## Rethinking False Spring Risk

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#### $_{\scriptscriptstyle 4}$ 1 Abstract

- 5 Trees and shrubs growing in temperate environments are at risk of being exposed to late spring freezes, or
- 6 false spring events, which can be damaging ecologically and economically. As climate change may alter the
- 7 potential prevalence and severity of false spring events, our ability to accurately forecast such events has
- become more critical. Yet currently, false spring studies largely simplify the various ecological elements that
- 9 could predict the level of plant damage from late spring freezing events. Here we review how to improve false
- spring equations for future projections. In particular we highlight how integrating species, life stage, and
- habitat differences could help accurately determine the level of damage sustained by a false spring event. We
- believe our suggested approaches could help rapidly advance understanding and forecasting of false spring
- events in climate change and ecological studies.

### 4 2 Introduction

- 15 Plants growing in temperate environments time their growth each spring to follow rising temperatures and
- increasing light and soil resource availability. While tracking spring resource availability, temperate plants
- are at risk of late spring freezes, which can be detrimental to growth. Individuals that leaf out before the last
- 18 freeze date are at risk of leaf loss, damaged wood tissue, and slowed or stalled canopy development (Gu et al.,
- 2008; Hufkens et al., 2012). These damaging late spring freezing events are known as false springs, and are
- <sup>20</sup> widely documented to result in highly adverse ecological and economic consequences (Knudson, 2012; Ault
- et al., 2013).
- 22 Climate change is expected to cause an increase in damage from false spring events due to earlier spring onset
- 23 and greater fluctuations in temperature in some regions (Cannell & Smith, 1986; Inouye, 2008; Martin et al.,

2010). Temperate forest species around the world are initiating leafout about 4-6 days earlier per degree 24 Celsius (Wolkovich et al., 2012; Polgar et al., 2014) and the magnitude of temperature variation is predicted to increase in certain habitats (Thompson et al., 2013; Vasseur et al., 2014). For these reasons, false spring events are expected to intensify across certain temperate regions (Kodra et al., 2011; Allstadt et al., 2015). 27 Already, multiple studies have documented false spring events in recent years (Gu et al., 2008; Augspurger, 28 2009; Knudson, 2012; Augspurger, 2013) and some have linked these events to climate change (Ault et al., 29 2013; Allstadt et al., 2015; Muffler et al., 2016; Xin, 2016). This increasing interest in false spring events has led to a growing body of research investigating the effects on temperate forests and agricultural crops. But 31 for this research to produce accurate predictions on future trends, researchers need methods that properly 32 evaluate the effects of false spring events across the diverse species, habitats and climate regimes they are 33 studying. 34

Current metrics for estimating false springs events are generally simple: often requiring an estimate for the start of 'spring' and whether temperatures occurred below a particular temperature threshold in the following week. Such estimates inherently assume consistency of responses across species, functional group, life stages, habitat type, and other climatic regimes, ignoring that such factors can greatly impact plants' false spring risk. As a result, such indices will most likely lead to inaccurate current estimates as well as poor future predictions, slowing our progress in understanding false spring events and how they may shift with climate change.

In this paper we aim to highlight the complexity of factors driving a plant's false spring risk and provide
a road map for improved metrics. First, we review the currently used definitions of false spring. Then,
combining research from plant physiology, climatology and community ecology, we outline major gaps in
current definitions. In particular we show how life stage (Caffarra & Donnelly, 2011), location within a
forest or canopy (Augspurger, 2013), interspecific variation in avoidance and tolerance strategies (Flynn &
Wolkovich 2017?), freeze temperature thresholds, and regional effects (Martin et al., 2010) unhinge simple
metrics of false spring. We argue that a new approach that integrates these and other crucial factors would
help accurately determine current false spring damage and improve predictions of spring freeze risk under
a changing climate—while potentially providing novel insights to how plants respond to and are shaped by
spring frost.

