


# Quantitative trait loci mapping reveals an oligogenic architecture of a rapidly adapting trait during the European invasion of common ragweed

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## Abstract

Biological invasions offer a unique opportunity to investigate evolution over contemporary timescales. Rapid adaptation to local climates during range expansion can be a major determinant of invasion success, yet fundamental questions remain about its genetic basis. This study sought to investigate the genetic basis of climate adaptation in invasive common ragweed (*Ambrosia artemisiifolia*). Flowering time adaptation is key to this annual species' invasion success, so much so that it has evolved repeated latitudinal clines in size and phenology across its native and introduced ranges despite high gene flow among populations. Here, we produced a high-density linkage map (4493 SNPs) and paired this with phenotypic data from an F2 mapping population ( $n = 336$ ) to identify one major and two minor quantitative trait loci (QTL) underlying flowering time and height differentiation in this species. Within each QTL interval, several candidate flowering time genes were also identified. Notably, the major flowering time QTL detected in this study was found to overlap with a previously identified haploblock (putative inversion). Multiple genetic maps of this region identified evidence of suppressed recombination in specific genotypes, consistent with inversions. These discoveries support the expectation that a concentrated genetic architecture with fewer, larger, and more tightly linked alleles should underlie rapid local adaptation during invasion, particularly when divergently adapting populations experience high levels of gene flow.

## KEYWORDS

*Ambrosia artemisiifolia*, flowering time, genetic map, haploblocks, quantitative trait loci

## 1 | INTRODUCTION

While invasive species often have disastrous economic or ecological impacts, and thereby are important subjects for applied research, they remain a fascinating evolutionary phenomenon. Exotic and

weedy species are highly successful colonizers that can rapidly spread through diverse habitats, responding to changing environmental conditions and novel selection pressures along the way (Bock et al., 2015; Hodgins et al., 2018). How they are able to thrive in foreign environments is of great interest, especially considering

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the reductions in genetic diversity that can often accompany long-distance range expansion (Franks & Munshi-South, 2014; Sax & Brown, 2000). These features render biological invasions a natural experiment that can be used to investigate adaptation over contemporary timescales (Dlugosch et al., 2015; Gilchrist & Lee, 2007; McGoey et al., 2020; Sakai et al., 2001; Westley, 2011). Applying an evolutionary lens to invasion biology is also critical to understanding invasion trajectories and to what extent they might be predictable in light of anthropogenic land use and climate change (van Boheemen & Hodgins, 2020). Hence, what is notoriously viewed as an economic and ecological problem also provides a promising evolutionary research opportunity (Callaway & Maron, 2006).

A large body of evolutionary research points to local adaptation as being an important mechanism for invasion success (Colautti & Barrett, 2013; Sherrard & Maherali, 2012). When an invasive species colonizes new regions, the invaders must contend with environmental variation in order to establish (Colautti & Lau, 2015). It is this environmental heterogeneity that can impose selection to favor traits differentially and push populations toward divergent trait optima, resulting in local adaptation (Ågren et al., 2017; Hereford, 2009; Hoban et al., 2016; Orr, 2005). Clinal variation in fitness-related traits is a striking manifestation of local adaptation (Savolainen et al., 2013). These patterns of population differentiation are shaped by climatic factors that are associated with latitudinal or altitudinal gradients (Bruehlheide & Heinemeyer, 2002; Chun et al., 2011). While trait clines can occur non-adaptively via neutral evolutionary processes (Colautti & Lau, 2015), a growing number of empirical studies have shown that adaptive responses to heterogeneous climatic pressures often explain the emergence of geographic clines in situ (Keller & Taylor, 2008; Santangelo et al., 2018). Oftentimes, these clines are the result of evolutionary trade-offs (Colautti & Barrett, 2010). For instance, a trade-off between growth and reproduction is frequently reported to shape adaptive trait divergence in many plant populations (Colautti & Barrett, 2010; Griffith & Watson, 2005; Grime, 1977). This trade-off directly relates to reproductive initiation or flowering time (a critical life-history trait and a key component of fitness in flowering plants), where the best strategy depends on local environmental conditions (Anderson et al., 2011; Yan et al., 2021). In temperate environments, at the cost of reduced size, plants in short growing seasons tend to flower earlier to ensure successful reproduction before the onset of harsh fall frosts (Anderson et al., 2011; Grime, 1977; Stinson et al., 2018). Contrastingly, where the growing season is longer, plants can afford to delay their flowering in exchange for enhanced growth, fecundity, and competitiveness (Colautti & Barrett, 2010; Kraleman et al., 2018; Stinson et al., 2018). This latitudinal cline in plant size and flowering time has been documented in several invasive plant species, such as *Lythrum salicaria* (Colautti & Barrett, 2013), *Medicago polymorpha* (Helliwell et al., 2018), and *Ambrosia artemisiifolia* (Hodgins & Rieseberg, 2011; McGoey et al., 2020; Scalone et al., 2016; van Boheemen et al., 2019).

Despite these preliminary insights, the genetic basis of local climate adaptation remains poorly understood. Primarily, there is a large knowledge gap concerning the genetic architecture underlying

local adaptation during invasion. In most cases, ecologically relevant traits that confer local adaptation are quantitative; genetic variants responsible for such quantitative trait variation are located in genomic regions known as quantitative trait loci (QTL) (Collard et al., 2005). However, despite the perceived importance of quantitative traits in local adaptation, our understanding of invasion dynamics from a quantitative genetics perspective is limited. Specifically, the number, distribution, and the effect sizes of QTL that contribute to adaptive trait variation are unclear, especially in the invasion context when both demography and selection are likely to have important effects (Dlugosch et al., 2015). During invasion, theory predicts that a combination of both large and small-effect loci will more frequently contribute to evolutionary rescue by working synergistically to maximize fitness (Gomulkiewicz et al., 2010). Large-effect loci will also preferentially contribute to adaptive divergence when migration is high and/or drift is strong (Hodgins & Yeaman, 2019; Yeaman & Whitlock, 2011). Additionally, clusters of small-effect loci can effectively act as a large-effect QTL if recombination between them is sufficiently low (Yeaman & Whitlock, 2011), such as in the case of a chromosomal inversion.

Common ragweed (*Ambrosia artemisiifolia*) is an annual weed native to North America that has successfully invaded a range of environments across the globe (Chauvel et al., 2006; Essl et al., 2015; Smith et al., 2013; van Boheemen & Hodgins, 2020) and is an important study system for investigating the genetic basis of climate adaptation. Firstly, due to its allelopathic effects on several major crop species and its highly allergenic pollen, common ragweed is of major agricultural and human-health concern (Bassett & Crompton, 1975; Laaidi et al., 2003; Tokarska-Guzik et al., 2011). Understanding how it may evolve and spread in the future is crucial to better managing the incidence of hay-fever and preventing further yield losses. Secondly, the species has evolved parallel latitudinal clines in size and phenology in its native North American range and its introduced ranges of Europe (Chun et al., 2011), Asia (Li et al., 2015), and Australia (van Boheemen et al., 2017, 2019). Remarkably, the clines observed in the introduced ranges evolved in a mere 100–150 years, signifying rapid adaptation in this species (Hodgins & Rieseberg, 2011; Leiblein-Wild & Tackenberg, 2014; Scalone et al., 2016; van Boheemen et al., 2019). There is further evidence to suggest that this clinal variation in flowering time is the result of adaptive rather than neutral processes (McGoey et al., 2020; van Boheemen et al., 2019). Hence, this species offers an important opportunity to study the genetic basis of rapid, local adaptation during range expansion.

