

MODELLING TREE-LEVEL WESTERN HEMLOCK RESPONSES TO FERTILIZATION

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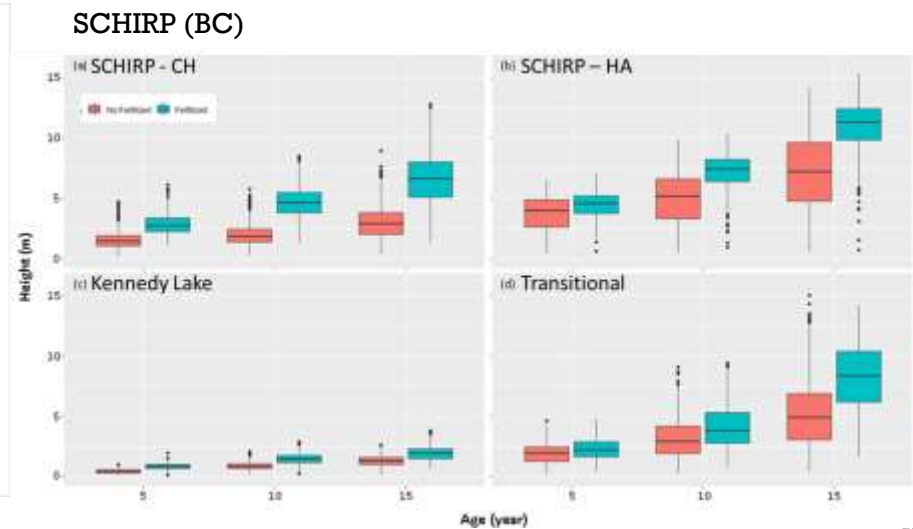
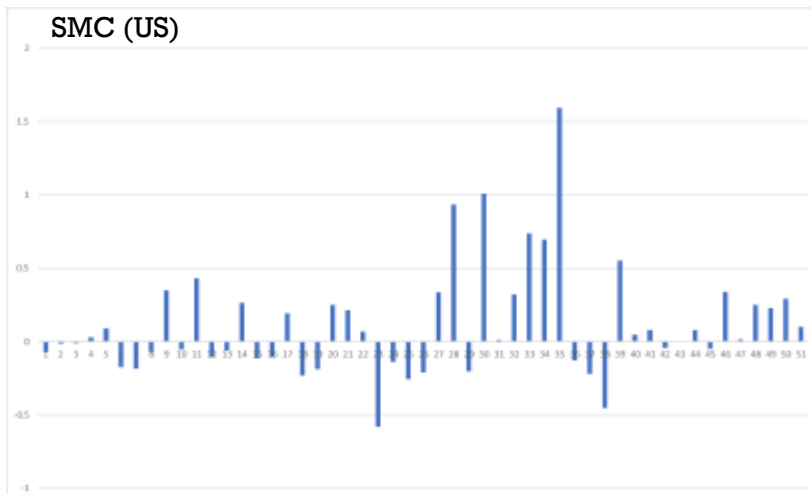
WESTERN HEMLOCK (*TSUGA HETEROPHYLLA* (RAF.) SARG.)

- Most common and important timber species in the PNW coastal forests
 - Account for up to 30% of total harvested log volume
 - In BC, ~0.7 mil ha pure Hw stands
- Providing ecosystem values
 - Esthetics, wildlife habitat and food, genetic diversity, carbon sequestration, and long-term productivity



