

REVIEW PAPER

Using breeding and quantitative genetics to understand the C₄ pathway

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Abstract

Reducing photorespiration in C₃ crops could significantly increase rates of photosynthesis and yield. One method to achieve this would be to integrate C₄ photosynthesis into C₃ species. This objective is challenging as it involves engineering incompletely understood traits into C₃ leaves, including complex changes to their biochemistry, cell biology, and anatomy. Quantitative genetics and selective breeding offer underexplored routes to identify regulators of these processes. We first review examples of natural intraspecific variation in C₄ photosynthesis as well as the potential for hybridization between C₃ and C₄ species. We then discuss how quantitative genetic approaches including artificial selection and genome-wide association could be used to better understand the C₄ syndrome and in so doing guide the engineering of the C₄ pathway into C₃ crops.

Keywords: C₄ photosynthesis, natural variation, hybridization, mapping population designs.

Introduction

Photosynthetic plants provide humanity's food, many textiles, and building materials, and represent the source of numerous medicines and fuels. Understanding how improvements in photosynthesis could be achieved therefore has the potential to impact many aspects of human life. Photosynthesis requires the enzyme Rubisco to fix atmospheric carbon dioxide (CO₂) into 3-phosphoglycerate (Calvin and Benson, 1948). Species that only use Rubisco for carbon fixation are known as 'C₃' plants, as 3-phosphoglycerate contains three carbon atoms. Rubisco, however, is also able to react with oxygen in addition to CO₂. This oxygenation reaction produces the toxic molecule 2-phosphoglycolate, which must be metabolized and recycled via the photorespiratory cycle. Photorespiration leads

to loss of carbon fixed by Rubisco and release of ammonia from amino acids at the expense of both ATP and reducing power (Bowes *et al.*, 1971). Rates of photorespiration typically increase at higher temperatures because, under these conditions, the oxygenation reaction of Rubisco is favoured (Portis and Parry, 2007), but photorespiration can also increase during periods of drought when stomatal closure limits CO₂ supply to the Rubisco active site. In extreme conditions, photorespiratory rates can use ~25% of photosynthetic outputs (Sharkey, 1988).

Land plants have evolved two carbon-concentrating mechanisms to reduce photorespiration. These are termed Crassulacean acid metabolism (CAM) and C₄ photosynthesis. Whilst in both cases rates of photorespiration are reduced because compared

with the C₃ state, ~10-fold higher concentrations of CO₂ are supplied to Rubisco, CAM and C₄ species use temporal and spatial systems, respectively. It is estimated that the C₄ pathway has evolved independently from C₃ ancestors at least 60 times to yield numerous phenotypes that concentrate CO₂ around Rubisco (Sage *et al.*, 2011). In all cases, in the C₄ leaf Rubisco-dependent fixation of CO₂ takes place in a specific compartment supplied with high concentrations of CO₂ such that the oxygenase activity of Rubisco is almost completely abolished (Fig. 1A). In most C₄ species, photosynthesis is compartmented between two cell types so that they are unified by a general pathway in which CO₂ is converted to bicarbonate (HCO₃⁻) by carbonic anhydrase (CA) in mesophyll cells, and then combined with the 3-carbon molecule phosphoenolpyruvate (PEP) by the enzyme phosphoenolpyruvate carboxylase (PEPC) into the 4-carbon molecule oxaloacetate (Fig. 1A). Oxaloacetate is then either reduced to malate or transaminated to aspartate. After diffusing to an adjacent cell layer such as the bundle or mesophyll sheath, malate or aspartate are decarboxylated such that high concentrations of CO₂ accumulate around Rubisco and so allow high rates of carboxylation (Fig. 1A). Finally, in species that use NAD-dependent malic enzyme (NAD-ME) or NADP-ME to release CO₂ around Rubisco, the 3-carbon molecule produced from decarboxylation is regenerated to PEP in mesophyll cells by pyruvate orthophosphate dikinase (PPDK) to continue the cycle (Fig. 1A).

Traits underpinning C₄ photosynthesis vary widely between species (Edwards and Voznesenskaya, 2011; Furbank, 2011; Sage and Stata, 2015; Sedelnikova *et al.*, 2018). This interspecific variation in C₄ traits includes differences in leaf anatomy, cell biology, and biochemistry, as well as the patterns of gene expression that determine these characteristics. For example, the cell types and arrangement of veins used by C₄ species vary between lineages that have independently evolved the pathway (Fig. 1B). At least nine anatomical types have been described in the grasses (Poaceae) (Edwards and Voznesenskaya, 2011). Examples of this variation include in the number of layers of mesophyll and/or bundle sheath cells, and whether Rubisco is compartmented into the bundle or the mesophyll sheath. Although much of this variation associated with C₄ photosynthesis is found in lineages that are separated by deep evolutionary time, Kranz anatomy also differs in species within families including the Amaranthaceae (Kadereit *et al.*, 2003; Muhaidat *et al.*, 2007; Sage, 2016), Asteraceae (Peter and Katinas, 2003), Cleomaceae (Koteyeva *et al.*, 2011), Portulacaceae (Voznesenskaya *et al.*, 2017), and Poaceae (Ohsugi and Murata, 1985; Edwards and Voznesenskaya, 2011). Of the ~8100 C₄ species defined to date, six operate the C₄ pathway in a single cell (Fig. 1B). In these single-celled C₄ species, the pathway is distributed between separate populations of chloroplasts such that the cell biology of these species has been modified compared with the C₃ state. However, modifications to the cell biology of C₄ leaves is not restricted to these single-cell species. In C₄ species that separate photosynthesis between two cell

types, plasmodesmatal frequency is increased compared with the C₃ state (Botha, 1992; Danila *et al.*, 2016). Some lineages contain suberin in the bundle sheath cell wall whilst others do not (Mertz and Brutnell, 2014), and whilst some C₄ lineages arrange chloroplasts in bundle sheath cells centripetally, others do this centrifugally with respect to the veins (Edwards and Voznesenskaya, 2011).

