



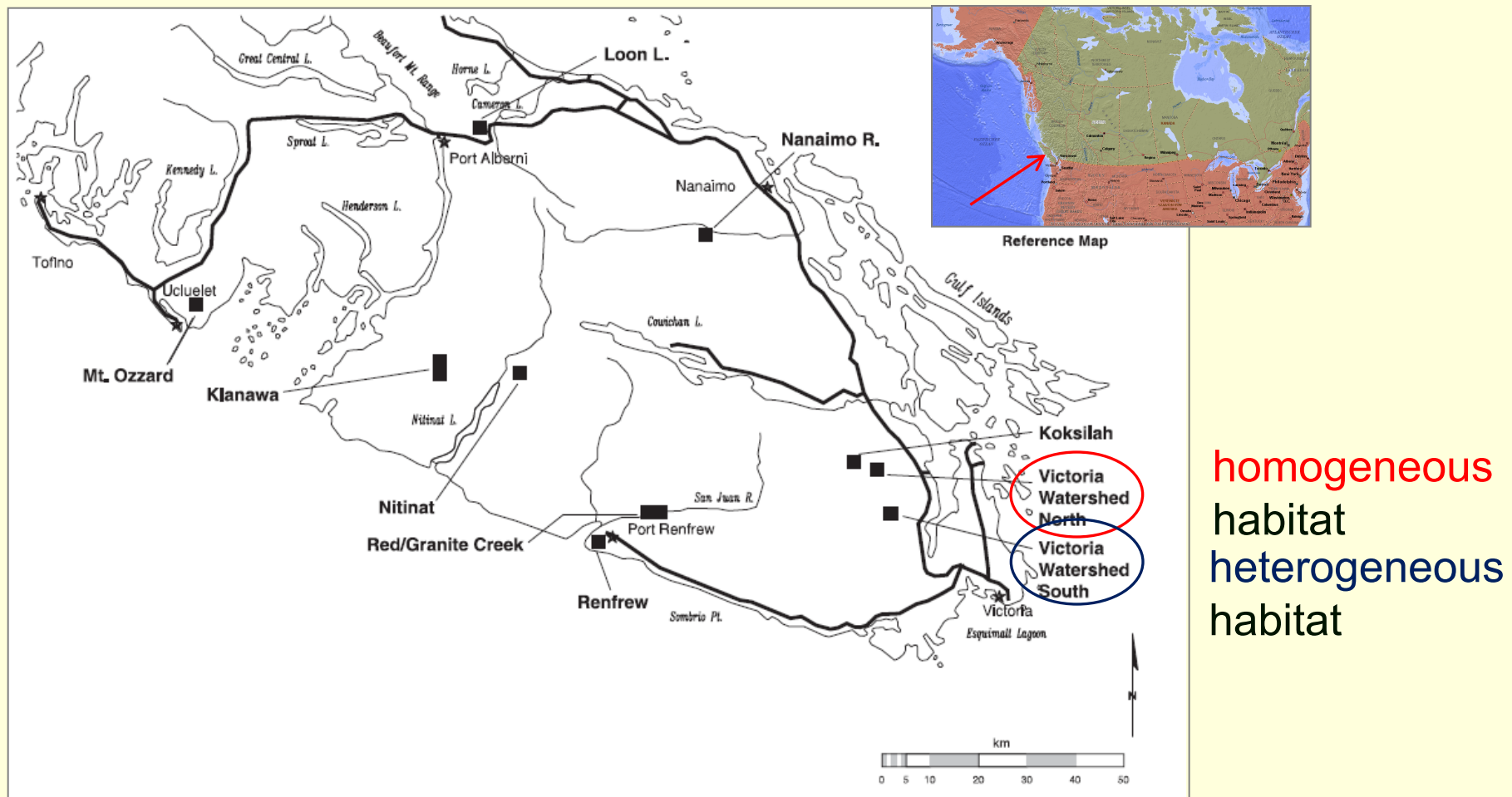
# **Spatial Statistics**

## **Summer semester 2020**

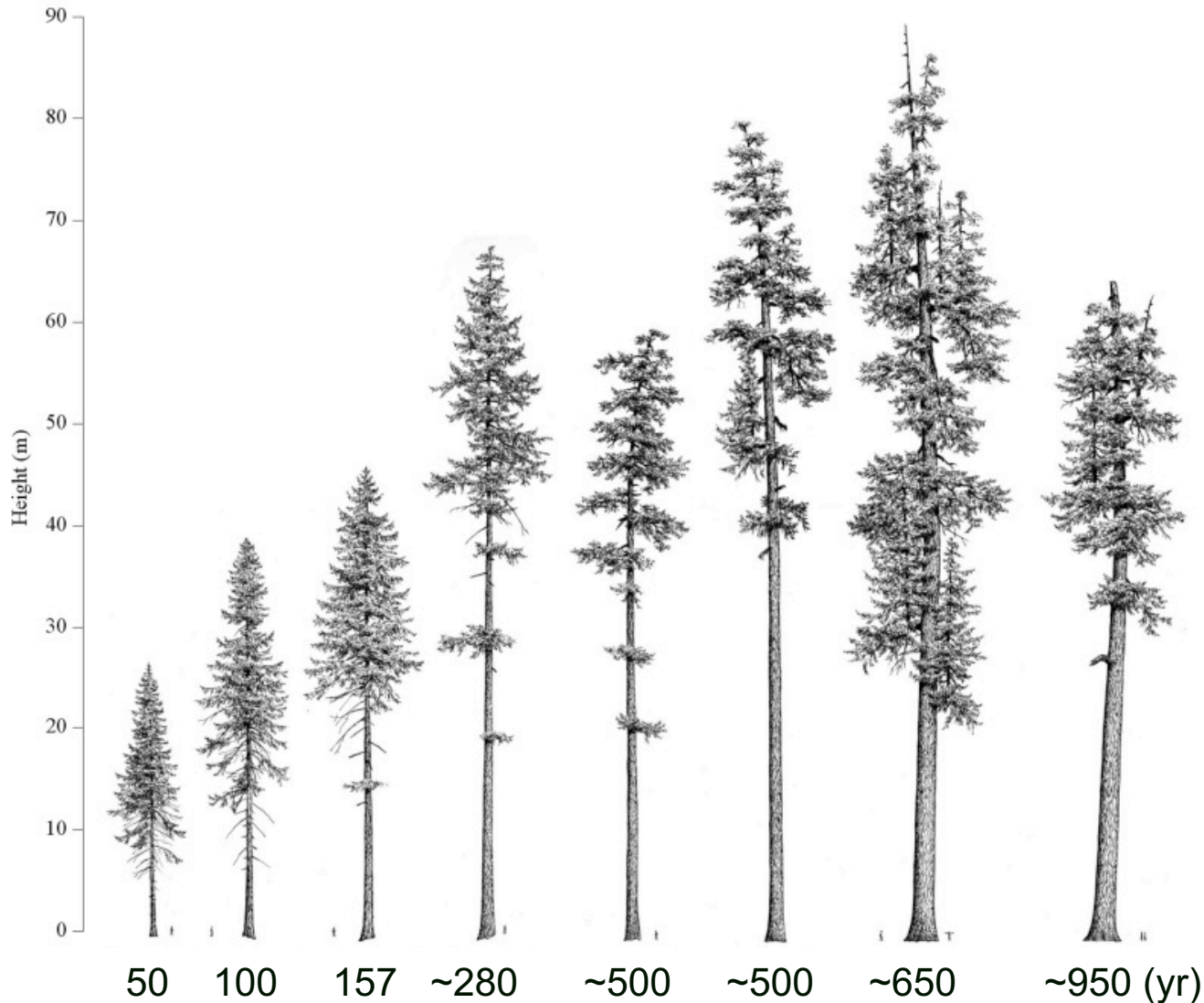
### **Practical I**

**Kerstin Wiegand, Stephan Getzin, Maximilian Hesselbarth**

## Coastal temperate forest on south-eastern Vancouver Island



## Aging pioneer Douglas-fir after stand replacing fire



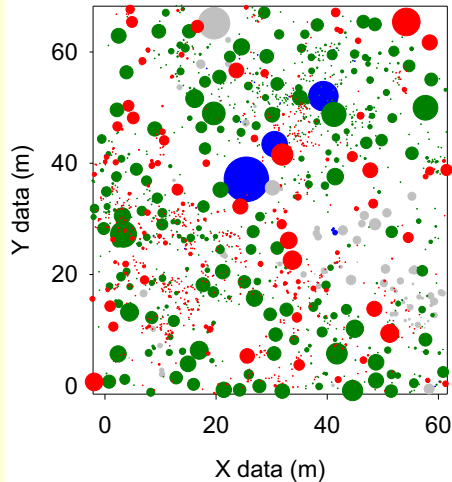
Shade-tolerant, late-successional western hemlock (left) and western redcedar