VARIATIONS OF FERTILIZATION RESPONSES

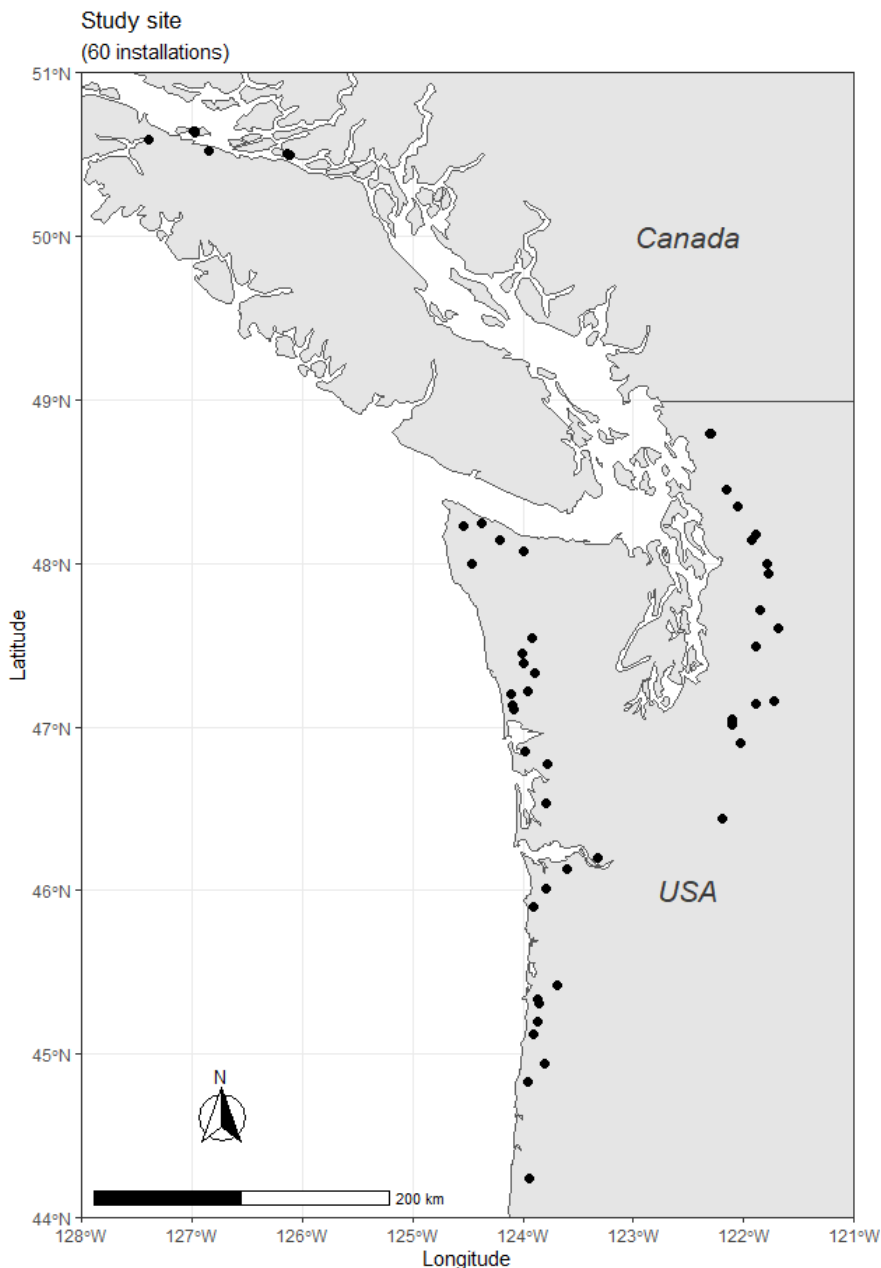
- Forest fertilization
 - Increase productivity, sequesterate carbon, enhance vitality of soil and stands, promote stand development, and increase diversity of wildlife habitat conditions
- Variable fertilization responses
 - Inconsistent outcomes, ranging from negative to positive
 - TIPSYP: default response is **0%** for all sites and ages



OBJECTIVE

- Develop the tree-level fertilization response models of western hemlock
 - Quantify mortality, dbh, and height growth responses
 - Examine if social standing, crown characteristics affect these responses
 - Predict tree-level fertilization response





