

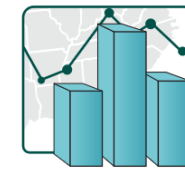
Predicting the spotted lanternfly dispersal in the United States



Lawrence Barringer, Pennsylvania Department of Agriculture, Bugwood.org

**Yu Takeuchi, Chris Jones, Anna Petrasova, Vaclac Petras,
Helena Mitasova, Ross Menntemeyer**
NC State University, Center for Integrated Pest Management
NC State University, Center for Geospatial Analytics

Outline



SAFARIS

Spatial Analytic Framework for Advanced Risk Information Systems

- **Spatial Analytic Framework for Advanced Risk Information Systems**
- **Development of a stochastic spread model**
- **Case study on spotted lanternfly**
- **Summary**

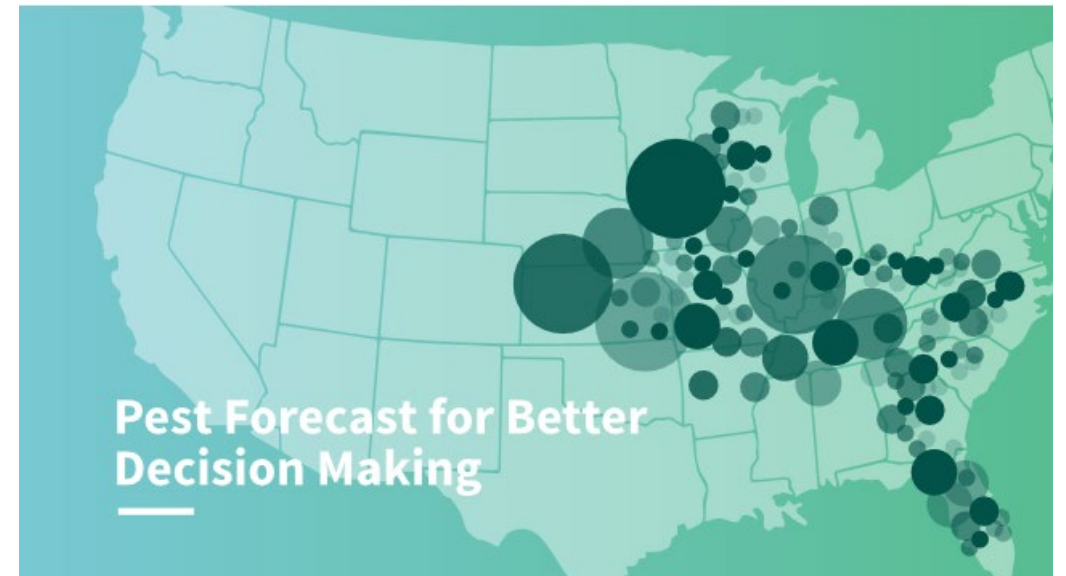




SAFARIS

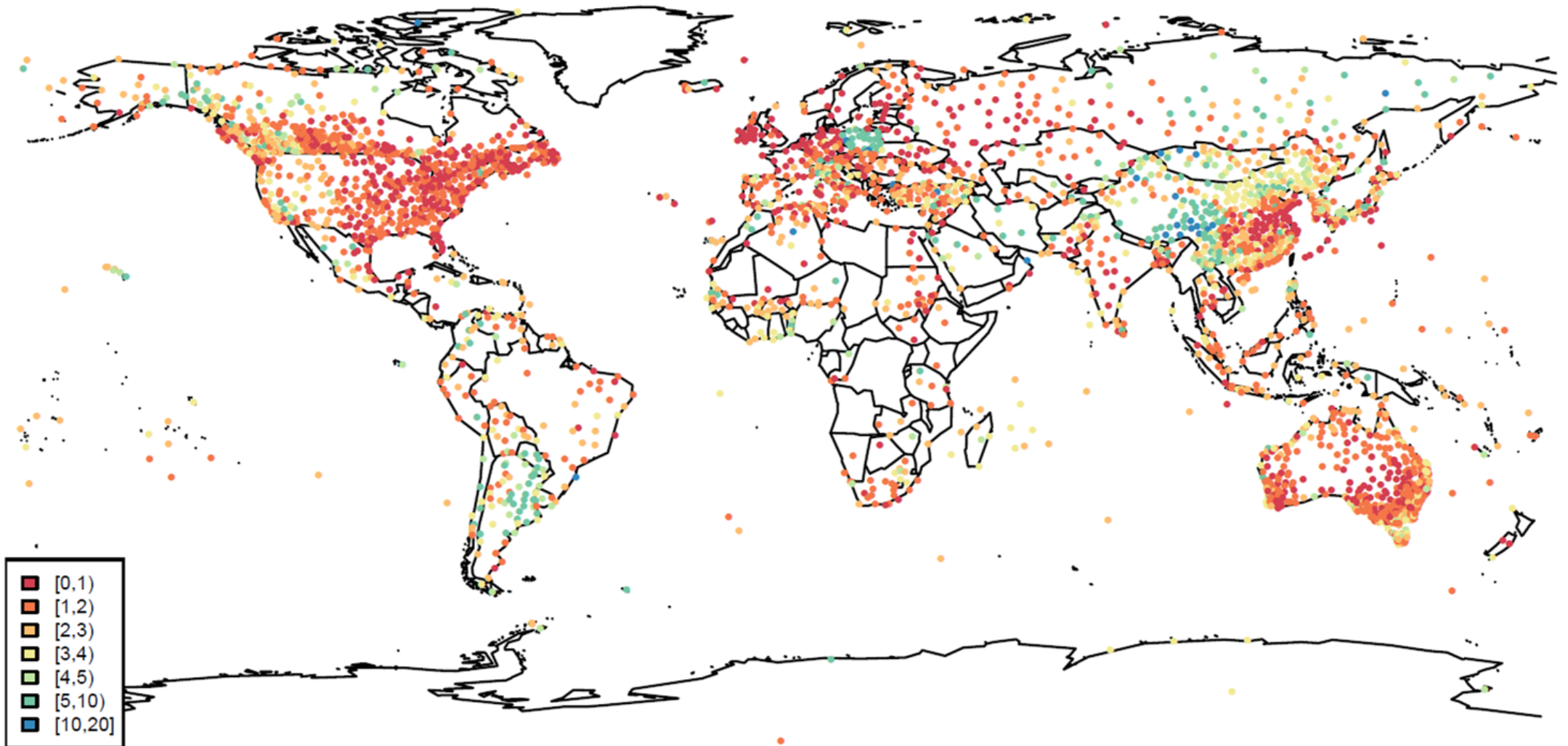
Spatial Analytic Framework for Advanced Risk Information Systems

- **Funded by USDA APHIS PPQ Science & Technology**
- **SAFARIS is a framework that can rapidly integrate new data, models, and tools to support PPQ's mapping needs.**
- **Why framework?**
 - Data gathering and processing
 - Multiple models and tools
 - Multiple pests
 - Easier to collaborate





RMSE (°C) by Station: CFSR Max Temp from Month 1



SAFARIS Wind Rose Web Tool

Data is between **January 1st, 1980** and **December 31st, 2018**

Select A Windrose Timeline

Monthly Daily

Enter a Start Date:

01 / 01 / 1980

Enter a End Date:

12 / 31 / 2018

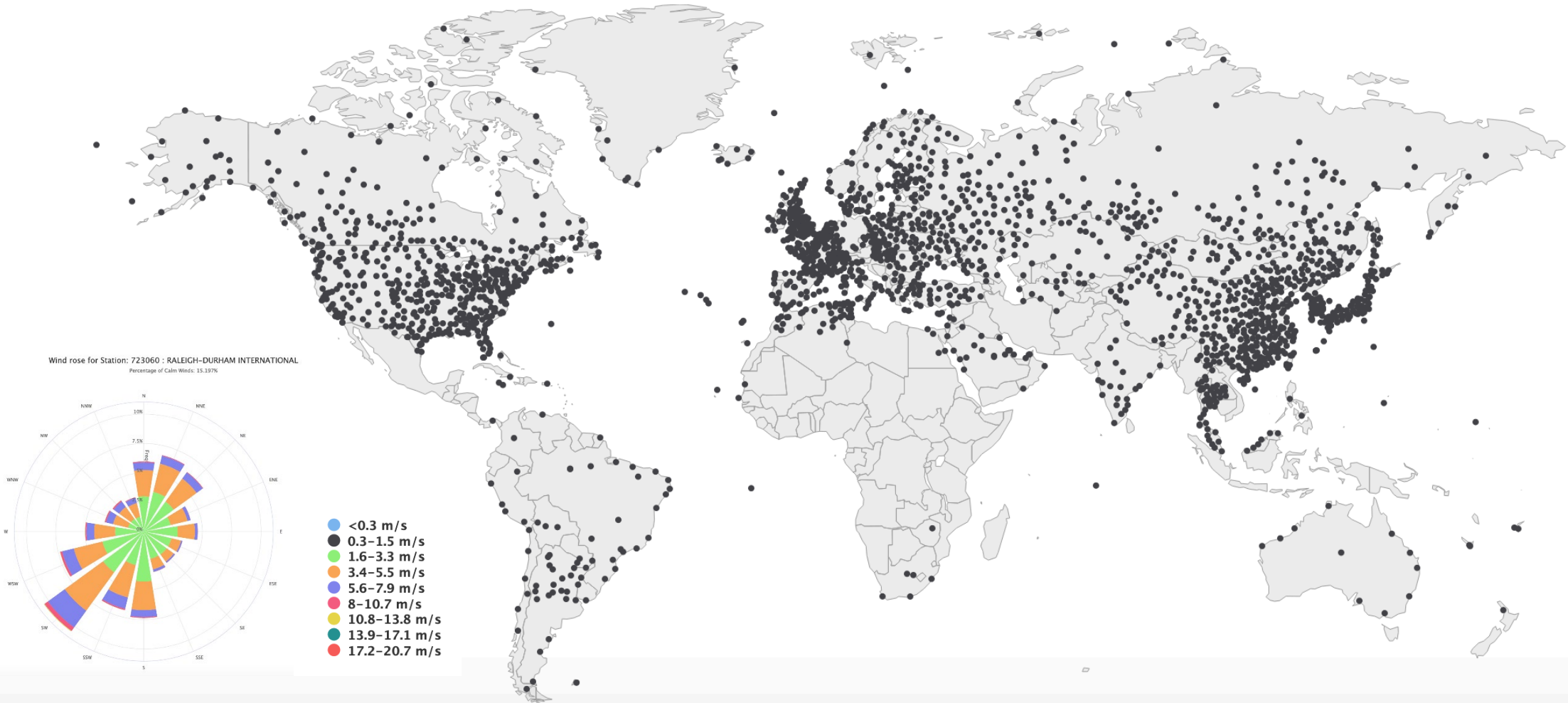
Enter a Station or Select from the map:

723060

Climatology

Global SAFARIS Stations

Select a Station to generate the Wind Rose



Maximum Temperature

Grid Cell (38.59375, -121.46875)

Emissions continue to rise strongly through 2050 and plateau around 2100 (RCP 8.5)

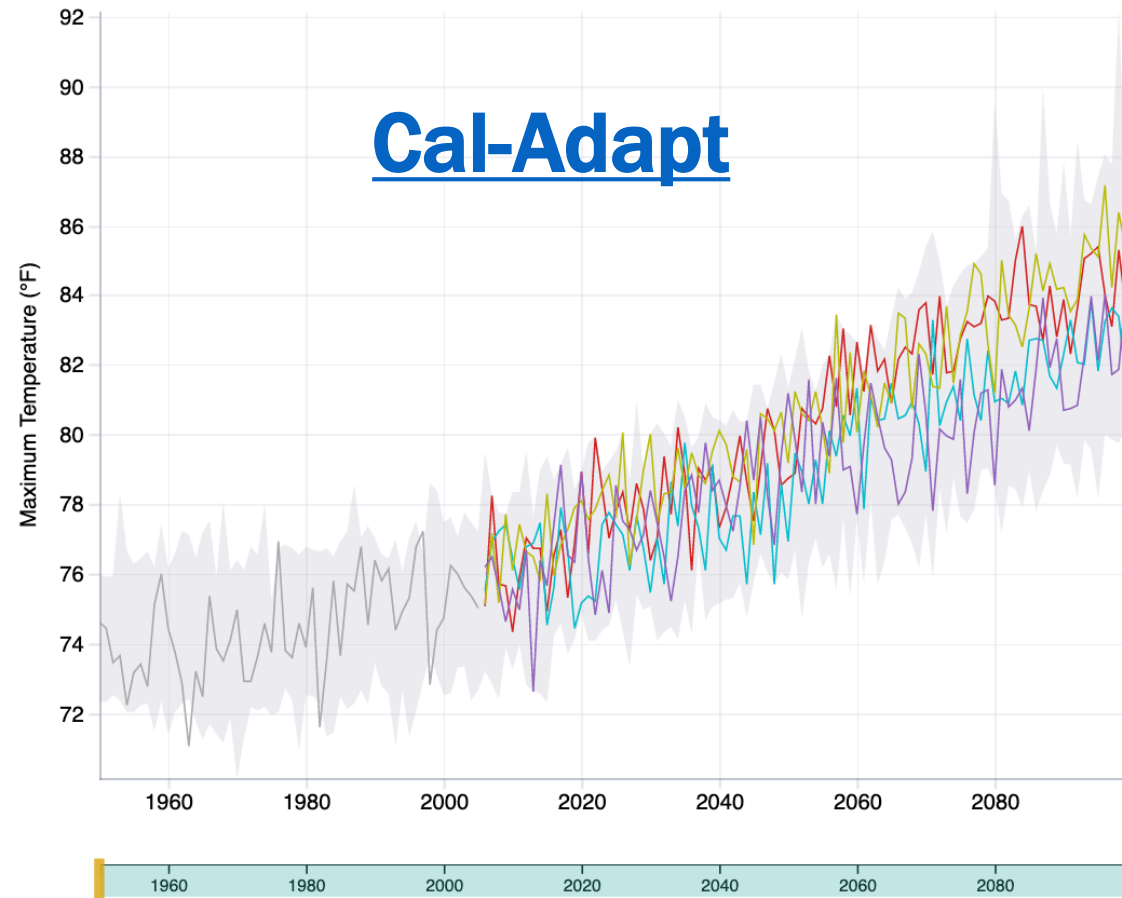
Range of annual average values from all 32 LOCA downscaled climate models

Modeled Data (2006–2099)

- HadGEM2-ES
- CNRM-CM5
- CanESM2
- MIROC5

■ Modeled Variability Envelope

— Observed Data (1950–2005)



