

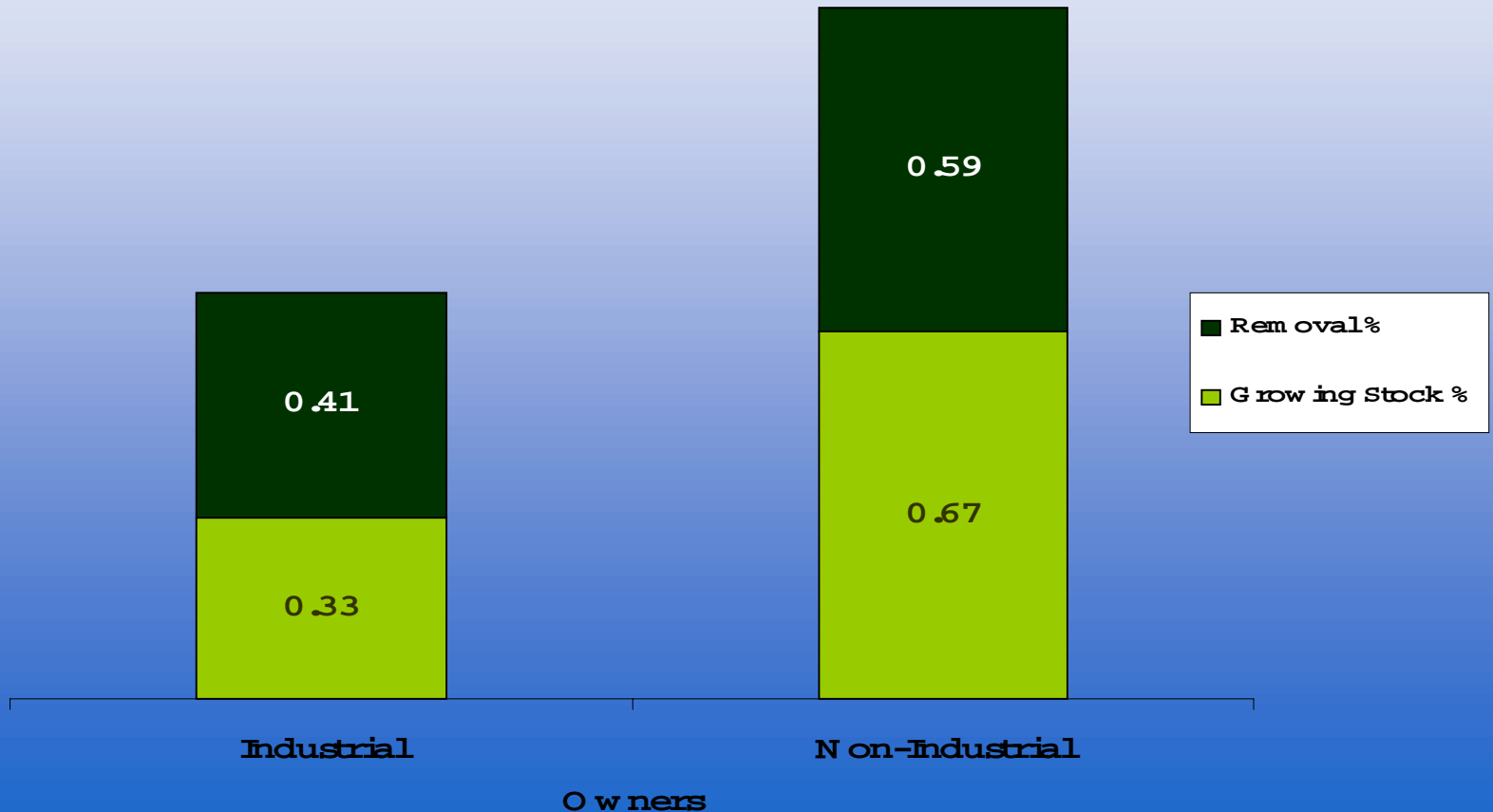
Modeling Timber Harvesting Behavior: II.B.2

- Introduction to Supply Modeling
- Evidence of Timber Supply Heterogeneity and Modeling Impacts
- Proposed Research Tasks