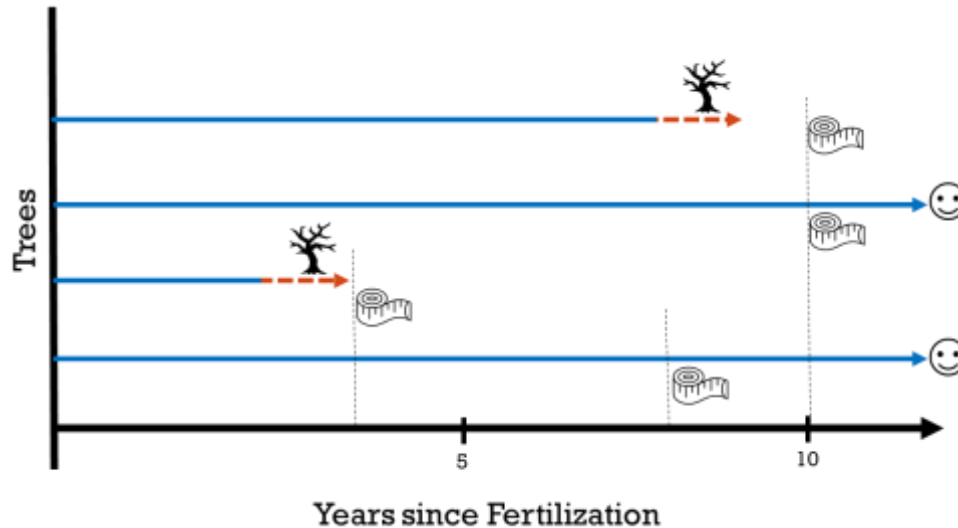
DATA & MODELS

- Data sources
 - EP703: 9 installations
 - SMC: 51 installations
 - Estab. 1969-1980 (19-56 yrs old)
 - 224-975 kg N ha⁻¹ of urea
 - Remeasured every 2-3 years
- Data compilation
 - Single-time application
 - DBH
 - <12 year-since-fertilization (ysf)
 - 124,982 obs. / 31,736 trees
 - HT
 - <12 ysf
 - 13,950 obs. / 4,460 trees
 - Mortality
 - Latest but not exceeding 10 ysf
 - 51,626 obs. & trees

VARIABLES USED FOR MODEL CONSTRUCTION

| Notation | Variable | Unit | Range | Mean |
|-------------|-----------------------------------|---------------------------------|-------------|-------|
| MAI | Mean annual increment of DBH | cm year ⁻¹ | 0.08–2.51 | 0.43 |
| DBH | Diameter at breast height | cm | 2.29–75.95 | 17.00 |
| HT | Total height | m | 3.05–48.5 | 16.18 |
| CR | Crown ratio | - | 0.17–1.00 | 0.57 |
| SBA | Stand basal area | m ² ha ⁻¹ | 2.66–111.40 | 50.54 |
| BAL | Sum of basal area of larger trees | m ² ha ⁻¹ | 0.13–111.28 | 28.33 |
| rBAL | Relative BAL | - | 0.00–1.00 | 0.58 |
| SI | Site index | m | 19.51–59.13 | 39.57 |
| N | Nitrogen application rate | N tons ha ⁻¹ | 0.00–0.98 | 0.22 |
| P | Phosphorus application | - | | |
| SDI | Stand density index | - | 65.1–1063.9 | 539.0 |

MODEL CONSTRUCTION - MORTALITY



- Variations in measurement intervals and differing times of mortality observation
 - Shaffer's (2004) "logistic-exposure link function"
- 2-level nested random effects (installation, plot)
- Stand-level, tree-level variables were tested for explanatory variables

$$\text{logit}(P_{mort}) = (\beta_0 + b_i + b_{ip}) + \beta_1 \cdot MAI + \beta_2 \cdot N + \beta_3 \cdot rBAL + \beta_4 \cdot SBA + \beta_5 \cdot DBH + \beta_6 \cdot MAI \cdot N + \beta_7 \cdot rBAL \cdot N$$

MODEL CONSTRUCTION - GROWTH RESPONSES

$$\Delta y = F_{base} \cdot F_{fert}$$

- Multiplicative form with baseline growth model (F_{base}) and fertilization effect (F_{fert})
 - Modified Hynynen et al. (1998) & Kuehne et al. (2022)
- F_{base} – reference growth
 - 3-level nested random effects (installation, plot, trees)
 - Stand-level & tree-level variables including initial size were tested
- F_{fert} – fertilization modifier
 - Stand- & tree-level variables, fertilization rate, P addition were included
 - Weibull pdf to model the size of fertilization effect by year

$$f_{ysf} = \frac{\kappa}{\lambda} \cdot \left(\frac{ysf}{\lambda} \right)^{\kappa-1} \cdot e^{-(ysf/\lambda)^\kappa}$$