Lastly, soon after the discovery of C₄ photosynthesis, differences in the biochemistry of the pathway were discovered among C₄ species (Hatch *et al.* 1975). These different pathways were termed C₄ 'subtypes' due to the fact that decarboxylation is associated with three separate C₄ acid decarboxylases, NADP-ME, NAD-ME, and phosphoenolpyruvate carboxykinase (PEPCK). Although there is growing support for the notion that species can modify the extent to which each C₄ acid decarboxylase is engaged (Omoto *et al.*, 2012; Sharwood *et al.*, 2014; Sales *et al.*, 2018), the differences in biochemistry associated with the subtypes exemplify the fact that the C₄ pathway is a convergent phenomenon, and that its operation varies between species.

The differences in leaf anatomy, cell biology, and biochemistry between independent C₄ lineages have frequently been summarized (Edwards and Voznesenskaya, 2011; Sage, 2016). In contrast, there have been fewer recent attempts to synthesize the literature relating to forced hybridizations between C₃ and C₄ species. Studies have included somatic hybridizations of phylogenetically distant C₃ and C₄ plants, as well as sexual hybridizations of congeneric species. Whilst these wide hybridizations have provided insight into the extent to which C₄ traits can be maintained and inherited in C₃ species, a growing body of evidence documents variation in C₄ traits within a species. We summarize examples of this work and suggest that there are opportunities to use quantitative trait mapping to better understand the C₄ pathway. Not only could these classical approaches provide insight into the evolution and genetic basis of C₄ photosynthesis, they may also inform efforts to engineer more efficient C₃ crops.

Somatic hybridization of C₃ and C₄ species

Approaches such as protoplast fusion allow somatic or asexual hybridization. Protoplasts from somatic cells from separate species are fused and regenerated into hybrid plants (Carlson *et al.*, 1972; Evans, 1983). In many cases, asexual hybridization can lead to fertile hybrids between species that are considered sexually incompatible. Attempts to form hybrids via somatic hybridization of C₃ rice (*Oryza sativa*) and other C₄ grasses have been moderately successful. Terada *et al.* (1987) produced somatic hybrids between rice and C₄ *Echinochloa oryzicola* that were morphologically different from either parent. Some contained 60 chromosomes which corresponded to the full hybrid complement, but plants developed necrosis and died before forming roots. Moreover, rice and C₄ *Panicum maximum* (now

Megathyrsus maximus) were successfully fused to form hybrids with abnormal floral structures with lowered fertility (Xin *et al.*, 1997). In all, 28 hybrids flowered but only five set fertile seed. To our knowledge, this work has never been repeated.

There have also been attempts to form hybrids between wheat and C₄ grasses. A cell suspension of *Triticum* (a perennial hybrid of *Triticum durum* and *Thinopyrum intermedium*) was hybridized with maize (Wang *et al.*, 1993; Wang and Niizeki, 1994). Plants that regenerated were aneuploids carrying incomplete sets of chromosomes from both species. Although the progeny were not full hybrids, this study demonstrated that after asexual hybridization, maize and *Triticum* chromosomes were not eliminated during successive cell divisions despite the uniparental genome elimination that occurs when both species are hybridized sexually (Laurie and Bennett, 1986, 1989; Laurie *et al.*, 1990). Szarka *et al.* (2002) fused a cell suspension of an albino maize mutant with wheat protoplasts. Plants that regenerated resembled maize but were green, indicating that photosynthesis from wheat rescued the albino phenotype in maize. Cytological observations showed the plants had all parental chromosomes, but no morphological traits associated with C₄ photosynthesis were detected and, although the plants produced male and female flowers, all were sterile (Szarka *et al.* 2002). Independently, Xu *et al.* (2003) reported wheat–maize hybrids that contained nuclear and mitochondrial genomes of both species but plastid DNA only from wheat. These somatic hybrids resembled wheat and, although many flowered, they were all sterile. This may have been due, at least in part, to the fact that the wheat and maize cell suspension cultures had chromosomal aberrations prior to fusion. Thus, taken as a whole, work on asexual hybridization of C₃ and C₄ cereals indicates that chromosomes of both photosynthetic types are stable in fused cells. However, in reports such as those from Xu *et al.* (2003) and Szarka *et al.* (2002), plants were not viable after transfer from tissue culture. In contrast, sexual hybridization of closely related C₃ and C₄ species has in some cases allowed production of fertile plants and their progeny assessed over multiple generations. We address this next.

Sexual hybridization of C₃ and C₄ species

A number of taxa containing either congeneric C₃ and C₄ species or C₃, C₃–C₄ intermediates, and C₄ species have been successfully hybridized (Fig. 2A, B). Although the outcome of these analyses varied, whilst wholesale transfer of C₄ traits have not been reported in some instances, specific traits were introgressed into a C₃ background. For example, crosses between C₄ *Atriplex rosea* and C₃ *Atriplex prostrata* (formerly *A. patula* ssp. *hastata* and *A. triangularis*, respectively), C₃ *A. rosea* and C₃ *A. glabriuscula* have been made (Björkman *et al.*, 1969; Nobs *et al.*, 1970). Populations derived from such crosses were progressed and C₄-like characteristics assessed (Björkman *et al.*, 1971). Among 200 F₃ individuals screened for the CO₂

