



# Anthocyanins and the PhenoCam Network: This Red Pigment as the Key to Predicting Fall Foliage

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# Introduction

**Why are anthocyanins important and how can the PhenoCam Network help identify when peak foliage occurs?**

## **TASKS:**

- Provide a literature review on anthocyanins
  - What roles do they play
  - Motivation for future examination of them
- Lay the groundwork for analyzing data from the PhenoCam Network
- Determine how well PhenoCam's data predicts peak foliage





# Introduction

## Refresher on senescence and what are anthocyanins?

### SENESCENCE AND NUTRIENT RESORPTION:

- Leaves go through an annual death where chlorophyll degrades, revealing yellow pigments
- Red pigments, like anthocyanins, are produced in the leaf rather than present year-round (Lee et al., 2003)
- A goal of the tree is to resorb as many nutrients from the leaves as it can before the leaves fall off (Lee et al., 2003)

### Anthocyanins:

- One of the red pigments in leaves
- Their function is not entirely understood
- Possible properties that aid in this nutrient resorption





## Introduction

## Anthocyanins

**Anthocyanins (a red pigment) likely have properties that aid in nutrient resorption through a photoprotection role**

**Possible Photoprotection Properties:**

- Antioxidants (Tsuda et al., 1994)
  - Scavenge damaging free radicals from photooxidation (Lee et al., 2003)
- Extended: free radicals can disrupt nutrient flow (Lee et al., 2003)
- Protect photosynthetic apparatus from photoinhibition (Hoch et al., 2001)
  - Need apparatus functioning for nutrient resorption

# Introduction

## The PhenoCam Network

### Phenocams are used to observe vegetation at over 700 sites

- Running since 2008
- Focused on understanding the effects of meteorological factors and climate change on vegetation and ecosystems
- Images at each site are taken every 15 minutes to an hour in the same direction
- Green chromatic coordinate (GCC) and RCC (red chromatic coordinate)
  - How they measure “greenness” or “redness”
- Available to the public!
  - Images as well as provisional data

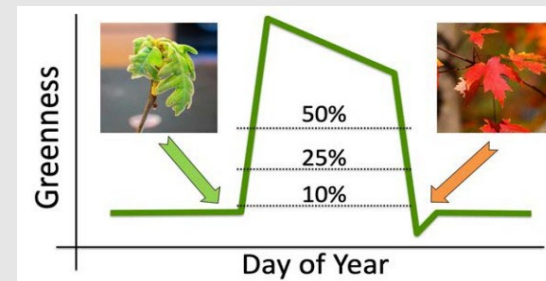


# Methods

## Data from PhenoCam Network

(Northern Arizona University, Perkins, and Richardson)

- Site: proctor at Proctor Maple Research Center in Vermont
  - 15 years of data (2009-2023)
  - Site has masks (bottom left figure) – area of data processing
- Downloaded provisional data from the site including midday\_gcc and midday\_rcc and uploaded to Python for analysis
- Calculated a three-day running average on both midday gcc and rcc to smooth out some wiggles
- Performed two visual assessments on images from each year to determine subjective dates of peak color
  - These served as the standard to which to compare peak coloration dates from PhenoCam's data
- Analyzed gcc and rcc data including...
  - Similar trends in both from year to year?
  - Testing different thresholds for each\*
    - Calculated proportion of gcc and rcc
  - Visualizing how the different methods of determining peak foliage compare