# Chronosequence

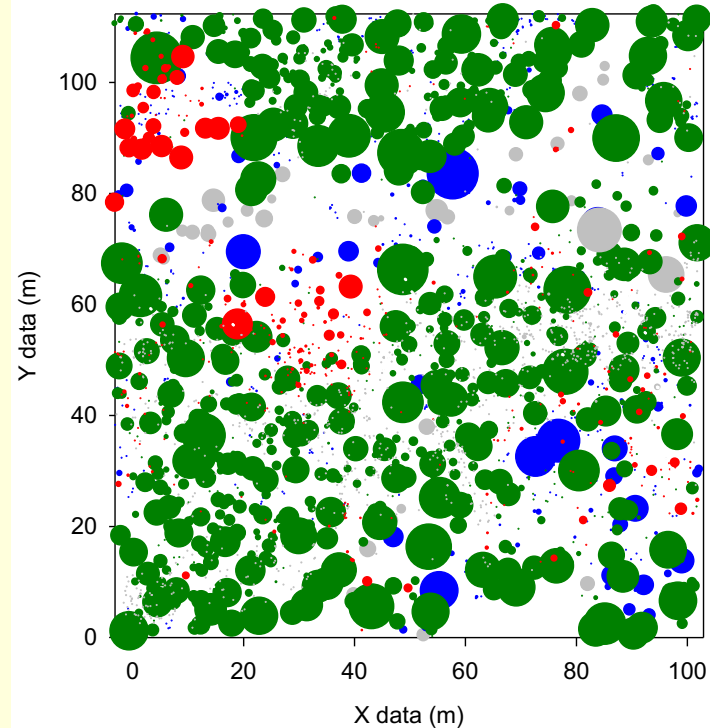
39 yr

Immature



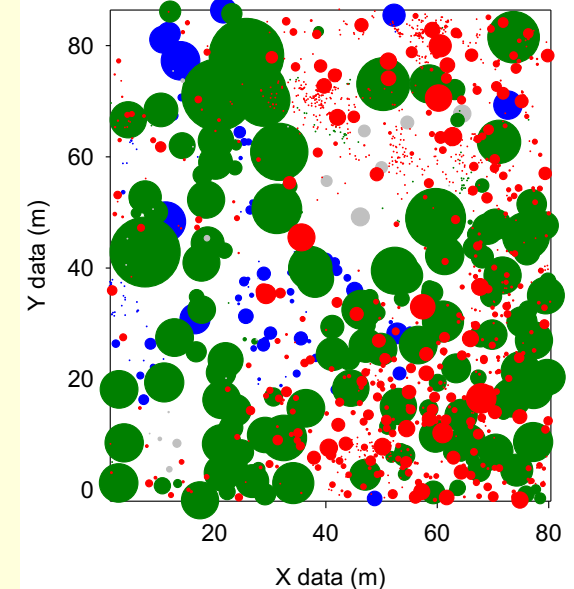
109 yr

Mature



254 yr

Old-Growth South

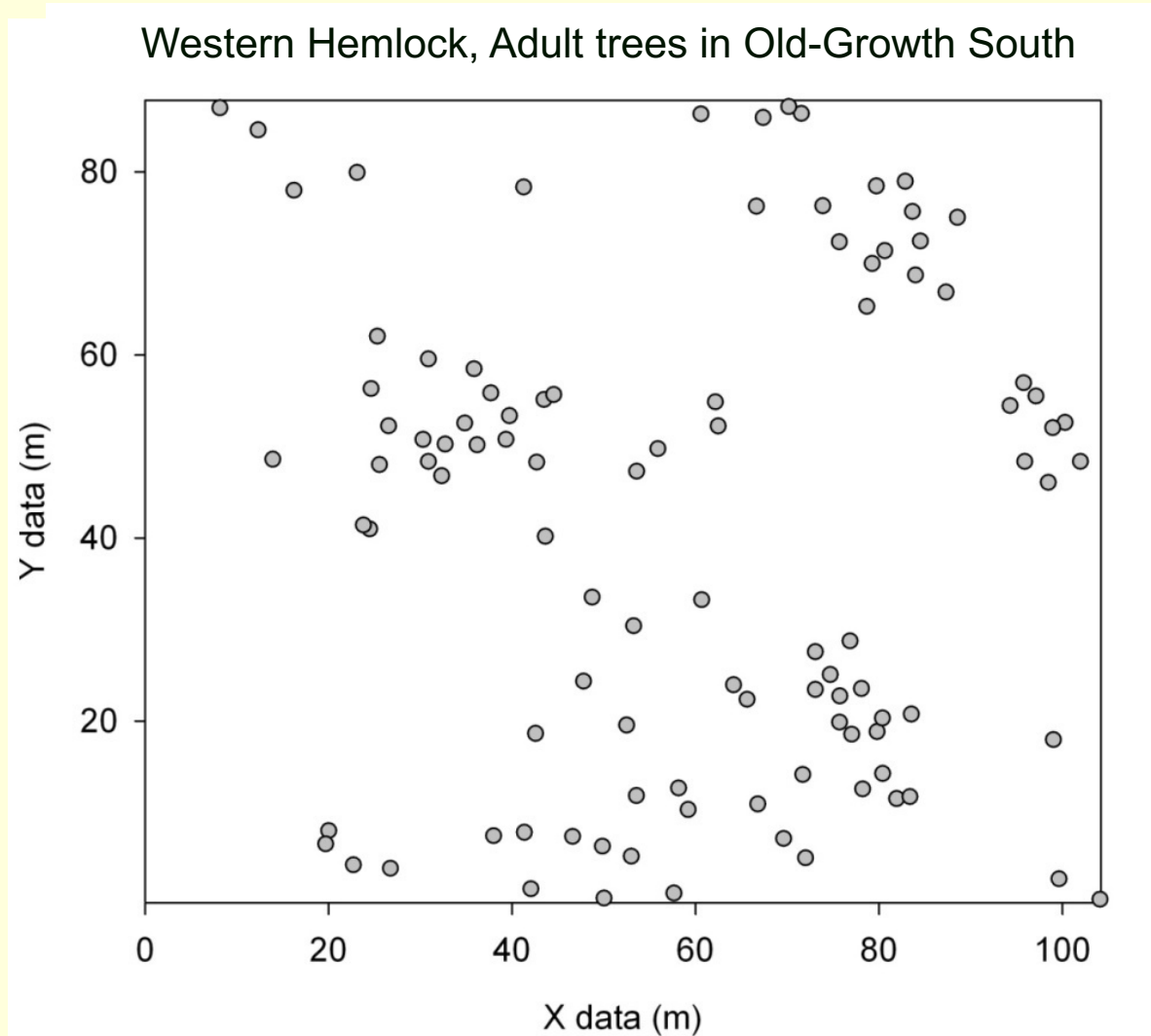


- Douglas-fir
- western hemlock
- western redcedar
- all others

- for all trees measured:
- x-y-coordinates, DBH  
(diameter at breast height)
  - height, status

