

The angiosperm phylogeny. To map the evolution of N₂-fixation, we used a recently published phylogeny of 32,223 angiosperm species^{26,33}. This phylogeny was generated using a maximum likelihood approach based on molecular data for seven loci (18S, 26S, ITS, matK, rbcL, atpB and trnLF); the tree building used the PHLAWD pipeline (ver. 3.3a) and total sequence alignment were performed using RAxML (ver. 7.4.1)^{52–55}. The phylogeny was constrained based on several recent phylogenetic systematic treatments of seed plants²⁶. Branch lengths were scaled based on a large fossil data set²⁶. The full phylogeny can be found in Dryad³³.

Phylogenetic analysis of character state evolution. To allow for variation in the speed of character evolution, we used an approach to infer rates of evolution and reconstruct ancestral states called ‘Hidden Rate Models’ (HRM)²⁵. These models are a generalization of the covarion model of nucleotide substitution⁵⁶, which allows for among-lineage heterogeneity in site-specific evolutionary rates of molecular sequence data. Classical methods of binary character state evolution (for example, the mk2-model²⁷) can be problematic at this phylogenetic scale, because they assume a single rate of evolution and loss of the focal trait. It is instead more realistic to assume that some angiosperm clades have a higher transition rate to and from symbiotic N₂-fixation than other clades.

HRMs allow for this heterogeneity in transition rates between the two character states (in this case N₂ fixing or non-fixing) of the focal trait over phylogeny²⁵. In HRMs, each node in the phylogeny has a character state, but is also in one of multiple rate classes (for example, Supplementary Fig. 1). Among rate classes, transition rates between the two character states can differ (that is, there is potential variation in the speed of evolution). A transition rate can be as low as zero, meaning the model can infer that a particular transition does not occur. At any point along the phylogeny, a species can either move to the other character state (horizontal transition in Supplementary Fig. 1) or it can move to another rate class (vertical transition in Supplementary Fig. 1). To accurately represent the evolution of a trait, it is necessary to infer transition rates for both of these potential transitions. These transition rates can be thought of as probabilities of moving or alternatively as a number of transition events per time unit (as represented in the main text).

We used the R-package *corHMM*²⁵ to generate HRMs for our N₂-fixing data set and the associated angiosperm phylogeny. For a given number of rate classes, this package infers transition rates between the various states in that HRM. It then reconstructs the most probable state of each node in the phylogeny, allowing us to map these states onto the phylogeny. Thus, for each node this framework provides the likelihoods of all of the potential states, summing up to 1. We used the marginal method to calculate states at each node⁵⁷. To create our HRMs, we constrained the root node of the phylogeny to be a non-fixer (that is, the ancestral state of angiosperms). Relaxing this constraint does not result in different conclusions. Transition rates were not constrained in any way, meaning that they are free to be estimated at any value, including the zero bound. To sample the full multidimensional parameter space, we used 100 random restarts. We explored higher number of restarts, but this did not result in better model convergence; thus, for our main analyses 100 restarts were used.

We generated HRMs assuming one to five rate classes, to allow for an exploration of a wide range of evolutionary scenarios. The HRM with only one rate class reduces to the basic mk2 model²⁷ and only assumes one gain and one loss rate. In addition, we generated a more limited case of the HRM framework, which requires a precursor state before the evolution of the focal character, but subsequently only allows one rate class for that character²⁸. Whereas our other models do not assume a precursor (but allow for one), this limited case does assume the evolution of a precursor.

To prevent model overfitting, we used AICc (AIC corrected for finite sample sizes) weights to determine which HRM best describes our character state distribution data (Supplementary Table 1). For a family of models using the same character state database and phylogeny, AICc weights represent the conditional probability that a specific model provides the best explanation⁵⁸.

An HRM can infer a rate pattern in which a species must first make the transition to the next rate class, before making the transition from a non-fixing to a fixing character state. This pattern was observed under our best model (Supplementary Fig. 1). The observed pattern is the modelling equivalent of a biological precursor: an innovation necessary for the evolution of the character but not the character phenotype itself. For this reason, we refer to the best HRM as the ‘single precursor’ model. Such a transition rate pattern is not inherent to HRMs: a direct transition from a non-fixing to a fixing character state (that is, not preceded by transition in rate class) is allowed under all models considered. For this reason, we have *a posteriori* assigned the states of our best model names that represent a biological interpretation (for example, ‘precursor’ and ‘stable fixer’).