The main objective of this study was to elucidate the genetic basis of climate adaptation in common ragweed. Specifically, we aimed to identify the underlying genetic architecture of flowering time and plant height, key adaptive traits in this annual species, by conducting QTL mapping on two divergent populations of common ragweed. We first developed a linkage map using F<sub>2</sub> progeny derived from two experimental crosses between an early flowering, introduced-range parent, and a late flowering, native-range parent. All plants were then genotyped using Genotype-by-Sequencing (GBS) and phenotyped under controlled environmental conditions.

Based on the evolutionary theory discussed above, we expected to identify an oligogenic trait architecture, with some larger-effect loci contributing to flowering time divergence. This is because common ragweed is an outcrossing wind-pollinated species with high population connectivity, yet strong flowering time differentiation, even in recently invaded ranges, consistent with rapid and recent local adaptation (Chun et al., 2011; McGoey et al., 2020; van Boheemen et al., 2019). We also anticipated that the flowering time QTL would colocalize with height QTL, due to the expected genetic correlation between flowering time and height in this species.

## 2 | METHODS

### 2.1 | Study species

Common ragweed (*Ambrosia artemisiifolia*) is a monoecious annual in the Asteraceae family (Bassett & Crompton, 1975; Smith et al., 2013). This outcrossing plant is a globally invasive species that has aggressively spread from its native North American range to many regions of the world (Friedman & Barrett, 2008). This species thrives in disturbed habitats and is primarily found growing alongside roads and in cultivated areas where competition from other plants is limited (Bassett & Crompton, 1975). It is widely recognized as a noxious agricultural weed due to its allelopathic effects on crop species such as soybean and maize (Weaver, 2001). Despite low genetic structure and high gene flow across much of its range (McGoey & Stinchcombe, 2021; van Boheemen et al., 2017), the species has locally adapted and evolved parallel latitudinal clines in size and phenology where high-latitude populations flower early when small and low-latitude populations flower later when tall (Chun et al., 2011; Hodgins & Rieseberg, 2011; Li et al., 2015; van Boheemen et al., 2019). Its wind-spread pollen can travel several thousands of kilometers and can induce allergic rhinitis in human populations, costing millions of dollars in medical treatment each year (Tamarcaz et al., 2005).

### 2.2 | Experimental crosses

We generated experimental mapping populations where early-flowering individuals from the northern part of the introduced European range (Drebkau, Germany N51°38'21" E14°11'50") were crossed with late-flowering individuals from the central part of the native North American range (Lexington, KY, USA N38°01' W84°33') to produce F1 offspring. *Ambrosia artemisiifolia* seeds of both populations were stratified on moist filter paper for 4 weeks and subsequently placed in a growth chamber providing 16-h light of  $50 \mu\text{mol m}^{-2} \text{ s}^{-1}$  at 27°C and 8-h darkness at 15°C to induce germination. After germination, seedlings were transplanted to pots with pumice (0.5 mm < diameter > 2.8 mm; Hekla Green, Bara Mineraler, Bara, Sweden) and moved into a climate chamber with short-day conditions (12-h light of  $280 \mu\text{mol m}^{-2} \text{ s}^{-1}$  at 25°C; 12-h darkness

at 15°C; humidity at 70%). Plants were watered with nutrient-enriched water ( $2 \text{ mL}^{-1}$  of Wallco växtnäring 53-10-43+ micro from Cederroth, Upplands Väsby, Sweden), if necessary. The position of the plants in the growth chamber was randomized daily. The induction of the germination was executed at different moments for each seed population (the seeds of the late-flowering population were induced before the seeds of the early-flowering population, according to the flowering time differences observed in [Scalone et al., 2016]), in order to "synchronize" them. When two plants—one of each population—were presenting similar growth and flowering development, they were both placed in the same individual cabinet, parameterized with identical temperature and light conditions and cycles than the growth chamber. The use of an individual and closed cabinet (located in different sectors of the Uppsala BioCenter) prevented pollen contamination among crosses. During the flowering period of each crossing pair, the maternal plant was emasculated to prevent self-pollination (although the species is self-incompatible) (Friedman & Barrett, 2008). For each cross/cabinet, two pollination methods were used daily: first, the yellowish pollen of the paternal plant was collected with an individual brush to pollinate female flowers of the maternal plant. Then, secondarily, before closing the two-door system of the cabinet and after the "brush"-pollination session, the paternal plant was gently slapped in order to generate/spread a "pollen cloud" inside the hermetic cabinet. At the end of the flowering period, F1 seeds were collected and stratified. Then, similar experimental conditions and techniques were used to produce F2 populations from these F1 seeds. Two F1 siblings from each set of parents were then inter-crossed to produce segregating F2 populations. F2 plants were grown in a growth chamber with a 12-h daylight/darkness cycle where leaves material of each F2-plants was collected for DNA extraction and the following phenotypes were scored: Initial budding time (number of days following germination at which a pale green budding point appeared), 1 cm budding time (number of days following germination at which the bud was greater than 1 cm), male and female flowering times (days following germination at which anthers/pistils first appeared), and plant height (including stem and terminal male inflorescence). Three experimental mapping families (named pink, yellow, and orange) were created from six different grand-parental plants (three obtained from the early flowering German population and three obtained from the late flowering Kentucky population). Leaf materials of grand- and parental plants were collected for DNA extraction.

We generated a fourth mapping population at the University of British Columbia. This F1 mapping population consisted of a cross between a single individual from North America (AA19\_3\_7, ND, USA N46°17' W103°55'), which was used in the creation of a reference genome assembly (Bieker et al., 2022), and a single individual from France (FR8-26-8, France N44°12' E4°15'). The two plants were grown alone in a growth chamber to facilitate crossing between the two wind-pollinated individuals and prevent pollen contamination from other individuals, and the maternal plant was emasculated to prevent self-pollination (although the plants are self-incompatible) (Friedman & Barrett, 2008). We collected the seeds from FR8-26-8.

Following this, we grew offspring from the cross in a glasshouse at Monash University, and their leaf tissue was harvested for DNA extraction. Tissue was preserved from the parents and offspring by drying using silica gel.

### 2.3 | Sequencing and data processing

We obtained marker loci using DNA extraction and genotype-by-sequencing (GBS) protocols described in van Boheemen et al. (2019). The libraries were sequenced on a HiSeq2500 (125 bp PE) at the Génome Québec Innovation Centre on four lanes resulting in 625 million paired end reads. Reads were demultiplexed with Stacks process\_radtags (Catchen et al., 2013). We trimmed and filtered reads using Fastx ([http://hannonlab.cshl.edu/fastx\\_toolkit](http://hannonlab.cshl.edu/fastx_toolkit)), allowing for Q-score of 20 or higher for  $\geq 90\%$  of the reads. We then aligned the FASTA files to a new chromosome-level reference genome (Battlay et al., 2022) using BWA-mem (Li & Durbin, 2010). SAMtools (Li et al., 2009) was used to call SNPs on each scaffold, and the resulting files were concatenated to produce a single VCF file retaining only SNPs genotyped with a minimum base quality score of 10. This file was further filtered with VCFtools (Danecek et al., 2011) to remove indels and exclude sites on the basis of the proportion of missing data (tolerating 25% missing data), leaving only biallelic SNPs with a mean depth of 10 and minimum quality threshold score of  $\geq 20$ . SNPs that had minor allele frequencies  $< 5\%$  were also discarded. The genotype data from two mapping families (the yellow and pink families) were used for linkage map construction for the QTL analysis, as the third family did not produce a sufficient sample size of genotyped plants. The F1 mapping population was not phenotyped and not used in the construction of the linkage map for the QTL analysis.