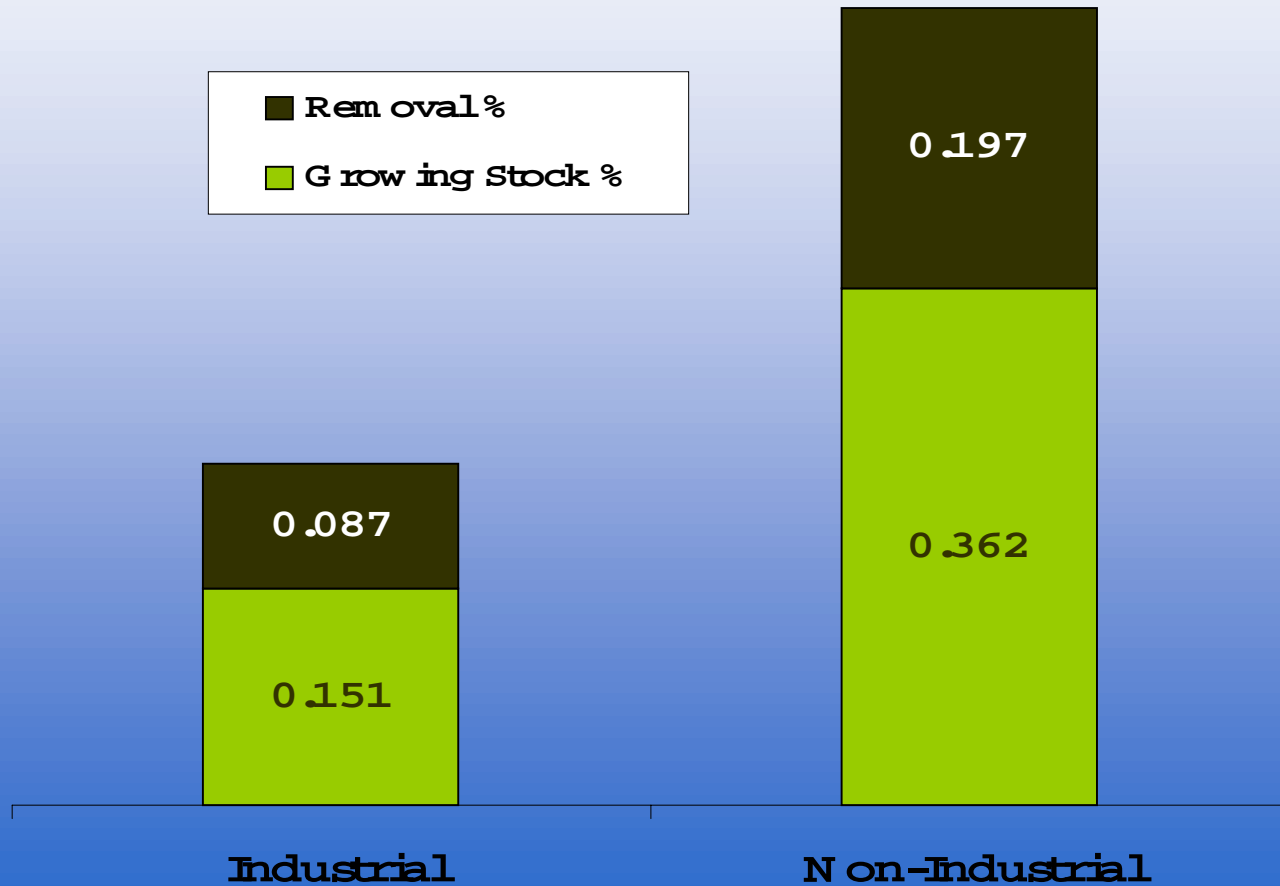
Introduction to Supply Modeling

- Parametric View of the World
 - Elasticity of Price
 - Elasticity of Inventory
 - Elasticity of Plantation Intensity
- Empirical Basis
- Heterogeneity
- Implications for Modeling Strategy
 - ‘Bottom-up’ vs. ‘Top-down’

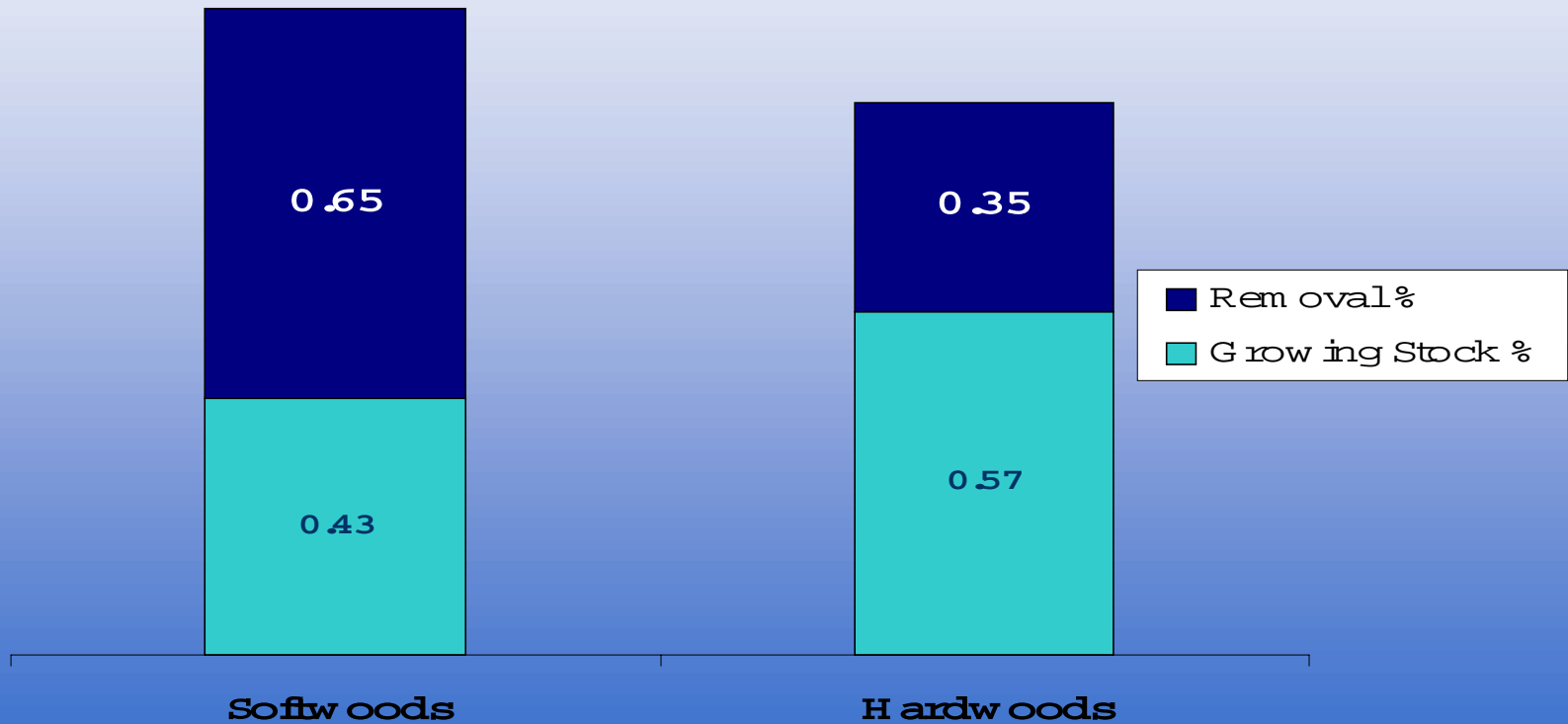
Empirical Evidence: Removals and Growing Stock by Owners



