- 1 Coordinated responses to changing environmental cues across a community of
- 2 temperate forest plants
- 3 Flynn, Wolkovich
- 4 The Arnold Arboretum of Harvard University
- Accurate predictions of future spring plant phenology for with continued climate
- 6 change are critical for robust projections of future growing seasons, plant
- 7 communities and a related suite of critical ecosystem-level properties. Despite
- 8 tremendous amounts of observational data of plant phenology progress towards
- 9 prediction has been hindered because the major cues known to drive
- phenology—chilling temperatures in fall and winter, photoperiod, and spring forcing
- 11 temperatures—generally co-vary in nature. Further, research to date using
- 12 controlled environments to separate these factors suggests that the cues are
- interactive, meaning accurate predictions of plant responses to climate change will
- be complex and non-linear [1]. Recently, however, other research has suggested
- many species may be dominated by one of the three possible cues [2], with a tradeoff
- between photoperiod and forcing temperature sensitivities, meaning some species'
- 17 responses would be simple to predict. To address this debate we present results of a
- 18 full-factorial experiment manipulating all three cues (spring forcing temperatures,
- photoperiod, and intensity of winter chilling ) across 28 woody species and two
- 20 latitudes (42.5°N and 46°N) in North American temperate forests. In contrast to the
- 21 predicted tradeoff between photoperiod and temperature cues we find responses to
- these cues are largely coordinated across species; namely, species highly sensitive to
- temperature were also highly sensitive to photoperiod. Bud burst and leaf-out were
- 24 more sensitive to temperature than to photoperiod. Winter chilling exerts a large
- role in driving advances in spring phenology, for both bud burst and leaf out stages,
- yet more intense chilling at 1.5°C resulted in less pronounced effects than at 4°C.
- 27 Latitude of origin exerted surprisingly small effects on sensitivity to abiotic factors in
- <sup>28</sup> driving spring phenology, indicating that local adaptation—at least across 4°of
- 29 latitude—may not necessarily constrain woody plant responses to climate change.

- 30 Shrub and small tree species were less sensitive to changing temperatures or
- photoperiod, but consistently earlier in their phenology. These results indicate that
- under warming conditions, communities could shift to a more canopy-tree dominated
- 33 system with generally later phenologies, counteracting advances in phenology at the
- <sup>34</sup> ecosystem scale.
- 35 Woody plant spring phenology drives local ecosystem properties, from the length of the growing
- 36 season to energy balance between land and atmosphere, and scales up to impact global carbon
- cycles [3]. The crucial role that phenology plays in ecosystem processes, and the wealth of
- observational data highlighting how rapidly plant and animal phenology are advancing [4] has led
- to increased interest in better understanding and prediction of how plant phenology will shift with
- 40 continued climate change.
- Decades of study on wild species spring phenology—mainly focused on temperate woody
- species—show that three major cues drive bud burst and leaf-out: spring temperatures (forcing),
- length and intensity of winter temperature (chilling), and changing day length (photoperiod).
- 44 Across studies increasing temperatures in the spring appear to be a dominant factor that controls
- spring phenology, yet many of these studies have been observational—making it nearly impossible
- to tease out the generally co-varying effects of longer days and reduced cold temperatures, which
- 47 generally reduce chilling. In contrast studies from controlled environments (e.g., growth chambers
- or greenhouses) have highlighted the additional importance of photoperiod and chilling [5–9], with
- 49 longer days and increased chilling leading to more rapid leaf-out [10]. Further, photoperiod and
- $_{50}$  chilling often appear to interact, as long photoperiod enhances cell growth, compensating for a
- 51 lack of chilling during plants' winter dormacy [5, 9, 11]. To an extent, all three
- 52 factors—temperature, photoperiod, and chilling may be interchangeable in some species—such
- 53 that a plant experiencing a mild winter with insufficient chilling can still break bud given
- sufficiently long photoperiods and warm temperatures [5].
- A major challenge to build on this extensive study of how temperature and photoperiod drive
- 56 spring phenology is understanding—and possibly predicting—how the sensitivity to each cue and
- 57 their interactions varies across species. Temperate woody species are well known to have different
- sets of cues, depending on the species [2,12]—with some species showing stronger spring forcing