## Defining False Spring: An example in one temperate plant community

Temperate forest plants are most at risk to frost damage from episodic spring frosts (Sakai & Larcher, 1987).

Due to the stochastic nature of episodic spring frosts, plants must exhibit flexible spring phenologies in order to minimize freezing risk. Freezing temperatures following a warm spell could result in plant damage or even death (Ludlum, 1968; Mock et al., 2007). Intracellular ice formation from false spring events often results in severe leaf and stem damage. Ice formation can also occur indirectly (i.e. extracellularly), which results in freezing dehydration and mimics extreme drought conditions (Pearce, 2001; Beck et al., 2004; Hofmann & Bruelheide, 2015). Both forms of ice formation can cause defoliation and, ultimately, crown dieback (Gu et al., 2008). Once buds exit the dormancy phase, they are less freeze tolerant and resistance to bud ice formation is greatly reduced (Taschler et al., 2004; Lenz et al., 2013; Vitasse et al., 2014b). An effective and consistent definition of false spring that more accurately determines the amount and type of ice formation is essential to properly evaluate the level of damage that could occur.

There are several definitions currently used to define a false spring. A common definition describes a false spring as having two phases: rapid vegetative growth prior to a freeze and a post freeze setback (Gu et al., 2008). Another definition instills a more precise temporal parameter, specific to the Midwestern United States, and is defined as a warmer than average March, a freezing April, and enough growing degree days between budburst and the last freeze date (Augspurger, 2013). A widely used definition integrates a mathematical equation to quantify a false spring event. This equation, known as a False Spring Index (FSI), signifies the likelihood of a damage to occur from a late spring freeze. Currently, FSI is evaluated by the day of budburst and the day of last spring freeze through a simple equation as seen below (Marino et al., 2011).

$$FSI = \text{Day of Year}(LastSpringFreeze) - \text{Day of Year}(Budburst)$$
 (1)

A damaging FSI is currently defined to be 7 or more days between budburst and the last freeze date (Equation 1) (Peterson & Abatzoglou, 2014). The 7 day parameter exposes less resistant foliate phenophases to a false spring, thus putting the plant at a higher risk of damage.

To demonstrate how the FSI definition works, we applied it to data from the Harvard Forest Long-term Ecological Research program in Massachusetts. We used three separate methodologies to calculate spring onset: long-term ground observational data (O'Keefe, 2014), PhenoCam data from Harvard Forest (Richardson, 2015), and USA National Phenology Network (USA-NPN) Extended Spring Index (SI-x) data (USA-NPN, 2016). These spring onset values were then inputted into the FSI equation (Equation 1) to calculate FSI from 2008 to 2014 (Figure 1).

Each methodology renders different FSI values, suggesting different false spring damage for the same site and same year. For most years, the observational FSI and PhenoCam FSI are about 10-15 days lower than the SI-x data. This is especially important for 2008, when the SI-x data indicates a false spring year, whereas the other two datasets do not. In 2012, the observational data and PhenoCam data become unhinged and the PhenoCam FSI is over 30 days less than the SI-x value.

The reason for these discrepancies is that each method evaluates spring onset for different species or functional groups within a forest community. Spring phenology in temperate forests typically progresses by functional group: understory species and young trees tend to initiate budburst first, whereas larger canopy species may start later in the season (Richardson & O'Keefe, 2009; Xin, 2016). The different FSI values determined in Figure 1 exemplify the differences in functional group spring onset dates and illustrate variations in forest demography and phenology, which is most apparent in 2012. In 2012, a false spring event was reported through many regions of the US due to warm temperatures occurring in March (Ault et al., 2015). These high temperatures would most likely be too early for larger canopy species to initiate budburst but they would affect smaller understory species as is seen in Figure 1.