### 2.4 | Linkage map construction

Using SNP data from two mapping families (pink and yellow families—four grandparents, four F1 parents, and 444 F2 offspring), we constructed an integrated linkage map using the software package Lep-MAP3 (Rastas, 2017). Firstly, the ParentCall2 module identified 26,921 informative markers based on pedigree information and imputed parental genotypes. The Filtering2 module was then used to remove markers that exhibited high segregation distortion ( $dataTolerance = 0.001$ ). Next, markers were assigned into linkage groups (LGs) using the SeparateChromosomes2 module, which computes all pairwise LOD scores between markers and groups those with an LOD score higher than a user given parameter. It is important to note that the grouping of two families can be inherently difficult as each marker can be informative only on one family (Rastas, 2017). Hence, markers were grouped separately using markers from the pink family first via parameter *families = Pink*. Clustering appeared to be optimal with an LOD score of 15 ( $lodLimit = 15$ ) and when the

minimum number of markers per LG was set to 25 ( $sizeLimit = 25$ ). Specifically, these parameters produced 18 major linkage groups, showing good correspondence with common ragweed's karyotype ( $2n = 36$ ; Essl et al., 2015).

The data containing the common markers for both yellow and pink families were then used to assign the remaining singular markers to the existing linkage groups using JoinSingles2All ( $lodLimit = 14$ ). The markers on LG1 were further split to even out the size distribution of linkage groups using SeparateChromosomes2 ( $lg = 1$ ,  $lodLimit = 20$  and  $sizeLimit = 25$ ) and the JoinSingles2All map file. Markers within each LG were then ordered using the OrderMarkers2 module ( $outputPhasedData = 1$ ,  $sexAveraged = 1$ ). As the physical positions of markers from the reference genome were known, this information was used to correct marker order via parameters  $evaluateOrder = order.txt$  and  $improveOrder = 0$ ,  $sexAveraged = 1$  where *order.txt* contained the markers in their physical order. Additionally, markers that inflated the length of LGs ( $> 25$  cM) or caused LGs to be spread across multiple scaffolds were removed. These orders were evaluated again using an additional parameter ( $grandparentPhase = 1$ ) to code genotypes according to grandparental inheritance. To obtain a maximum number of markers, the two evaluated map outputs were matched using phasematch.awk script provided with Lep-MAP3. Finally, the map2genotypes.awk script of Lep-MAP3 was used to convert these phased outputs to fully informative genotype data.

As genomic analysis suggested that some of the identified QTL intervals fell within two putative inversions (haploblocks) on Scaffold 27 (Battlay et al., 2022), we developed sex-specific genetic maps for this scaffold and in each mapping population (pink, yellow, and F1 mapping population) to determine if recombination rates were suppressed within these regions in some genotypes. Genotype-specific suppression of recombination in the regions would therefore be consistent with inversions rather than general reductions of recombination in the region. Linkage map construction was carried out using the physical order of the markers from Scaffold 27. Genetic distance (cM) was plotted against physical position along the chromosome for each map and the intervals of the QTL and the boundaries of the haploblocks were visualized and inspected for reduced recombination compared with the rest of the scaffold.

### 2.5 | QTL analysis

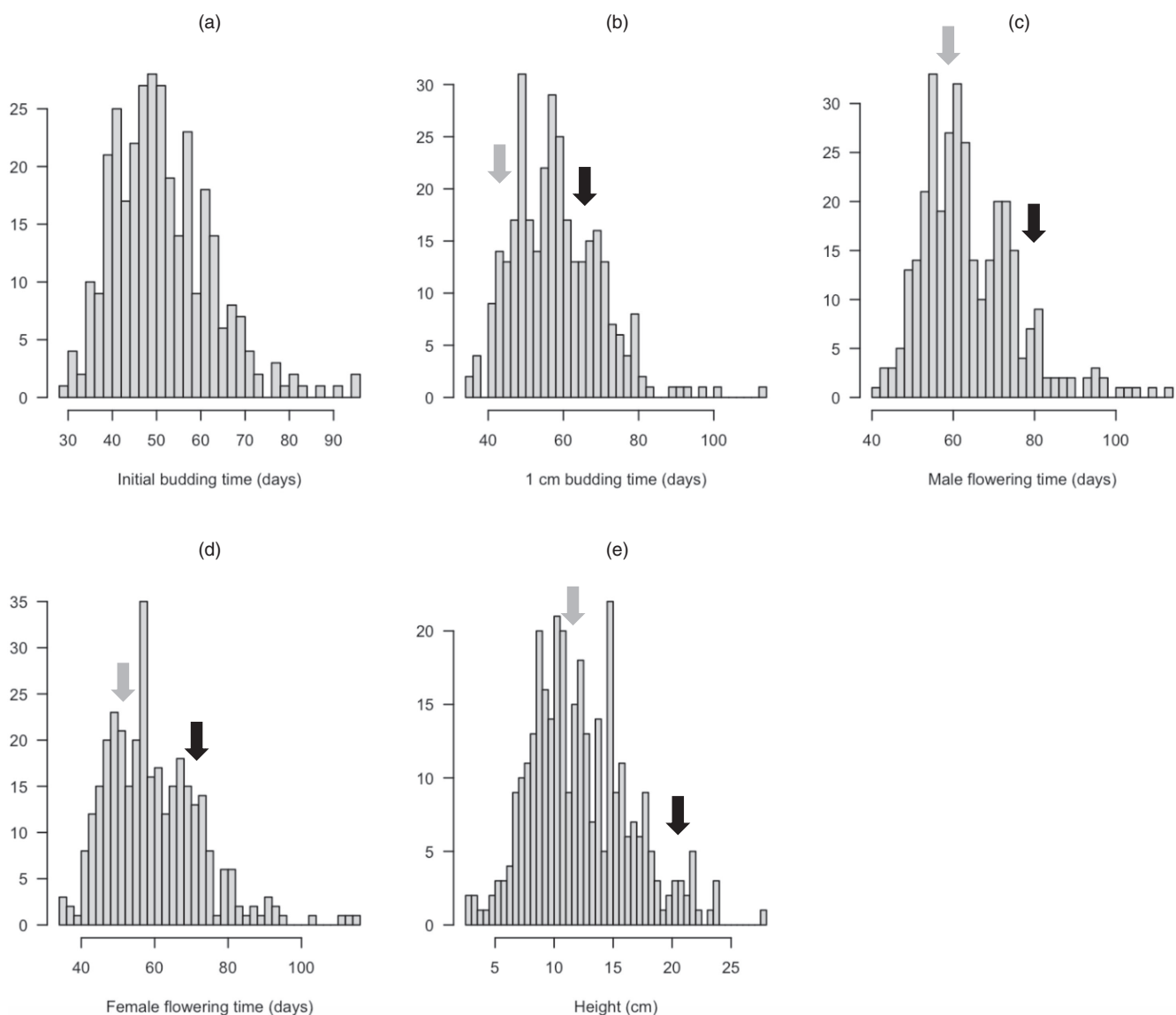
QTL analysis was performed in R (version 4.0.5) using the R/qtl package (Broman et al., 2003). Since a minimum of 200 individuals are needed to harness sufficient phenotypic power (Beavis, 2019; Li et al., 2010), we only conducted QTL scans on the yellow family as it had a larger sample size ( $n = 336$ ) compared with the pink family ( $n = 108$ ). To input the data, yellow F2s were treated as an outbreeding full-sibling population and were therefore read-in as a four-way cross.