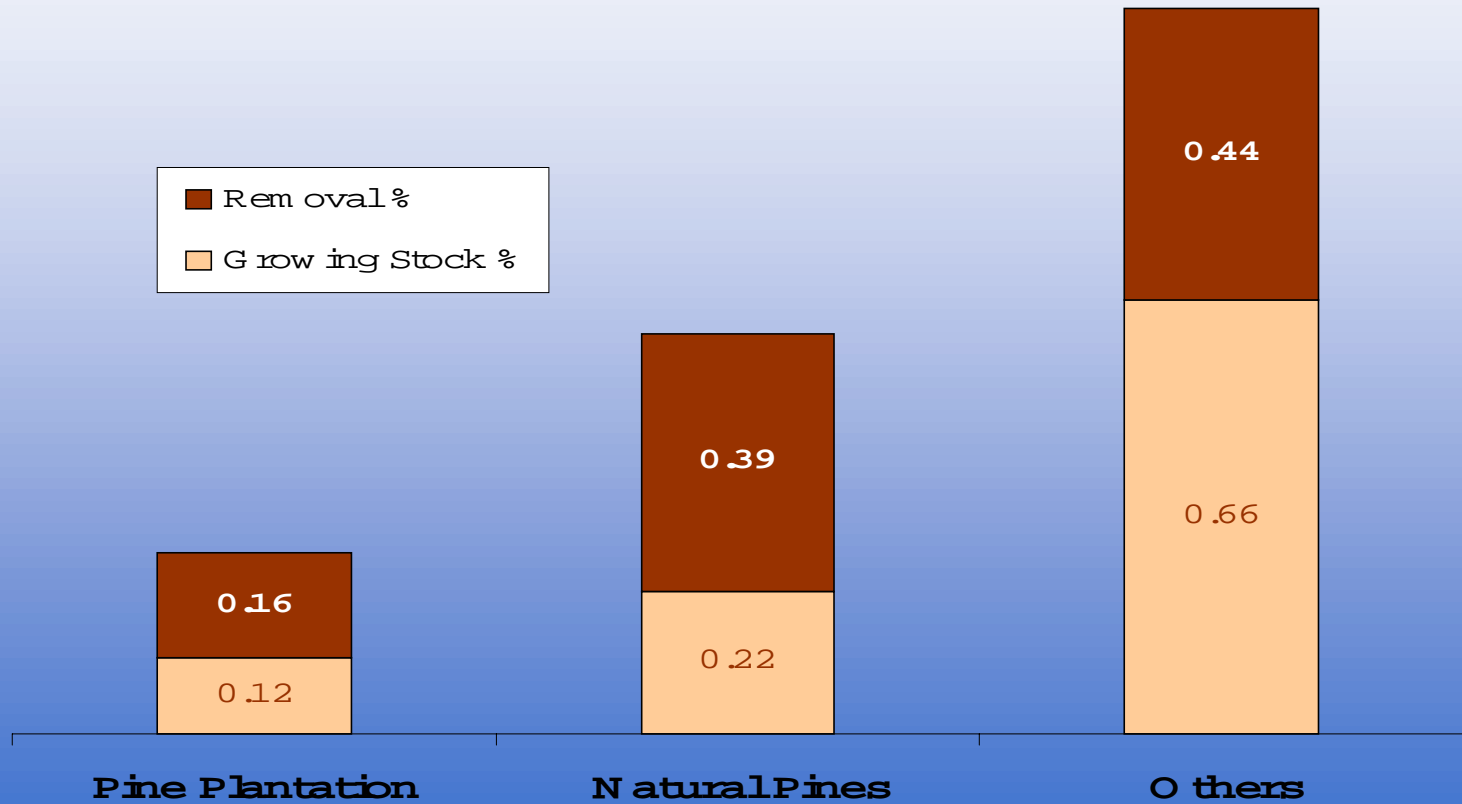
Empirical Evidence: Removals and Growing Stock by Owners for Age-class >50



Empirical Evidence: Removals and Growing Stock by Species



Empirical Evidence: Removals and Growing Stock by Management Type



Exploratory Data Analysis

- Exploratory regression modeling of FIA data, Southeastern U.S.
- Age structure, Species, Ownership and Management on Harvest