Yet, in contrast to our three metrics of spring onset for one site, most FSI work currently ignores variation
across functional groups — instead using one metric of spring onset and assuming it applies to the whole
community of plants. The risk of a false spring varies across habitats and with species composition since
spring onset is not consistent across functional groups. Therefore, one spring onset date cannot be used as an
effective proxy for all species. False spring studies should first assess the forest demographics and functional
groups of the study species in order to effectively estimate the date of spring onset. However, as we outline
below, considering different functional groups is unlikely to be enough for robust predictions. It is also crucial
to integrate species differences within functional groups and consider the various interspecific avoidance and
tolerance strategies against false springs.

## Plant Physiology and Diversity versus the Current False Spring Definition

Plants have evolved to minimize false spring damage through two strategies: avoidance and tolerance. Effective avoidance strategies require well-timed spring phenologies. Temperate deciduous tree species optimize growth and minimize spring freeze damage by using three cues to initiate budburst: low winter temperatures, warm spring temperatures, and increasing photoperiods (Cleland *et al.*, 2007; Chuine, 2010). The evolution of these three cues and their interactions has permitted temperate plant species to occupy more northern ecological niches and decrease the risk of false spring damage, which is crucial for avoidance strategies (Samish, 1954). One avoidance strategy, for example, is the interaction between over-winter chilling and spring forcing
temperatures. Warm temperatures earlier in the year (i.e. in February) will not result in early budburst due
to insufficient chilling (Basler & Körner, 2012). Likewise, photoperiod sensitivity is a common false spring
avoidance strategy: species that respond strongly to photoperiod cues in addition to warm spring temperatures will likely delay budburst and evade false spring events as spring continues to advance earlier in the
year (Basler & Korner, 2014).

Some temperate forest species have evolved to be more tolerant of spring freezing temperatures, rather than try to avoid frosts via more flexible phenologies. Temperate forest plants utilize various morphological 120 strategies to be more frost tolerant: some have toothed or lobed leaves to increase 'packability' in winter 121 buds, which permits more rapid leafout and minimizes exposure time of less resistant tissues (Edwards et al., 122 2017). Other species have young leaves with more trichomes to act as a buffer against spring frosts (Agrawal et al., 2004), and many are able to respond to abiotic cues such as consistently dry winters. Species living in 124 habitats with drier winters develop shoots and buds with decreased water content, which makes the buds more 125 tolerant to drought and also to false spring events (Beck et al., 2007; Morin et al., 2007; Norgaard Nielsen 126 & Rasmussen, 2009; Poirier et al., 2010; Kathke & Bruelheide, 2011; Hofmann & Bruelheide, 2015). More studies are needed to investigate the interplay between false spring events, leaf morphology, and precipitation 128 and how these relationships affect false spring tolerance. Given the diverse array of spring freezing defense 129 mechanisms, predicting damage by false spring events requires a greater understanding of avoidance and 130 tolerance strategies across species, especially with a changing climate. 131

# Defining Vegetative Risk: Complexities due to Species' Strategies and Climate

Phenology and frost tolerance are intertwined. Different phenological phases respond differently to false spring events. Flowering and fruiting phenophases are generally more sensitive than vegetative phases (Augspurger, 2009; Lenz et al., 2013). False spring events that occur during the vegetative growth phenophases impose the greatest freezing threat to deciduous tree and shrub species because plants will suffer greater long-term effects from the loss of photosynthetic tissue, which could impact multiple years of growth, reproduction, and canopy development (Sakai & Larcher, 1987; Vitasse et al., 2014a). Within certain phenological phases (i.e. before full leafout of the entire plant) plants are more likely to sustain damage from a false spring than individuals past the leafout phenophase. Spring phenology is thus a crucial measure for how much damage a plant will sustain from a freezing event.