## 2.6 | Phenotype and genotype data checks

QTL analysis relies on the assumption that phenotypes follow a normal distribution (Broman & Sen, 2009). To check for adherence to normality, histograms of each phenotype were plotted accordingly. Height was normally distributed; however, the remaining budding and flowering time traits were slightly skewed (Figure 1) and so were log-transformed. Prior to QTL analysis, further linkage map and genotype diagnostic tests were conducted using R/qtl. Firstly, markers were checked again for segregation distortion (a departure from 1:1:1 in a 4-way cross) using a  $\chi^2$  test. A total of 398 markers on LGs 2, 3, 4, 7, 8, 13, and 18 showed extreme segregation distortion, and so these markers were removed. To test for unusually similar genotypes (indicating potential sample mix-ups), the proportion

of identical genotypes for each pair of individuals were calculated. These were all below 80%, suggesting no unusually similar pairs. Next, pairwise recombination fractions between all pairs of markers were estimated to check marker assignment to LGs. The obtained recombination heat map showed that some markers on LG14 and LG15 appeared to be linked and so these markers (~100) were omitted.

Marker orders within LGs were further checked using a crossover count method. This method involves counting the number of obligate crossovers for each possible order to find the order with the minimum number of crossovers (Broman & Sen, 2009). A large window size of seven markers was used first, followed by a smaller window of three, yet no orders were more likely than the original. To test for unusually tight double-crossovers, genotyping error LOD scores for all individuals at each marker were calculated



**FIGURE 1** Histograms showing the frequency distributions of (a) initial budding time, (b) 1 cm budding time, (c) male flowering time, (d) female flowering time, and (e) height for the yellow mapping family of common ragweed ( $n = 336$ ). Gray arrows denote the phenotypic values of the early-flowering parent from the introduced European range. Black arrows denote the phenotypic values of the late-flowering parent from the native north American range. Initial budding time was not measured in the parental generation.

(an LOD score higher than a specified cutoff indicates potential genotyping errors). There were no error LOD scores above a specified cutoff of four, three or two indicating no important errors of this kind. Finally, individual crossover counts were checked, and a scatterplot of the observed number of crossovers revealed no major outliers. The final cross data used for QTL analysis consisted of phenotype data for 336 individuals, and their genotypes at 3995 markers.

## 2.7 | QTL scans

Firstly, the function *calc.genoprob* was used to calculate QTL genotype probabilities conditional on the observed marker data, at a genotyping error rate of 0.01. Single-QTL scans with a normal model were subsequently performed for all five phenotypes using the function *scanone* and the extended Haley–Knott regression method (*method=ehk*). This method was chosen as it is an improved version of Haley–Knott regression (i.e., offers better approximation) and is more robust than standard interval mapping (Broman & Sen, 2009). For each scan, individuals with missing phenotype data were removed by the program (between 3 and 18 individuals per phenotype). We performed permutation tests ( $\times 1000$ ) to obtain 0.1% and 5% genome-wide LOD significance thresholds, which were applied to each LOD distribution curve. The function *bayesint* was then used to derive Bayesian credible confidence intervals for the locations of identified QTLs at a coverage probability of 95%. To identify multiple pairs of linked or potentially interacting QTL, two dimensional two-QTL scans were carried out using the *scantwo* function. For each phenotype, permutation tests ( $\times 1000$ ) were run to generate 5% genome-wide LOD significance thresholds for full, conditional-interactive, interactive, additive, and conditional-additive models. Using the results from *scanone* and *scantwo* and drawing from 1000 genotype simulation replicates, a multiple-QTL model was fit for each phenotype using the function *fitqtl*. Within this same function, estimates of QTL effect-sizes were obtained through analysis of variance (ANOVA). The integrated, high-density linkage map and QTLs were visualized using the R/LinkageMapView package (Ouellette et al., 2017).

## 2.8 | Identifying candidate genes

To identify homologous flowering time genes within each QTL interval, we conducted BLAST searches of 29,849 annotated ragweed gene models (Battlay et al., 2022) against *Arabidopsis* proteins with an *E*-value cutoff of  $1 \times 10^{-6}$ . The putative function of genes with a top hit in *Arabidopsis* was identified using gene ontology (GO) terms from The Arabidopsis Information Resource (TAIR) database (Berardini et al., 2015). Genes that had annotations relating to photoperiodism, floral development/regulation, vernalization, and circadian rhythm were flagged as potential candidates. Additionally, annotations were cross-referenced with 306 *A. thaliana* flowering time pathway genes

(Bouché et al., 2016). In total, 538 predicted *A. artemisiifolia* genes were matched to this dataset, representing 212 unique *A. thaliana* flowering time genes.

## 3 | RESULTS

### 3.1 | Linkage map

The final integrated linkage map consisted of 4493 markers spread over 18 linkage groups with a total length of 1825.7 cM (Figure 2). LGs ranged in size from 55.1 cM to 139.4 cM with an average length of 101.4 cM. The average genetic distance between markers was 3.25 cM, with the largest gap being 13.34 cM in length (Figure 2).