compensation point, 178 individuals showed values similar to the C₃ parent, 19 showed intermediate phenotypes, and three were similar to the C₄ parent (Björkman *et al.*, 1969). Thus, in a small number of individuals, it appears that crossing was able to integrate loci associated with the compensation point. When F₁ derived from a C₄ *A. rosea* × C₃ *A. patula* hybridization were backcrossed to C₄ *A. rosea*, these BC₁ offspring segregated for either C₄ or C₃ photosynthesis, with only two individuals showing C₄ photosynthesis (Rikiishi *et al.*, 1988), suggesting dominance towards a C₃ state in this hybrid combination. In these reports above, no F₁ individual, nor any within segregating F₂ and F₃ populations, showed a full transfer of C₄ photosynthesis. More recently, F₂ individuals derived from a resynthesized C₄ *A. rosea* × C₃ *A. prostrata* cross showed large variation in leaf anatomy and nearly intermediate CO₂ compensation points, but individuals in the F₃ generation seemed to revert to C₃-like values (Oakley *et al.*, 2014). Hybrids have also been made between C₃ and C₄-like species of *Flaveria* (Apel *et al.*, 1988; Cameron *et al.*, 1989) and C₃–C₄ intermediate and C₄ *Flaveria* species (Brown *et al.*, 1986, 1992). Significant F₁ sterility was encountered (Brown and Bouton, 1993) but F₂ were obtained and, although they possessed continuous variation with regard to C₄ leaf anatomy and carbon isotope discrimination characteristics, it was skewed away from the mid-parental mean towards a C₃ or C₃–C₄ phenotype. This would indicate dominance deviation towards a C₃ phenotype despite the presence of genes that allow C₄ photosynthesis. In F₁ hybrids derived from a C₃ × C₄-like *Flaveria* cross, enzyme activities of PEPC, PPDK, and NADP-ME were skewed towards those associated with C₃ photosynthesis, but C₄-like activities were reported for NADP-malate dehydrogenase (Holaday *et al.*, 1988), indicating that incomplete dominance for certain genes may exist while others show dominant activity patterns. In summary, although many C₃ × C₄ hybrids in the dicotyledons showed reduced fertility and limited penetrance of C₄ traits, these studies also indicate that aspects of C₄ photosynthesis are heritable in a C₃ background. As many other closely related C₃ and C₄ species exist (Fig. 2C), it is possible that additional stable hybrids could be generated that exhibit increased genomic stability and/or better trait segregation between the C₃, C₃–C₄, and C₄ types. Hybrids between different C₄ decarboxylation subtypes may also be possible. Closely related species such as *Blepharis ciliaris* and *Blepharis attenuata* that use NAD-ME and NADP-ME, respectively, have been described (Akhani *et al.*, 2008). To our knowledge, whilst no hybrids have been reported in *Blepharis*, natural hybrids between *Cynodon dactylon* (NAD-ME) and *Chloris* sp. (PEPCK) display intermediate activities of NAD-ME and PEPCK (Prendergast, 1987).

C₃–C₄ hybrids have been generated in the grasses by two broad approaches. First, as with dicotyledons, congeners using either C₃ or C₃–C₄ photosynthesis have been crossed. Second, much wider crosses of distantly related species have been performed. Examples of crosses within a genus include C₃ and C₃–C₄ intermediate *Steinchisma* (formally *Panicum*) species