GROWTH RESPONSE MODELS - DBH

$$\Delta dbh = F_{base} \cdot F_{fert}$$

$$F_{base} = \exp \left(\begin{array}{l} (\beta_0 + b_i + b_{ip} + b_{ipt}) + \beta_1 \cdot DBH + \beta_2 \cdot \log(DBH) + \\ \beta_3 \cdot CR + \beta_4 \cdot BAL^2 + \beta_5 \cdot \log(SBA) + \beta_6 \cdot \log(SI) \end{array} \right)$$

$$F_{fert} = \left(1 + \left(\begin{array}{l} \alpha_1 + \alpha_2 \cdot P + \alpha_3 \cdot SDI + \alpha_4 \cdot rBAL + \\ \alpha_5 \cdot rBAL^2 + \alpha_6 \cdot CR \end{array} \right) \cdot N \cdot f_{ysf} \right)$$

$$f_{ysf} = \frac{\kappa}{\lambda} \cdot \left(\frac{ysf}{\lambda} \right)^{\kappa-1} \cdot e^{-(ysf/\lambda)^\kappa}$$

GROWTH RESPONSE MODELS - HEIGHT

$$\Delta HT = F_{base} \cdot F_{fert} = PHG \cdot HMOD \cdot F_{fert}$$

$$PHG = f(SI, GEA + 1) - Ht$$

$$GEA = f^{-1}(SI, Ht)$$

- F_{base} for height is a product of potential growth (PHG) and a height growth modifier (HMOD; Weiskittel et al. 2007)
- PHG: potential height growth of a site tree given site index and growth effective age (GEA)
- GEA: age of site trees with the same height as the subject tree in the given site (index)

$$HMOD = \exp \left(\frac{(\beta_0 + b_i + b_{ip} + b_{ipt}) + \beta_1 \cdot \log(Ht) + \beta_2 \cdot CR + \beta_3 \cdot BAL^2 + \beta_4 \cdot \log(SI)}{\beta_3 \cdot BAL^2 + \beta_4 \cdot \log(SI)} \right)$$

$$F_{fert} = (1 + (\alpha_1 + \alpha_2 \cdot rBAL + \alpha_3 \cdot CR + \alpha_4 \cdot P) \cdot N \cdot f_{ysf})$$

RESULTS – MORTALITY

$$\text{logit}(P_{mort}) = (\beta_0 + b_i + b_{ip}) + \beta_1 \cdot MAI + \beta_2 \cdot N + \beta_3 \cdot rBAL + \beta_4 \cdot SBA + \beta_5 \cdot DBH + \beta_6 \cdot MAI \cdot N + \beta_7 \cdot rBAL \cdot N$$

| Parm | Estimate | SE | z-value | P-value | Note |
|-----------|----------|--------|---------|---------|---------|
| β_0 | 0.7179 | 0.3448 | 2.082 | 0.03732 | Int |
| β_1 | -1.9339 | 0.3949 | -4.897 | <0.0001 | MAI |
| β_2 | 4.1232 | 0.7508 | 5.492 | <0.0001 | N |
| β_3 | 2.1726 | 0.1902 | 11.423 | <0.0001 | rBAL |
| β_4 | 0.6978 | 0.2649 | 2.634 | 0.00844 | SBA/100 |
| β_5 | -6.1808 | 0.8372 | -7.383 | <0.0001 | DBH/100 |
| β_6 | -4.0159 | 0.8282 | -4.849 | <0.0001 | MAI:N |
| β_7 | -2.6226 | 0.5452 | -4.811 | 0.00197 | N:rBAL |

- Fertilization increase mortality probability
 - Facilitate self-thinning process
- But, the interactions indicate:
 - Hw with the higher avg. dbh growth rate has lower mortality
 - Fertilization ameliorates the mortality for relatively suppressed Hw
 - Fertilization can alleviate below-ground competition for nutrition