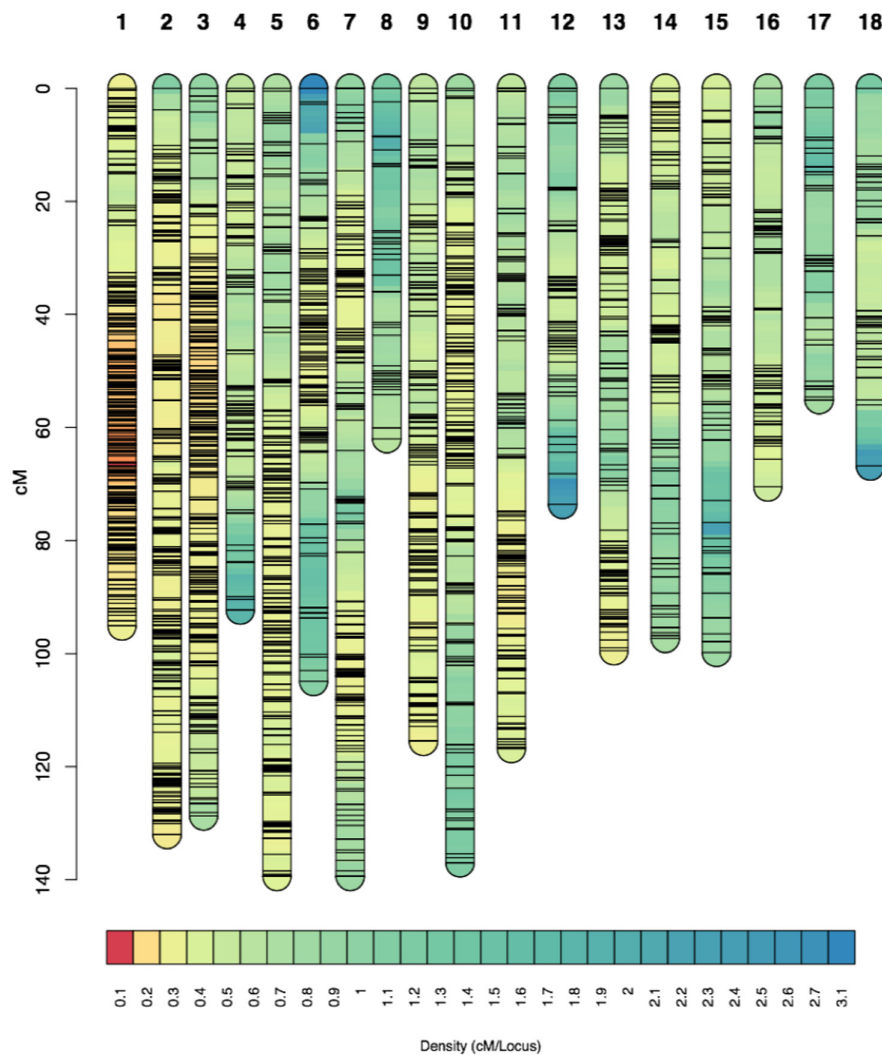
### 3.2 | QTL analysis

Single-QTL scans detected a significant QTL on LG2 (*QTL-2*) and LG12 (*QTL-12*) for all budding and flowering time traits (Figure 3; Table 1). A significant QTL for height was also found to colocalize with the flowering traits on LG2, with LOD scores maximized on the same marker but with a wider interval estimate of 82.2 cM compared with 13.2–23.0 cM (Table 1; Figure 4). Interval estimates for flowering and budding traits on *QTL-12* were relatively small, spanning 1.8–7.8 cM (Table 1; Figure 4). Two-dimensional two-QTL scans did not identify any significant QTL-QTL interactions. Instead, the previously identified QTL on LG2 and LG12 was recognized as a significant pair of additive QTL. An additional QTL on LG6 (*QTL-6*) was found to have an additive interaction with *QTL-2* but only for female flowering time (Table 1). The interval estimate for this additional QTL spanned 38.1 cM (Table 1; Figure 4). *QTL-2* was a major QTL for budding and flowering traits, explaining 22.12%–23.16% of observed phenotypic variance (Table 1). For height, *QTL-2* was defined as a minor QTL as it explained less than 10% of the phenotypic variation (Table 1). *QTL-12* was defined as a minor-effect QTL for budding and flowering traits, explaining 5.13%–6.70% of phenotypic variance (Table 1). *QTL-6* was also of minor effect, explaining 2.73% of the variation in female flowering time (Table 1).

### 3.3 | Candidate flowering time genes

Within the *QTL-2* interval, nine genes with a top hit for *Arabidopsis* proteins had annotations relating to photoperiodism, circadian rhythm, and flowering time regulation (Table 2), including two MADs box proteins closely related to FLOWERING LOCUS C (*FLC*). Only one gene had annotations relating to flowering time within the *QTL-12* interval (Table 2), and this was later identified as a homolog of FLOWERING LOCUS T (*FT*). Within the QTL interval on LG6, another nine genes were returned with annotations relating to photoperiodic sensing, circadian clock, and flower development (Table 2).

**FIGURE 2** Density chart showing linkage group lengths and marker distributions of the integrated linkage map constructed from two mapping families of common ragweed. The 18 linkage groups correspond to the study system's karyotype ( $2n = 36$ ).



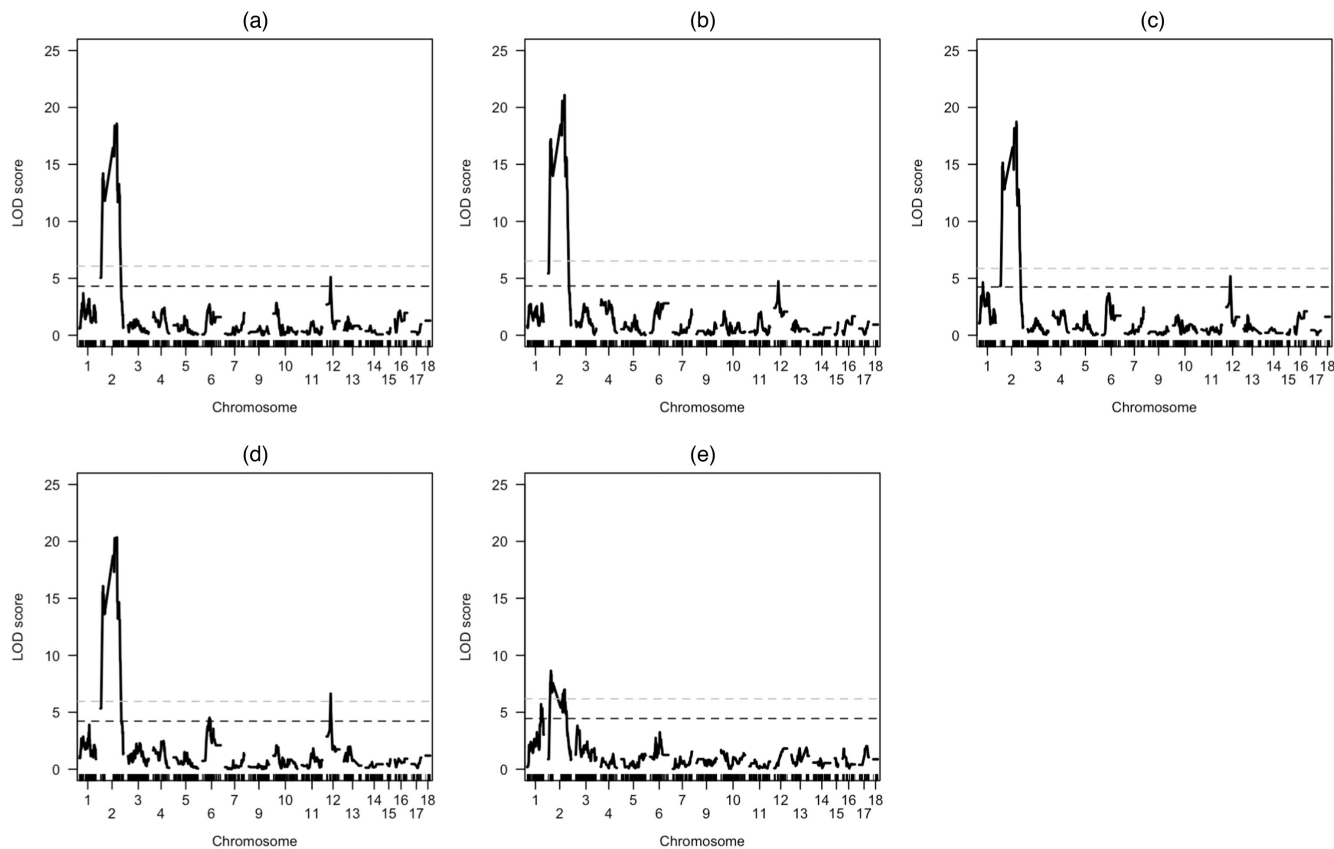
### 3.4 | Recombination within QTL-associated haploblocks

QTL-2 (Scaffold 27), which was associated with height and different measures of flowering time, colocalized with previously identified haploblocks (Battlay et al., 2022). As haploblocks can be produced via suppressed recombination among specific haplotypes, as would be expected in the case of inversions, we examined recombination along this scaffold in separate genetic maps for each family and sex (Figure 5). Haploblock HB27a overlapped with the large interval for height. We found evidence for reduced recombination across the entirety of haploblock HB27a in three maps from the yellow and pink family (Figure 5a–c). In the female map of the yellow family and in both F1 maps (Figure 5d–f), recombination within the 27a haploblock was observed, suggesting that these parents were homozygous for the haploblock haplotypes while the others were heterozygous. Haploblock HB27b colocalized with the intervals for flowering time and height. In the pink and the yellow family, recombination was strongly reduced in the first half of HB27b (Figure 5a–d), which overlapped with the flowering time QTL. The remainder of the haploblock

had substantial recombination in the pink family and in the female map for the yellow family, but limited evidence of recombination in the male map for the yellow family (Figure 5c), suggesting this parent may have been heterozygous for the haploblock. The F1 map showed recombination throughout the region suggesting both parents were homozygous for haploblock HB27b.