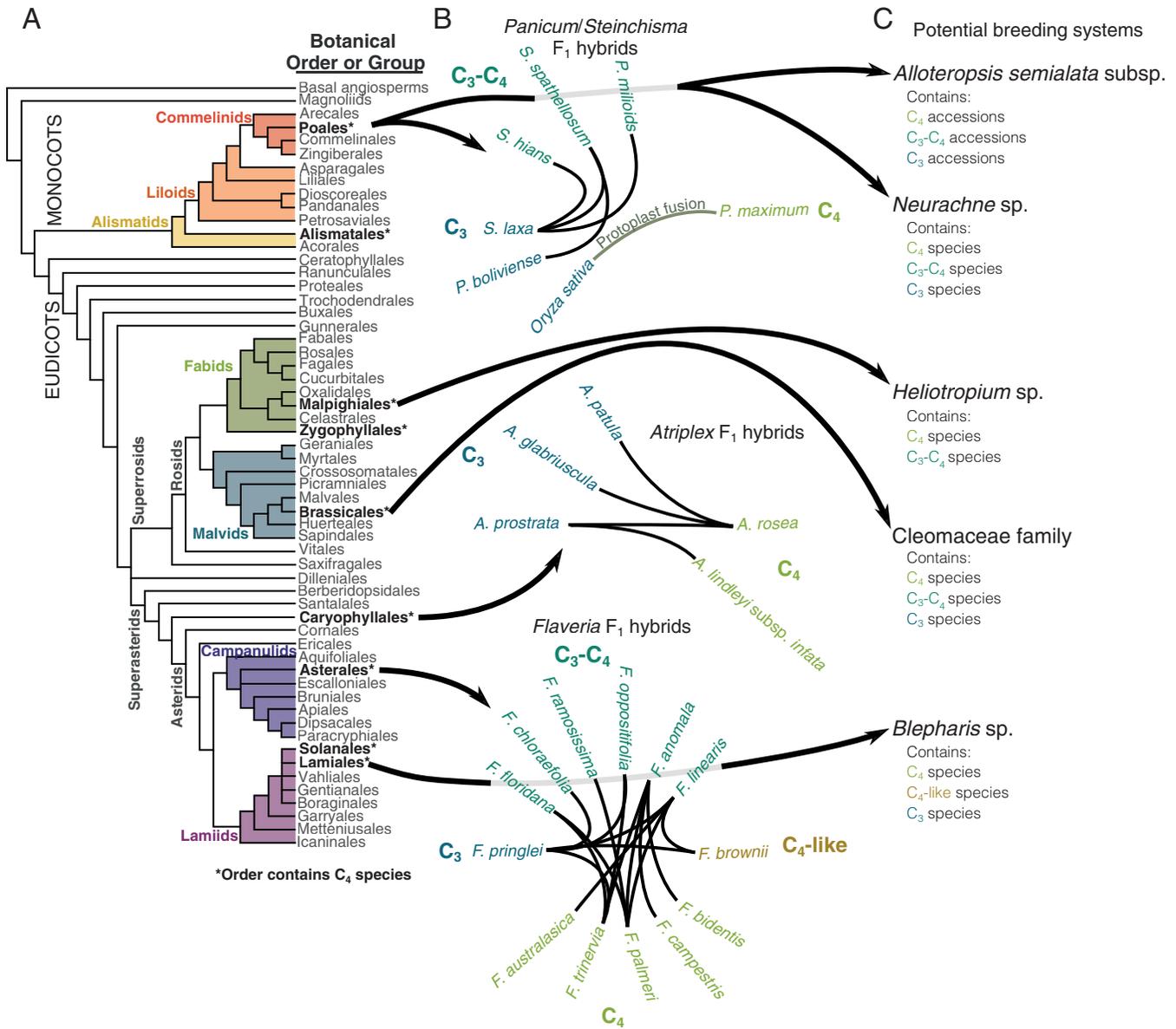


Fig. 2. Examples of successful as well as potential hybridizations between C₃ and C₄ species. (A) Phylogenetic reconstruction of the orders constituting flowering plants according to The Angiosperm Phylogeny Group (2016). Orders containing C₄ lineages are shown in bold. (B) Exemplar hybridization webs that have resulted in successful F₁ hybrids between C₃, C₄, and C₃-C₄ intermediate photosynthetic types. (C) Taxa that contain closely related C₃, C₄, or C₃-C₄ intermediate species or accessions for which hybridization has not been reported, but may be possible. These groups are potential systems where C₄ genes could be mapped. Arrows from the phylogenetic tree indicate from which order the plant species originate (B, C).

from the Poaceae (Bouton *et al.*, 1986; Brown *et al.*, 1986; Sternberg *et al.*, 1986). F₂ and F₅ individuals derived from hybridization of *Steinchisma milioides* (C₃-C₄) and *Steinchisma laxum* (C₃), or *S. spathellosum* (C₃-C₄) and *S. boliviense* (C₃) exhibited intermediate leaf morphologies, CO₂ compensation points, and δ¹³C values. Also within the Poaceae, C₃ and C₄ accessions of *Alloteropsis semialata* have been hybridized, producing plants with intermediate anatomical traits as well as C₄ gene expression (Bianconi *et al.*, 2021, Preprint). Thus, in these hybridizations, some traits important for C₄ photosynthesis could be introduced into an otherwise C₃ leaf. A variety of

attempts at wide hybridization have also been reported. For example, although maize pollen germinates and fertilizes the ovule of wheat to form zygotes containing a full haploid set of each parental genome (Laurie and Bennett, 1986), these hybrids were unstable and after three rounds of mitotic cell divisions during embryogenesis all maize chromosomes were lost (Laurie and Bennett, 1986, 1989). In contrast, after hybridization of oat and pearl millet (*Pennisetum glaucum*) (Gernand *et al.*, 2005; Ishii *et al.*, 2010), some oat embryos contained all pearl millet chromosomes, and embryo rescue allowed hybrids possessing the haploid genomes of both species to be obtained

(Ishii *et al.*, 2013). It appears that the pearl millet chromosomes had incorporated centromeric oat histones (Ishii *et al.*, 2015), but these haploid oat–millet F₁ hybrids developed necrosis and died. This may have been caused by incompatibility between the species or non-ideal tissue culture conditions. Crosses between wheat and grain pearl millet (*Pennisetum americanum*) or oat and maize both allowed individual chromosomes from one species to be incorporated into the other. In the case of wheat and grain pearl millet from 958 hybridizations, one wheat plant carrying an additional pearl millet chromosome was identified (Ahmad and Comeau, 1990). Although this chromosome was maintained until flowering, it was not detected in the next generation. Thus, wheat–pearl millet hybrids may be more stable than wheat–maize hybrids, but problems maintaining chromosomes from both parents still appear to exist. Unlike wheat–maize hybrids, maize chromosomes have successfully been integrated into oat. This allowed the synthesis of so-called oat–maize chromosome addition lines that stably inherit single chromosome pairs from maize (Kynast *et al.*, 2001, 2004). As with the pearl millet–oat crosses (Ishii *et al.*, 2015), stability of the oat–maize addition lines appears to be mediated by incorporation of centromeric oat histones into the maize chromosomes such that proper chromosomal segregation can take place during mitosis (Jin *et al.*, 2004; Wang *et al.*, 2014). In some maize–oat lines, C₄ characteristics such as abundant transcripts of *PEPC* or C₄-like bundle sheath cell size and vein spacing were detected (Tolley *et al.*, 2012).

In summary, the findings based on wide hybridization of maize and oat indicate that breeding offers a possible route to incorporate some C₄ traits into C₃ crops without prior knowledge of the underlying genetics. Although additional parental combinations may exist that allow greater trait stability in progeny, this approach has not yet allowed loci controlling C₄ traits to be identified. In contrast, quantitative variation in C₄ characteristics within a C₄ species would allow trait mapping, and there is increasing evidence that this could be informative.

Intraspecific variation in C₄ photosynthesis

As PEPC discriminates less than Rubisco against the ¹³C isotope, a stronger C₄ cycle leads to lower incorporation of ¹³C into tissue and so less negative δ¹³C values (Leary, 1988). Intraspecific variation in δ¹³C has been reported in maize and *Gynandropsis gynandra* (Voznesenskaya *et al.*, 2007; Kolbe and Cousins, 2018; Kolbe *et al.*, 2018; Reeves *et al.*, 2018; Twohey *et al.*, 2019). To our knowledge, the extent to which this variation in C₄ efficiency is caused by differences in Kranz anatomy, cell biology, or C₄ biochemistry has not been determined but, as summarized next, variation in some of these traits within a species has been reported. This includes variation in vein density in maize (Yabiku and Ueno, 2017; Kolbe and Cousins, 2018) as well as bundle sheath cell size in *Alloteropsis semialata* (Lundgren *et al.*, 2016) and *G. gynandra* (Reeves *et al.*, 2018).

Thus, natural variation in Kranz anatomy is found within species of C₄ monocotyledons and dicotyledons. Statistical modeling suggests that evolution of enlarged bundle sheath cells and vein density were among the first changes to occur during the transition from C₃ to C₄ photosynthesis (Williams *et al.*, 2013), and phylogenetic reconstructions reveal that these changes probably happened in response to reduced water availability (Edwards and Smith, 2010). As bundle sheath cell size and vein density were found to be correlated with water use efficiency in maize (Yabiku and Ueno, 2017) and *G. gynandra* (Reeves *et al.*, 2018), it is possible that analysis of C₄ accessions adapted to different water availabilities will allow additional examples of intraspecific variation in Kranz anatomy to be identified.