- or photoperiod cues, for example. A possible framework for understanding this variation in cues
- comes from considering how adaptive pressures may drive temperate plant phenology [13, 14].
- 61 Temperate woody plants should aim to maximize the carbon gain that comes from starting
- 62 growth early in the season and gaining first access to critical resources such as light, soil nitrogen
- and water, while at once minimizing the risk of tissue loss to frost in early spring [2, 15, 16].
- 64 Across a community of co-occuring species we may expect a diversity of strategies to address
- these pressures—allowing each species to persist in the community.
- The ways that species manage such risks, and possible rewards, can vary in both when on average
- in the spring they begin their growth, and also how flexible they are around that average timing.
- Related to this, two tradeoffs have been described for spring phenology of woody plants in
- 69 response to a variable spring environment: tolerance versus avoidance of freezing [17], and
- opportunistic versus conservative strategies [2]. The former describes how early or late in a season
- 71 a species leafs out—with tolerant species consistently leafing out early each year, while avoidance
- 72 species would consistently leaf out late—while the latter describes how flexible a species or
- 73 individual may be in response to unusually early warm-up events, with opportunistic species
- 74 tending to have phenological cues that yield variable leaf-out times across variable years and
- 75 conservative species tending to leaf out consistently across variable years. While related, these
- 76 tradeoffs predict some differences in the characteristic of the cues and related traits of each
- 575 species and may combine to produce contrasting changes in phenology.
- 78 Importantly, the combinations of these axes can result in non-intuitive responses at the
- 79 community level. For example, under a relatively stationary long-term climate early tolerant but
- 80 conservative species would enjoy the advantage of a long growing season. Yet, as that
- 81 environment becomes nonstationary—as is the case with climate change—such advantages may
- 82 quickly eroded. In contrast under a warming environment, species that are relatively late in
- 83 leafing out (avoidance) and flexible (opportunistic) close the gap with those tolerant species in
- bud burst and leaf out times. Thus, understanding both the rank order of phenology and the
- 85 sensitivity of species to environmental cues across a whole community is important in
- <sup>86</sup> understanding how a changing climate will affect community dynamics.
- For the tolerance-avoidance axis, plants may either tolerate risk of spring freezing in two major

ways: through phenological cues that allow them to leaf out well after all frost risk has passed (avoidance) or through investing in tissue which can withstand freezing (tolerant). For perennial plants, it has been found that leaf and wood tissues of species which have later phenologies can be 90 more sensitive to frost damage [12, 18, 19], supporting the notion of a tradeoff between tolerance and avoidance of freezing risk. In contrast, avoidance-strategy plants would be expected to express lower tissue densities, with the shorter growing season being made up for by faster growth rates, less investment in structural elements of tissue, and relatively greater percent nitrogen in leaves. The axis of conservative versus opportunistic strategies makes specific predictions for the phenological cues of differing species and may also predict the related traits of species. In 96 opportunistic plant strategies, temperature is the dominant driver of spring phenology, while for 97 species with conservative strategies, photoperiod and chilling would be the major drivers. It has been found for several cases that short-lived, early successional species typically exhibit such opportunistic strategies, and late-successional species are more typically chilling- and 100 photoperiod-controlled in breaking of dormancy [2, 10, 20]. 101 Tests of how these two tradeoff axes drive phenology across a co-occurring community of species 102 have not previously been carried out. As the abiotic environment is not the sole contributor to 103 plant performance, considering a suite of co-occurring species together is key for making progress 104 in understanding the role phenology plays in shifts in community composition and ecosystem 105 functioning [21]. 106 To test the interactive effects of the three controlling drivers of spring phenology, temperature, 107 photoperiod, and chilling across latitudes, we carried out a study of 28 woody plants. We assessed 108 both bud burst and leaf-out to account for the potential different sensitives of these phenological 109 stages to abiotic drivers, and analyzed responses across all species to examine the support for how 110 well the tolerance-avoidance and opportunistic-conservative tradeoff axes represent temperature plant spring phenology. 112