SCENARIOS

RCP 4.5

Emissions peak around 2040, then decline

RCP 8.5

Emissions continue to rise strongly through 2050 and plateau around 2100

QUICK STATS

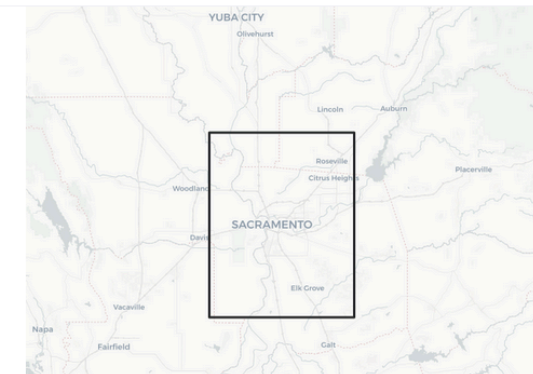
Historical Annual Mean for 1961–1990

74.2°F Observed

Modeled Projected Annual Mean for 2070–2099

82.7°F

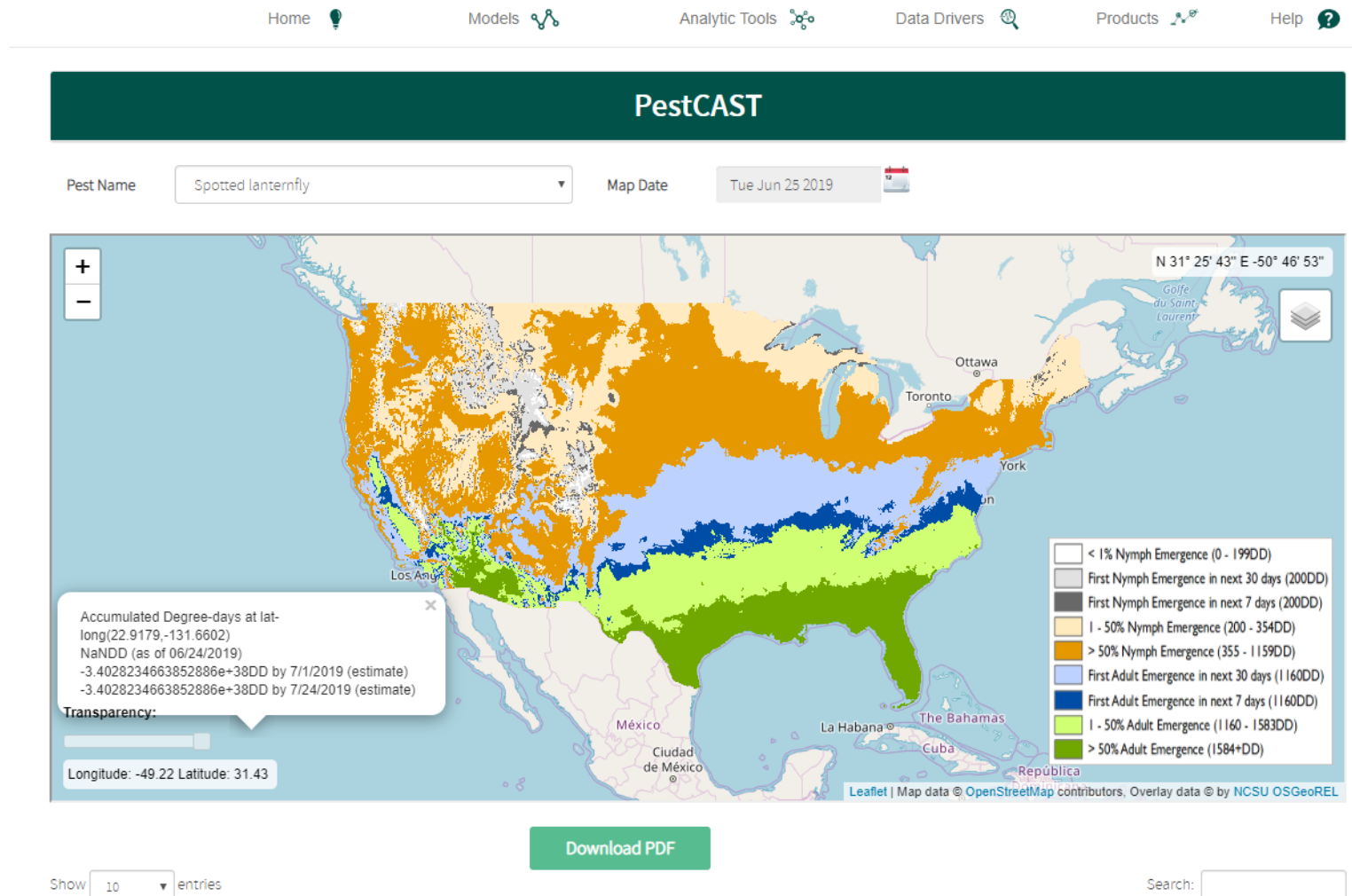
[Change Location](#)



PestCAST: Near-Real Time Phenology and 30 Day Forecasts

[Login/SignUp](#)

- Connected to NOAA and other databases
- 7 day weather forecasts
- 20-year of historical data
- Web-based tool



Plant Hardiness Zones

Global Plant Hardiness Zones

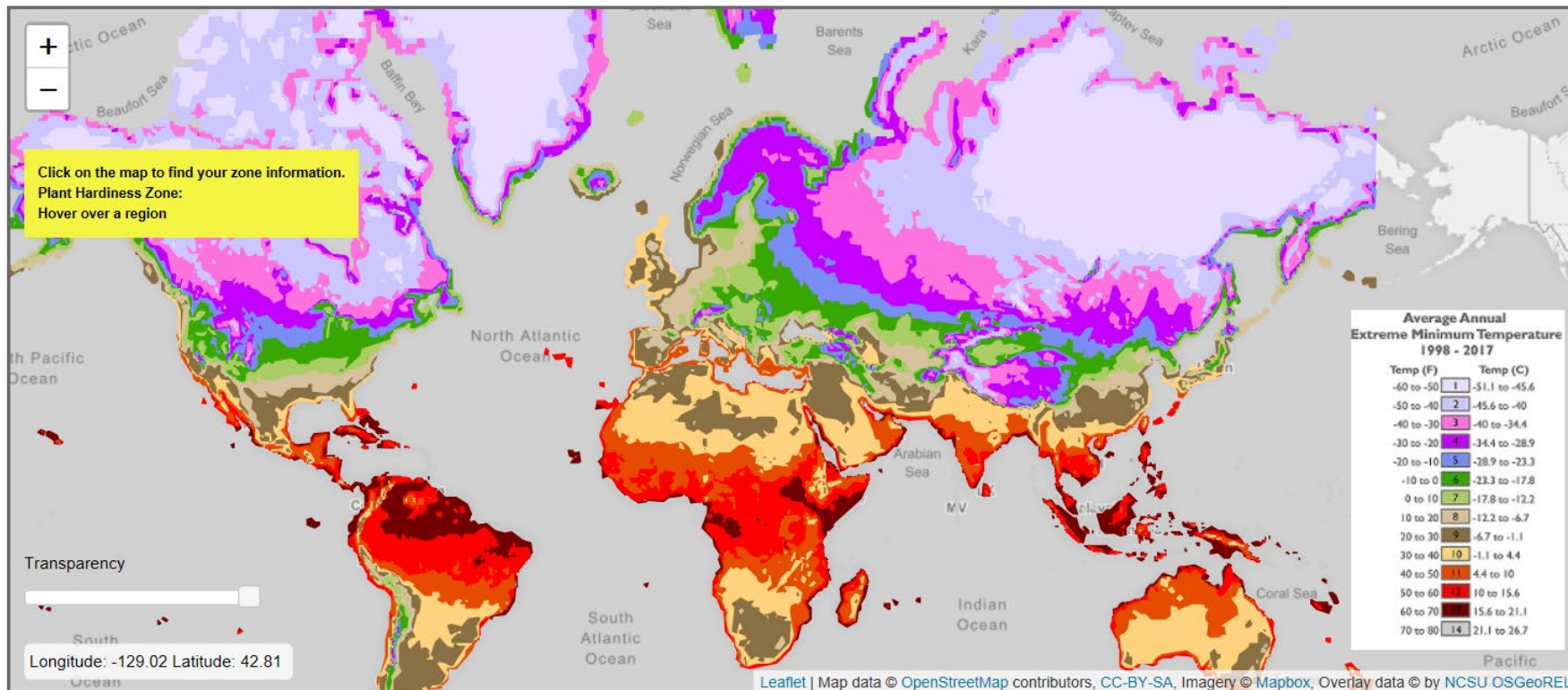
[Global PHZ Methodology Document](#)

[Global PHZ File Download](#)