$$\begin{aligned} \% H_{ijk1} = & \alpha_0 + \alpha_1 \bullet AG_i + \alpha_2 \bullet SP_j + \alpha_3 \bullet OW_k + \alpha_4 \bullet MT_1 \\ & + \alpha_5 \bullet AG_i \bullet OW_k + \alpha_6 \bullet AG_i \bullet SP_j + \alpha_7 \bullet AG_i \bullet MT_1 \\ & + \alpha_8 \bullet SP_j \bullet OW_k + \alpha_9 \bullet SP_j \bullet MT_1 + \alpha_{10} \bullet OW_k \bullet MT_1 \\ & + \alpha_{11} \bullet AG_i \bullet SP_j \bullet MT_1 + \alpha_{12} \bullet AG_i \bullet SP_j \bullet OW_k + \alpha_{13} \bullet AG_i \bullet MT_1 \bullet OW_k \\ & + \alpha_{14} \bullet AG_i \bullet SP_j \bullet MT_1 \bullet OW_k \\ & + \% GS \bullet \beta_0 + \beta_1 \bullet AG_i + \beta_2 \bullet SP_j + \beta_3 \bullet OW_k + \beta_4 \bullet MT_1 \\ & + \beta_5 \bullet AG_i \bullet OW_k + \beta_6 \bullet AG_i \bullet SP_j + \beta_7 \bullet AG_i \bullet MT_1 \\ & + \beta_8 \bullet SP_j \bullet OW_k + \beta_9 \bullet SP_j \bullet MT_1 + \beta_{10} \bullet OW_k \bullet MT_1 \\ & + \beta_{11} \bullet AG_i \bullet SP_j \bullet MT_1 + \beta_{12} \bullet AG_i \bullet SP_j \bullet OW_k \\ & + \beta_{13} \bullet AG_i \bullet MT_1 \bullet OW_k + \beta_{14} \bullet AG_i \bullet SP_j \bullet MT_1 \bullet OW_k] \\ & + \varepsilon \end{aligned}$$

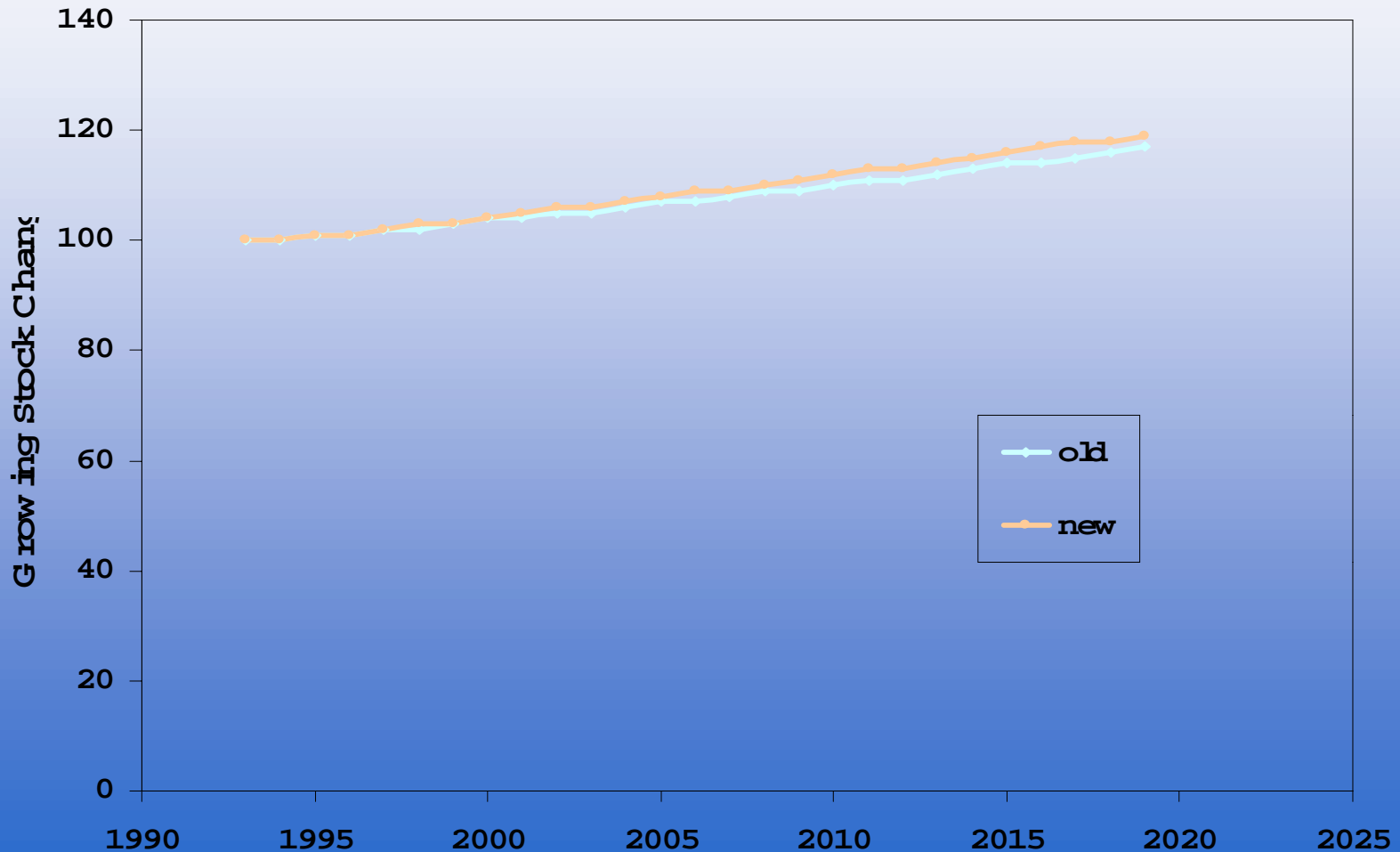
Hypothesis Test

- H_{01} : Ownership effect - joint significance of ownership dummy
F 50, 587 = 7.1 p-value (F) = 0.0000
- H_{02} : Species effect - joint significance of species dummy
F 49, 587 = 14.82 p-value (F) = 0.0000
- H_{03} : Management (PP) effect - joint significance of management
F 26, 587 = 3.55 p-value (F) = 0.0000
- H_{04} : Management (NP) effect - joint significance of management
F 38, 587 = 7.16 p-value (F) = 0.0000