## 4 | DISCUSSION

Despite a growing interest in invasion biology from an evolutionary perspective, the genetic basis of rapid climate adaptation remains unresolved. To help address this knowledge gap, the present study attempted to dissect the genetic architecture underlying flowering time adaptation in the prolific invader, common ragweed. We identified one large-effect and two small-effect QTL underlying flowering time and height differentiation in this species. This is consistent with the expectation that when populations evolve under spatially divergent selection with migration, an oligogenic architecture is favored. The colocalization of flowering time and height QTL further



**FIGURE 3** LOD distribution curves for (a) initial budding time, (b) 1 cm budding time, (c) male flowering time, (d) female flowering time, and (e) height, based on single-QTL scans of an experimental mapping population of common ragweed. dotted lines represent genome-wide significance thresholds at 0.1% (light-gray dashes) and 5% (dark-gray dashes).

**TABLE 1** Summary of QTL detected for flowering time and height in a common ragweed experimental mapping population

QTL	LG	Closest marker	Position (cM)	95% CI (cM)	Trait	LOD	p-value	PVE (%)
QTL-2	2	10,159	93.2	74.4–94.9	Initial budding time	18.58	<0.001**	22.12
					1 cm budding time	19.81	<0.001**	22.12
					Male flowering time	18.74	<0.001**	22.1
					Female flowering time	20.35	<0.001**	23.16
					Height (cm)	6.687	0.001**	6.7
QTL-12	12	15,616	23.5	23.5–25.3	Initial budding time	5.11	0.01*	6.1
QTL-6	6	21,648	44.4	17.5–25.3	1 cm budding time	4.74	0.025*	6.1
					Male flowering time	5.18	0.006*	6.04
					Female flowering time	6.64	0.001**	5.13
					Female flowering time	5.14	0.023*	2.73

Note: Highly significant values (<0.001) are marked with \*\* and significant values (<0.05) are marked with\*.

Abbreviations: % PVE, percentage of phenotypic variance explained by the QTL; CI, confidence interval; LG, linkage group.

supports the notion that gene pleiotropy is contributing to a genetic correlation (trade-off) between the two traits and the clinal variation in flowering time and height observed in common ragweed. We also identified several candidate flowering time genes identified within the QTL that could be contributing to flowering time adaptation by controlling photoperiodic sensing flowering. Together, these findings provide crucial insights into the genetic basis of climate adaptation during invasion, knowledge that is becoming increasingly

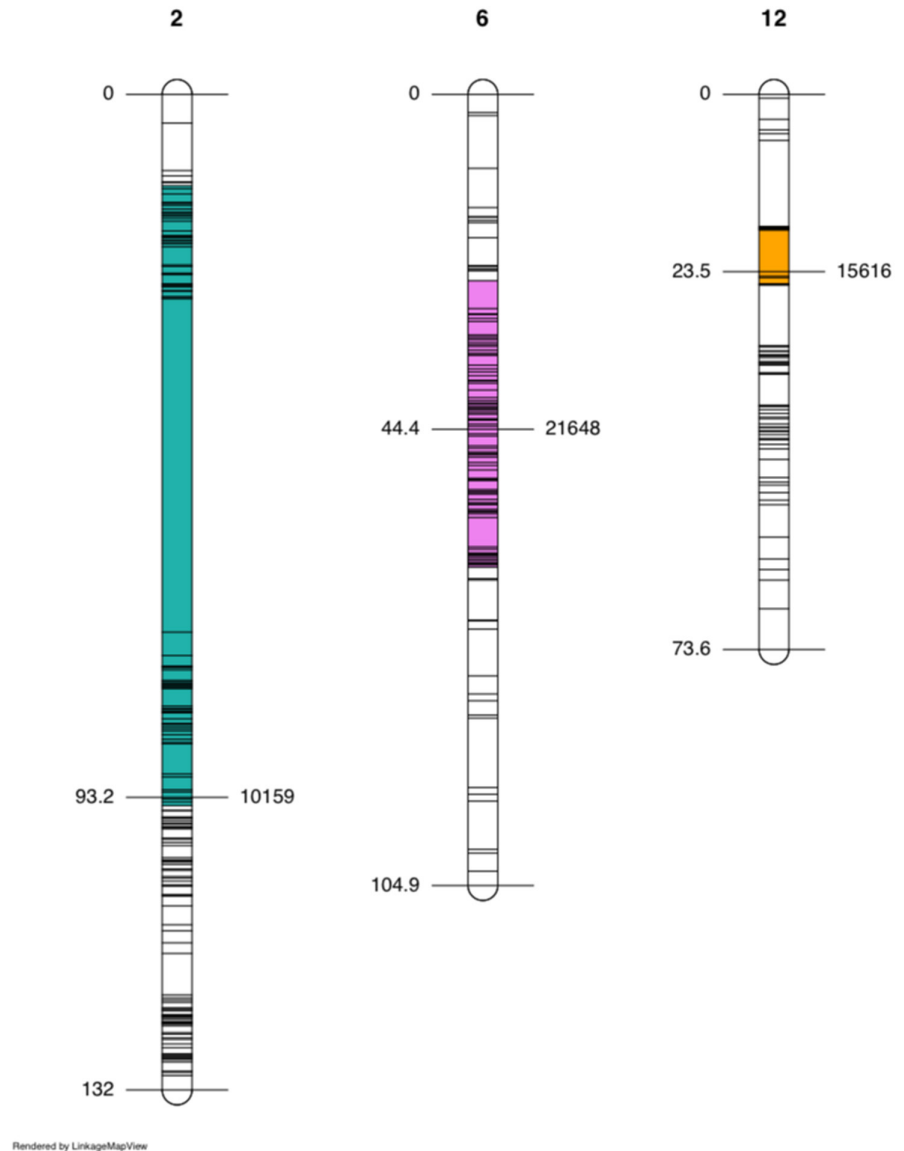
invaluable as we strive to develop a more predictive understanding of species' invasions in light of anthropogenic climate change.

#### 4.1 | The genetic architecture of adaptation

Our discovery of one major and two minor QTL partly aligns with the theoretical prediction that adaptive evolution to local environments



**FIGURE 4** Linkage groups 2, 6, and 12 and their corresponding quantitative trait loci (QTL). Central markers where LOD scores were maximized are to the right and their genomic positions in centimorgans (cM) are to the left. combined 95% Bayesian confidence intervals for all five traits are indicated by the colours sea-green (QTL-2), pink (QTL-6), and orange (QTL-12).



follows a stepwise approach to the optimum (Orr, 1998). In the early stages of an “adaptive walk,” when a population is far from its optimum (e.g., following colonization of a new environment), both large and small-effect loci work in combination to produce large trait shifts, which help to rapidly move the population closer to the phenotypic optimum (Dittmar et al., 2016; Orr, 1998). However, as the population approaches the optimum, there is an increased likelihood that large-effect loci will reduce fitness by overshooting the optimum (Dittmar et al., 2016). At this point, small-effect loci that confer subtle trait shifts are required (Baxter et al., 2009; Orr, 1998). This leads to an exponential distribution of allele effect sizes, with few loci of relatively large effect and many of relatively small-effect (Dittmar et al., 2016; Orr, 1998). While this model may be applicable to some species (Bainbridge et al., 2020; McKay et al., 2008), we must take into account the effects of gene flow before we can confidently apply it to common ragweed. In contrast to this exponential distribution of allele effect sizes expected under adaptation to a single optimum without migration (Orr, 2005), divergent selection with migration is predicted to result in genetic architectures with fewer,

larger, and more tightly linked alleles (i.e., oligogenic architecture) (Ferris et al., 2017; Tigano & Friesen, 2016; Yeaman & Otto, 2011). Since large-effect loci have larger selection coefficients compared with small-effect loci, they are more likely to be maintained by local selection despite the homogenizing effects of gene flow (Yeaman & Otto, 2011). As such, prolonged bouts of adaptation in the face of ongoing gene flow could result in the gradual replacement of many small-effect alleles by fewer large-effect alleles, resulting in a genetic architecture that is skewed toward larger-effect loci (Yeaman & Otto, 2011; Yeaman & Whitlock, 2011). In some cases, these large-effect loci may often comprise several tightly linked genes each contributing small individual phenotypic effects (Yeaman & Whitlock, 2011). As an obligately outcrossing species reliant on wind pollination (Essl et al., 2015; Friedman & Barrett, 2008), common ragweed exhibits substantial gene flow across much of its native and introduced range (McGoey et al., 2020; van Boheemen et al., 2017). Hence, this high level of gene flow among ragweed's divergently adapting populations may also serve to explain the oligogenic architecture observed in this QTL mapping population.