### 13 Results

Major findings

- All of the 28 species showed sensitivity to all three of the abiotic drivers.
- The strength of the sensititivty to each driver was coordinated, not showing a trade-off axis
- Species with greater sensitivity were generally later-phenology, canopy trees, rather than early-season, early-successional shrubs.

Forcing temperature, photoperiod, and chilling individually and interactively determined timing 119 of both bud burst and leaf-out. We found photoperiod sensitivity was common and strong across 120 all of the woody plants studies, consistently reducing time to phenological responses for each 121 species, across sites of origin. For the 28 species studied, sensitivity to temperature and photoperiod cues for leaf-out times 123 varied substantially, and—in contrast to our hypotheses [that we set up in the intro]—co-varied 124 overall. The coordinated response to warming temperatures and longer photoperiod was 125 consistent with overall pace of phenological events; earlier-leafing out species (namely the shrubs 126 Spiraea alba, Viburnum cassanoides, and Vaccinium murtilloides) exhibited relatively limited 127 advances to either warming or longer days, while later leafing-out species showed ability to advance their phenology by in response to both warming and longer days. Thus, no trade-off was 129 observed between photoperiod-cued and temperature-cued species, but rather species exhibit 130 coordinated responses to both environmental factors (Fig. 1). Of the other species, Fagus 131 grandifolia exhibits relatively limited response to warming but substantial photoperiod sensitivity, 132 while Rhamnus franqula shows relatively limited response to photoperiod but substantial warming 133 sensitivity; if only a small subset of species including these two had been included in the study, it 134 might have been concluded that a tradeoff between photoperiod sensitivity and warming 135 sensitivity would exist. 136 While both photoperiod and temperature cues were important for driving woody plant phenology, 137 responses to chilling were also substantial. Bud burst day was accelerated most by the chilling 138 treatments. Tables 1 and 2 summarizes hierarchical mixed-effects model analysis of day of bud 139 burst and leaf-out, with negative values indicate earlier day of experiment for each event. Overall the 5°C experimental warming resulted in 6.8 days earlier bud burst and 21.9 days earlier leaf out. Such advance was delayed by the each chilling treatment, as indicated by the positive coefficient

for the temperature x chilling interactions. Latitude of origin (Site) overall had little direct effect
on bud burst or leaf-out, but populations from the northern site tended to exhibit slower bud
burst and leaf-out, with a more rapid bud burst and leaf out in response to the chilling treatments
(indicated by negative coefficients for site x chilling treatments).

Warming, photoperiod, and chilling individually and interactively acted to drive bud burst and leaf out earlier across species. The strength of the acceleration in bud burst due to both warming and photoperiod were similar, but the acceleration of leaf out due to warming exceeded that of photoperiod for both phenological stages. Surprisingly, site of origin exerted limited effect on either bud burst or leaf out across species.

# 152 Effect of chilling

Species varied widely in response to chilling treatments, with some exhibiting strong chilling requirements (*Acer saccharum*, *Fagus grandifolia*), while others exhibited little change in phenological advancement under experimentally manipulated chilling. Overall, bud burst and leaf-out advanced by 22.1 or 26.4 days under additional 30 d of vernalization at 4°C, and advanced by a reduced amount of 19.7 or 26.1 days under 30 d of vernalization at 1.5°C. The reduced chilling effect at the lower temperature chilling is consistent with the Dynamic Model of chilling accumulation.