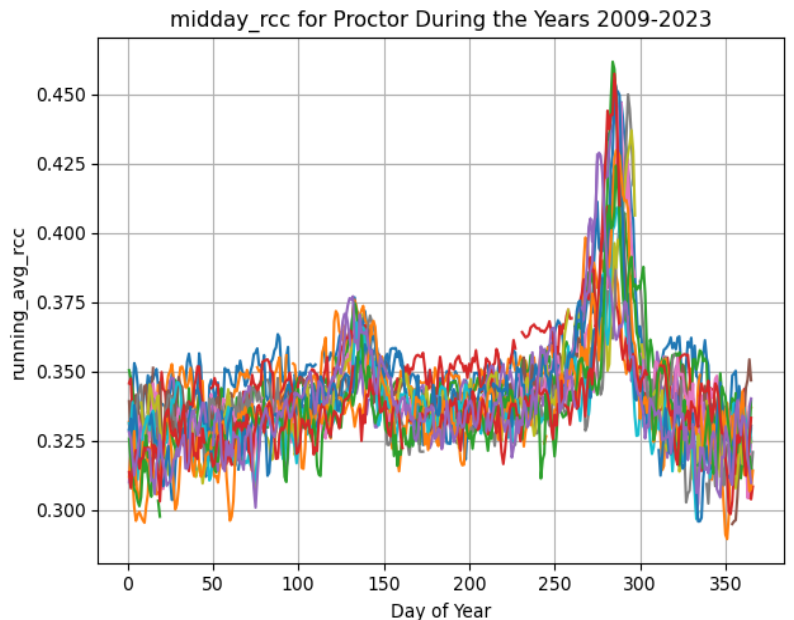
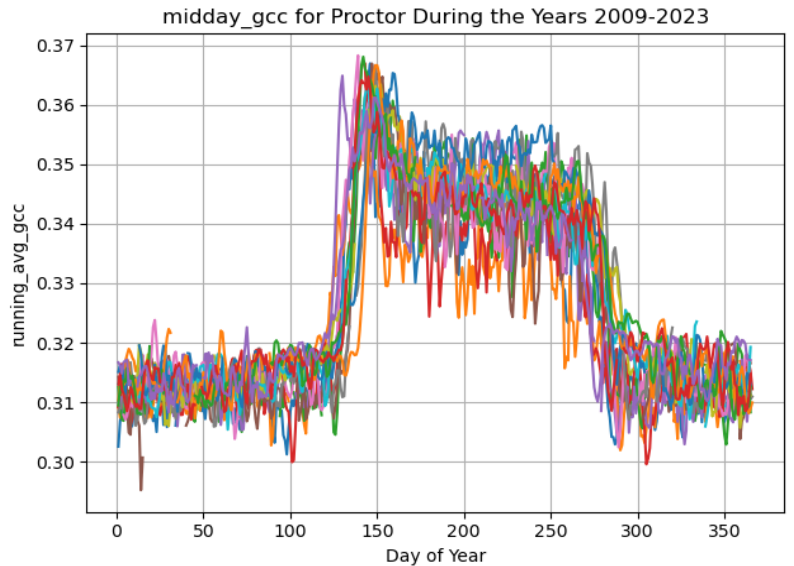


# Results

## Verifying that GCC and RCC have similar trends for each year

**There's variability, but similar**

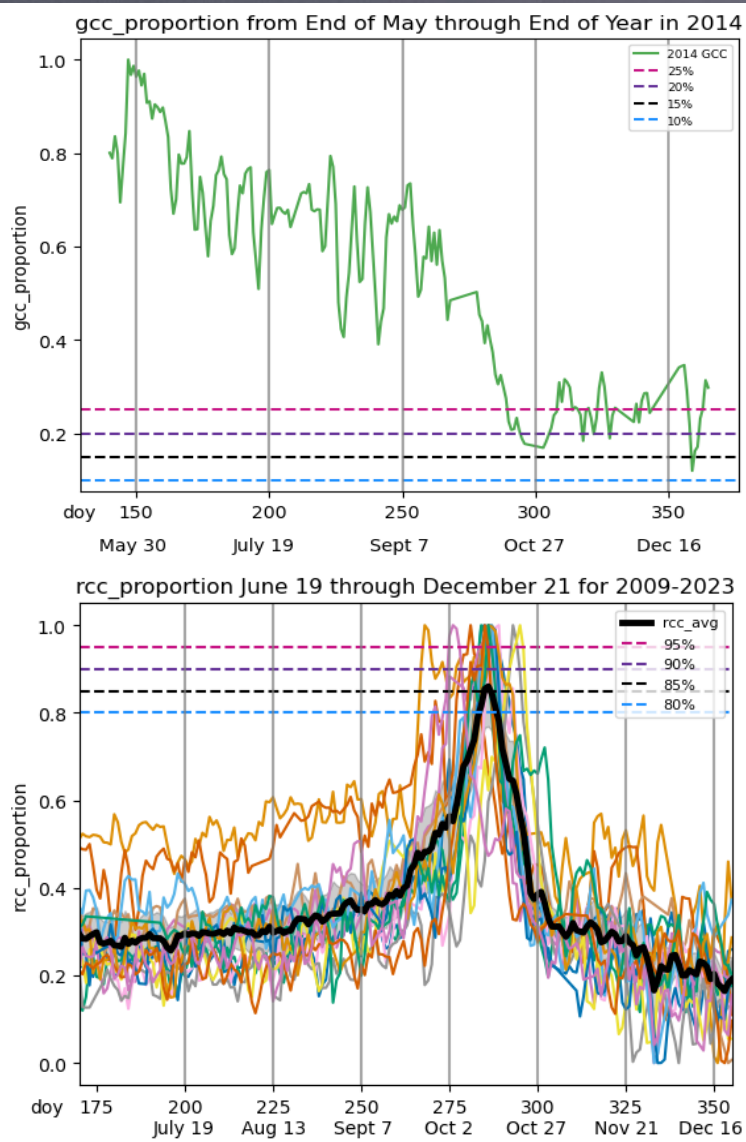
- Plotting the three-day running averages for gcc and rcc values all together exemplifies that the years are comparable
- GCC starts to increase during leaf-out in the spring, peaks near the end of May, stays steady, then declines around September
- RCC is low most of the year except for a jump around leaf-out and the peak between mid-September and end of October



