# Internship Project: Interpreting Canopy Phenology using an Automatic Image Analysis Algorithm to Process Phenocam Images

Stephanie Cortés (Senior, Universidad de los Andes)

Co-Author: Kevin Sacca (Junior, Rochester Institute of Technology)

Mentors: Michael SanClements, Sarah Elmendorf (NEON)



#### Introduction

Phenology is the study of the timing in plant and animal life cycle events, which are mostly related to climate and weather (Schwartz 2003)<sup>1</sup>. The study of plant phenology in relation to global warming and increases in greenhouse gases can give information on the fluctuations of plant phenology due to climate change.

NEON will collect data for 30 years at 60 terrestrial sites in different ecosystems, and this requires automatized and standardized methods to gather reliable data. For this project, an automated algorithm was designed to quantify phenology in different ecosystems.

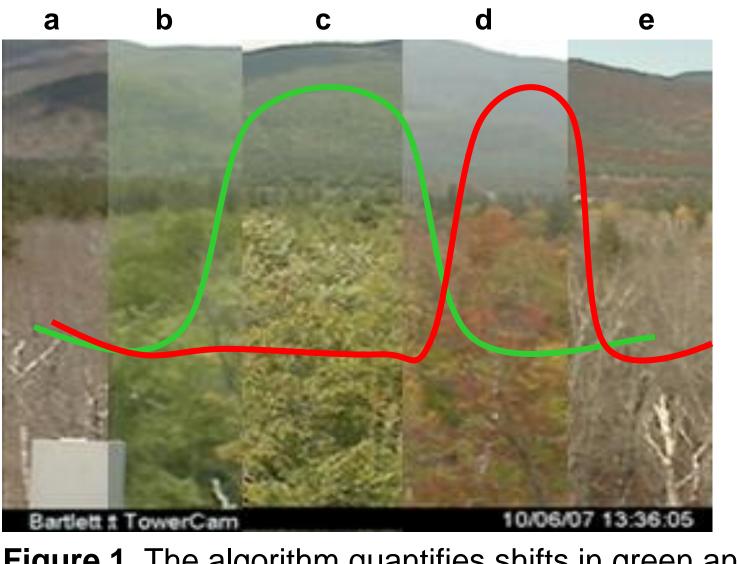
a. Winter

**b.** Spring

c. Summer

d. Early fall

e. Late Fall



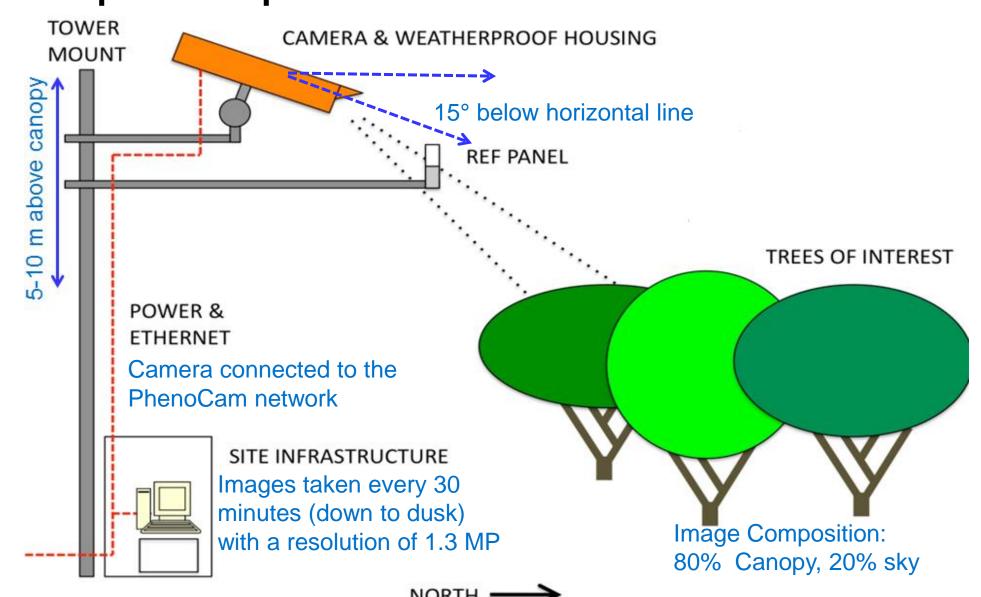
**Figure 1**. The algorithm quantifies shifts in green and red from digital images . \*

### The PhenoCam Network

The PhenoCam Network is a cooperative network that archives and distributes imagery and derived data products from digital Stardot cameras located at different research sites around the world and North America. This network archives image time series of vegetation that can be analyzed with the PhenoCam Software Tools (<a href="http://phenocam.sr.unh.edu/">http://phenocam.sr.unh.edu/</a>). NEON will use PhenoCam network protocols and install Stardot cameras in 60 terrestrial sites.