RESULTS – GROWTH RESPONSES

$$\Delta dbh, ht = F_{base} \cdot F_{fert} = F_{base} \cdot (1 + f(\alpha, x) \cdot f_{vsf})$$

DBH model

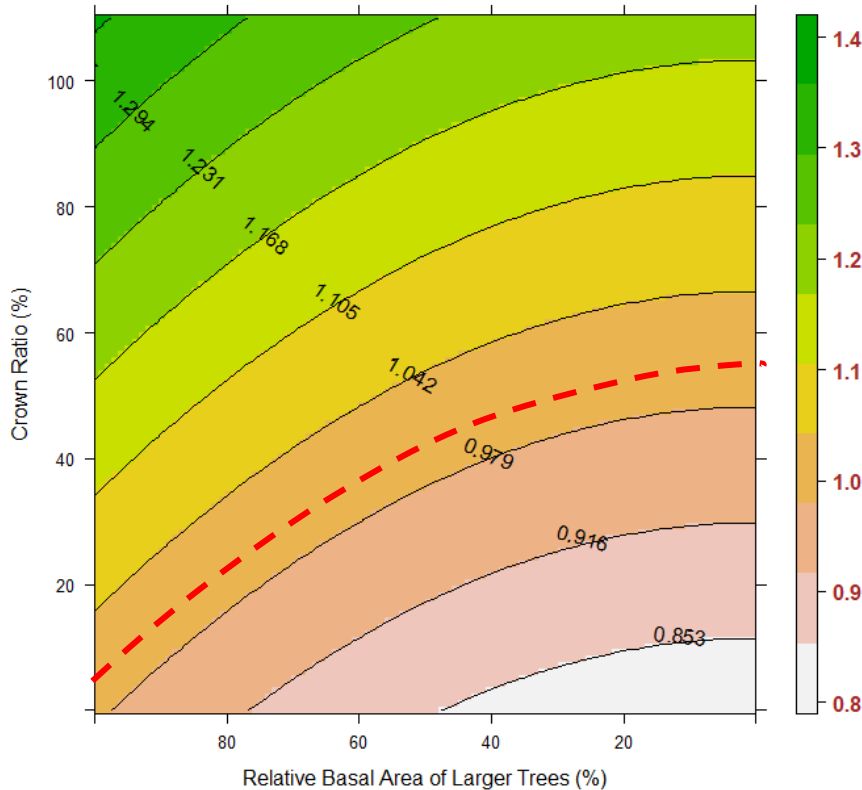
| Parm | Estimate | P-value | Note |
|------------|-----------|---------|----------------------|
| β_0 | 1.111522 | 0.2208 | Int. |
| β_1 | -0.017257 | <0.0001 | DBH |
| β_2 | 1.364692 | <0.0001 | log(DBH) |
| β_3 | -1.150056 | <0.0001 | CR |
| β_4 | -0.000207 | <0.0001 | BAL |
| β_5 | -0.731281 | <0.0001 | log(SBA) |
| β_6 | -0.568521 | 0.0180 | log(SI) |
| α_1 | -9.866462 | <0.0001 | N |
| α_2 | -0.930669 | <0.0001 | P:N |
| α_3 | 0.006888 | <0.0001 | SDI:N |
| α_4 | -0.007593 | 0.9848 | rBAL:N |
| α_5 | 5.683386 | <0.0001 | rBAL ² :N |
| α_6 | 11.187504 | <0.0001 | CR:N |
| λ | 4.908749 | <0.0001 | scale |
| K | 1.765493 | <0.0001 | shape |