**TABLE 2** Flowering time candidates in each QTL-interval identified from BLAST searches between *Arabidopsis thaliana* proteins and annotated common ragweed gene models

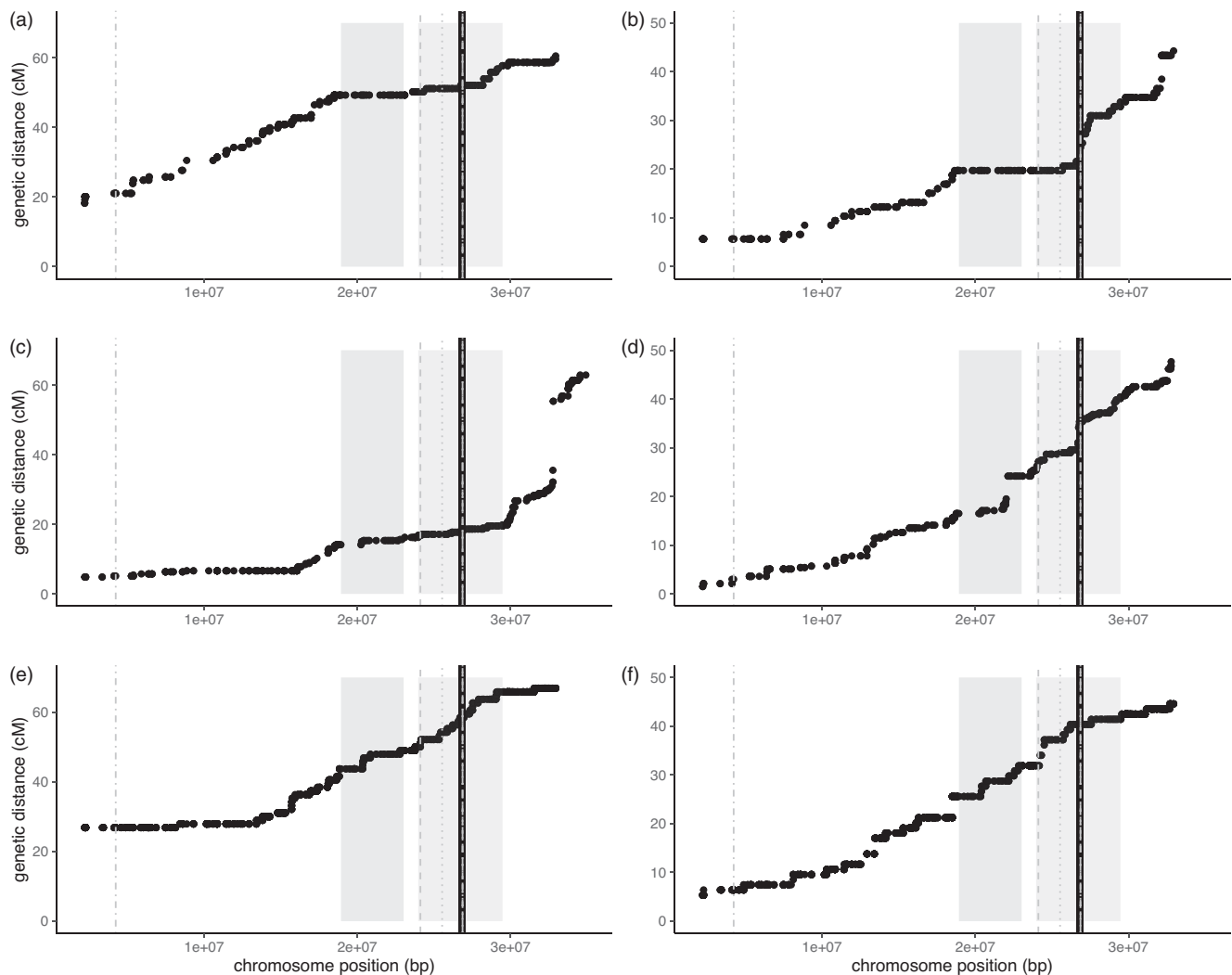
QTL	TAIR ID	<i>Arabidopsis thaliana</i> gene name
QTL-2	AT1G25540	PHYTOCHROME AND FLOWERING TIME 1 (PFT1)
QTL-2	AT1G57820	VARIANT IN METHYLATION 1 (VIM1)
QTL-2	AT1G68050	F BOX 1, FLAVIN-BINDING (FKF1)
QTL-2	AT1G77080	MADS AFFECTING FLOWERING 1 (MAF1)
QTL-2	AT2G02760	UBIQUITIN-CONJUGATING ENZYME 2 (UBC2)
QTL-2	AT3G01090	SNF1 KINASE HOMOLOG 10
QTL-2	AT4G15880	EARLY IN SHORT DAYS 4 (ESD4)
QTL-2	AT4G32980	HOMEOBOX GENE 1, ATH1
QTL-2	AT5G65050	MADS AFFECTING FLOWERING 2 (MAF2)
QTL-12	AT1G65480	FLOWERING LOCUS T (FT)
QTL-6	AT1G12910	LIGHT-REGULATED WD 1 (LWD1)
QTL-6	AT1G26830	CULLIN 3A
QTL-6	AT2G27550	ATC, CENTRORADIALIS
QTL-6	AT2G28550	TARGET OF EAT1(TOE1)
QTL-6	AT3G01090	SNF1-RELATED PROTEIN
QTL-6	AT3G28730	NUCLEOSOME/CHROMATIN ASSEMBLY FACTOR D
QTL-6	AT5G06600	UBIQUITIN-SPECIFIC PROTEASE 12 (UBP12)
QTL-6	AT5G14170	CHC1
QTL-6	AT5G35910	RRP6-LIKE 2

As a result of the interplay between divergent natural selection and migration, a genetic architecture that minimizes recombination between locally adapted alleles is expected to evolve (Kirkpatrick & Barton, 2006; Lenormand & Otto, 2000; Yeaman & Whitlock, 2011). Interestingly, in the present study, QTL-2 overlaps with two large, divergent haplotype blocks or "haploblocks" (Battlay et al., 2022; Todesco et al., 2020), which indicate reduced recombination indicative of chromosomal inversions (Li & Ralph, 2019). Both haploblocks also show substantial signatures of climate mediated selection in both Europe and North America (Battlay et al., 2022). QTL-2 for height overlaps both haploblocks (HB27a and HB27b), while the QTL-2 for flowering time-related traits have smaller intervals that only overlap the first half of HB27b (Figure 5). Our pink and yellow genetic maps reveal substantial reductions in recombination within HB27a (overlapping the height QTL) and in the first half of HB27b (overlapping the height and flowering time QTL). Recombination also appears to be reduced in the male map for the yellow family across all of HB27b (Figure 5c), which is the family used for the trait mapping. This suggests that the haploblock haplotypes may be contributing to the large-effect QTL for flowering time, which we identified in this study. The fact that some maps show repressed recombination

while others do not indicate these haploblocks are not located in regions with generally low recombination, but rather that reduced recombination is dependent on the genotypes used in the cross. This would occur, for example, if inversions had suppressed recombination when heterozygous, but not when homozygous. In plants, chromosomal inversions have frequently been associated with flowering time, which can contribute to both local adaptation and assortative mating (reviewed in Huang & Rieseberg, 2020). For example, (Lowry & Willis, 2010) demonstrated that a chromosomal inversion associated with flowering time in yellow monkeyflower (*Mimulus guttatus*) contributed to an adaptive annual-perennial life-history shift and reproductive isolation in this species. Although the evidence is largely indirect at this stage, these haploblocks could be capturing several tightly linked locally adapted alleles, causing sections of QTL-2 to act as single units with substantial effects on locally adapting traits including height and flowering time. Future studies confirming the mechanism underlying the suppressed recombination in these regions (e.g., inversions) and linking haplotypes to trait variation and fitness effects in divergent climates in the field will be important in addressing this hypothesis.