Species-specific responses to chilling demonstrate that chilling requirements are not uniform
across species, with of *Fagus grandifolia* to increasingly strong vernalization varies by latitude of
origin and by phenological stage; winter chilling reduced day to bud burst and leaf-out, but more
strongly for individuals from the northern site.

While nearly all species showed advances in spring phenology in response to the experimental chilling treatment, as indicated by fewer days to phenological events for the 4°C and 1.5°C treatments, the majority of species (e.g. *Populus grandidentata*) showed delays in both bud burst and leaf out at the more severe chilling treatment. Of the species exposed to the additional chilling, only *Fagus grandifolia* was consistently advanced by the more severe chilling.

## 169 Species-specific responses

Species traits partly explain variation in warming and photoperiod sensitivities of leaf out. Plants 170 with high nitrogen leaves, as well as high SLA (thinner, less dense) leaves, were significantly later 171 in both bud burst and leaf out. Thus early leaf out species tended to be tougher, less N-dense, and 172 have higher carbon investments than later species. Greater wood density had inconsistent effects 173 as a driver, with higher wood density driving later bud burst but tending to drive earlier leaf out. Ring-porous species (Fraxinus sp., Lonicera, Myrica, and Quercus; lower values of Pore Anatomy 175 variable) exhibited significantly later bud burst and leaf out compared to diffuse-porous species, 176 in line with previous work on wood anatomy and freezing risk [22]. 177 Shrubs with low specific leaf area (thick/dense leaves) and high stem density were more likely to 178 leaf out earlier. For trees, with an overall later leaf out pattern, 179 Rank order of leaf out and bud burst was stable across warming and photoperiod treatments. 180 Chilling treatments shifted the order, for example Fagus grandifolia was the 23-28th species to 181 burst bud with no additional chilling, but advanced to the 10-11th species to burst bud in with 182 additional chilling. Within chilling treatments, the consistency of the rank order was high, with 183 standard deviation of the rank order ranging from 2.05 d (bud burst, no additional chilling) to 184 0.75 d (leaf out, additional chilling at 4°C). Compared to field observations, rank order of leaf out 185 was generally most related in the cool, short-day treatment with no additional chilling (Fig. S10).

### Discussion

Photoperiod sensitivity is common in northeastern woody plants, and greater photoperiod
sensitivity is related to, not instead of, temperature sensitivity. Taken together, this result shows
that the opportunism-conservatism tradeoff is not supported by the data for this suite of species.
The most sensitive species to both cues, namely the species which could advance their phenology
in response to both longer days and warmer temperatures, were the later-successional tree species,
rather than the shrubs. The trait data indicate partially that the species earliest to leaf out,
namely the shrubs and small trees, also had lower SLA and lower leaf %N, indicating greater

investment in tissue structures. These results support the tolerance-avoidance tradeoff, with the early phenology species being tolerant to freezing but relatively less able to advance their phenology in a warming environment. These results also indicate that the later-successional 197 species have potentially the most to gain from a warming world, as they can extend their growing 198 seasons 199 While both photoperiod and temperature sensitives were common, chilling sensitivity greatly 200 outweighed both of these factors. It is important to note that the results from the chilling part of 201 this experiment are derived from 11, not 28 species, but the strength of this effect is notable. 202 Strong chilling requirements were detected both for bud burst and leaf out responses, and the 203 most substantial advance in spring phenology came from the more mild chilling treatment, at 4°C, 204 with reduced effectiveness of chilling at 1.5°C. These three factors did show some degree of substituability, meaning for example that a lack of 206 chilling could be made up for by an increase in temperature. These are indicated by the positive 207 two-way interactions; chilling and forcing temperature are more substitutable than chilling and 208 photoperiod, for both bud burst and leaf out. 209 We found only limited support for the northern populations showing more conservative 210 (photoperiod-cued) strategies in these 28 species was found, with small delays in both 211 phenological events for populations from the more northern site. The latitudinal range studied 212 here is within the range of the phenotypic flexibility of these species. Of these study species, we 213 should not be overly concerned about being photoperiod limited at the more northern sites; given 214 sufficient pace of dispersal, they will be able to track a changing climate. 215 bud burst is sensitive to the same environmental cues as leaf out, but species show idiosyncratic 216 orderings of their sensitivity to environmental cues at these two phenological stages; leaf out 217 responses can not necessarily be used to back-cast bud burst responses. Bud burst showed a more 218 limited total response to environmental cues, and species were more tightly clustered in those 219 responses. 220 Surprisingly, the smaller statured, earlier-leafing out shrubs and small trees exhibited reduced 221