While bundle sheath cells are always greener in C₄ compared with C₃ species, the proportion of leaf tissue allocated to bundle sheath cells compared with the mesophyll cells can be caused by either increased bundle sheath cell size or vein density (Sedelnikova *et al.*, 2018). Interestingly, within *G. gynandra*, these characteristics co-vary and correlate negatively with one another (Reeves *et al.*, 2018). In addition to variation in Kranz anatomy in a species, there is also evidence that the cell biology of C₄ leaves can differ. For example, some accessions of *Panicum coloratum* possess a suberized bundle sheath whilst others do not (Ohsugi and Murata, 1985). There is also variation in chloroplast organization, with some accessions arranging chloroplasts centrifugally and others centripetally compared with veins (Ohsugi and Murata, 1985). Interestingly, *Cynodon dactylon*, an NAD-ME subtype with centripetal chloroplasts and a suberized bundle sheath, hybridizes naturally with *Chloris* that uses PEPC as the primary C₄ acid decarboxylase, has centrifugally arranged chloroplasts, and no suberization of the bundle sheath (Prendergast, 1987). F₁s demonstrated intermediacy for these traits (Prendergast, 1987). Thus, these species offer an interesting system to study regulators of bundle sheath cell biology.

To our knowledge, there are no clear examples of quantitative variation in the extent to which accessions of an individual C₄ species use the various C₄ acid decarboxylases. However, there are two reasons to consider this likely. First, in 26 founder lines of a maize multiparent population, variation in the activities of C₄ enzymes has been reported (McMullen *et al.*, 2009; Kolbe *et al.*, 2018). As the founders show differences in enzyme activity, it is likely that lines of the mapping population possess similar variation. Accessions of *A. semialata* (Dunning *et al.*, 2017) and *G. gynandra* (Reeves *et al.*, 2018) demonstrate differences in transcript abundance and so it appears likely that these species will also demonstrate variation in activity of C₄ acid decarboxylases. Second, the extent to which the different C₄ acid decarboxylases are engaged can vary with the environment. For example, in *G. gynandra* and maize, increased abundance of transcripts encoding C₄ enzymes did not correlate with photosynthetic efficiency (Kolbe and Cousins, 2018; Reeves *et al.*, 2018) but in *G. gynandra* they were associated with increased water use efficiency. Additionally, the PEPC subtype

is considered more efficient under lower levels of light since it theoretically requires fewer quanta of light per CO₂ molecule fixed (Furbank, 2011; Yin and Struik, 2020). Consistent with this, sugarcane (*Saccharum officinarum*) and maize which predominantly use NADP-ME showed lower and higher activities of NADP-ME and PEPCK, respectively, after either shade or salt stress (Omoto *et al.*, 2012; Sharwood *et al.*, 2014; Sales *et al.*, 2018). Increased CO₂ leakage from bundle sheath cells has also been reported, and it has been proposed that this is caused by increased use of cytosolic PEPCK compared with the chloroplastic NADP-ME (Sales *et al.*, 2018). If populations of these species have become reproductively isolated in habitats with distinct light supplies, differences in subtype preference may have evolved. Thus, C₄ traits ranging from discrimination against δ¹³C, C₄ leaf anatomy, bundle sheath cell biology, and C₄ transcript abundance have been documented within a species. In each case, breeding and quantitative genetics offer an opportunity to identify loci controlling these traits. Within this context, we next assess opportunities associated with quantitative genetics to better understand C₄ photosynthesis.

Quantitative genetics and C₄ photosynthesis

Quantitative genetics allow traits exhibiting continuous variation to be linked to genomic regions termed quantitative trait loci (QTL). Advances in high-throughput phenotyping relevant to photosynthetic performance (reviewed by Choudhury *et al.*, 2019; van Bezouw *et al.*, 2019) mean that quantitative genetics now offers a path to dissect the genetics underlying photosynthesis.

Traditional QTL mapping requires a linkage map (or genetic map) to order loci. Using a population derived from two parents that differ in a trait of interest, associations between the trait and molecular markers can identify genes in close proximity to the trait (Mauricio, 2001). Advantages of QTL mapping are that limited knowledge of the genome is necessary and producing bi-parental populations is relatively rapid (Fig. 3A). Recombinant inbred lines (RILs) can be produced, for example, from a segregating F₂ generation through rounds of self-fertilization and so generate an immortalized population that can be genotyped once but phenotyped repeatedly. This is especially useful for heritability estimates and mapping QTL in different environments or years (Broman, 2005). Due to considerable differences in the biochemistry and physiology of C₃ and C₄ plants, if mapping populations derived from C₃ and C₄ parents of *Atriplex*, *Alloteropsis*, or *Flaveria* were generated, QTL mapping could probably associate genes with a wide variety of C₄ phenotypes. *Alloteropsis semialata* could be of particular interest here because of the presence of both C₃ and C₄ sub-species that hybridize to produce offspring with intermediate characteristics (Bianconi *et al.*, 2021, Preprint). As self-fertilization is also possible, a population of RILs could be designed

specifically for the investigation of C₄ traits. High-throughput phenotyping combined with the convoluted neural network Mask R-CNN (He *et al.*, 2017) has been used for QTL mapping of C₄-relevant traits in biparental populations. This allowed rapid assessment of thousands of images and identification of QTL for stomatal traits such as size and density (Xie *et al.*, 2021).