A potential caveat of this study is that the modest size of 336 F<sub>2</sub>s (from a single family) may not have allowed the detection of many small-effect QTL. This inherent bias toward the detection of large-effect QTL is common in QTL studies (Beavis, 2019; Remington, 2015; Rockman, 2012). Additionally, we only utilized one mapping family in our QTL analysis, as the others had little statistical power due to small sample size. Future studies could conduct QTL mapping on multiple and larger mapping families to improve resolution and further interrogate the genetic basis of adaptation in a wider array of genotypes. Moreover, it is possible that additional QTL resides in the regions where markers had to be removed due to extreme segregation distortion, particularly on the linkage group where QTL-2 was found. In fact, all markers within haploblock HB27a (in QTL-2) experienced segregation distortion in the yellow QTL mapping population. Segregation distortion is common in mapping studies, can be associated with chromosomal inversions (Fuller et al., 2020; Li et al., 2011), and is often caused by meiotic drive (Lyttle, 1993). Interestingly, HB27a is enriched for pectate lyase genes that are hypothesized to be involved in pollen tube growth (Chen et al., 2018), including the primary pollen allergen gene and five other paralogs of this gene (Battlay et al., 2022). With that being said, the high-density linkage map and adequately sized mapping population used for QTL analysis in this study did lead to the detection of some loci of small effect and one locus of large effect, thereby shedding light on the genetic architecture underlying rapid climate adaptation in common ragweed.

Based on overlapping credible intervals and similar LOD profiles, many of the QTL detected in this study were shared among traits. In particular, the colocalization of a QTL for height and a QTL for flowering time is consistent with the expectation that these two traits will be at least partly genetically correlated (Colautti & Barrett, 2010; Kralemann et al., 2018). This may be due to linkage, or gene pleiotropy, where a single locus controls multiple phenotypes (Roff, 1995). In the latter case, a pleiotropic gene that determines the onset of



**FIGURE 5** The genetic distance (cM) versus physical distance (bp) along a portion of scaffold 27 containing *QTL-2*. Recombination distance was calculated for the pink (top), yellow (middle), and F1 families (bottom), and separately for each sex (male left; female right). The marker closest to *QTL-2* is represented by the black line. The 95% confidence intervals for male flowering time (dot), female flowering time (dash), and height (dash and dot) are shown in gray. The haploblocks are shaded (HB27a blue; HB27b purple).

flowering could also be controlling the plant's level of vegetative growth (Zu & Schiestl, 2017). That is, if mutations that cause early flowering also result in reduced height due to a shift in the allocation of resources, the colocalization of height and flowering time QTL is expected (Shen et al., 2018). Pleiotropic effects of flowering time genes on growth have been frequently identified (Auge et al., 2019). This evidence of colocalized height and flowering time QTL also lends support to a recent study on common ragweed, which (by proxy measurement) discovered that widespread pleiotropy facilitates local adaptation in this species, particularly when populations were far from their selective optima (Hämälä et al., 2020).

## 4.2 | Flowering time candidates

The transition to flowering is a well-orchestrated process that consists of hundreds of genes and transcription factors embedded in a

complex network (Franks & Hoffmann, 2012; Putterill et al., 2004; Wellmer & Riechmann, 2010). To ensure flowering occurs at the right time, plants must accurately perceive and process a range of environmental and internal cues (Putterill et al., 2004). In the model plant *Arabidopsis thaliana*, these signals are integrated through four main pathways (photoperiod, temperature, gibberellin, and autonomous) and involve a number of genes that are presumably shared among most angiosperms (Michaels, 2009; Putterill et al., 2004; Wellmer & Riechmann, 2010). In this study, we discovered two MADS-box proteins closely related to FLOWERING LOCUS C (FLC) within the major-effect *QTL-2* interval. Known as MADS AFFECTING FLOWERING 1 (MAF1) and 2 (MAF2), these genes, like FLC, are floral repressors in *Arabidopsis* (Ratcliffe et al., 2001, 2003). Through the autonomous and vernalization pathways, they are likely to act independently or downstream of FLC to delay flowering until after prolonged exposure to cold temperatures (Ratcliffe et al., 2001). In comparison to the late-flowering phenotype of winter-annual

accessions of *A. thaliana*, weak FLC alleles have been linked to earlier flowering phenotypes in summer-annual accessions, enabling these populations to adapt and flower rapidly in the absence of vernalization (Michaels et al., 2003). Additionally, we detected a homolog of EARLY IN SHORT DAYS4 (ESD4), which has been shown to encode a novel regulator of FLC expression alongside another gene known as VERNALIZATION INDEPENDENCE4 (VIP4) (Reeves et al., 2002; Zhang & van Nocker, 2002). A mutant ESD4 allele has also been associated with an extreme early-flowering phenotype caused in part by a reduction in the expression level of FLC in *Arabidopsis* (Reeves et al., 2002).

As a major floral integrator, FLOWERING LOCUS T (FT) has a central position in the *A. thaliana* genetic network that regulates flowering time (Corbesier et al., 2007). It is expressed predominantly in the leaves and moves to the shoot apex where it interacts with the FLOWERING LOCUS D (FD) transcription factor to induce flowering (Corbesier et al., 2007; Jaeger & Wigge, 2007). Conversely, the closely related TERMINAL FLOWER 1 (TFL1) gene functions antagonistically to repress flowering (Moraes et al., 2019). This balance between FT/TFL1 is said to control photoperiodic flowering through competition with FD (Ahn et al., 2006) and is likely conserved between *A. thaliana* and other plant species (Higuchi et al., 2013). The discovery of an FT homolog within the QTL-12 interval and a TFL1-like gene CENTRORADIALIS HOMOLOG (ATC) within the QTL-6 interval supports the results of a previous study examining the same divergent populations of common ragweed used for QTL analysis in this present study (Kralemann et al., 2018). Specifically, Kralemann et al. (2018) found that the FT/TFL1 family of genes, and their effect on photoperiodic flowering, have conserved effects on floral induction in ragweed.

Overall, the homologs identified here indicate that variation of genes involved in the autonomous, temperature, and photoperiodic pathways may allow common ragweed to time flowering in accordance with favorable climatic conditions. Their colocalization with the QTL identified here suggests at least some of these candidate genes are involved in the flowering time differentiation of this species. In particular, future analysis of the function of natural variants within QTL-2 will be important in assessing if single or multiple mutations in one or more flowering time genes are contributing to the large phenotypic effects we identified.

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## CONFLICTS OF INTEREST

The authors declare no conflicts of interest.

## DATA AVAILABILITY STATEMENT

Sequence data are available at the National Center for Biotechnology Information Sequence Read Archive under Bioproject PRJNA820134. Phenotypic and genetic data are available at FigShare <https://figshare.com/account/home#/projects/143754>. R scripts are available at <https://github.com/khodgins/ragweed2021>.

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