HT model

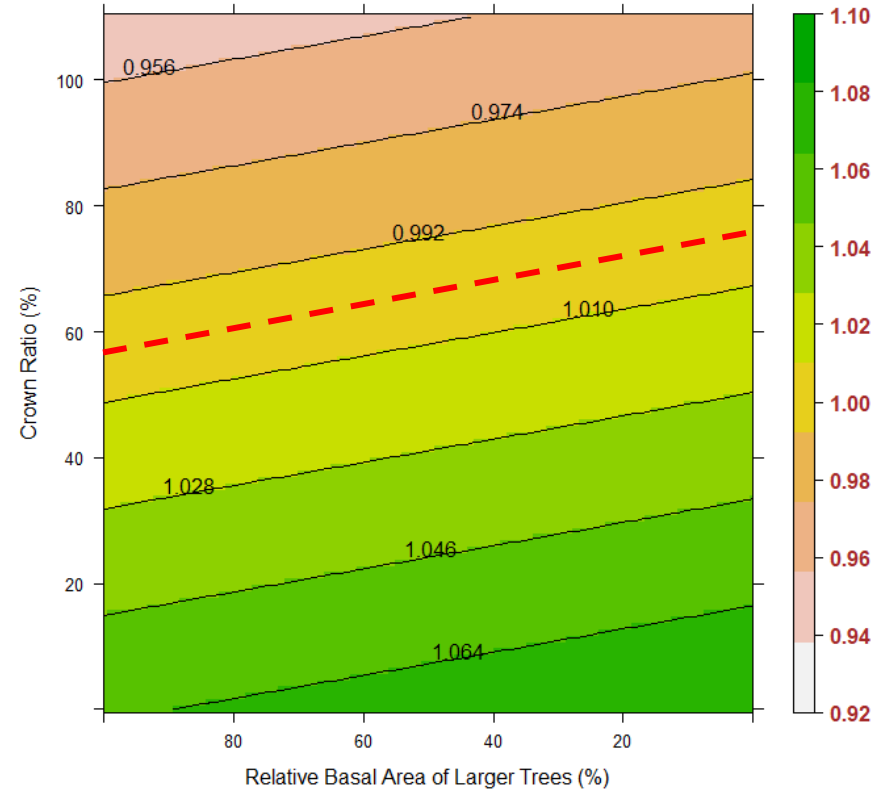
| Parm | Estimate | P-value | Note |
|------------|-----------|---------|------------------|
| β_0 | 3.454878 | <0.0001 | Int |
| β_1 | 0.233705 | <0.0001 | log(Ht) |
| β_2 | 0.216848 | 0.0335 | CR |
| β_3 | -0.000112 | <0.0001 | BAL ² |
| β_4 | -1.249609 | <0.0001 | log(SI) |
| α_1 | 2.359009 | <0.0001 | N |
| α_2 | -0.567380 | 0.0033 | rBAL:N |
| α_3 | -3.077309 | <0.0001 | CR: N |
| α_4 | 0.698335 | 0.0059 | P:N |
| λ | 5.783165 | <0.0001 | scale |
| K | 4.781137 | <0.0001 | shape |