Number of evolutionary events. The marginal ancestral reconstruction approach⁵⁷ constrains nodes to multinomial probabilities. As such, the expected number of major evolutionary events (gains and losses of precursors, fixing and stable fixing) over angiosperm phylogeny, can be estimated using the sum of the

appropriate differences in state probability over the full phylogeny for each transition of interest. To exclude small fluctuations between two nodes that represent uncertainty in the underlying method rather than real evolutionary transitions, we used a cut-off value of 0.01 (that is, 1%) between two nodes. Under a maximum parsimony assumption, where on a given branch only one transition is possible between two nodes, this summation corresponds to the expected number of events that has occurred over the entire phylogeny given the estimated probabilities at each node (Table 1).

To obtain confidence estimates for these numbers, we repeated these steps for 100 bootstrap versions of our angiosperm phylogeny^{26,33,59,60} and calculated s.d. and median values over the resulting distributions (Table 1). These values indicate the extent to which the estimated event numbers are affected by phylogenetic uncertainty (see also below ‘Robustness to phylogenetic uncertainty’).

Likelihoods of extant precursors and stable fixers. To estimate the N₂-fixing states of extant angiosperms, we used the character state likelihoods of the node directly ancestral to each species. Note that estimating extant states is only necessary for distinguishing non-fixing precursors from non-fixing non-precursor and for distinguishing stable fixers from fixers, as fixation can be directly observed in extant species. We then deducted the probability of a transition occurring on the terminal branch: the terminal branch length multiplied by the combined transition rates out of that state (Supplementary Fig. 1). This correction is crucial because in some species the terminal branch may be tens of millions of years long. Consequently, without correction we would run the risk of strongly overestimating the likelihood an extant species still retains precursor or stable fixing state. Our more conservative approach is instead an underestimate of these likelihoods, because we only take into account the possibility of state loss over the terminal branch and not that of a gain of precursor or stable fixing state.

Robustness to sampling uncertainty. To account for uncertainty in the N₂-fixation data set we compiled, we recalculated the basic binary and the single precursor models (Supplementary Table 1) after dropping random species subsets from the full data set (retaining 25%, 33% or 50% of species). This helps account for false reports of nodulation or its absence found in the literature⁶¹. We repeated this procedure 100 times for each of these modified data sets and determined the difference in AICc between both models (Supplementary Fig. 2). To test the null model that there is no pattern in the N₂-fixation data, we furthermore generated 100 single precursor and 100 binary models using the same angiosperm phylogeny, but reshuffled the underlying N₂-fixation data over all species (Supplementary Fig. 2). This approach allows us to fix the proportions of fixers and non-fixers, but randomizes the actual distribution of nodulation over all species.

Robustness to phylogenetic uncertainty. A second source of uncertainty is in the phylogenetic relationships among the angiosperms. This includes, for example, various alternative estimates of phylogenetic relationships within the legumes, which are a subject of much current debate⁶². To test the robustness of our results with respect to this phylogenetic uncertainty, we used three alternative approaches using the 100 bootstrap phylogenies^{26,33,59,60} containing a wide range of hypothesized evolutionary relationships in all clades, including within-legumes. First, we re-ran the single precursor and binary models for the 100 bootstrap phylogenies. We then determined the difference in AICc value for these re-runs (Supplementary Fig. 3). Second, we analysed the transition rates between the four symbiotic states as they were calculated for each of these 100 phylogenies. We generated a histogram to show the distribution of these rates for each possible transition (Supplementary Fig. 4). Third, we mapped the four symbiotic states as calculated using the median of the 100 alternative transition rates (rather than the transition rates inferred under the best phylogeny) to the angiosperm phylogeny (Supplementary Fig. 5).