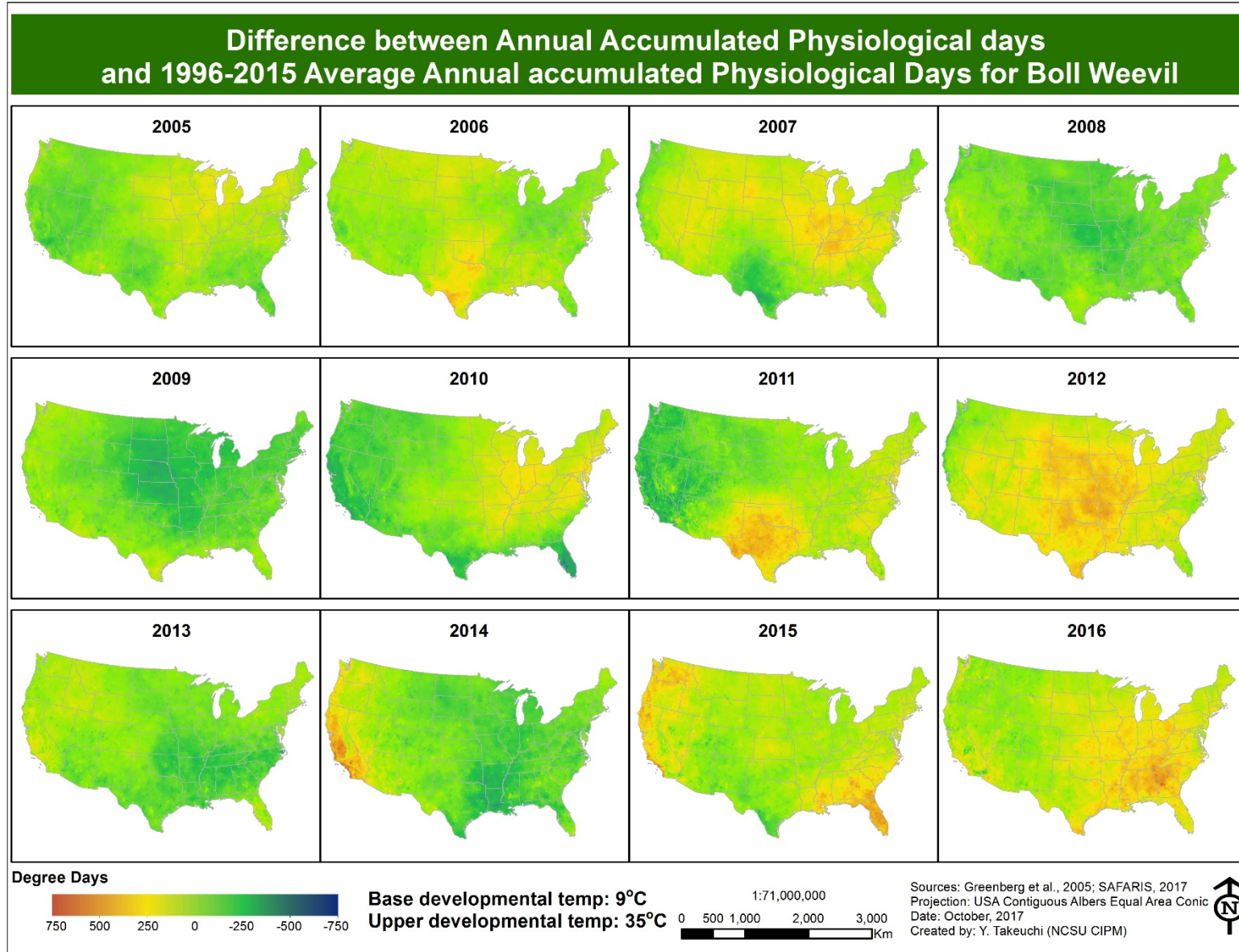
Year Range:

Map Options

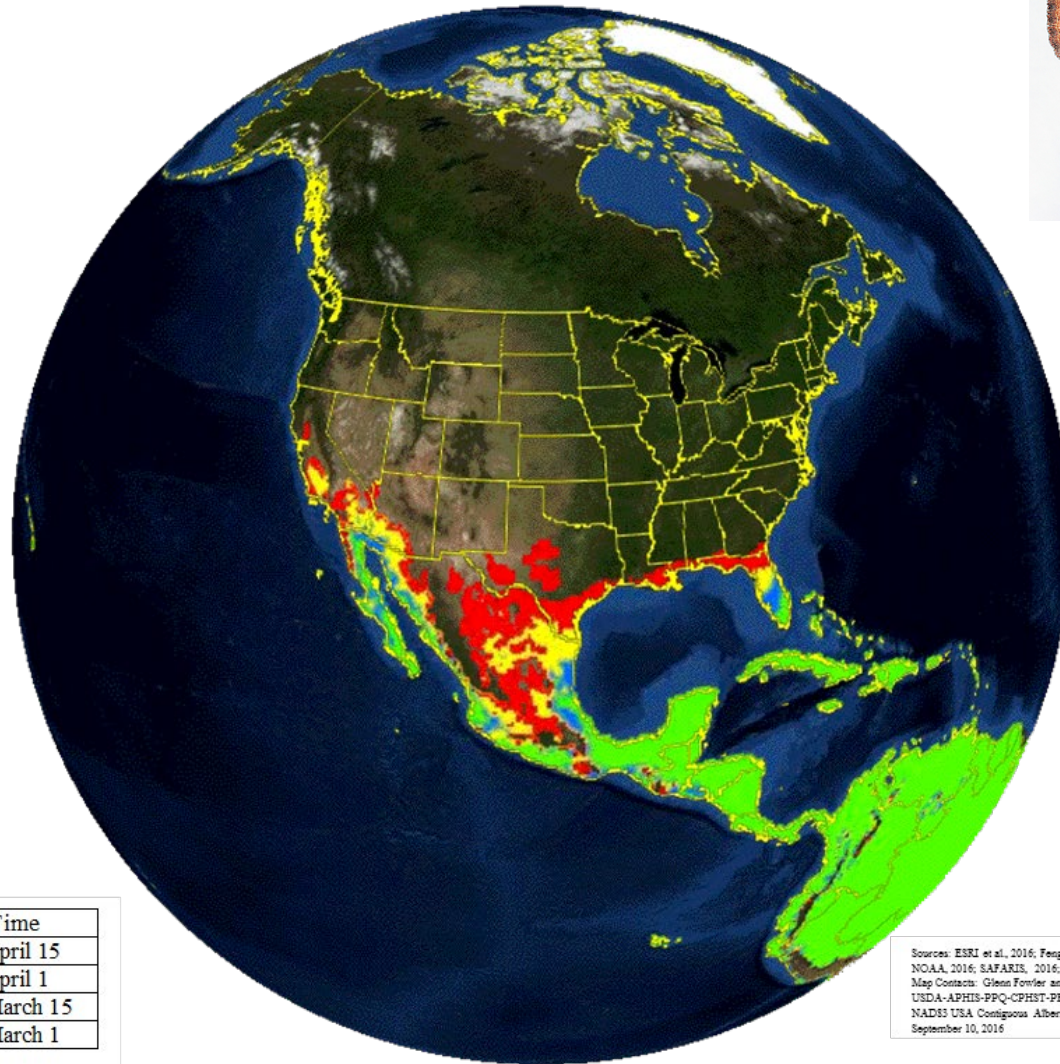
- Tier I**: PHZs are assigned on a scale from 1 to 14 in incremental 10°F thermal bands ranging from -60°F to 80°F.
- Tier II**: PHZs are assigned on a scale from 1a to 14b in incremental 5°F thermal bands ranging from -60°F to 80°F.



Annual Weather Variability



Predicted *Helicoverpa armigera*: Flight Times March 1 to April 15



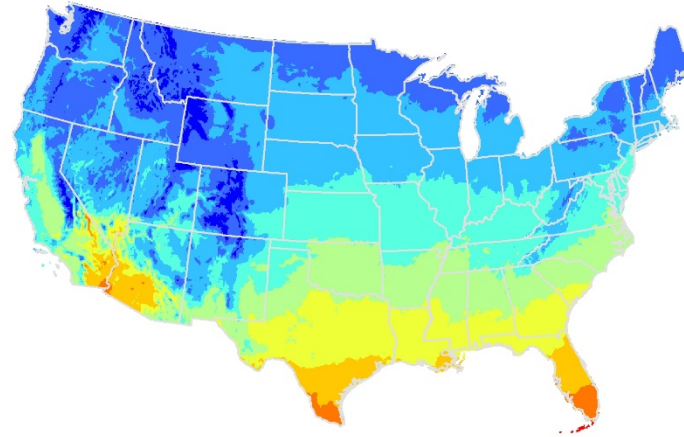
Flight Time	
Red	April 15
Yellow	April 1
Blue	March 15
Green	March 1

Sources: ESRJ et al., 2016; Feng et al., 2010;
NOAA, 2016; SAFARIS, 2016; TopoWYX, 2016
Map Contacts: Glenn Forrier and Yo Tabeuchi
USDA-APHIS-PPQ-CPHST-PERAL-NCISU-CIPM
NADES USA Contiguous Albers Equal Area Conic
September 10, 2016

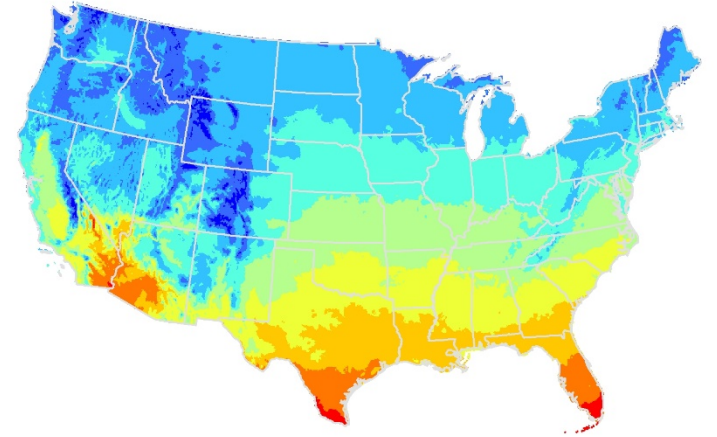
Long-term Forecast: Oriental Fruit Fly

- 20 MACA downscaled GCMs
- RCP 8.5
- Southern US is expected to have 2-3 more generations in the future