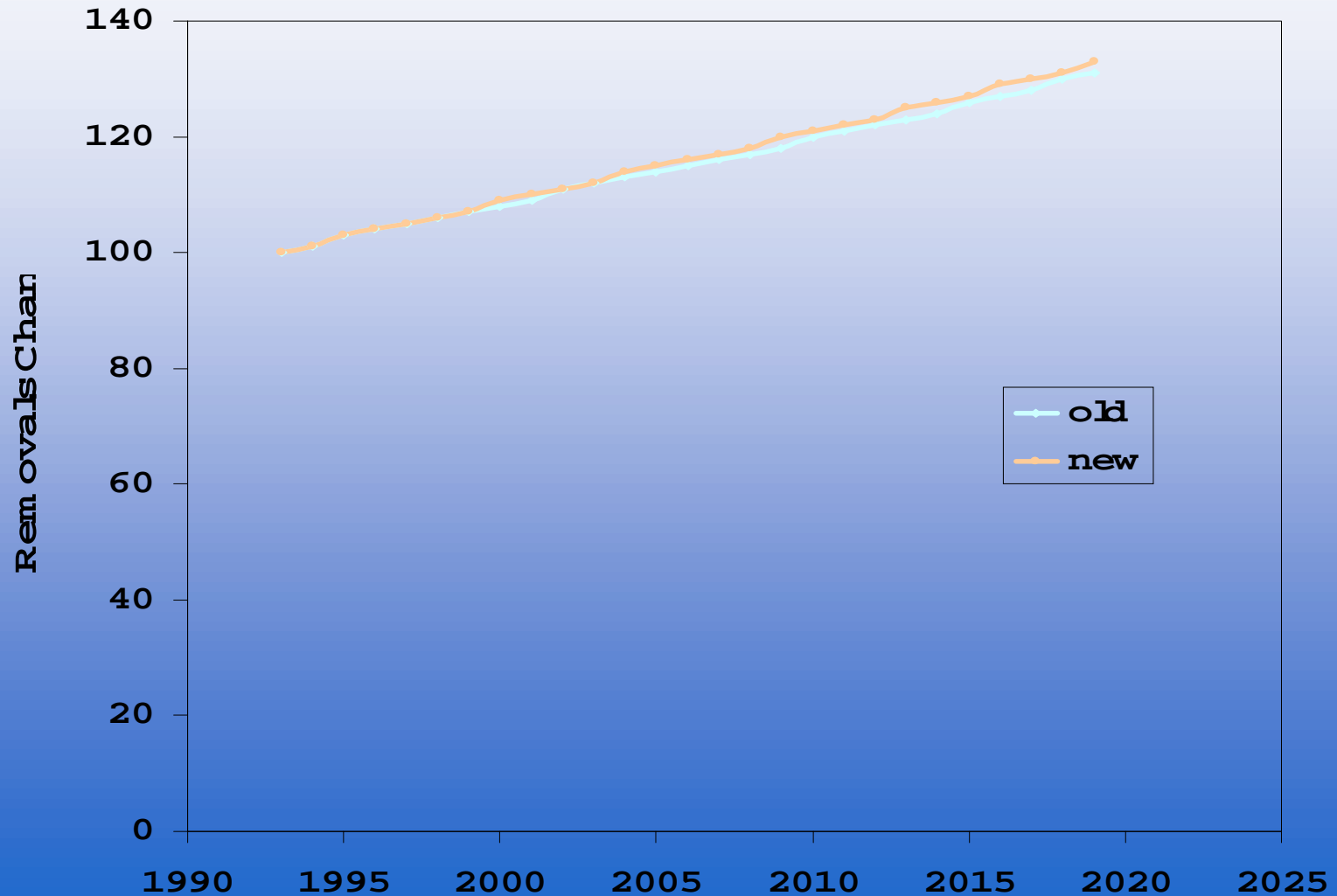
Effects of new modeling approach on projected outcomes

- Economic
 - growing stock
 - removals
 - prices
- Ecological (for North Carolina)
 - age class distribution
 - seral stages
 - wildlife suitability habitat