Expanded phylogeny. To allow the reader to find all individual species analysed in this study and identify interesting transition in the evolution symbiotic N₂-fixation in more detail, we provide a supplementary expanded high-resolution phylogeny with individually readable species names at each branch tip (Supplementary Data 1). This file is an expanded (>3 m × >3 m) version of Fig. 1 in the main text. In Supplementary Data 1, branches are not only coloured according to the most probable state of the ancestral node, but also the exact state reconstruction per node is represented by a pie chart on each node. Colours represent the same states as in Fig. 1. We also list N₂-fixation status (as in our data set) between parentheses after each species name.

References

- Joy, J. B. Symbiosis catalyses niche expansion and diversification. *Proc. Biol. Sci.* **280**, 20122820 (2013).
- Moran, N. A. Symbiosis as an adaptive process and source of phenotypic complexity. *Proc. Natl. Acad. Sci. USA* **104**, 8627–8633 (2007).
- Dubilier, N., Bergin, C. & Lott, C. Symbiotic diversity in marine animals: the art of harnessing chemosynthesis. *Nat. Rev. Microbiol.* **6**, 725–740 (2008).

4. Woyke, T. *et al.* Symbiosis insights through metagenomic analysis of a microbial consortium. *Nature* **443**, 950–955 (2006).
5. Shubin, N., Tabin, C. & Carroll, S. Deep homology and the origins of evolutionary novelty. *Nature* **457**, 818–823 (2009).
6. Oldroyd, G. E. D. Speak, friend, and enter: signalling systems that promote beneficial symbiotic associations in plants. *Nat. Rev. Microbiol.* **11**, 252–263 (2013).
7. Parniske, M. Arbuscular mycorrhiza: the mother of plant root endosymbioses. *Nat. Rev. Microbiol.* **6**, 763–775 (2008).
8. Soltis, D. E. *et al.* Chloroplast gene sequence data suggest a single origin of the predisposition for symbiotic nitrogen fixation in angiosperms. *Proc. Natl Acad. Sci. USA* **92**, 2647–2651 (1995).
9. Doyle, J. J. Phylogenetic perspectives on the origins of nodulation. *Mol. Plant Microbe Interact.* **24**, 1289–1295 (2011).
10. Masson-Boivin, C., Giraud, E., Perret, X. & Batut, J. Establishing nitrogen-fixing symbiosis with legumes: how many rhizobium recipes? *Trends Microbiol.* **17**, 458–466 (2009).
11. Pawłowski, K. & Demchenko, K. N. The diversity of actinorhizal symbiosis. *Protoplasma* **249**, 967–979 (2012).
12. Op den Camp, R. *et al.* LysM-type mycorrhizal receptor recruited for rhizobium symbiosis in nonlegume Parasponia. *Science* **331**, 909–912 (2011).
13. Xie, F. *et al.* Legume pectate lyase required for root infection by rhizobia. *Proc. Natl Acad. Sci.* **109**, 633–638 (2011).
14. Gherbi, H. *et al.* SymRK defines a common genetic basis for plant root endosymbioses with arbuscular mycorrhiza fungi, rhizobia, and Frankiabacteria. *Proc. Natl Acad. Sci. USA* **105**, 4928–4932 (2008).
15. Markmann, K., Giczey, G. & Parniske, M. Functional adaptation of a plant receptor-kinase paved the way for the evolution of intracellular root symbioses with bacteria. *PLoS Biol.* **6**, e68 (2008).
16. Beatty, P. H. & Good, A. G. Future prospects for cereals that fix nitrogen. *Science* **333**, 416–417 (2011).
17. Oldroyd, G. E. D., Harrison, M. J. & Paszkowski, U. Reprogramming plant cells for endosymbiosis. *Science* **324**, 753–754 (2009).
18. Scotland, R. W. Deep homology: a view from systematics. *Bioessays* **32**, 438–449 (2010).
19. Wagner, G. P. The developmental genetics of homology. *Nat. Rev. Genet.* **8**, 473–479 (2007).
20. De Mita, S., Streng, A., Bisseling, T. & Geurts, R. Evolution of a symbiotic receptor through gene duplications in the legume-rhizobium mutualism. *N. Phytol.* **201**, 961–972 (2013).