#### **Setup and Requirements**

Figure 2. Depiction of camera setup.



Contact Information: sp.cortes1026@uniandes.edu.co

www.neoninc.org

#### **Modifications for NEON**

The algorithm followed the PhenoCam Network tools by:

- Applying the suggested dark threshold (15%)
- Calculating the 90th quantile and averaging consecutive images.
- Plotting the 90th quantile vs. day of the year.
- Calculating the day of the year with the image name.

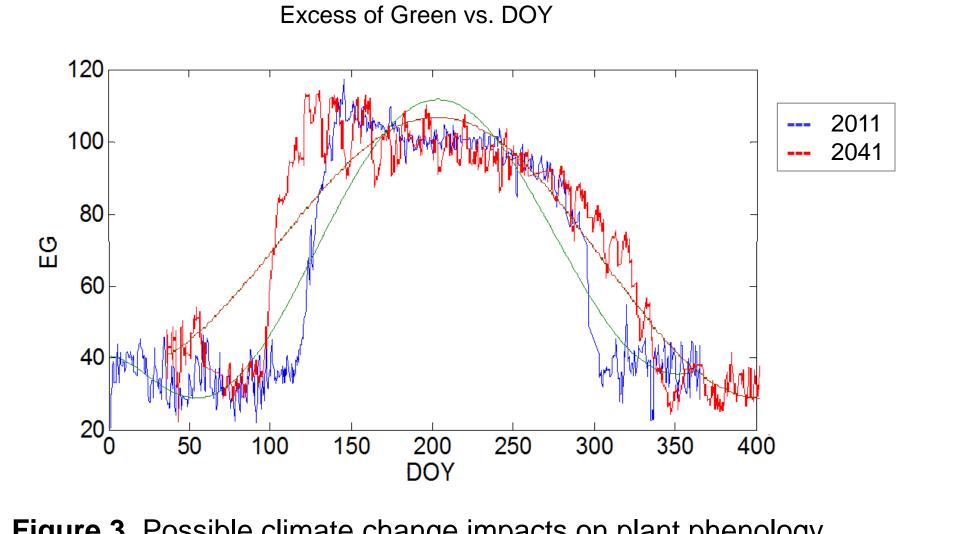
The algorithm was modified to be automated and standardized:

- Region of interest is fixed and a grid is used for having detailed phenology information per subarea.
- Calculation options are fixed: dark threshold and number of consecutive images to average
- 6 Phenology metrics were calculated: green chromatic coordinate (G/[G+R+B]), red chromatic coordinate (R/[G+R+B]), normalized difference ratio ([G-R]/[G+R]), simple band ratio (G/R), excess of green (2G-R-B), and excess of red (2R-G-B).
- Algorithm calculates the DOY when the maximum, minimum and inflection points occur.

#### **Algorithm Flowchart** Time series images from Last **PhenoCam** image? **Graphs and Dataset** readout per Calculate day of the subarea of the year (DOY) with the grid with curve fit Read image **Crop vegetatio** Calculate 90th Calculate Split cropped inflection points quantile of area in color in the graph 3 consecutive channels: R, subarea on grid G,and B Create a grid on Plot 90<sup>th</sup> Perform dark the cropped area naximum points in the graph threshold of 15%

#### Determining Phenology Changes in the Long Term

Phenology metrics plots will be calculated for every year during the 30 years of NEON's data gathering. By having a standardized algorithm, plots will be comparable between different years and sites, so changes in phenology can be measured.



**Figure 3**. Possible climate change impacts on plant phenology. Climate change could cause an earlier spring and a later autumn.