Freezing tolerance steadily decreases after budburst begins until the leaf is fully unfolded (Lenz et al., 2016)

(Figure 4). Therefore, the rate of budburst and the length of time between budburst and leafout is essential for predicting level of damage from a false spring event. We will refer to the timing of these collective phenophases (i.e. budburst to leafout) as the duration of vegetative risk. The duration of vegetative risk is usually extended if a freezing event occurs during the phenophases between budburst and full leafout (Augspurger, 2009). One hypothesis suggests that species with short durations of vegetative risk often sustain higher levels of damage because more sensitive tissues will be exposed to frost. But if the duration of vegetative risk is longer, then the less vulnerable phenophases will be exposed to the frost for longer thus potentially minimizing the risk of damage (Augspurger, 2009).

Climate change further complicates understanding species vulnerabilities to spring frost between budburst 152 and leafout. Most species are expected to begin leafout earlier in the season with warming spring temperatures 153 but some species may have the opposite response due to less winter chilling or decreased photoperiod cues (Cleland et al., 2006; Yu et al., 2010; Xin, 2016). Individuals that initiate budburst earlier in the spring may 155 attempt to limit freezing risk by decreasing the duration of vegetative risk in order to minimize the exposure 156 of less frost tolerant phenophases. Alternatively, studies indicate that species growing at more northern 157 latitudes tend to respond more to photoperiod than species growing further south and, subsequently, these 158 species may have a longer durations of vegetative risk (Partanen, 2004; Vihera-aarnio et al., 2006; Caffarra 159 & Donnelly, 2011). Furthermore, larger canopy species exhibit greater photoperiod sensitivities than shade 160 tolerant or understory species (Basler & Körner, 2012) and they also, generally, require more chilling in 161 the winter and greater forcing temperatures in the spring to initiate budburst (Laube et al., 2013). We 162 assessed climate data across Europe, long-term observational data, and experimental data to gain a better 163 understanding of the the interaction between duration of vegetative risk and false spring events.

## 5.1 Predictable Regional Differences in Climate, Species Response and False Spring Risk

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Numerous studies have investigated the the relationship between budburst and photoperiod by using latitu-167 dinal gradients (Partanen, 2004; Vihera-aarnio et al., 2006; Caffarra & Donnelly, 2011; Zohner et al., 2016; 168 Gauzere et al., 2017), however few have integrated longitudinal variation or regional effects. Yet climate and 169 thus false spring risk varies across regions. For example, consider five archetypal regions within a temperate climate. Some regions may experience harsher winters and greater temperature variability throughout the 171 year than others. We found that some of these more variable regions had a much higher risk of false spring 172 (i.e. Maine) than others (i.e. Lyon). Understanding and integrating such spatiotemporal effects and regional 173 differences when investigating false spring risk and duration of vegetative risk would help improve predictions 174 as climate change progresses.

Predictions will want to consider carefully how chilling and forcing, which are key drivers of budburst and leafout, vary significantly across a longitudinal gradient. Climatic variation across regions results in varying durations of vegetative risk due to different chilling and forcing temperatures. It is therefore important to recognize climate regime extremes (e.g. annual minima and annual maxima) in future studies in order to better understand the interplay between duration of vegetative risk and climatic variation. Different habitats exhibit variations in the amplitude of temperature variation, which could provide insight in the relationship between spring plant phenology and false spring risk.

The climatic implications of advancing forcing temperatures could potentially lead to earlier dates of budburst 183 and enhance the risk of frost. These shifts in climatic regimes could vary in intensity across regions (i.e. 184 habitats currently at risk of false spring damage could become low risk regions over time). There are also 185 discrepancies in defining a false spring event, especially with understanding damaging freezing temperatures. Some regions and species may tolerate lower temperature thresholds than others (Figure 5). Not only is there 187 debate on what a damaging temperature threshold is, but it is still not well understood how the damage 188 sustained relates to the duration of the frost (Sakai & Larcher, 1987; Augspurger, 2009; Vitasse et al., 2014a; 189 Vitra et al., 2017). It is crucial to gain an understanding on which climatic parameters result in false spring events and how these parameters may vary across regions. It is anticipated that most regions will have earlier 191 spring onsets, however, last freeze dates will not advance at the same rate (Inouye, 2008; Martin et al., 2010; 192 Labe et al., 2016), rendering some regions and species to be more susceptible to false spring events in the 193 future. 194