sensitivity to all three factors of temperature, photoperiod, and chilling. They are relatively more

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- fixed in their timing of both bud burst and leaf out, perhaps indicating an alternative mechanism for timing of spring phenology in these plants [23].
- Given these results, the future of the northeastern forests may shift towards later-phenology,
- canopy trees, as these species demonstrated a greater ability to lengthen their growing seasons
- 227 opportunistically in response to warmer temperatures.

# $_{228}$ Methods

#### 229 Field sampling

- Woody plant cuttings were made in January 2015 for 28 species which occurred in both Harvard
- Forest (HF, 42.5°N, 72.2°W) and the Station de Biologie des Laurentides in St-Hippolyte, Quebec
- (SH, 45.9°N, 74.0°W). The typical late January temperatures are -3.4 and -22°C, respectively; day
- length between these two sites differs by a maximum of 45 minutes. Weather station data from
- each field site was obtained for calculations of chilling units.
- Species were chosen based on the dominant forest vegetation at each site, aiming to maximize the
- number of shared species between the two sites. Of the 28 species, 19 occurred at both sites.
- 237 Comparing only shared species, the mean days to bud burst and leaf out across all treatments for
- Harvard Forest and St. Hippolyte was 25.6/36.8 and 24.8/36.1 days, respectively (Table S1). For
- each species, up to 15 representative healthy, mature individuals with branches accessible by pole
- pruners from the ground were tagged in late summer and fall 2014. In winter 2015, six individuals
- were located and 4-16 cuttings taken from each individual, depending on size of the individual
- 242 and number of treatments to be applied. Cuttings were kept cold and transported back to the
- 243 Arnold Arboretum in Boston, MA.

## 244 Growth Chamber Study

- <sup>245</sup> Cuttings were placed in growth chambers at the Arnold Arboretum in Erlenmeyer flasks distilled
- water, with water changed every 7-10 days. The base of cuttings was re-cut at each water change
- under water to prevent callusing. For 11 of the 28 species, sufficient cuttings were obtained from
- each individual tree to apply the full set of 12 experimental treatments: 2 temperature (20°C /

10°C warm vs. 15°C / 5°C cool) x 2 photoperiod (12 vs. 8 h) x 3 chilling (no additional chilling, additional 33 d at 4°C, or 33 d at 1.5°C) treatments. For the remaining 17 species, only sufficient 250 cuttings were obtained to apply the temperature and photoperiod treatments, without the 251 additional chilling levels. The total number of cuttings for a given species thus ranged from 24 to 252 144, depending on presence at each site and application of the chilling treatment. 253 Phenology of the cuttings was assessed using a modified BBCH scale [24], with observations on 254 each of the 2.136 cuttings made every 2-3 days for the course of the 82-day experiment, a total of 255 48 observation days. The phenological stages assessed in the present study are bud burst, defined 256 as beginning of sprouting or bud breaking or shoot emergence (Code 07 in [24]) and leaf out, 257 defined as first leaves unfolded (Code 11 in [24]). Additional stages up to flowering and stem 258 elongation were also recorded. In total, we made 19.318 phenological observations at the cutting 259 level.