Three-day average for midday GCC and RCC. Each colored line represents a year. Day 150 is May 30<sup>th</sup>, day 200 is July 19<sup>th</sup>, day 250 is September 7<sup>th</sup>, day 300 is October 27<sup>th</sup>, day 350 is December 16<sup>th</sup>. The range for GCC and RCC is the y-axis.

# Results

## What thresholds to use



- Different years were examined to see where the GCC and RCC proportion crossed certain thresholds
- GCC: experimented with 10% (PhenoCam's), 15%, 20%, and 25%
  - 10% is not accurate for all years, ex. 2014
- RCC: tested 80%, 85%, 90%, and 95%
  - Most proportion lines cross around 85 or 90
  - Consulted table of visual analysis dates to choose, even though both would have been fine

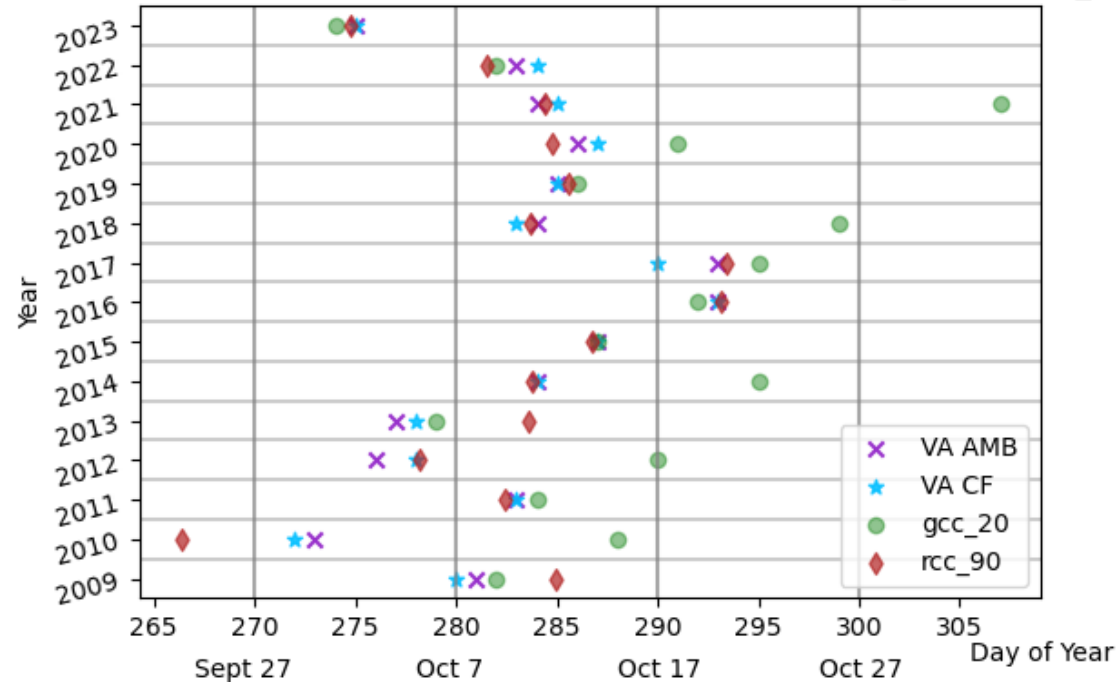
**20% for GCC and 90% for RCC**



# Results

## How well peak foliage dates obtained from GCC\_20 and RCC\_90 compare to visual

Peak Color Dates Based on Visual Analysis 1 and 2, gcc\_20, and rcc\_90



### Comparing all four methods of acquiring dates of peak

- Lot of information, let's step through
- First takeaway – dates using GCC\_20 have a wider variability and is less close to dates using visual analyses
- Second – RCC\_90 dates are better! But not perfect
- Overall: concluded that RCC is a better indicator of when maximum coloration occurs