### 5.2 Changes in Phenological Cues and the Duration of Vegetative Risk

The risk of false spring may shift regionally as climate change progresses and forcing temperatures advance. 196 Studies suggest that spring forcing temperatures directly affect the duration of vegetative risk: years with lower forcing temperatures and fewer growing degree days will have longer durations of vegetative risk (Don-198 nelly et al., 2017). With spring advancing, it is anticipated that there will be greater fluctuations in spring 199 forcing temperatures (Martin et al., 2010). These fluctuations in spring temperature are expected to oscillate 200 above and below the development threshold within a spring season. With less consistent forcing temperatures, 201 we would expect to see longer durations of vegetative risk in a changing climate. Therefore, it is hypothesized 202 that the species able to track the shifts in spring advancement due to climate change will be more susceptible 203 to false spring damage (Scheifinger et al., 2003). We investigated this interaction using observational data 204 from Harvard Forest (O'Keefe, 2014) and compared two years of data: one year that had an unusually early 205 spring onset (2010) and another year that an unusually late spring onset (2014).

By comparing the durations of vegetative risk to the growing degree days for each year, we found that the

number of growing degree days were highly comparable for both years (Figure 2). Observational data failed to
demonstrate the expected result. However, phenological data in an experimental context suggests differently.

### 5.3 Interaction of Phenological Cues and the Duration of Vegetative Risk

Each species responds differently to climate change, therefore, it is important to consider the interaction 211 between cues and species when thinking about the duration of vegetative risk. Spring forcing temperatures 212 and day length requirements for budburst to occur vary among species and across habitats. Since species 213 distributions are largely driven by phenology (Chuine et al., 2001), species less reliant on photoperiod cues 214 are likely to out compete species that are reliant on photoperiod cues as spring forcing temperatures continue 215 to initiate earlier (Vitasse et al., 2011; Gauzere et al., 2017). Similarly, as climate change progresses, higher spring forcing temperatures may be required due to potentially insufficient winter chilling, especially at lower 217 latitudes (McCreary et al., 1990; Morin et al., 2009; Fu et al., 2012; Polgar et al., 2014; Chuine, 2010). 218 Anthropogenic climate change will cause changes in winter and spring temperatures, resulting in greater 219 differences in spring phenology cue requirements across species and regions. This interaction of cues and how climate change will affect that interaction is crucial to understand in order to recognize which species will 221 likely become more at risk of false spring events in the future. 222

We assessed data from a growth chamber experiment in order to investigate the interaction of cues across species and predict potential shifts in duration of vegetative risk with climate change. We compared 9 temperate forest species between two treatments: high chilling hours, long photoperiod and high forcing temperatures (WL1) against no additional chilling, short photoperiod and low forcing temperatures (CS0) (Flynn and Wolkovich, 2017?). According to the results, individuals that initiate budburst earlier in the season (i.e. Betula papyrifera (Marsh.) and Ilex mucronata (L.)) tend to initiate budburst early regardless of treatment, but the treatment does affect the duration of vegetative risk significantly (Figure 3). As the season progresses, treatment does not affect the duration of vegetative risk as much but the day of budburst tends to be later in the season with the weaker treatment effects (i.e. CS0). Anova results indicate forcing temperatures and photoperiod length determine the duration of vegetative risk more than chilling requirements. This could suggest that chilling influences budburst and leafout similarly, while photoperiod and forcing temperatures have varying effects on the two phenophases. With a changing climate, forcing temperatures will increase and initiate earlier in the season while photoperiod cues will remain stagnant or decrease. This cue interaction could potentially elongate the duration of vegetative risk and expose at risk plants to more intense false spring events or even multiple events in one year. Further studies are essential to investigate the interplay between chilling, forcing, and photoperiod cues on the duration of vegetative risk, especially for species occupying ecological niches more susceptible to false spring events.