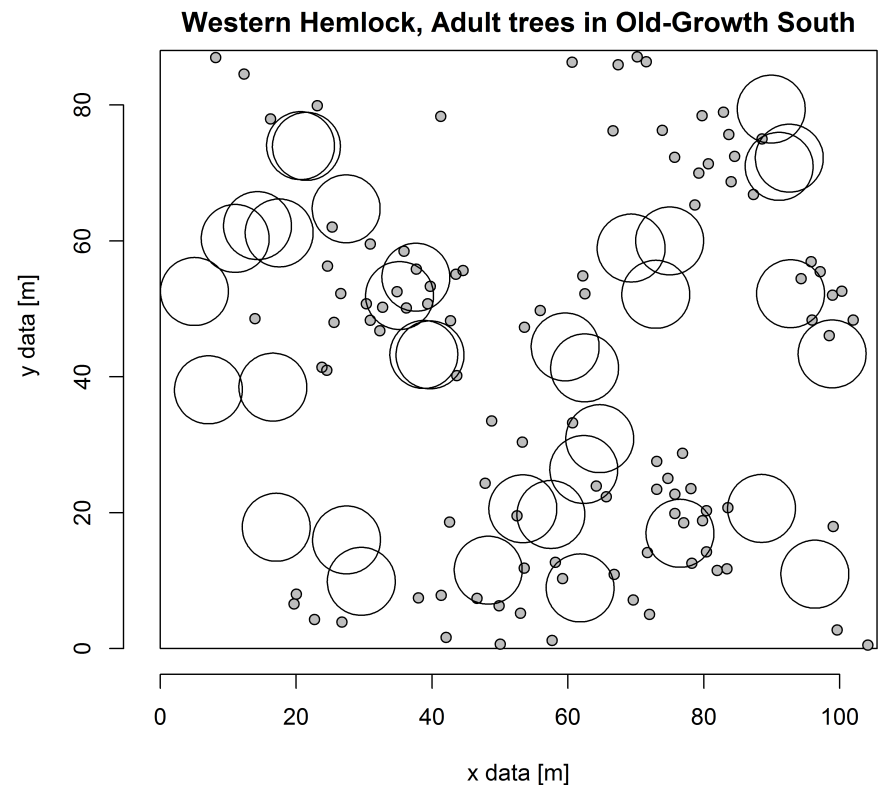
bubble size  
~ DBH

## 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data



## 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

- ⇒ estimate intensity  $\lambda$  by randomly throwing coin (35×)
- ⇒ coin = “*moving window*”  
(two groups: 1 Cent & 2 Euro)
- ⇒  $\lambda$  = absolute number events in samples / number of samples
- ⇒ e.g.: 32 events in  $m = 35$  samples of fixed size  
 $\lambda = 0.914$  events/area



## 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

$$P_{\lambda}(n) = \frac{\lambda^n}{n!} e^{-\lambda}$$

⇒  $P_{\lambda}(n)$  = probability to find  $n$  trees within a circle (of area  $B=1$  unit) for the estimated intensity  $\lambda$

⇒  $P_{0.914}(0) = 0.401 = 40.1\%$

⇒  $P_{0.914}(1) = 0.366$

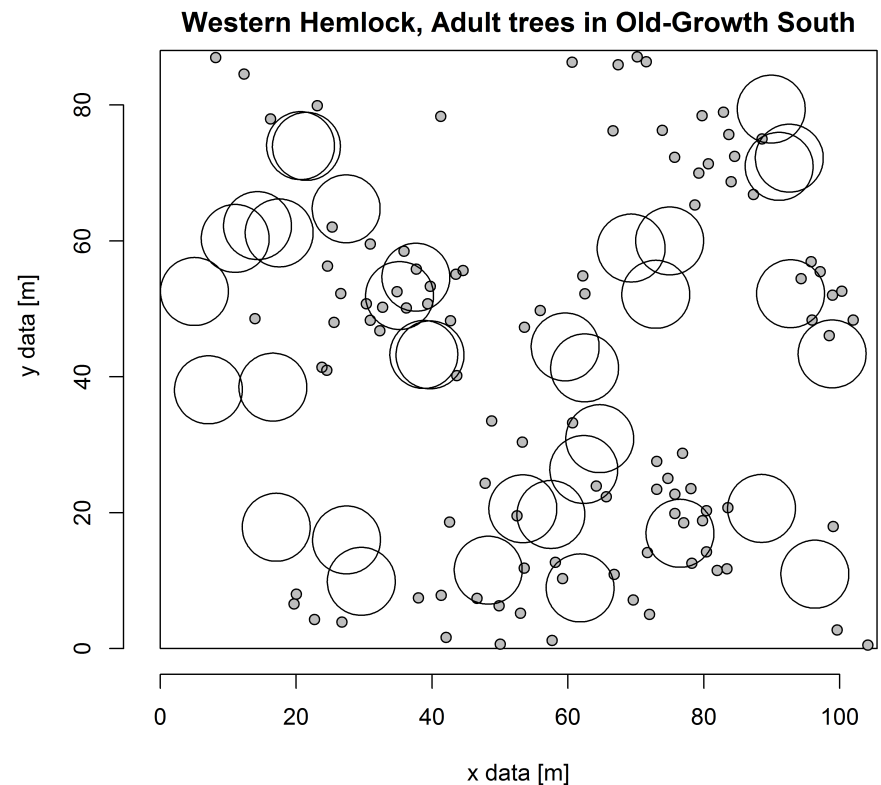
⇒  $P_{0.914}(2) = 0.168$

⇒  $P_{0.914}(3) = 0.051$

⇒  $P_{0.914}(4) = 0.012$

⇒  $P_{0.914}(5) = 0.002$

⇒  $P_{0.914}(6) = 0.000 = 0.03\%$



## 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

$$P_{\lambda}(n) = \frac{\lambda^n}{n!} e^{-\lambda}$$

⇒  $P_{\lambda}(n)$  = probability to find  $n$  trees within a circle (of area  $B=1$  unit) for the estimated intensity  $\lambda$