21. Oono, R., Schmitt, I., Sprent, J. I. & Denison, R. F. Multiple evolutionary origins of legume traits leading to extreme rhizobial differentiation. *New. Phytol.* **187**, 508–520 (2010).
22. Bruneau, A., Mercure, M., Lewis, G. P. & Herendeen, P. S. Phylogenetic patterns and diversification in the caesalpinioid legumes. *Botany* **86**, 697–718 (2008).
23. Op den Camp, R. H. M. *et al.* A phylogenetic strategy based on a legume-specific whole genome duplication yields symbiotic cytokinin type-A response regulators. *Plant Physiol.* **157**, 2013–2022 (2011).
24. Sprent, J. I. *Legume Nodulation: A Global Perspective* (Wiley-Blackwell, 2009).
25. Beaulieu, J. M., Meara, B. C., Donoghue, M. J. & O'Meara, B. C. Identifying hidden rate changes in the evolution of a binary morphological character: the evolution of plant habit in campanulid angiosperms. *Syst. Biol.* **62**, 725–737 (2013).
26. Zanne, A. E. *et al.* Three keys to the radiation of angiosperms into freezing environments. *Nature* **506**, 89–92 (2014).
27. Pagel, M. Detecting correlated evolution on phylogenies: a general method for the comparative analysis of discrete characters. *Proc. R. Soc. B Biol. Sci.* **255**, 37–45 (1994).
28. Marazzi, B. *et al.* Locating evolutionary precursors on a phylogenetic tree. *Evolution* **66**, 3918–3930 (2012).
29. Barve, A. & Wagner, A. A latent capacity for evolutionary innovation through exaptation in metabolic systems. *Nature* **500**, 203–206 (2013).
30. Rajakumar, R. *et al.* Ancestral developmental potential facilitates parallel evolution in ants. *Science* **335**, 79–82 (2012).
31. Blount, Z. D., Borland, C. Z. & Lenski, R. E. Historical contingency and the evolution of a key innovation in an experimental population of *Escherichia coli*. *Proc. Natl Acad. Sci. USA* **105**, 7899–7906 (2008).
32. Wang, H. *et al.* Rosid radiation and the rapid rise of angiosperm-dominated forests. *Proc. Natl Acad. Sci. USA* **106**, 3853–3858 (2009).
33. Zanne, A. E. *et al.* Data from: Three keys to the radiation of angiosperms into freezing environments. *Dryad Digit. Repos.* (2013) doi:10.5061/dryad.63q27/3.
34. Vitousek, P. M., Menge, D. N. L., Reed, S. C. & Cleveland, C. C. Biological nitrogen fixation: rates, patterns and ecological controls in terrestrial ecosystems. *Philos. Trans. R. Soc. Lond. B Biol. Sci.* **368**, 20130119 (2013).
35. Batterman, S. A. *et al.* Key role of symbiotic dinitrogen fixation in tropical forest secondary succession. *Nature* **502**, 224–227 (2013).
36. Peoples, M. B., Herridge, D. F. & Ladha, J. K. Biological nitrogen fixation: an efficient source of nitrogen for sustainable agricultural production? *Plant Soil* **174**, 3–28 (1995).
37. Quandt, E. M., Deathage, D. E., Ellington, A. D., Georgiou, G. & Barrick, J. E. Recursive genomewide recombination and sequencing reveals a key refinement step in the evolution of a metabolic innovation in *Escherichia coli*. *Proc. Natl Acad. Sci. USA* **111**, 2217–2222 (2014).
38. Blount, Z. D., Barrick, J. E., Davidson, C. J. & Lenski, R. E. Genomic analysis of a key innovation in an experimental *Escherichia coli* population. *Nature* **489**, 513–518 (2012).
39. Radutoiu, S. *et al.* Plant recognition of symbiotic bacteria requires two LysM receptor-like kinases. *Nature* **425**, 585–592 (2003).
40. Liang, Y. *et al.* Nonlegumes respond to rhizobial nod factors by suppressing the innate immune response. *Science* **1384** (2013).
41. Buckling, A., Craig Maclean, R., Brockhurst, M. a. & Colegrave, N. The Beagle in a bottle. *Nature* **457**, 824–829 (2009).