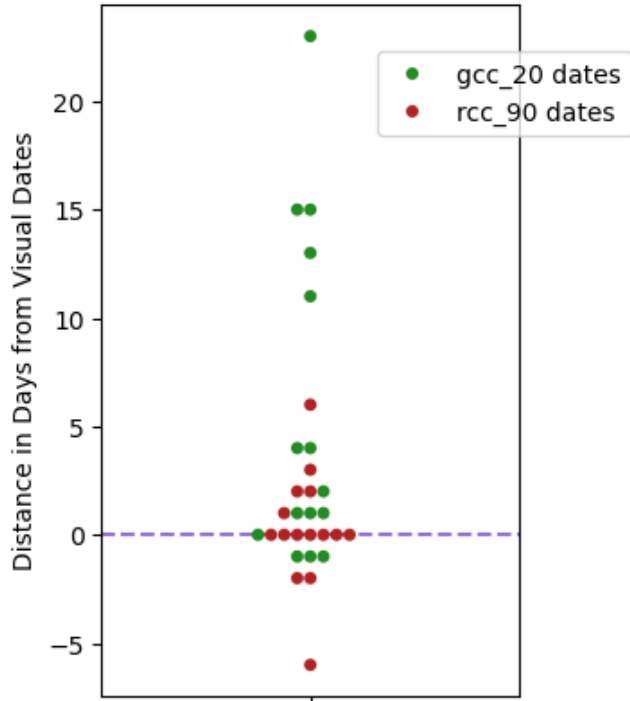
year	2009	2010	2011	2012	2013	2014	2015	2016	2017	2018	2019	2020	2021	2022	2023
visual analysis amb	10/08	09/30	10/10	10/02	10/04	10/11	10/14	10/19	10/20	10/11	10/12	10/12	10/11	10/10	10/02
visual analysis cf	10/07	09/29	10/10	10/04	10/05	10/11	10/14	10/19	10/17	10/10	10/12	10/13	10/12	10/11	10/02
gcc_20	10/09	10/15	10/11	10/16	10/06	10/22	10/14	10/18	10/22	10/26	10/13	10/17	11/03	10/09	10/01
rcc_90	10/11	09/24	10/10	10/05	10/10	10/11	10/14	10/19	10/19	10/11	10/12	10/11	10/13	10/08	10/02



# Results

## How well peak foliage dates obtained from GCC\_20 and RCC\_90 compare to visual

How Far Away GCC and RCC Peak Dates are from the Visual Analysis Dates for 2009-2023



### Using RCC is more accurate than GCC

- Another way to visualize, showing similar data
- Y=0 line denotes the average visual analysis dates
- Green points are dates obtained from GCC\_20, red points from RCC\_90 dates
- Points are plotted as how far away they are from the visual analysis date of that year
- Standard deviation
  - GCC 7.59
  - RCC 2.63
- Overall: RCC more closely matches peak dates from visual assessments