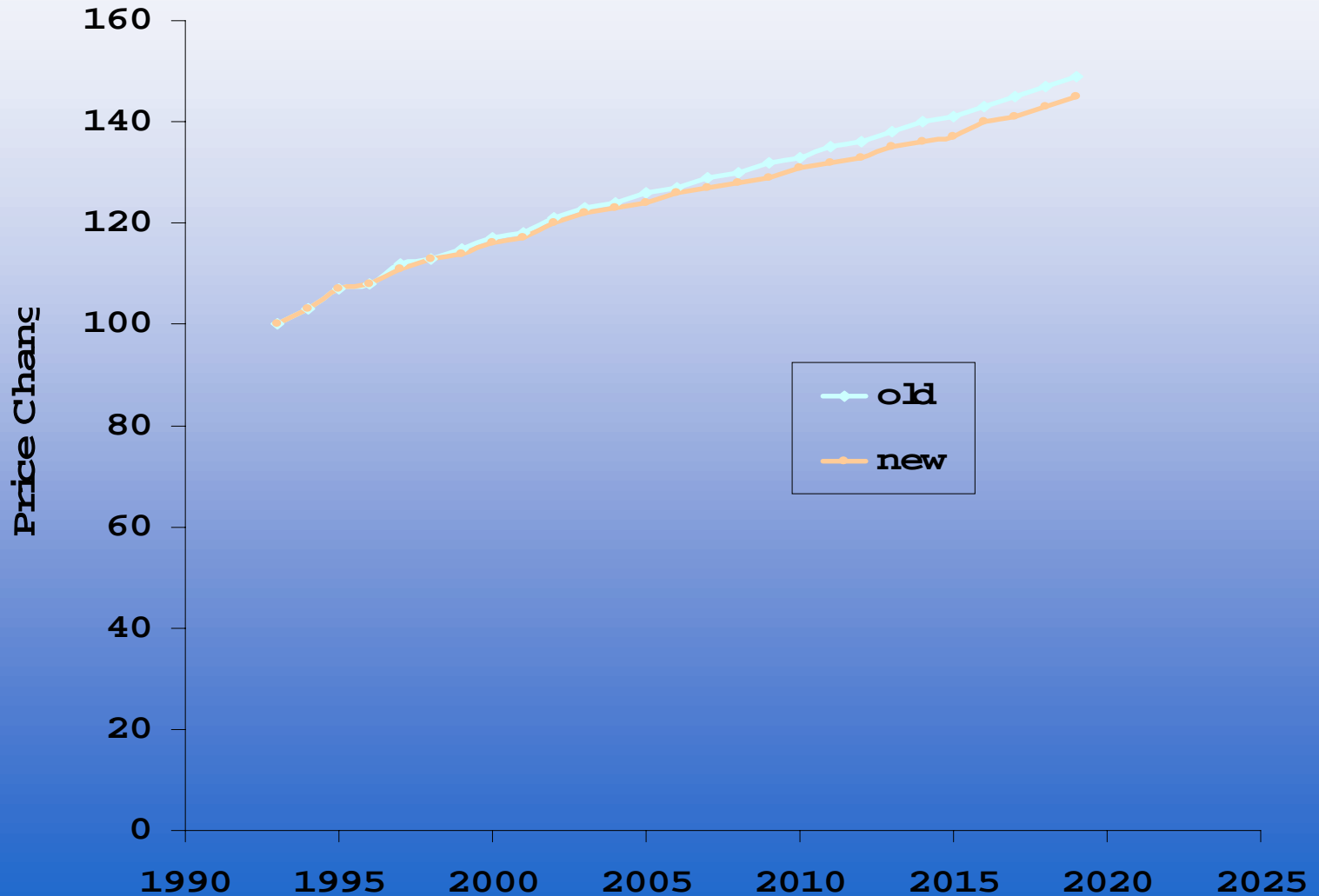
Growing Stock Projections (1994-2020) under two modeling approaches



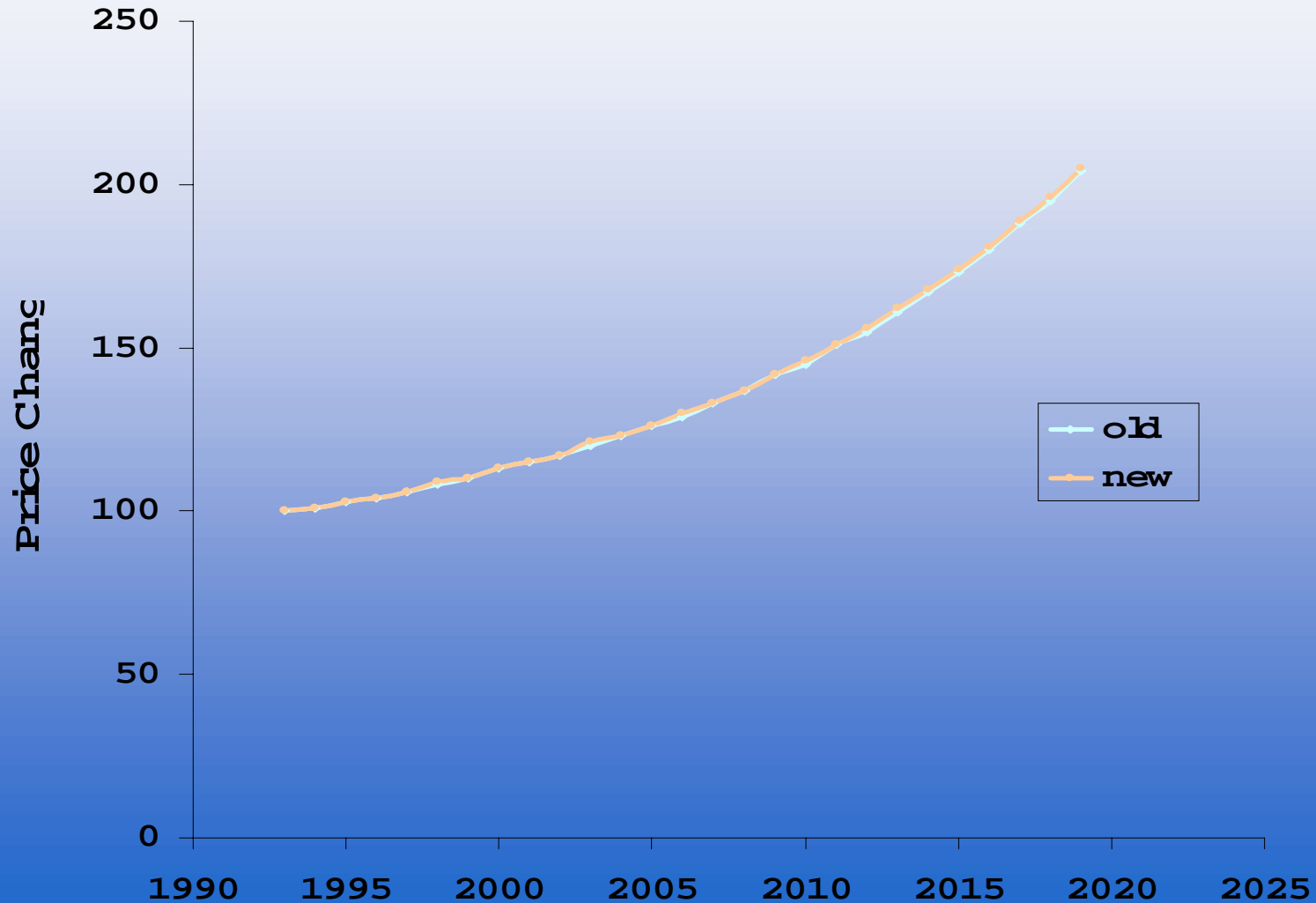
Removals Projections (1994-2020) under two modeling approaches



