



# **The Effect of Spatial Interpolation on the Hedonic Model: a Case of Forest Pest Damages**

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# Introduction

- ▶ Estimate a hedonic model of the Hemlock Woolly Adelgid (HWA) infestation in central Connecticut and central Massachusetts in the northeastern U.S.
- ▶ Site-specific case studies: Hemlock Woolly Adelgid is shown to diminish property values (Holmes et al., 2006 & 2010).
- ▶ Scale up damage data to the geographic extent of the HWA infestation and then estimate the economic model.

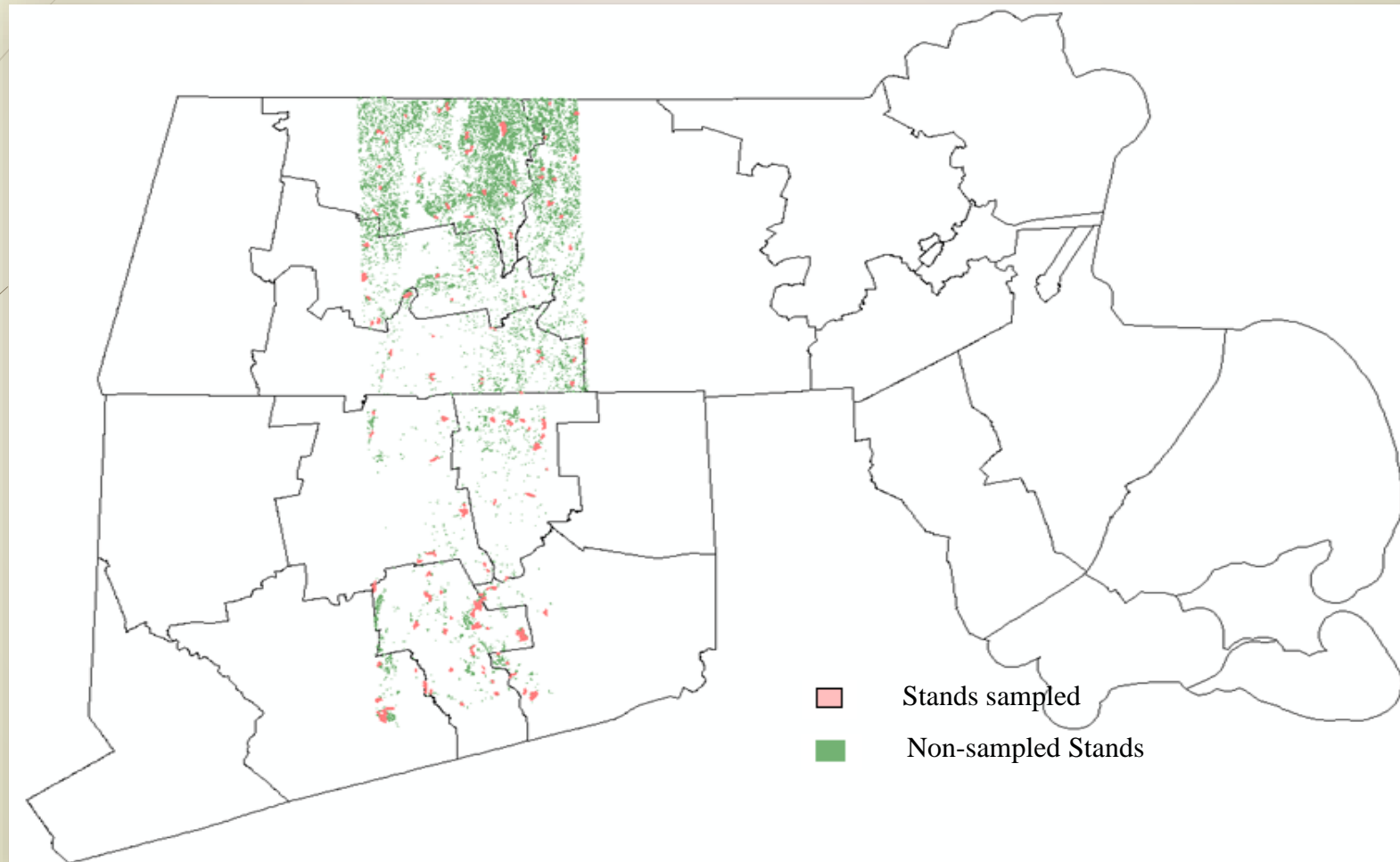


# Motivation



- ▶ **Spatial interpolation** has only seen limited use in economic analyses:
  - air pollution (Beron et al. 2004, Anselin and Gallo 2006, Fernandez-Aviles et al. 2012)
  - water quality (Ara et al., 2006).
- ▶ While air and water pollution may be continuous in dispersal through space, Hemlock trees are clustered in discrete (lumpy) stands.
- ▶ Explore how different spatial interpolation approaches affect the performance of hedonic property value models.

# Hemlock Stands in Study Area





# Data

- ▶ **HWA Damage Data** for 2007, 2009 and 2011
  - Central Connecticut and Central Massachusetts (10 counties)
  - Field survey of 141 hemlock stands
  - Live basal area and Vigor
  
- ▶ **Aerial Photographs:** all hemlock stands (6,127 polygons) – by Harvard Forest
  
- ▶ **Residential Property Data**
  - House attributes and sale prices from DataQuick
  
- ▶ **National Land Cover Data** (2006)
  - Water, open space, high developed district, forest, agricultural land and wetland.

# Spatial Interpolation

## ► Interpolation Variables

- Live basal area ( $m^2/ha$ ): diameter at basal height;
- Vigor (1 → 0 – 25% foliar loss; 2 → 26-50% foliar loss; 3 → 51-75% foliar loss; 4 → 76 – 99% foliar loss)

## ► Interpolation Methods (cross validation)

- IDW (Inverse Distance Weighted)
- Kriging (Simple Kriging, **ordinary Kriging**, Universal Kriging)
- Spline: (Completely Regularized Spline, **Tension Spline**, Thin Plate Spline, Multiquadric spline)

# Model Specification

## ► Traditional Hedonic Model

$$\ln P_{it} = Z_i\alpha + L_i\beta + lba_{it}\gamma_t + lba\_vigor_{it}\theta_t + \tau_t + \omega_j + \varepsilon_{it}$$

$lba_{it}$  is live basal area

$lba\_vigor_{it}$  is interaction of live basal area and vigor.

## ► Repeat Sale Model

$$\begin{aligned} & \ln P_{it} - \ln P_{it-1} \\ &= (lba_{it} - lba_{it-1})\gamma_r + (lba_{it} * vigor_{it} - lba_{it-1} * vigor_{it-1})\theta_r + \tau_t + \omega_j + \varepsilon_{it} \end{aligned}$$



# Conclusions

- Based on spatial interpolation results, HWA infestation had significant effects for 0.1km buffer.
- Two effects:
  - Ability to use site specific data for all sale properties.
  - Ability to employ repeat sales model.
- Inverse Distance and Spline are similar, Kriging differs due to scaling.
- From cross validation results, caution should be taken because of the prediction error for spatial interpolation.