DBH VS. HT GROWTH RESPONSE

DBH Growth response at 4 years after Fertilization

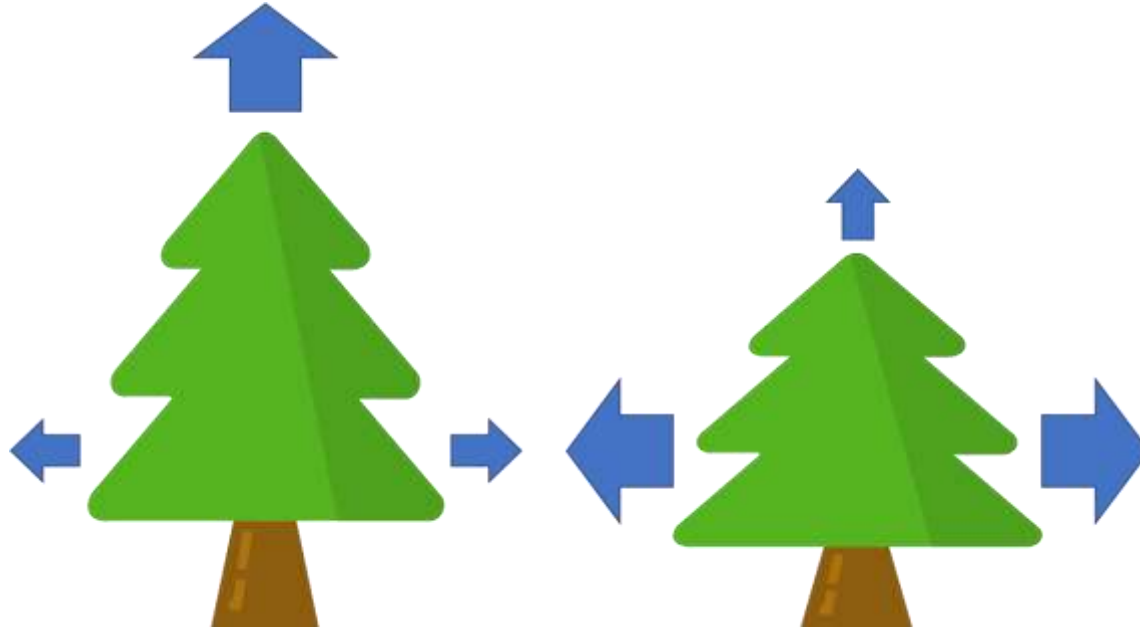


Height Growth response at 4 years after Fertilization



Dominant →

DBH VS. HT GROWTH RESPONSE



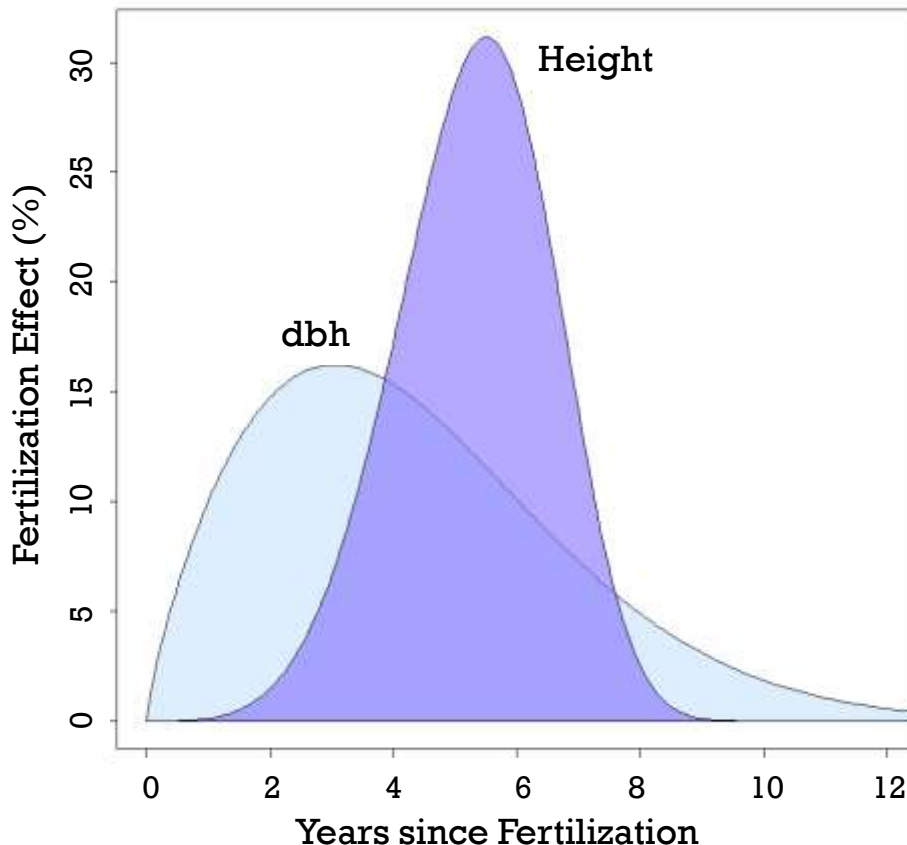
Dominant trees

- Prioritize vertical growth
- Maintain competitive advantage to capture sunlight
- Or, might be experiencing intense competition for full sunlight

Suppressed trees

- Prioritize lateral growth
- Increase crown projected area and maximize light capture in the low light level (rel. with shade-tolerance)