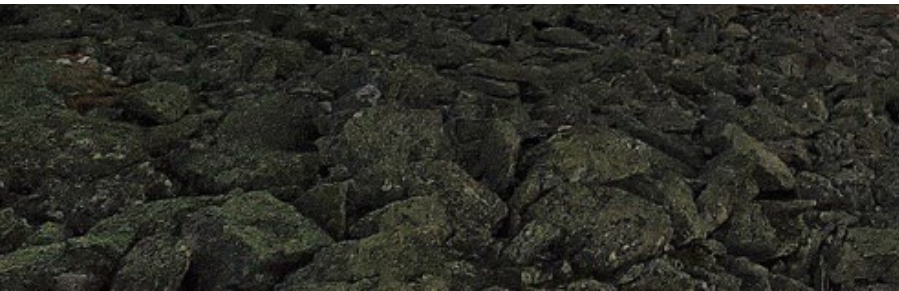
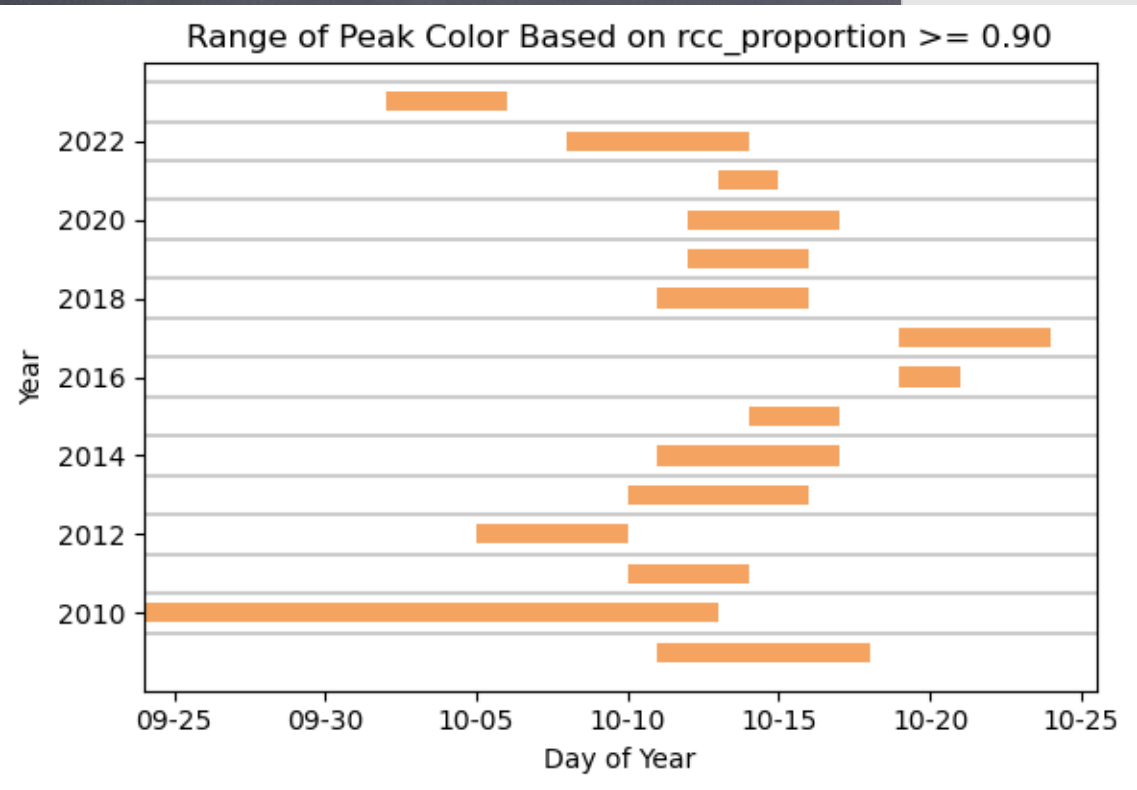


# Results

## What else can we learn using data from the PhenoCam Network?

### Acquiring a range of peak foliage

- Here, when the proportion of RCC was greater than or equal to 0.90 was used to pull the “range”
  - Other thresholds could be used!
- This method gave a wide range year to year and of varying lengths
- Subjectivity: this is a quantitative measure of how long peak lasts, but this will vary from person to person
- Overall: interesting technique to play with in the future and to which to compare data from future years



# Conclusions

## To Recap:

- Anthocyanins have properties that can aid in the nutrient resorption of a tree and protect against light damage
- Using a 10% threshold for GCC to determine the date of peak coloration is too low (especially when not doing a curve fit)
- RCC is a better indicator of fall foliage
- This led to many ideas...



# Future Work

## ANTHOCYANINS:

- **Measuring anthocyanins directly rather than assumption that RCC is close enough**
- More exploration with drought and other meteorological factors
- **Which of their aforementioned roles is most dominant? A combination?**
- **Sugars as an indicator for anthocyanin production (Schaberg et al. 2003)**

## PHENOCAM NETWORK DATA AND RCC:

- More phenocams near Mount Washington
  - Auto road, base, cog railway
- RCC data with a curve fit – more accuracy?
- Range of peak coloration – test different thresholds
- Compare near-surface observations to satellite remote sensing – verify and improve satellite data
- Look at more sites!





# Acknowledgements



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**Thank You!**

# References

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