⇒  $P_{0.914}(0) = 0.401 = 40.1\%$

⇒  $P_{0.914}(1) = 0.366$

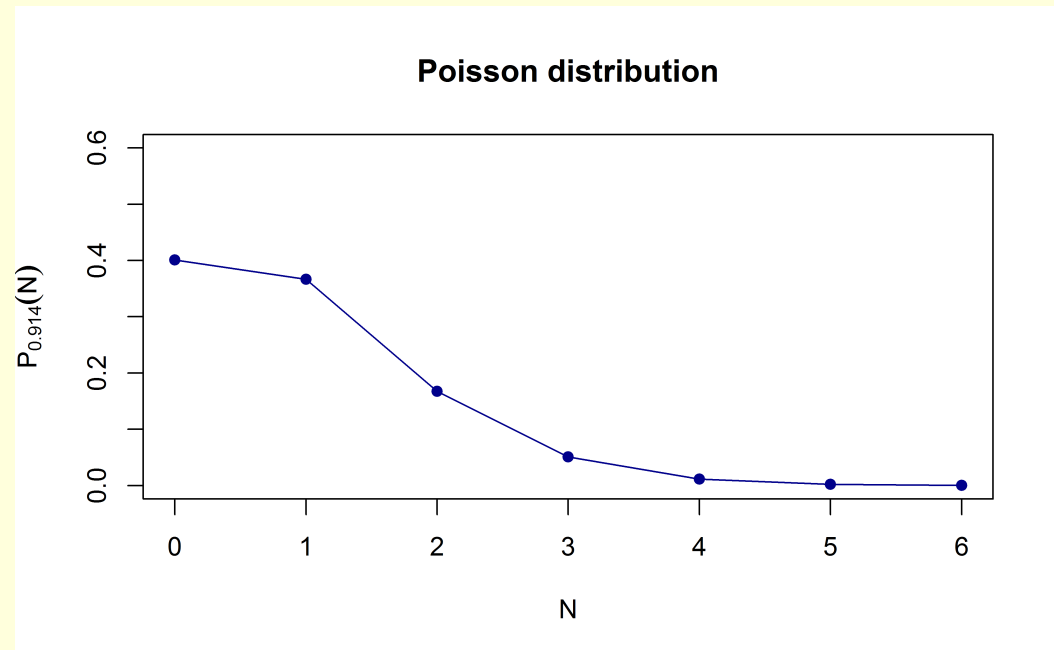
⇒  $P_{0.914}(2) = 0.168$

⇒  $P_{0.914}(3) = 0.051$

⇒  $P_{0.914}(4) = 0.012$

⇒  $P_{0.914}(5) = 0.002$

⇒  $P_{0.914}(6) = 0.000 = 0.03\%$



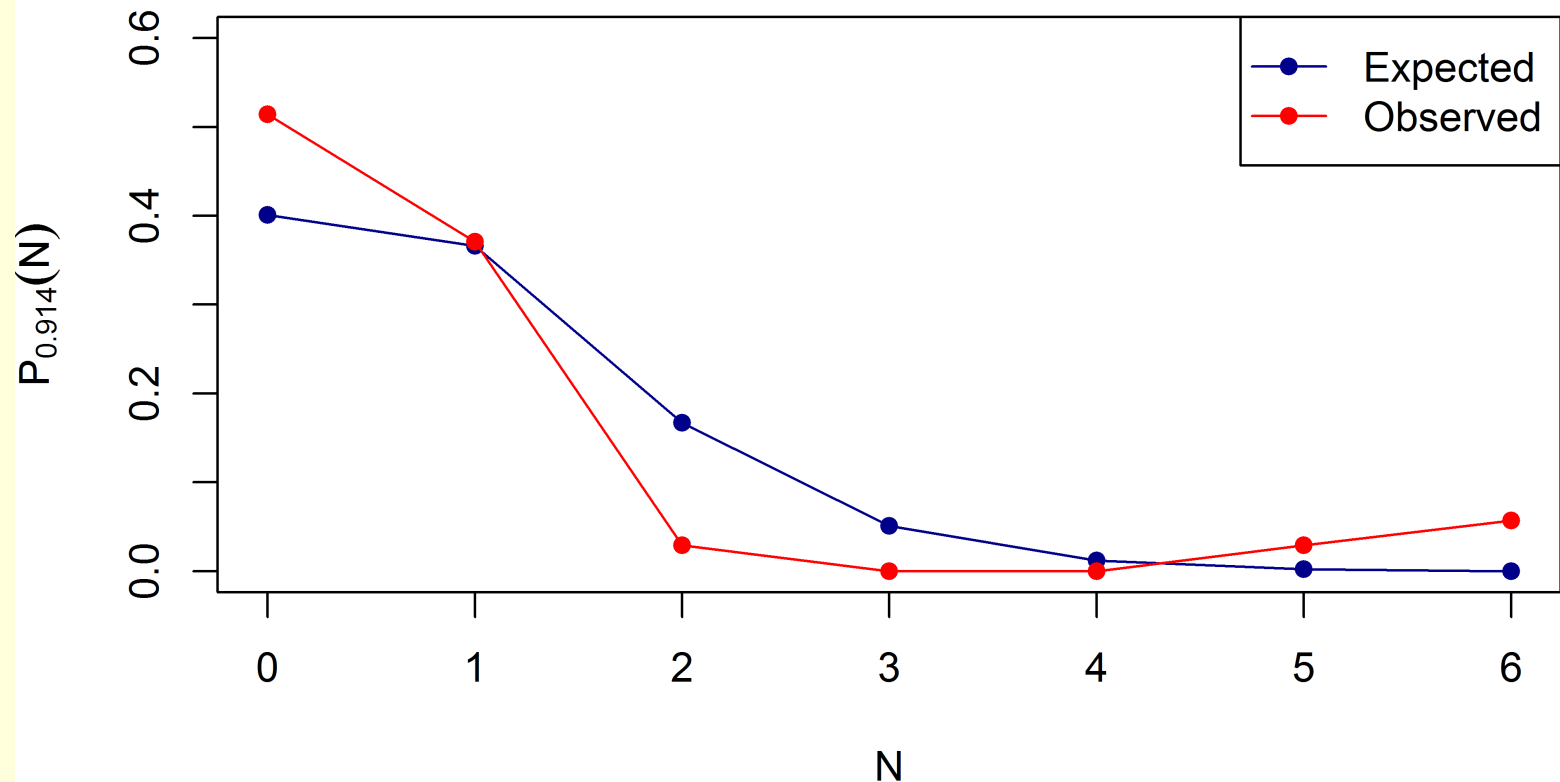


1<sup>st</sup> order properties – comparing theoretical Poisson  
distribution against empirical data