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## 6 Conclusion

The risk of false spring damage varies across years and regions and the timing between last freeze date and date of spring onset may become less consistent. With warm temperatures advancing in the spring but last spring freeze dates staying the same, there could potentially be more damaging events in the future, especially in high risk regions (Gu et al., 2008; Inouye, 2008). This shift in timing could result in more events where understory species leaf out prior to the last freeze and escape frost damage but canopy species may be at higher risk, thus potentially resulting in crown dieback for the larger tree species and subsequently enhanced sun exposure and damage to understory species. For these reasons, a greater understanding of false spring damage as climate change progresses is necessary.

By utilizing only two simple metrics (last freeze date and spring onset date), researchers fail to assess the myriad of factors essential in determining false spring risk and damage. Future studies are necessary to gain an understanding with relationships between species, functional group, phenophase, and region and the differences in false spring damage. It is also essential that a temperature threshold is established for all functional types and phenophases across regions in order to effectively predict false spring risk in the future. An integrated approach to assessing past and future spring freeze damage must be realized as global climate change progresses in order to mitigate the adverse ecological and economic effects of false springs.

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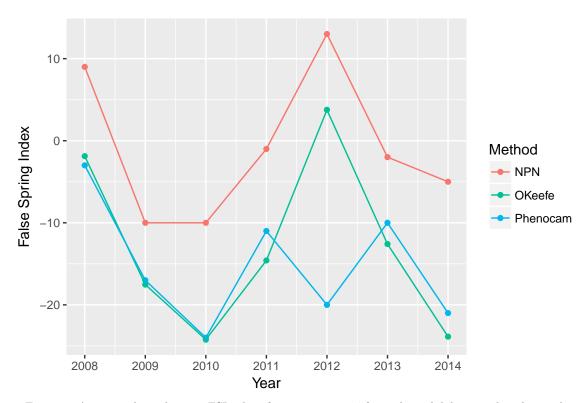


Figure 1: A scatterplot indicating FSI values from 2008 to 2014 for each methology used in this study. USA-NPN FSI values are green (USA-NPN, 2016), observed FSI values are blue (O'Keefe, 2014), and PhenoCam FSI values are red (Richardson, 2015).

```
## lmer(formula = risk ~ chilling + warm + photo + (chilling + warm +
```

```
## photo | species), data = dxx)
           coef.est coef.se
##
## (Intercept) 53.35 6.15
## chilling -0.10 0.36
          -1.54 0.19
## warm
          -1.19 0.15
## photo
##
## Error terms:
## Groups Name Std.Dev. Corr
## species (Intercept) 17.27
         chilling 0.61 -0.73
##
         warm 0.50 -1.00 0.78
##
         photo 0.29 -0.98 0.84 0.99
## Residual 7.44
## ---
## number of obs: 996, groups: species, 9
## AIC = 6896.2, DIC = 6861.6
## deviance = 6863.9
```

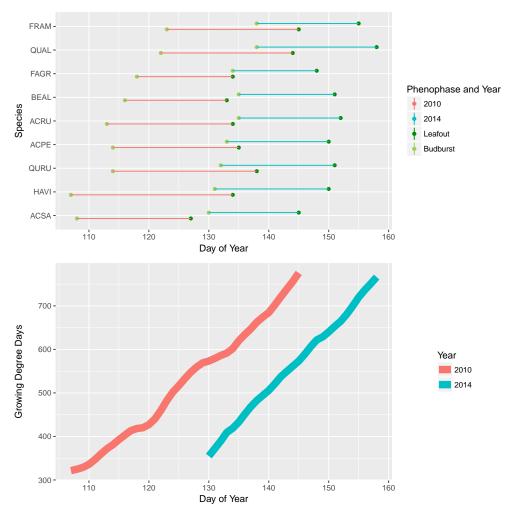


Figure 2: A comparison of two years of observational data investigating the effects of growing degree days on the duration of vegetative risk. The average duration of vegetative risk for 2010 was 21 + / 3.39 days versus 17.1 + / - 1.96 days in 2014.