Although QTL mapping is used extensively, its power is limited if the trait is responsive to the environment and so has low heritability. The heritability of many C₄ traits remains poorly understood, but there is growing evidence that variations in CO₂ fixation processes and leaf anatomy exist (Table 1) and so estimates of heritability of such C₄ traits should be possible. Given the complexity of photosynthesis, its ability to respond to the environment, and temporal variation in its efficiency, it is highly likely that low-heritability traits will be encountered (Flood *et al.*, 2016). Although traits with low heritability can be investigated using highly controlled environments, highly inbred populations in combination with high-density marker systems are necessary to capture the multiple small-effect QTL contributing to the low-heritability trait of interest. An alternative approach involves genome-wide association studies (GWAS) or linkage disequilibrium (LD) mapping, which identifies markers such as single nucleotide polymorphisms (SNPs) that are in LD with the phenotype of interest (Tam *et al.*, 2019). GWAS does not require a segregating population but rather uses many diverse accessions that represent thousands of years of recombination to capture multiple alleles, allowing marker groups (haplotypes) to be identified in close association with causal loci. Additionally, it has the advantage of being feasible for obligate outcrossers. In order to work successfully, GWAS requires many markers since it relies on LD decay (Mackay and Powell, 2007) and, as pedigrees are unknown, physical maps are also needed. Although population structure increases the number of false positives derived from GWAS (Korte and Farlow, 2013), this is increasingly being overcome by statistical modelling (Cortes *et al.*, 2021). GWAS has identified QTL associated with photosynthetic performance during chilling in maize (Strigens *et al.*, 2013) and sorghum (Ortiz *et al.*, 2017). More recently, a sorghum diversity panel of 756 African accessions was described (Faye *et al.*, 2021) and a diverse 869 line panel (Valluru *et al.*, 2019) was subjected to GWAS to identify genes controlling stomatal conductance and water use efficiency (Ferguson *et al.*, 2021; Pignon *et al.*, 2021). The latter two studies used transcriptome data to allow transcriptome-wide association as well as GWAS (reviewed by Wainberg *et al.*, 2019) to increase the likelihood of identifying candidate genes. Association mapping has also been used to study the light-dependent reactions of photosynthesis (van Bezouw *et al.*, 2019) but, to our knowledge, QTL determining differences in C₄ carbon fixation or Kranz anatomy have not yet been identified. The sorghum and maize mapping panels present an avenue through which

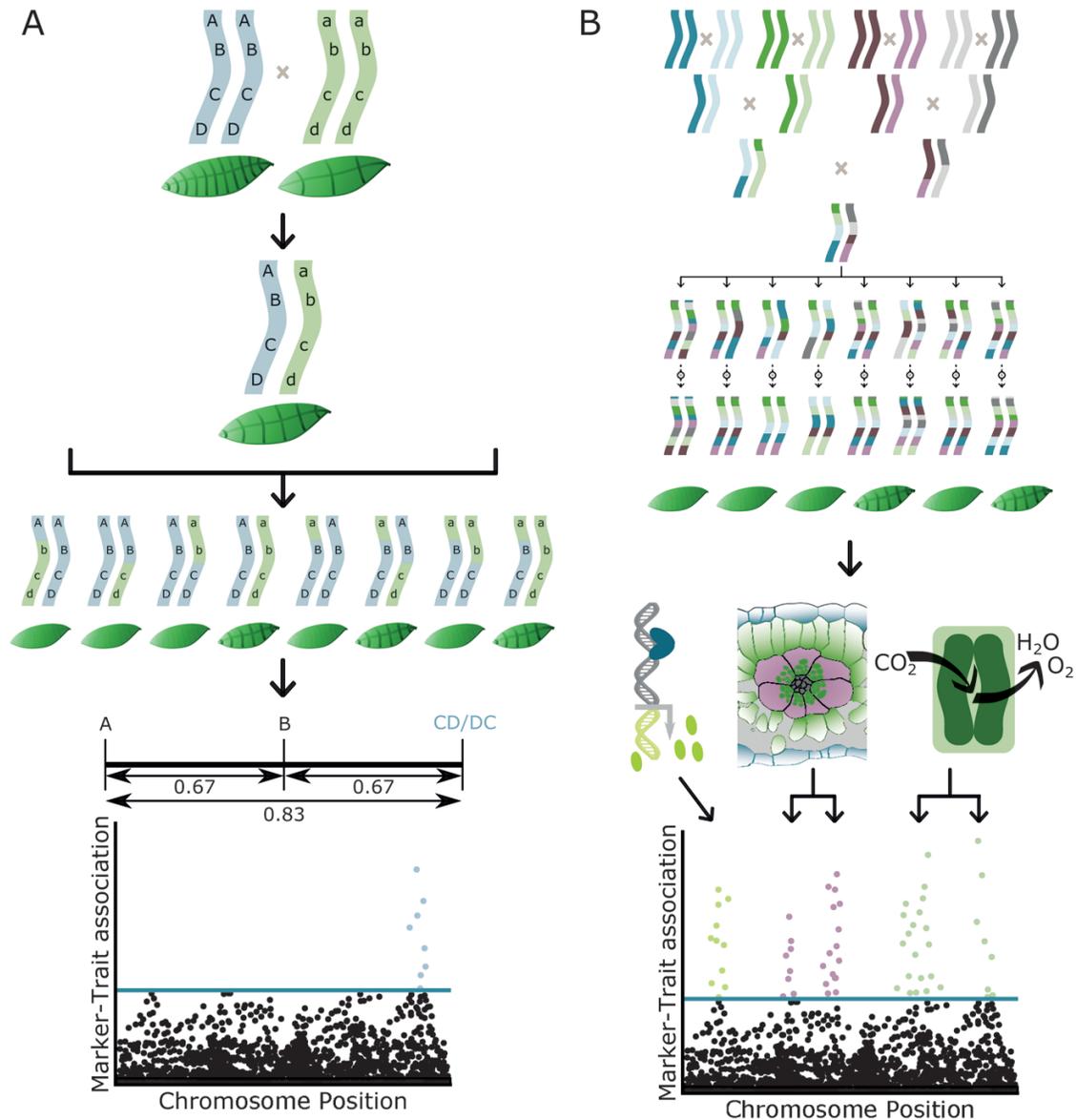


Fig. 3. Quantitative genetics in the context of C₄ photosynthesis. (A) A schematic for QTL mapping of leaf anatomical traits. Two homozygous parents, genotyped for four markers, A, B, C, and D, and differing in vein density are hybridized and advanced to form a bi-parental population that can be used to identify QTL associated with vein density (here located near markers C and D). Numbers show recombination fractions, which are used to position the QTL relative to flanking markers. (B) Population structure of a MAGIC pedigree followed by four generations of intercrossing and self-fertilization. Progeny contain more genetic variation than that derived from a bi-parental design. Hypothetical plot showing how QTL associated with individually mapped C₄ phenotypes such as gene expression, bundle sheath cell size, or gas exchange parameters (e.g. stomatal conductance, CO₂ assimilation, etc.) can be mapped with one population.

targeted phenotyping of C₄-specific traits could be used to identify genes responsible for the C₄ syndrome. For example, if a gene controlling bundle sheath cell size was identified through mapping in maize or sorghum, this could then be introduced in a C₃ crop such as rice to determine whether this allowed engineering of this trait.