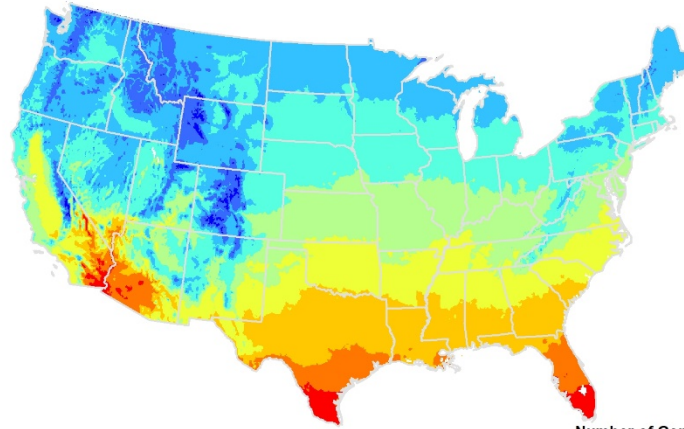
A: Historical (1998-2017)



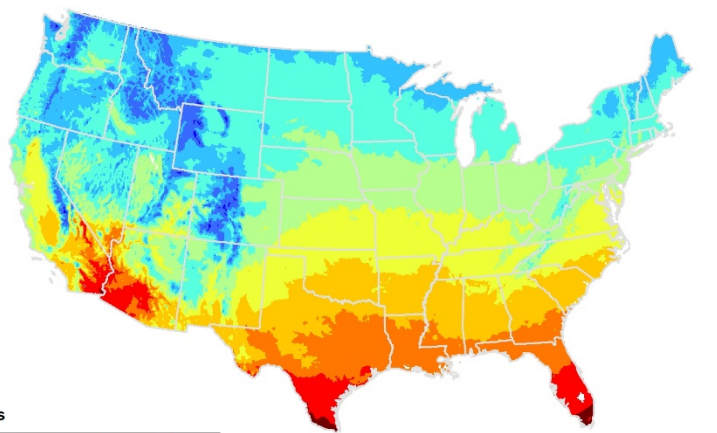
B: 2021-2040



C: 2041-2060

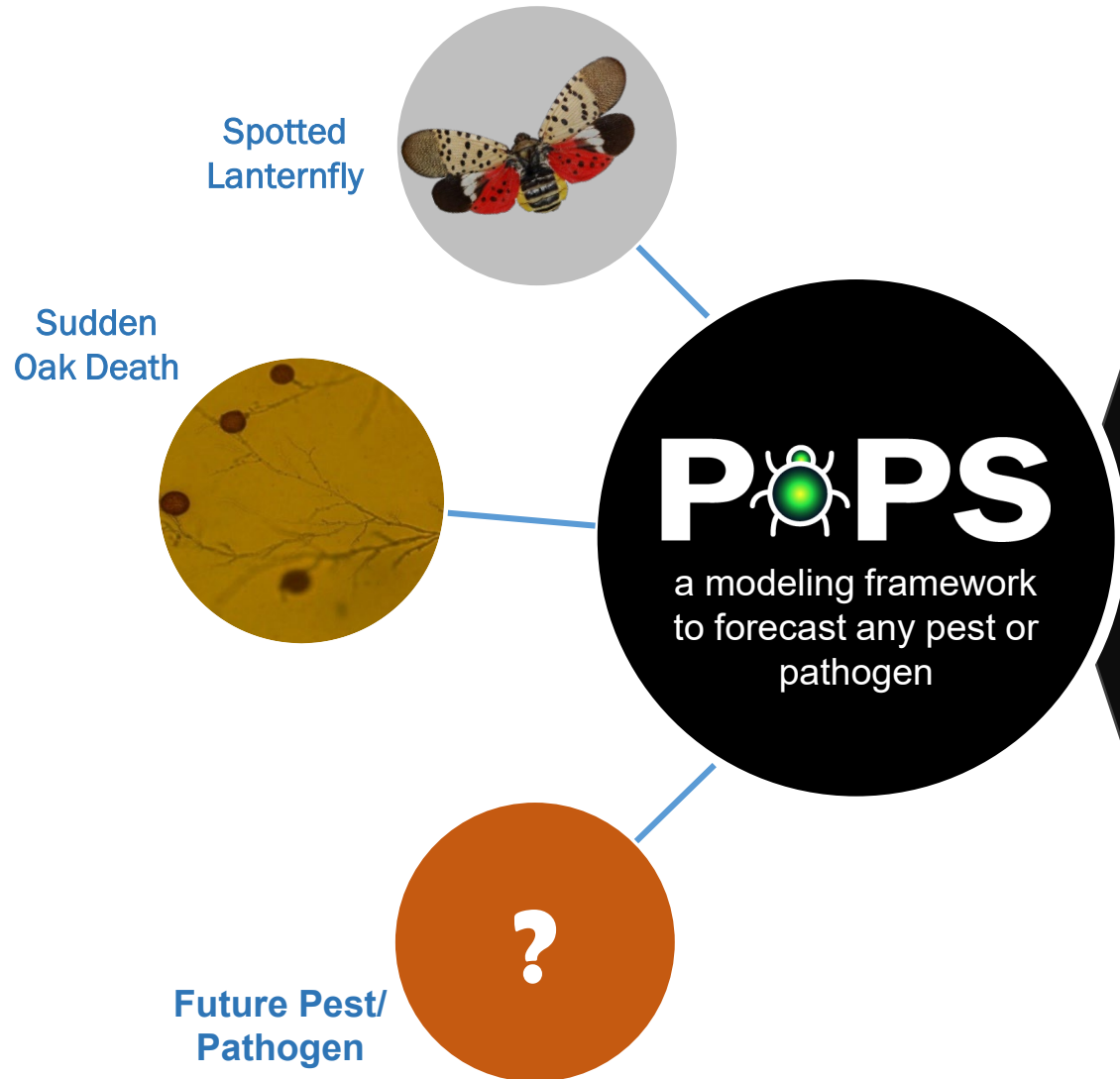


D: 2061-2080



Development of a stochastic spread model

Model that could generalize to multiple pests/pathogens



The **POPS** tool suite includes:



Data prep



Calibration



Validation



Interactive Interface
(In Development)



Installation instructions at popsmodel.org

Model

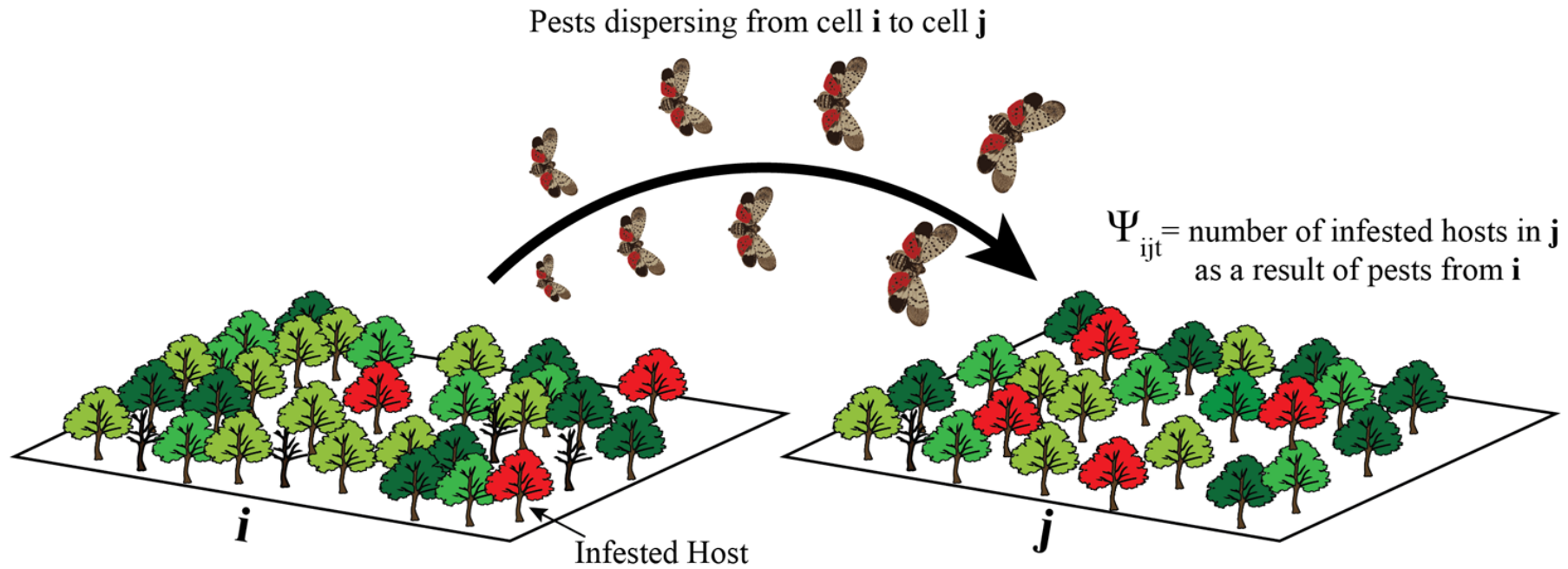
Number of pests moving from one location to another