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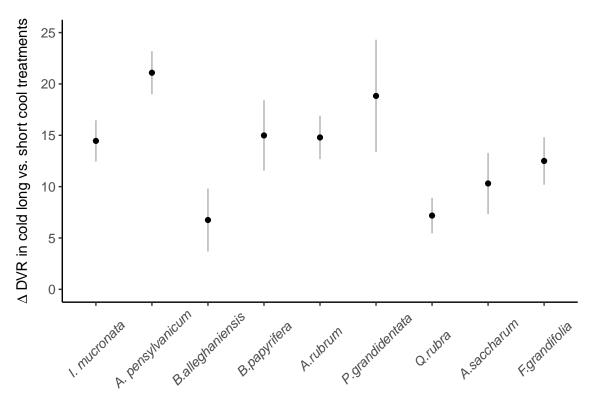


Figure 3: This figure is comparing difference in duration of vegetative risk across two treatments for each species collected for the experiment. Data was collected from a growth chamber experiment where one treatment had no additional overwinter chilling, low spring forcing temperatures, and shorter spring daylengths and the other had additional overwinter chilling, high spring forcing temperatures, and longer spring daylengths. The standard error is represented by the bars around each point.

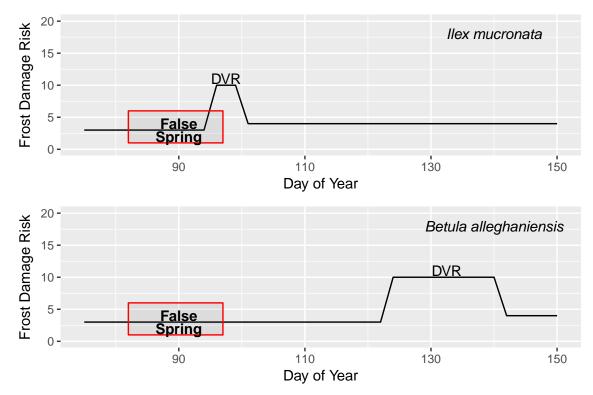


Figure 4: A figure showing the differences in spring phenology and false spring risk across two species: *Ilex mucronata* and *Betula alleghaniensis*. We mapped a possible false spring event based on historic weather data and compared it to the observational data collected at Harvard Forest (O'Keefe, 2014). In this scenario, the *Ilex mucronata* would be exposed to a false spring event, whereas the *Betula alleghaniensis* would avoid it entirely. DVR stands for Duration of Vegetative Risk.

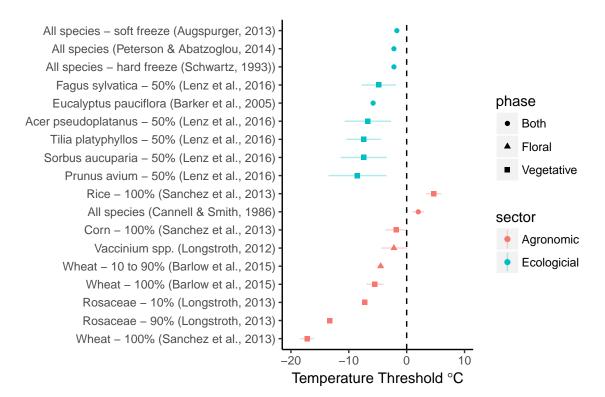


Figure 5: A comparison of damaging spring freezing temperature thresholds across ecological and agronomic studies. Each study is listed on the y axis along with the taxonimic group of focus. Next to the species name is the freezing definition used within that study (e.g. 100% is 100 lethality). Each point is the best estimate recorded for the temperature threshold with standard deviation if indicated in the study. The shape of the point represents the phenophases of interest and the colors indicate the type of study (i.e. agronomic or ecological).