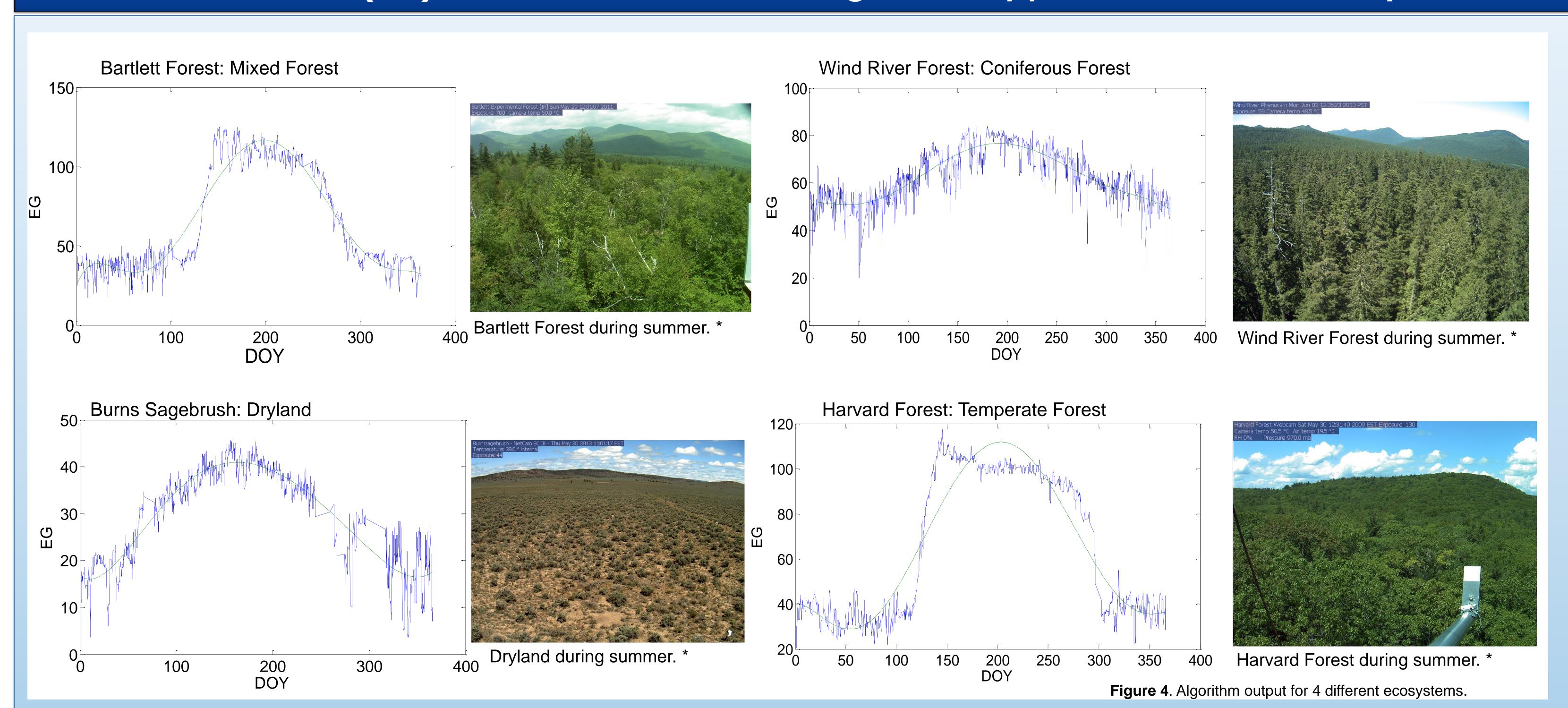
## Excess of Green (EG) vs. DOY: Results of the Algorithm Applied to Different Ecosystems

Calculate 6

Curve fitting to a

6 degree

polynomial



The algorithm is standardized and automated to different ecosystems:

The figure shows the result plot with the 6 degree polynomial fit for four of the ecosystems tested. The results show a clear shift in the EG phenology metric (EG=2G-B-R) during spring and summer, even though all of these ecosystems have different vegetation. These clear shifts show that the algorithm does not need changes depending on the ecosystem and that it can be standardized and automated for the 60 terrestrial NEON sites.

<sup>1</sup> Schwartz MD (2003) Phenology: an integrative environmental science. Kluwer, Dordrecht. \* Images taken from the PhenoCam Network (http://phenocam.sr.unh.edu/).