Number ( $n$ ) of events in sample category	$P_{\lambda}(n)$	Expected number of discoveries in sample category $= 35 \times P_{\lambda}(n)$	Observed number of discoveries $x$ in sample category	Observed fraction of discoveries in sample category
0	0.401	14.04	18	0.514
1	0.366	12.81	13	0.371
2	0.167	5.85	1	0.029
3	0.051	1.78	0	0.000
4	0.012	0.42	0	0.000
5	0.002	0.07	1	0.029
6	0.000	0.00	2	0.057

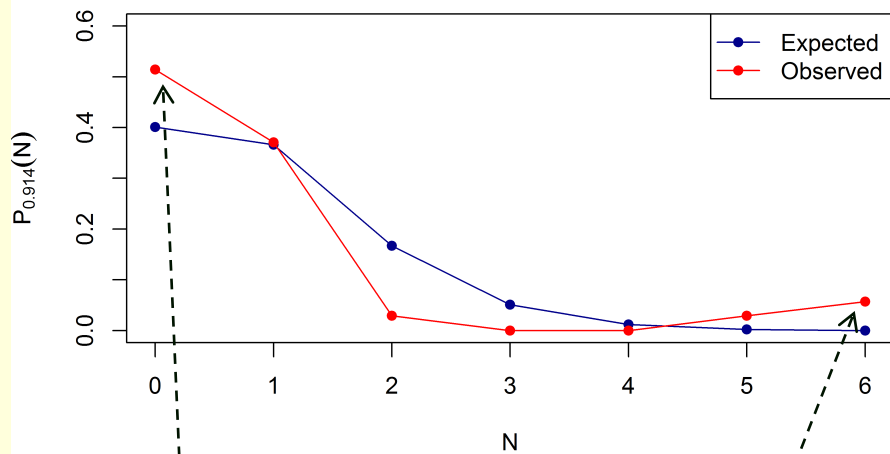
# 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