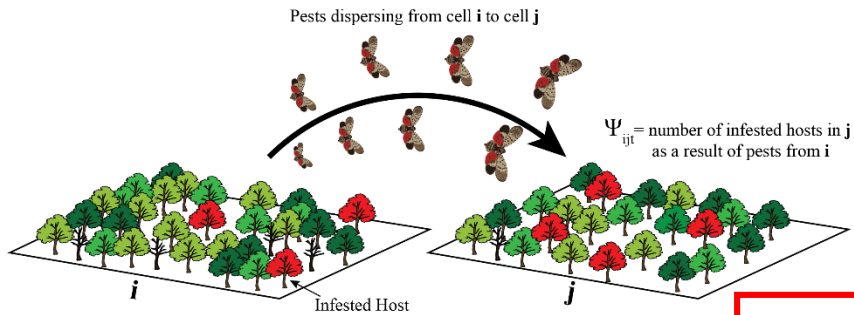
Reproduction

Dispersal

Survival

$$\Psi_{ijt} = \beta(X_{it}P_{it}T_{it}I_{it}) * K(d_{ij}; \alpha_1, \alpha_2, \gamma) / d_{ij} * (X_{jt}P_{jt}T_{jt}S_{jt} / N_j)$$

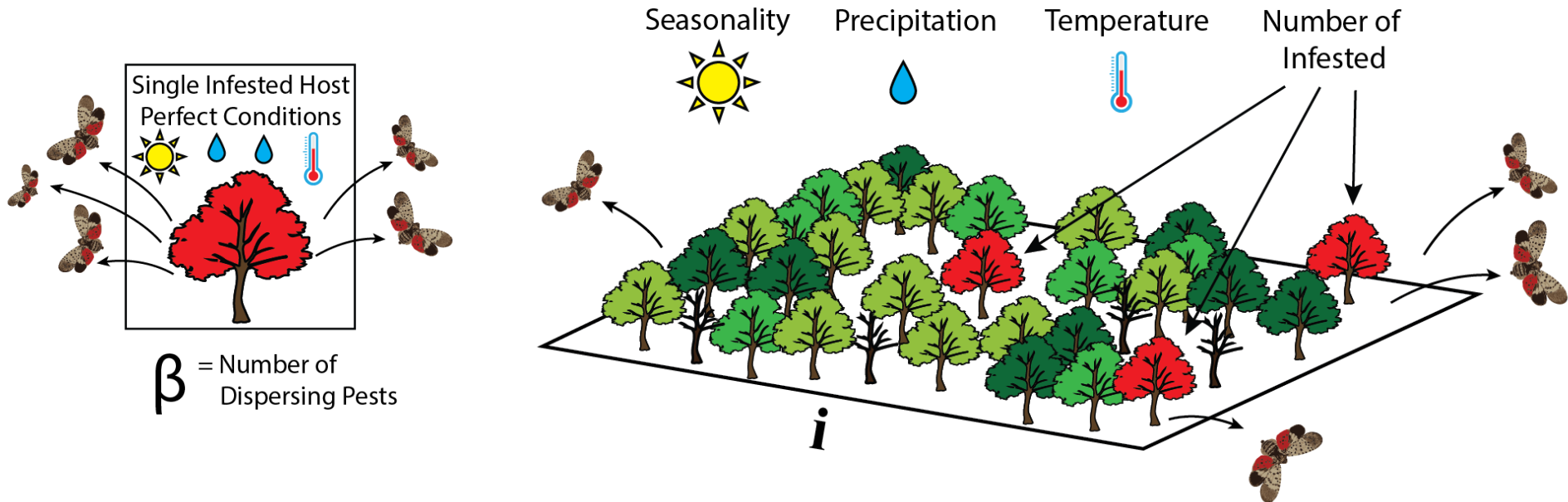


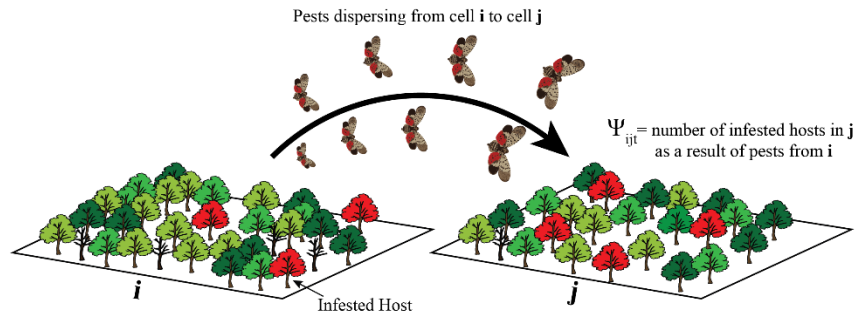


How many hosts in cell j are infested as a result of pests from cell i ?

$$\Psi_{ijt} = \beta(X_{it} P_{it} T_{it} I_{it}) * K(d_{ij}; \alpha_1, \alpha_2, \gamma) / d_{ij} * (X_{jt} P_{jt} T_{jt} S_{jt} / N_j)$$

Reproduction
Dispersal
Survival

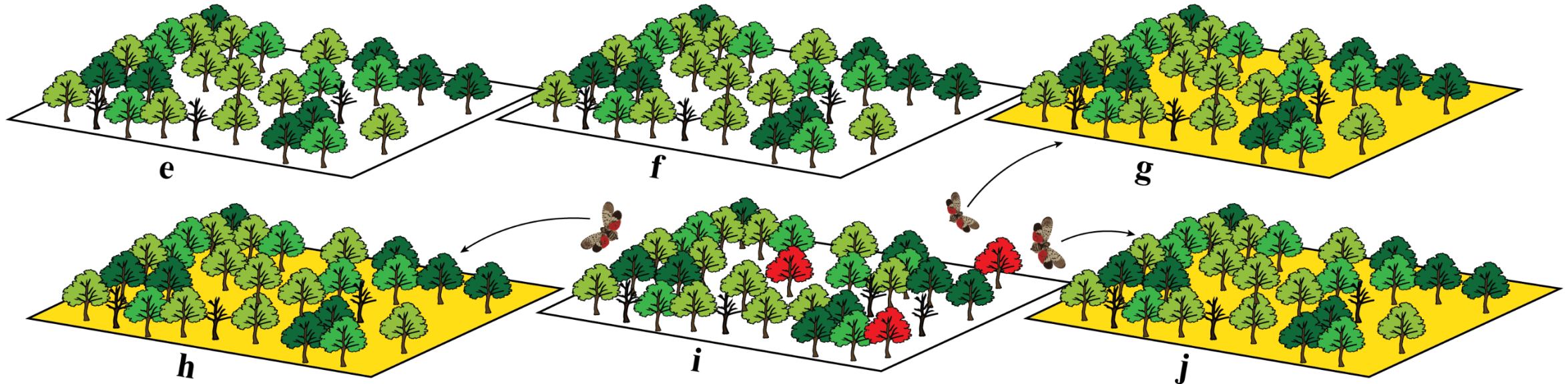


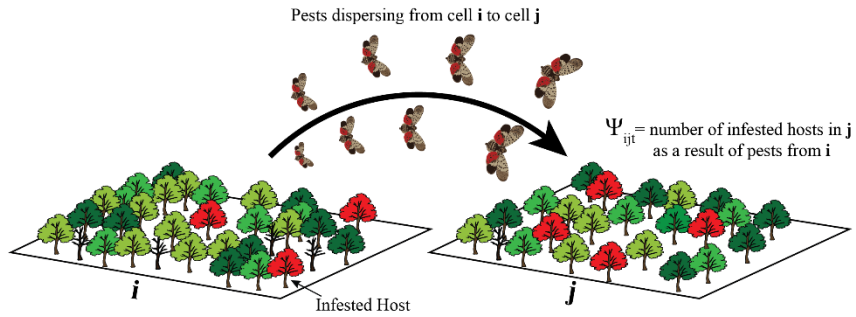


How many hosts in cell *j* are infested as a result of pests from cell *i*?