Softwood Price Projections (1994-2020) under two modeling approaches



Hardwood Price Projections (1994-2020) under two modeling approaches

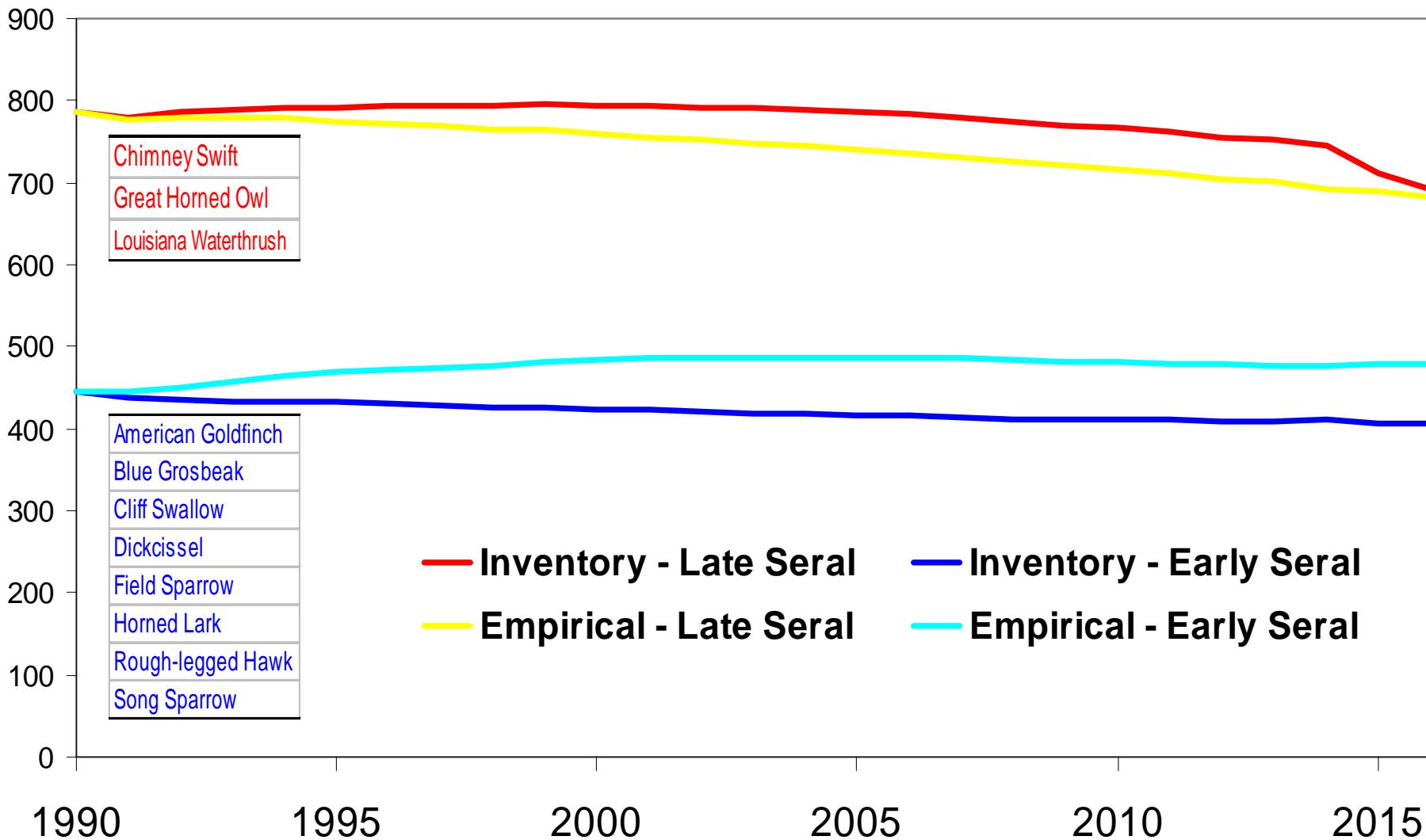


Harvesting Patterns and Wildlife Habitat (implications for product modeling)

- Link Age class distributions from SERTS to wildlife habitat model
- Evaluate effects of evolving forest structure (from SERTS) on habitat abundance for different wildlife species groups
- Evaluate whether modeling approach affects wildlife habitat projections
- Case study: North Carolina

NC All Mgt Types All Regions Early vs Late Seral Stage

Acres (x 10,000)