Functional trait collection In summer 2015, the same individuals previously tagged in the field 261 were revisited as part of an additional study. Six individuals of each species were sampled for 262 several plant functional traits, following standard protocols [25]. In some cases, the individual 263 used in the growth chamber study was missing, in poor condition, or had no remaining branches 264 to sample, and was replaced by a nearby representative individual. For each individual, height 265 and diameter at breast height (DBH) were recorded, and leaf and stem material were sampled from the middle of the canopy or the greatest height reachable with pole pruners. Leaf material 267 was kept cool and moist, and within several hours was scanned for leaf area and weighed fresh. 268 Stem volume was measured using a water-displacement method. Samples were oven dried at 70°C and weighed within several days of sampling, and specific leaf area (SLA) were calculated stem 270 density. Leaf tissue was further processed for carbon:nitrogen ratio using an elemental analyzer 271 (Perkin-Elmer Elemental Analyzer) at Harvard Forest. Since in not all cases the same individual 272 used for the growth chamber experiments was the individual sampled for functional traits. 273

#### 274 Statistical analysis

For the two phenology responses measured, bud burst and leaf-out, we fit mixed effect hierarchical models using site, warming, photoperiod, and chilling treatments as predictors (fixed effects) and species as a modeled groups (random effects). For each model, two-way interactions for effects of

site, warming, and each of the chilling treatments were included. The models were fit using a

279 Markov Chain Monte Carlo sampling approach in the programming language

280 Stan [26] (www.mc-stan.org), accessed via the rstan package in R www.r-project.org.

The model was fit using a Baeysian approach with weak priors with five main effects and each of

their two-way interactions, which allowed us to calculate the posterior probabilities of the effects

283 for each of the abiotic drivers individually and interactively. We ran four chains simultaneously,

with 2 500 burn-in iterations followed by 2 500 sampling iterations, resulting in 10 000 posterior

samples for each parameter. The model was fit as follows:

$$\begin{aligned} y_i \sim N(\alpha_{sp[i]} + \beta_{site_{sp[i]}} + \beta_{temperature_{sp[i]}} + \beta_{photoperiod_{sp[i]}} + \beta_{chilling1_{sp[i]}} + \beta_{chilling2_{sp[i]}} \\ + \beta_{temperature \times photoperiod_{sp[i]}} + \beta_{temperature \times site_{sp[i]}} + \beta_{photoperiod \times site_{sp[i]}} \\ + \beta_{temperature \times chilling1_{sp[i]}} + \beta_{temperature \times chilling2_{sp[i]}} \\ + \beta_{photoperiod \times chilling1_{sp[i]}} + \beta_{photoperiod \times chilling2_{sp[i]}} \\ + \beta_{site \times chilling1_{sp[i]}} + \beta_{site \times chilling2_{sp[i]}}) \end{aligned}$$

Each of the 14  $\beta$  coefficients was modeled at the species level, as follows

1. 
$$\beta_{site_{sp}} \sim N(\mu_{site}, \sigma^2_{site})$$
...
14.  $\beta_{site \times chilling_{sp}} \sim N(\mu_{site \times chilling_2}, \sigma^2_{site \times chilling_2})$ 

For the mu and sigma parameters, weakly informative priors were chosen.

#### 287 Phylogenetic methods

We tested the influenced of phylogenetic relatedness on the relationship between functional traits and sensitivities to warming, photoperiod, and chilling treatment. Sensitivities were extracted as the slopes of the species-level responses of leaf out day to each of the experimental factors; more negative values indicate greater advance in leaf out in response to that factor. Using a phylogenetic tree resolved at the genus level from Phylomatic (www.phylodiversity.net), and the caper package in R, we fit phylogenetic generalized linear models between the sensitivities at the species level to the functional traits of stem density, SLA, and percent leaf nitrogen (%N). In this type of model, the parameter  $\lambda$  represents the strength of the phylogenetic symbol, with values close to 1 indicating that closely related species have more similar responses to the abiotic drivers.

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