$$\Psi_{ijt} = \beta(X_{it} P_{it} T_{it} I_{it}) * K(d_{ij}; \alpha_1, \alpha_2, \gamma) / d_{ij} * (X_{jt} P_{jt} T_{jt} S_{jt} / N_j)$$

Reproduction
Dispersal
Survival

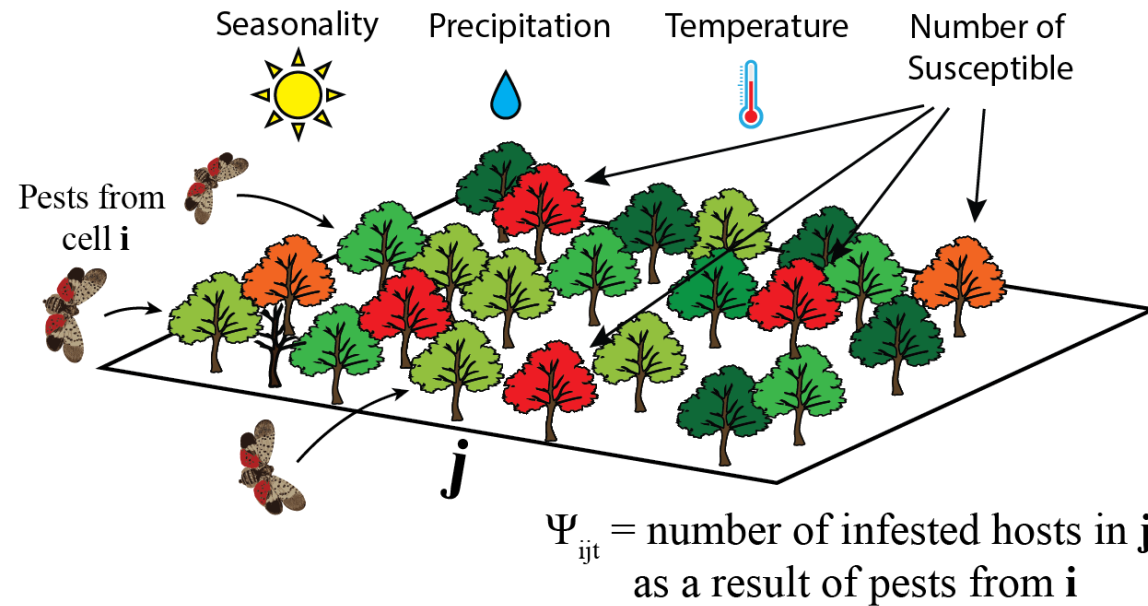




How many hosts in cell j are infested as a result of pests from cell i?

$$\Psi_{ijt} = \beta(X_{it}P_{it}T_{it}I_{it}) * K(d_{ij}; \alpha_1, \alpha_2, \gamma) / d_{ij} * (X_{jt}P_{jt}T_{jt}S_{jt}/N_j)$$

Reproduction
Dispersal
Survival





Spotted Lanternfly in Pennsylvania:

- Native range: China, Vietnam, India
- Discovered in PA in 2014
- 16 counties quarantined
- Has also been found in New Jersey, Delaware, Virginia, and Maryland.



Sucks the sap out of branches and stems!

Management effort by:



pennsylvania
DEPARTMENT OF AGRICULTURE

PoPS Dashboard

Parameter settings

- Years for model calibration
- Years for the model forecast
- Host information
- Weather data inputs
- Temperature requirements for SLF growth

POPS Pest or Pathogen Spread Model About ▾ Explore My PoPS ▾ chr

Review Case Study

Please carefully review your case study. If everything is correct, click "Calibrate" to calibrate and validate the case study. If you find any mistakes, click "Edit" to edit the case study.

Note: Calibration and validation can take many hours. You may check on the progress of your case study on your Account page. If you have any questions, be sure to read the [Case Study Help](#) page.

Edit Calibrate

Spotted Lanternfly in PA

Description: Examine the management of spotted lanternfly in PA and surrounding states.

Name:	Spotted Lanternfly in PA
Number of pests:	1
Number of hosts:	1
First calibration year:	2015
Final calibration year:	2016
Final model year:	2023
Time step:	month
PEST 1:	Spotted Lanternfly
Model type:	SI
Dispersal type:	CAUCHY
HOST 1:	Tree of heaven
Score:	1.00

Mortality
 Vector
 Prior treatments

Weather details:

Wind

Seasonality (May - November)

Lethal temperature (January, -12.87 °C, Cold)

Temperature (Method: Reclass)

Precipitation

Temperature reclass

Note: Any values not specified in the reclass table will be reclassified to zero (shown in red in the figure below).

Min (°C)	Max (°C)	Reclass
-50.00	-13.00	0.00
-13.00	-10.67	0.10
-10.67	-8.34	0.20



Edit Calibrate

Uploaded files:

Infestation data:	initial_infection.tif
All plant data:	all_plants.tif
Host 1 data:	host.tif

Run name:

Hide Details

Run PoPS Model

-
-
-
-
-

Field observations

Number of detections (per km²):
0 5+

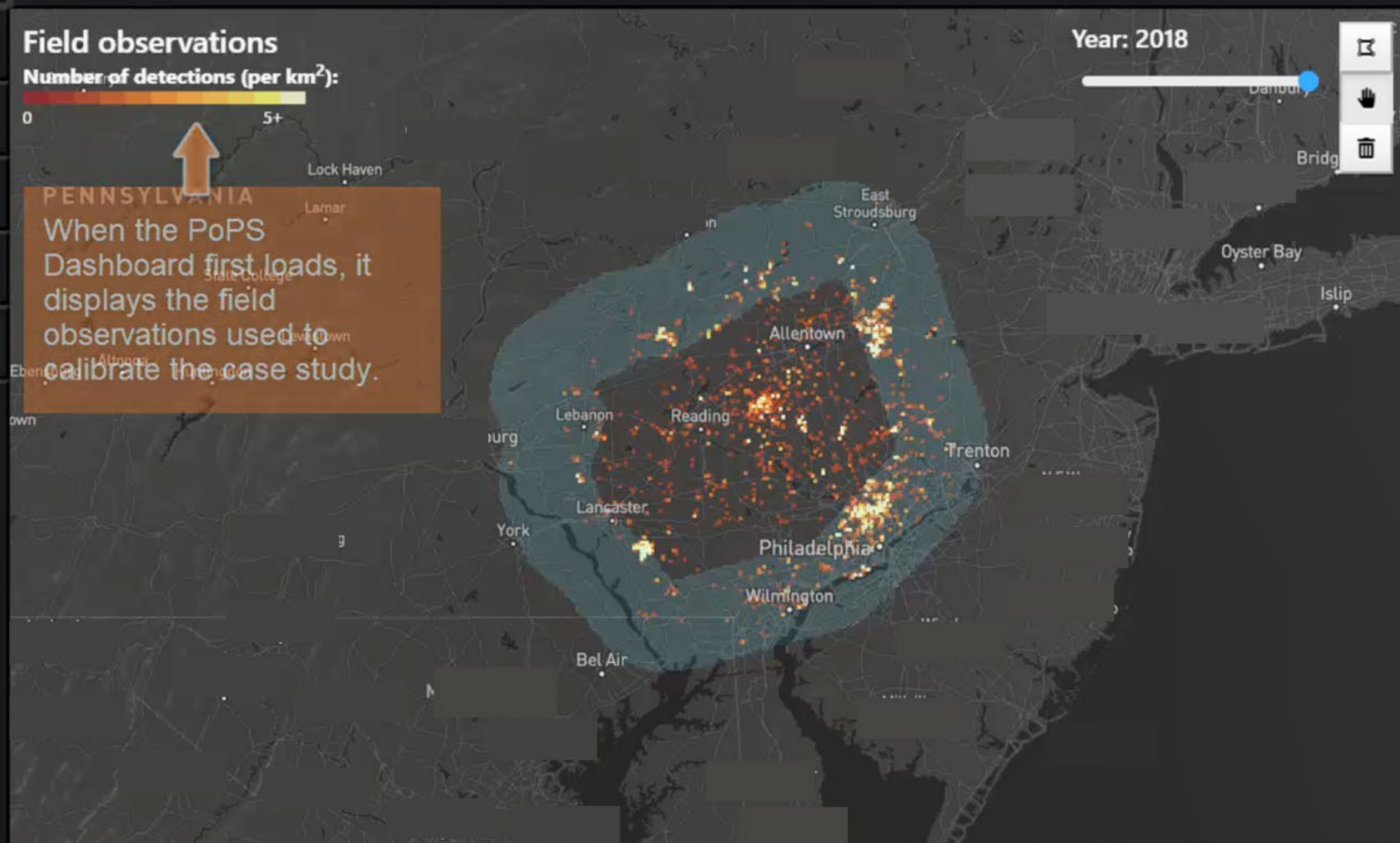
↑

PENNSYLVANIA

When the PoPS Dashboard first loads, it displays the field observations used to calibrate the case study.

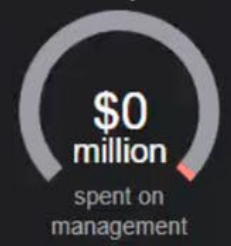
Year: 2018

-
-
-



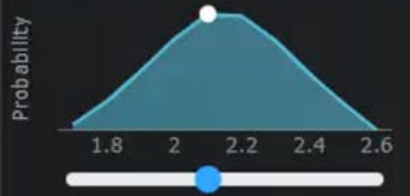
Parameters

Management:
Use the polygon tool to draw management areas.

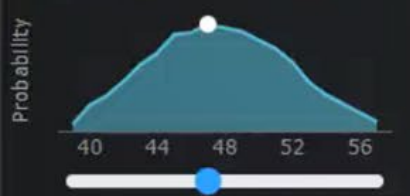


Efficacy: 100%

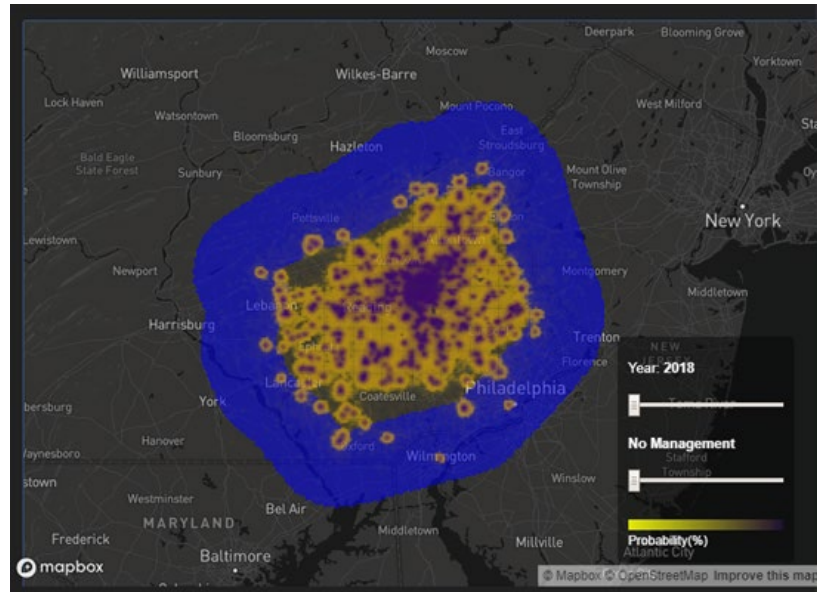
Max number of dispersers: 2.1



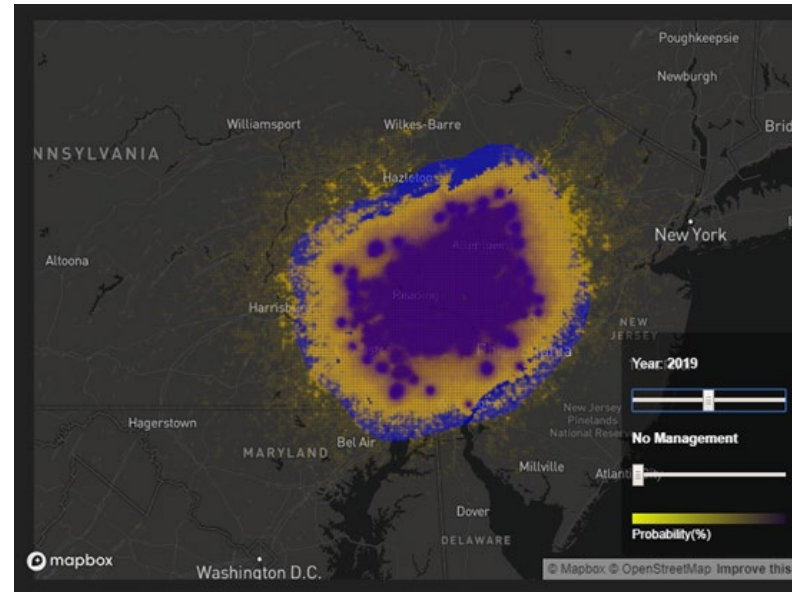
Dispersal scale: 47 meters



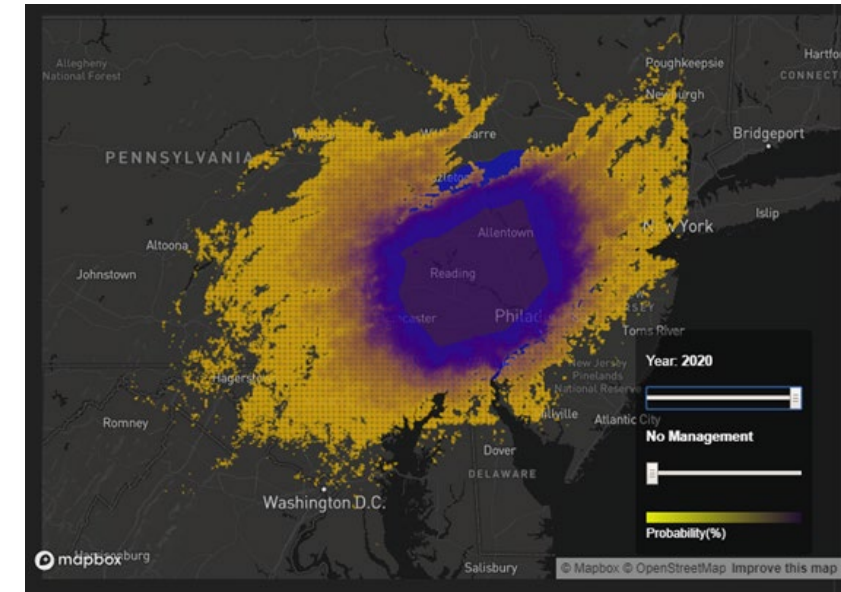
Spread Predictions



Prediction for 2018



Prediction for 2019



Prediction for 2020

Tangible Landscape

<https://tangible-landscape.github.io/index.html>

- Tangible freeform modeling
- Visualization
- Real-time geospatial analytics
- Participatory research



- 3D Topographic background (optional)
- Grass GIS & R
- Felt represents treatment







PoPS – Tangible Landscape

- **Real time simulation to forecast pest spread by implementing management strategies proposed on the Tangible Landscape**
- **Calculates economic damages and management costs**
- **Visualizes effectiveness of proposed management scenarios instantly**
- **We want to use forecasted weather data for the prediction instead of averaged weather data**
- **Making update on the dashboard to easily compare different scenarios**

Summary and Conclusions

- **The main objective SAFARIS is to create a framework to meet PPQ's predictive mapping and modeling needs with regard to informing surveys, operations and policy.**
- **Supporting PPQ's activities by developing new models and tools.**
- **Looking for new ideas to better predict pest activities at global scale in a timely manner.**

Thank You

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