**Poisson vs. empirical distribution**



# 1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

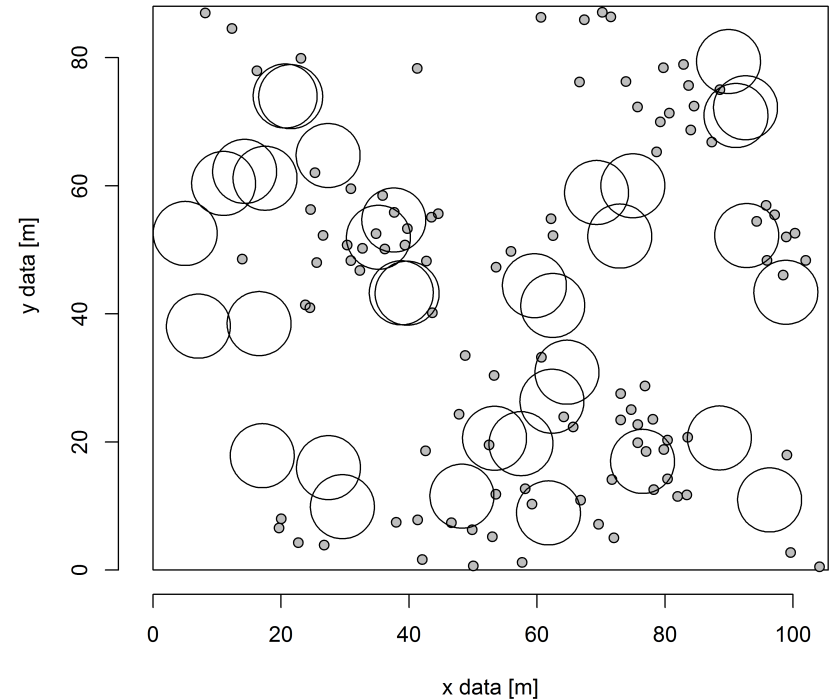
Poisson vs. empirical distribution



„holes“

„clustering“

Western Hemlock, Adult trees in Old-Growth South





1<sup>st</sup> order properties – comparing theoretical Poisson  
distribution against empirical data

.....with chi-square test (because of small sample size)

$H_0$ : Western hemlock adult trees are randomly distributed.

$H_1$ : Western hemlock adult trees are not randomly distributed.

1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

.....with chi-square test (because of small sample size)

$H_0$ : Western hemlock adult trees are randomly distributed.

$H_1$ : Western hemlock adult trees are not randomly distributed.

$$\chi^2 = \sum \frac{(O - E)^2}{E}$$

O = Observed value

E = Expected value

Age Group	Percentage
18-24	~10%
25-34	~35%
35-44	~25%
45-54	~20%
55-64	~15%
65-74	~10%
75-84	~5%
85+	~2%

d.f. =  $k-2 = 1$ ; critical value  $\chi^2_{0.95,1d.f.} = 3.841 (> 3.210) \rightarrow$  **do not reject  $H_0$**

d.f. =  $k-2 = 1$ ; critical value  $\chi^2_{0.95,1d.f.} = 3.841 (> 3.210) \rightarrow$  **do not reject  $H_0$**

1<sup>st</sup> order properties – comparing theoretical Poisson distribution against empirical data

Number ( $n$ ) of events in sample category	Expected number of discoveries in sample category $= 35 \times P_{\lambda}(n)$	Number of observed discoveries in sample category	chi-square $\frac{(O-E)^2}{E}$
0	14.04	18	1.117
1	12.81	13	0.003
2	5.85	1	4.021
3	1.78	0	} 0.235
4	0.42	0	
5	0.07	1	
6	0.00	2	
<div> <div> <div>&gt;1</div> <div>all expected values should be 3 or more</div> </div> <div> <div>2.27</div> </div> </div>		<div> <div>4</div> </div>	
$\Sigma = 5.376$			

d.f. =  $k-2 = 2$ ; critical value  $\chi^2_{0.95, 2 d.f.} = 5.991$  ( $> 5.376$ ) -> **do not reject  $H_0$**

## 2<sup>nd</sup> order properties

Is the pattern is not CSR, but is it clustered or regular?

under CSR the variance  $\sigma^2 = \bar{x}$     Index of dispersion  $I = \frac{s^2}{\mu} = \frac{\frac{1}{m-1} \sum_{i=1}^m (x_i - \bar{x})^2}{\frac{1}{m} \sum_{i=1}^m x_i}$



## 2<sup>nd</sup> order properties

Is the pattern is not CSR, but is it clustered or regular?

under CSR the variance  $\sigma^2 = \bar{x}$  Index of dispersion  $I = \frac{s^2}{\mu} = \frac{\frac{1}{m-1} \sum_{i=1}^m (x_i - \bar{x})^2}{\frac{1}{m} \sum_{i=1}^m x_i}$

if  $I > 1$ , pattern is clustered

if  $I < 1$ , pattern is regular

$I$  for Western hemlock adults = 2.726 -> **trees are clustered (n.s.)**  
(at scale of moving window)