RESULT – FERTILIZATION EFFECTS



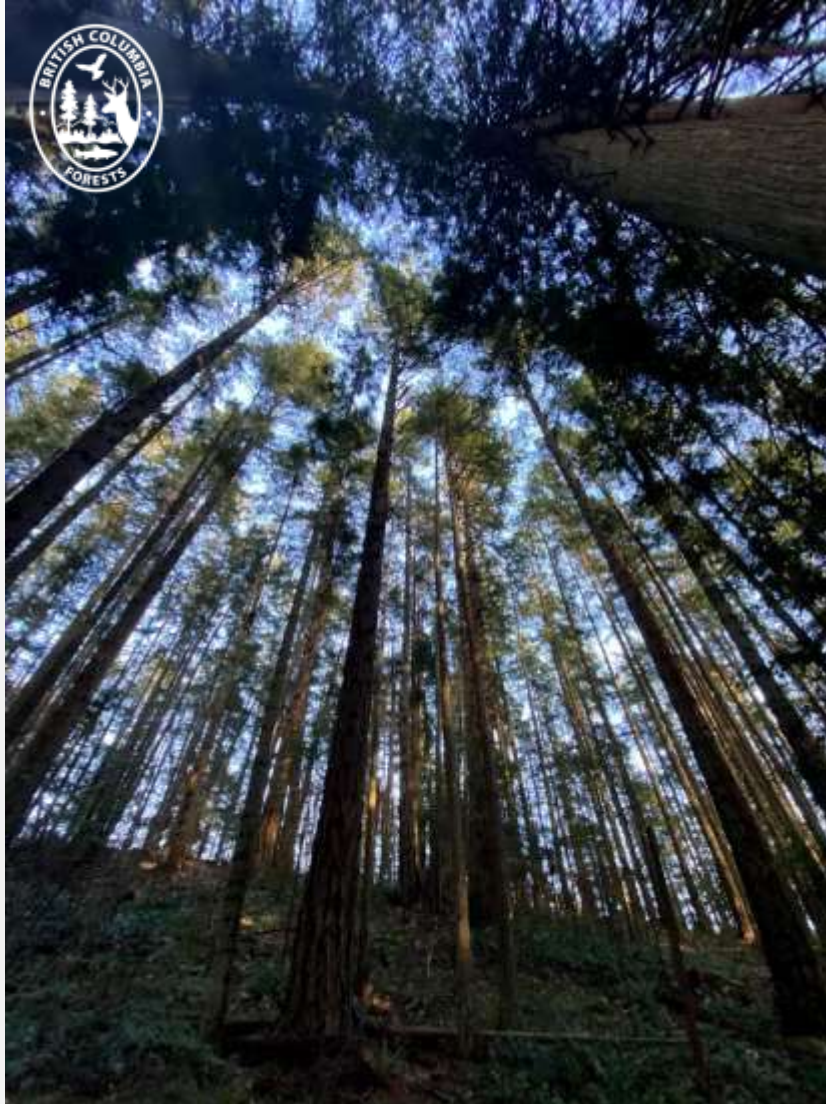
- Fertilization effects peaked
 - DBH: ~ 3 ysf
 - HT: ~ 6 ysf
- Lateral growth can be favored over vertical growth during the resource re-allocation process (Kuehne et al. 2022)
- Crown responds immediately after fertilization, and stem growth follows in a way to maintain structural stability (Valinger 1993)

$$f_{ysf} = \frac{\kappa}{\lambda} \cdot \left(\frac{ysf}{\lambda}\right)^{\kappa-1} \cdot e^{-(ysf/\lambda)^\kappa}$$

CONCLUSION

- More precisely quantify fertilization responses by individual's social standing and crown ratio (and other stand-level variables)
- Provide inspirations to the relationship among Hw's resource allocation strategy, physiological characteristics (e.g., shade tolerance), tree-level attributes including social standing
- Not easily applicable to identify the optimum sites for investment
 - But incorporated in TASS, enable to estimate stand-level mortality, growth response of Hw to fertilization
- Will implement to other species, including interior species (e.g., EP 886) & other treatments

THANK YOU!



Questions?

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