42. Stracke, S. *et al.* A plant receptor-like kinase required for both bacterial and fungal symbiosis. *Nature* **417**, 959–962 (2002).
43. Delaux, P.-M., Séjalon-Delmas, N., Bécard, G. & Ané, J.-M. Evolution of the plant-microbe symbiotic ‘toolkit’. *Trends Plant Sci.* **18**, 298–304 (2013).
44. Young, N. D. *et al.* The *Medicago* genome provides insight into the evolution of rhizobial symbioses. *Nature* **480**, 520–524 (2011).
45. Li, Q.-G., Zhang, L., Li, C., Dunwell, J. M. & Zhang, Y.-M. Comparative genomics suggests that an ancestral polyploidy event leads to enhanced root nodule symbiosis in the papilionoideae. *Mol. Biol. Evol.* **30**, 2602–2611 (2013).
46. Schranz, M. E., Mohammad, S. & Edger, P. P. Ancient whole genome duplications, novelty and diversification: the WGD radiation lag-time model. *Curr. Opin. Plant Biol.* **15**, 147–153 (2012).
47. Sprent, J. I. *Nodulation in Legumes* 156Kew Publishing, 2001).
48. Kattge, J. *et al.* TRY—a global database of plant traits. *Glob. Chang. Biol.* **17**, 2905–2935 (2011).
49. USDA. Germplasm Resources Information Network—(GRIN) [Online Database]. *Natl. Germplasm Resour. Lab. Beltsville, Maryland*. URL at <http://www.ars-grin.gov/~sbmljw/cgi-bin/taxnodul.pl> (2011).
50. Boyle, B. *et al.* The taxonomic name resolution service: an online tool for automated standardization of plant names. *BMC Bioinformatics* **14**, 16 (2013).
51. The Plant List. Version 1. URL at <http://www.theplantlist.org/> (2010).
52. Smith, S. A., Beaulieu, J. M. & Donoghue, M. J. Mega-phylogeny approach for comparative biology: an alternative to supertree and supermatrix approaches. *BMC Evol. Biol.* **9**, 37 (2009).
53. Katoh, K. & Toh, H. Recent developments in the MAFFT multiple sequence alignment program. *Brief. Bioinform.* **9**, 286–298 (2008).
54. Stamatakis, A. RAxML-VI-HPC: maximum likelihood-based phylogenetic analyses with thousands of taxa and mixed models. *Bioinformatics* **22**, 2688–2690 (2006).
55. Ott, M., Zola, J., Stamatakis, A. & Aluru, S. Large-scale maximum likelihood-based phylogenetic analysis on the IBM BlueGene/L. *Proc. ACM/IEEE Conf. Supercomput.—SC '07* 1–11 (2007) doi:10.1145/1362622.1362628.
56. Fitch, W. M. & Markowitz, E. An improved method for determining codon variability in a gene and its application to the rate of fixation of mutations in evolution. *Biochem. Genet.* **4**, 579–593 (1970).
57. Yang, Z. *Computational Molecular Evolution* 357 (Oxford University Press, 2006).
58. Wagenmakers, E.-J. & Farrell, S. AIC model selection using Akaike weights. *Psychon. Bull. Rev.* **11**, 192–196 (2004).
59. Felsenstein, J. Confidence limits on phylogenies: an approach using the bootstrap. *Evolution (N.Y.)* **39**, 783–791 (1985).
60. Efron, B., Halloran, E. & Holmes, S. Bootstrap confidence levels for phylogenetic trees. *Proc. Natl Acad. Sci. USA* **93**, 13429–13434 (1996).
61. Sprent, J. West African legumes: the role of nodulation and nitrogen fixation. *N. Phytol.* **167**, 326–330 (2005).
62. Doyle, J. J. *et al.* Legume phylogeny and classification in the 21st century: progress, prospects and lessons for other species-rich clades. *Taxon* **62**, 217–248 (2013).

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Author contributions

G.D.A.W., W.K.C. and J.I.S. compiled the N₂-fixation database. J.K. contributed data. G.D.A.W. and W.K.C. performed the phylogenetic analyses. G.D.A.W., W.K.C. and E.T.K. designed the study and wrote the paper. All authors discussed the results and commented on the manuscript.

Additional information

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