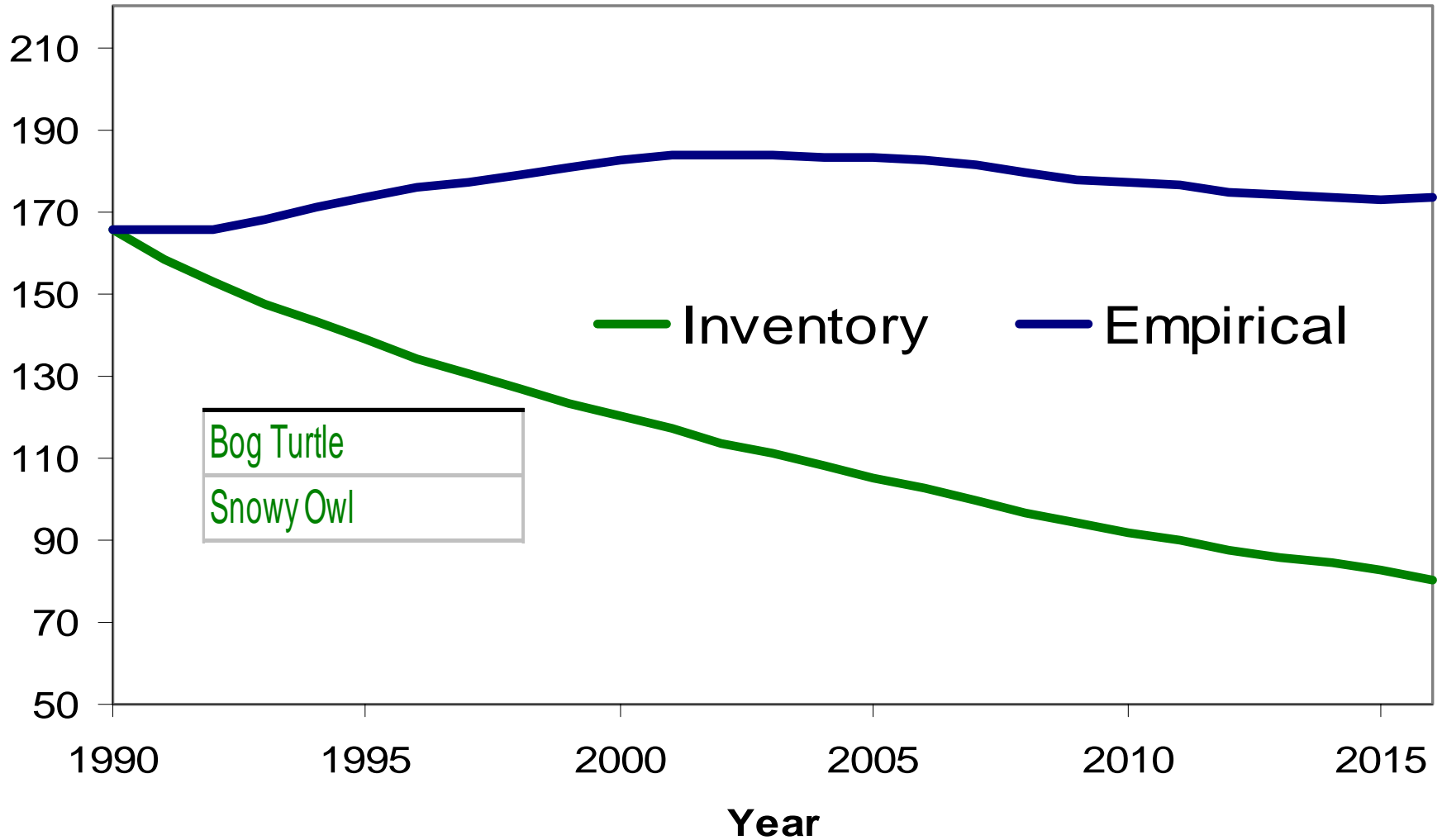
- Chimney Swift
- Great Horned Owl
- Louisiana Waterthrush

- American Goldfinch
- Blue Grosbeak
- Cliff Swallow
- Dickcissel
- Field Sparrow
- Horned Lark
- Rough-legged Hawk
- Song Sparrow

- Inventory - Late Seral
- Empirical - Late Seral
- Inventory - Early Seral
- Empirical - Early Seral

NC Piedmont/Mountain All Mgt Types - Early Seral Stage

Acres
(x 10,000)



Task II.B.2.1: Consistently Aggregate Supply

- Move disaggregation down from unit-owner to type-age class level
- Estimate cell-level parameters

Task II.B.2.2 Collect Data

- Literature review (benchmark)
- Quantity data from FIA tables
 - physical volumes if measured at region scale
 - discrete variable (1 = cut, 0 = not cut) at plot level
- FIA tables will also provide disaggregated data on timber inventories
 - better biometric descriptions of forest growth,
 - influence of age-class distribution on timber supply
- Price data from TMS
 - accurate mapping of FIA and TMS measurement zones
 - using GIS coverage to crosswalk FIA and TMS
- Census data - characterize the different owners of forestlands

Task II.B.2.3: Identify Spatial Scale

- Little *a priori* justification for choosing a particular regional scale
 - FIA ‘plot’ supply (area expansion factor)
 - FIA unit supply (ST, Eco Region, SP, OW, MT)
- Patterns in the existing data to determine the scale of heterogeneity
- Purely empirical criterion to choose the appropriate spatial scale
 - compatibility of our price (TMS) and quantity (FIA) data.

Task II.B.2.4: Estimate Supply Parameters

- Timber Supply = Function (Market Prices, Timber Inventory, Socio-Economic Factors, Biophysical Characteristics)
 - Discrete choice version of harvesting
 - Continuous version of quantity of timber supply
- Three established statistical methods to determine the extent of heterogeneity
 - fixed effects,
 - random effects,
 - random coefficients
- Choose among these models based on the predictive power

Task II.B.2.5: Verify Model Parameters

- Statistical criteria for predictability (*e.g.* Adj R^2)
- Internal Statistical Verification
 - estimation data subset (A), validation data subset (B)
 - compare predicted for B, using estimates from A, with actual timber supply for B
- External Economic Verification
 - use model parameters in MP-SRTS for validation runs
 - compare the simulated prices, timber inventory, and timber harvests to historical trends and future projections available in the literature