Association mapping can be combined with specific breeding pedigrees to capture multiple recombination events, account for population structure, and so allow higher

resolution mapping. These include nested-association mapping (NAM) and multiparent advanced generation inter-crossing (MAGIC) population designs. Both address issues with GWAS and capture more allelic variation than bi-parental populations. Whilst allelic diversity is reduced in these multiparent designs compared with GWAS, linkage mapping as well as association mapping are possible, and this is particularly useful when a physical map is not available (Broman *et al.*, 2018). Thus, NAM and MAGIC are currently particularly relevant

Table 1. Summary of publications documenting intraspecific variation in traits relevant to C₄ photosynthesis-associated traits

Species	Varying trait	Reference
<i>Alloteropsis semialata</i> (C ₄ accessions)	Abundance of <i>PEPC</i> and <i>PEPCK</i> transcripts	Dunning <i>et al.</i> (2017)
	PEPC content	Lundgren <i>et al.</i> (2016)
	Carbon isotope discrimination	
	Mesophyll cell size	
	Bundle sheath cell size	
	Leaf physiology	
<i>Gynandropsis gynandra</i>	C ₄ transcript abundance, physiology, and leaf morphology	Reeves <i>et al.</i> (2018)
<i>Panicum coloratum</i>	Chloroplast location	Ohsugi and Murata (1985)
	Bundle sheath suberization	
<i>Setaria italica</i>	Carbon isotope	Lightfoot <i>et al.</i> (2016)
	Differing intensities of green'	
<i>Sorghum bicolor</i>	Net assimilation rate	Kataria and Guruprasad (2012)
<i>Zea mays</i>	CA transcript abundance	Zhang <i>et al.</i> (2015)
<i>Zea mays</i>	CA, PEPC, and Rubisco activity	Kolbe and Cousins (2018)
	Net assimilation rate	
	Interveinal distance	
	Mesophyll thickness	
	Maximum assimilation rate	
	CA, PEPC, and Rubisco activity	Kolbe <i>et al.</i> (2018)
	C ₄ transcript abundance	
	Carbon isotope	
	Vein density	Yabiku and Ueno (2017)
	Gas exchange traits	
	PEPC, NADP-ME, PEPCK, and Rubisco activity	

CA, carbonic anhydrase, NADP-ME; NADP-dependent malic enzyme; PEPC, phosphoenolpyruvate carboxylase; PEPCK, phosphoenolpyruvate carboxykinase.

for C₄ photosynthesis because although annotated genome sequences are being developed for, for example, *Alloteropsis* sp., *Flaveria* sp., and *G. gynandra*, complete and well-annotated genomes for many C₄ model species have not yet been developed. The NAM design involves crossing one recurrent parent with many other accessions. Progeny from each cross are initially bulked and then self-fertilized for multiple generations, leading to multiple RIL families (one family per unique founder) that then constitute the final NAM population (Yu *et al.*, 2008; McMullen *et al.*, 2009). At least two NAM populations exist for maize (Yu *et al.*, 2008; Chen *et al.*, 2019) and, as mentioned above, significant variation for $\delta^{13}\text{C}$ as well as CA, PEPC, and Rubisco activities has been reported in the founder lines (Zhang *et al.*, 2015; Kolbe *et al.*, 2018; Twohey *et al.*, 2019). Despite this, QTL for these traits have to our knowledge not yet been determined. A sorghum NAM population has been used in conjunction with an association panel to identify QTL for grain filling (Tao *et al.*, 2020). NAM populations offer the chance to study an extremely divergent line, such as a pre-domesticated species in the background of a stable population. This has been done with teosinte and maize as the recurrent parent (Chen *et al.*, 2019). Given the noted differences in maize and teosinte photosynthetic capacity (Yabiku and Ueno, 2017), this offers an interesting resource to map traits that differ between these species.

The MAGIC design also relies on homozygous founder lines that differ in traits of interest. Intercrossing for multiple generations allows segregating populations to be formed consisting of lines that capture the founder genomes in unique recombinants (Fig. 3B). Such segregating lines then undergo self-fertilization for several generations to generate RILs that capture multiple allele combinations from the various parents (Cavanagh *et al.*, 2008). With MAGIC, haplotype diversity is not limited by the use of a single recurrent parent (Ladejobi *et al.*, 2016) and, although the MAGIC design requires large amounts of hybridization and significant time to produce the final population (Huang *et al.*, 2015; Pascual *et al.*, 2015; Ongom and Ejeta, 2017; Mahan *et al.*, 2018), simplified strategies can be implemented (Stadlmeier *et al.*, 2018). In the context of C₄ photosynthesis, MAGIC RILs are available for maize and sorghum (Dell'Acqua *et al.*, 2015; Ongom and Ejeta, 2017; Mahan *et al.*, 2018; Butrón *et al.*, 2019). Additionally, transcriptome data exist for the founders of one maize MAGIC population (Dell'Acqua *et al.*, 2015) and 94 of the MAGIC RILs (Baute *et al.*, 2016). Should these RILs possess variation in activity of C₄ enzymes or components of Kranz anatomy, QTL could be identified. To our knowledge, there is currently no MAGIC population available for a C₄ dicotyledon, nor a mapping panel designed explicitly to map C₄ photosynthetic traits. As variation in C₄ traits has been reported in *A. semialata* and

G. gynandra (Lundgren *et al.*, 2016; Reeves *et al.*, 2018) and they can be crossed (Sogbohossou *et al.*, 2018; Bianconi *et al.*, 2020), mapping resources in these species would be useful.

Once a QTL is identified using any of the above population types, fine mapping enables causative genes to be identified (Hormozdiari *et al.*, 2014; Tam *et al.*, 2019). Parsing C₄ photosynthesis into individual components, such genes controlling C₄ enzyme activity or bundle sheath cell size (Dunning *et al.*, 2017) are identified by different phenotyping techniques which, combined with fine mapping, could identify additional genes required for C₄ photosynthesis. Exploiting the high degree of natural variation among C₃ and C₄ species will enable genome-wide associations to help map critical photosynthesis regulators. Furthermore, inferences into the inheritance of C₄ components such as cell-specific gene expression can be parsed even without proper segregation or recombination in C₃ and C₄ hybrids (Fig. 4). While such methods cannot identify QTL, they can at least establish broad modes of inheritance (Charlesworth and Willis, 2009). For example, sterile F₁ populations derived from C₃ and C₄ parents that show altered transcript abundance or cellular localization of C₄ enzymes can provide insight into whether genes are controlled in *cis*, *trans*, or

a combination of both mechanisms, and whether these mechanisms are functioning in an activating or repressive manner (Fig. 4). This technique has been deployed in F₁ hybrids derived from a cross between the C₃–C₄ intermediate *Moricandia arvensis* and the C₃ *M. moricandiodes* to show that *cis*-regulation dominates control of photosynthetic and anatomical phenotypes (Lin *et al.*, 2021, Preprint). Information from such studies could inform mapping strategies and marker placement for associations.

In summary, in order to modify C₃ leaves to perform C₄ photosynthesis, an improved understanding of C₄ anatomy, cell biology, and biochemistry is needed. Wide hybridization by either sexual or asexual means to recombine interspecific variation found in C₃ and C₄ species or intraspecific photosynthetic variation in C₄ species, combined with mapping populations and high-throughput phenotyping, should facilitate a better understanding of C₄ photosynthesis. Quantitative genetics then offer robust methods to better understand the regulatory mechanisms behind these traits. Applying these techniques therefore promises to enhance photosynthetic efficiency of C₃ and C₄ crops and so contribute to a more robust world agriculture in the future.

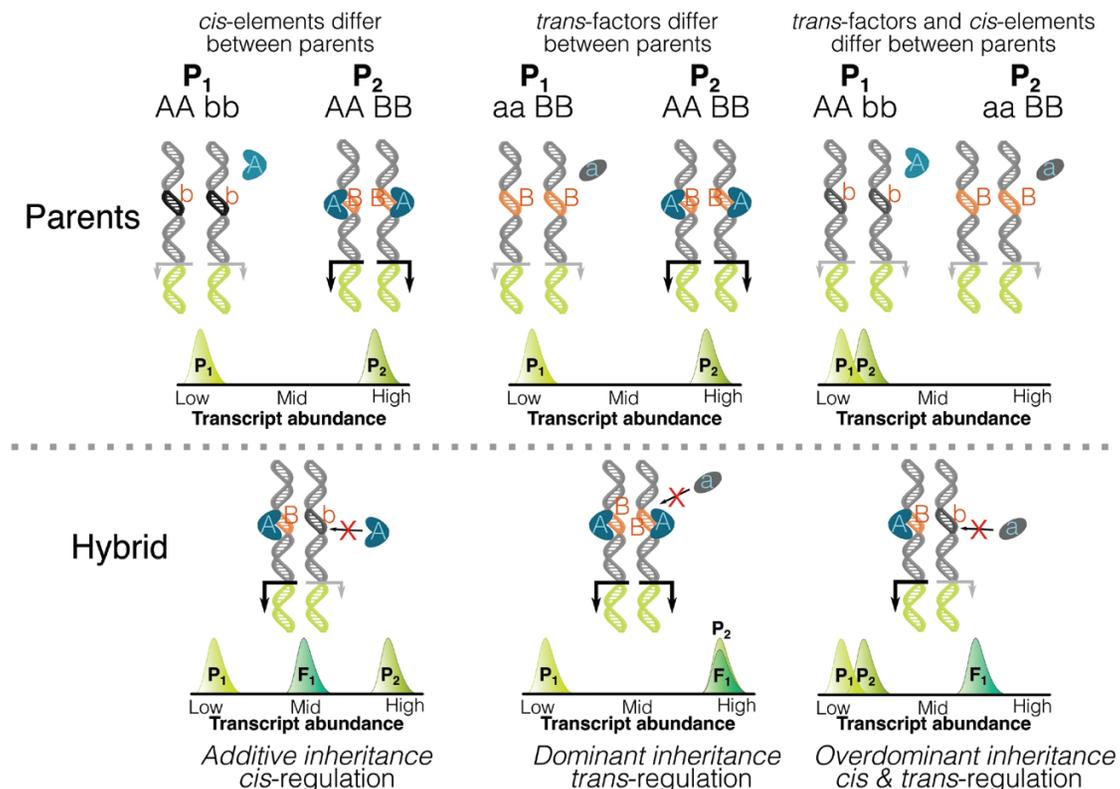


Fig. 4. Using breeding to understand the molecular basis of C₄ gene regulation. Parental populations that differ in transcript abundance can be due to multiple genetic effects that can be parsed by quantitative genetics. A simplified two loci model where one locus is a *cis*-element and the other an activating *trans*-factor is presented to illustrate how the molecular basis underpinning variations in gene expression can be determined by inheritance of gene expression in F₁ hybrids. If expression of a gene is controlled by changes in *cis*-regulation between parents, offspring exhibit additive expression patterns. If variation in expression is due to changes *in trans* between parents, then offspring exhibit dominance deviation towards one parent. Lastly, if differences in gene expression between parents is due to both *cis* and *trans* factors, offspring demonstrate heterosis or overdominance.

Author contributions

All authors contributed to the analysis of literature and writing of this review.

Conflict of interest

The authors declare no conflicts of interest.

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