

# Prediction of tree age distribution based on survival analysis in natural forests

-a case study of preserved permanent plots in the University of Tokyo Hokkaido Forest, northern Japan-

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# Tree mortality and survival analysis of natural forests

- **Tree mortality** is a crucial element of **population dynamics**.
- It is important for the **maintenance of biological and structural diversity** in forested ecosystems.

(Franklin et al 1987; McComb and Lindenmayer 1999)

- **Natural disturbances** produce **structural complexity** in a forest, resulting in deaths of individual trees; this plays a key role in various ecosystem processes and functions.

(Pickett and White 1985)

- Improved predictions of tree mortality allow
  - to project forest development
  - to estimate the economic and habitat values of forest (Price 1989; Hunter 1999)
  - to assess the impact of environmental stresses and disturbances on forests (Kienast 1991)

# Estimate tree mortality- plantation vs natural

- Plantation forests – the event is harvesting of stands
- Uneven aged forests- the event is mortality of individual trees
- **The problem is – event of death not happen every time – in uneven aged forests**
- Tree age- enables to predict the mortality of trees accurately

## Alternatives

DBH

Dominant height

Basal area

Growth rate completion index



- ✓ Common approaches – to measure tree mortality
- ✓ These can avoid age-based methods

- However, studies focusing on the survival of **uneven aged forests** are **comparatively rare** because of difficulty of measuring tree age.

# Why survival analysis on UTHF?



The University of Tokyo  
Hokkaido Forest (UTHF)

- natural forest management based on selection cutting
- Define as the Stand based Silvicultural Management System (SSMS)

- 10–17% of the stand volume is harvested by single-tree selection at a cutting cycle of 15–20 years
- Remove the defective trees such as diseased, senescent, non-vigorous, and twisted ones.

**The productivity of harvested trees can be enhanced by early identification of likely-to-die or decaying trees**

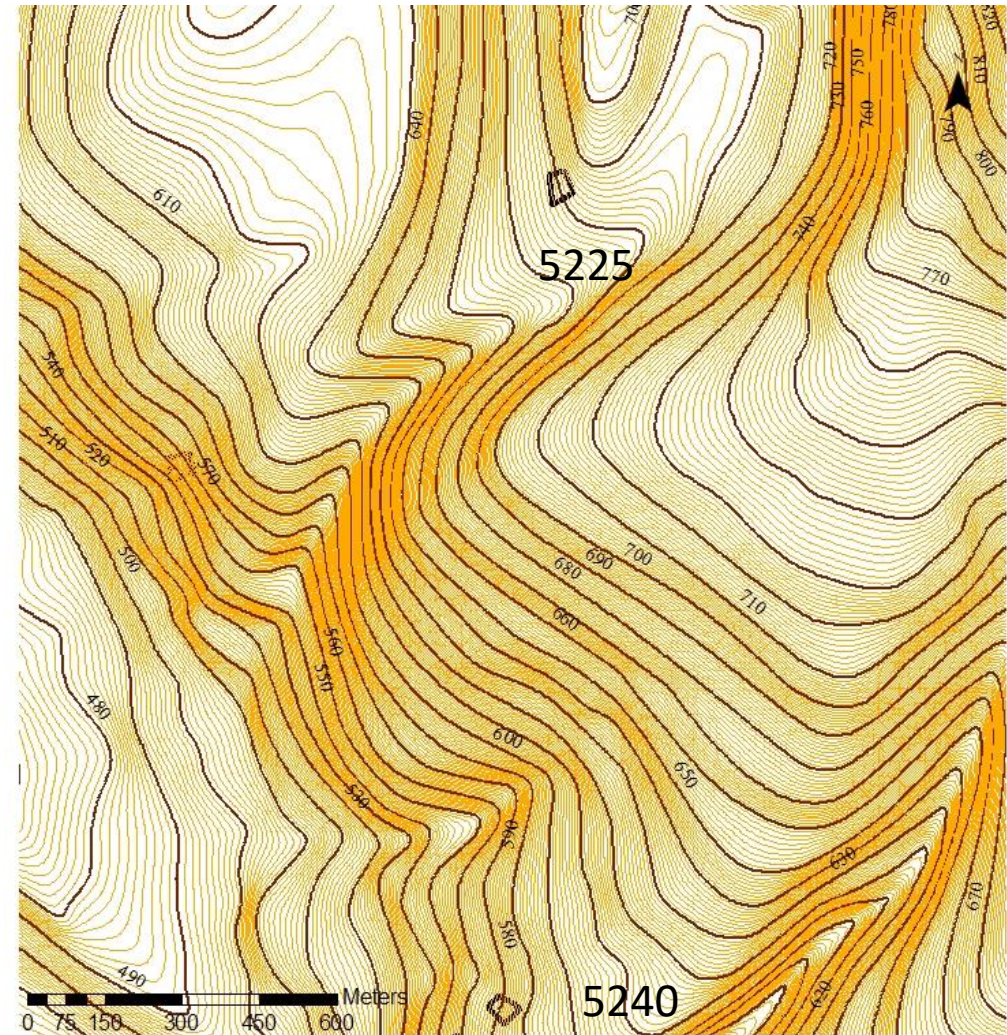
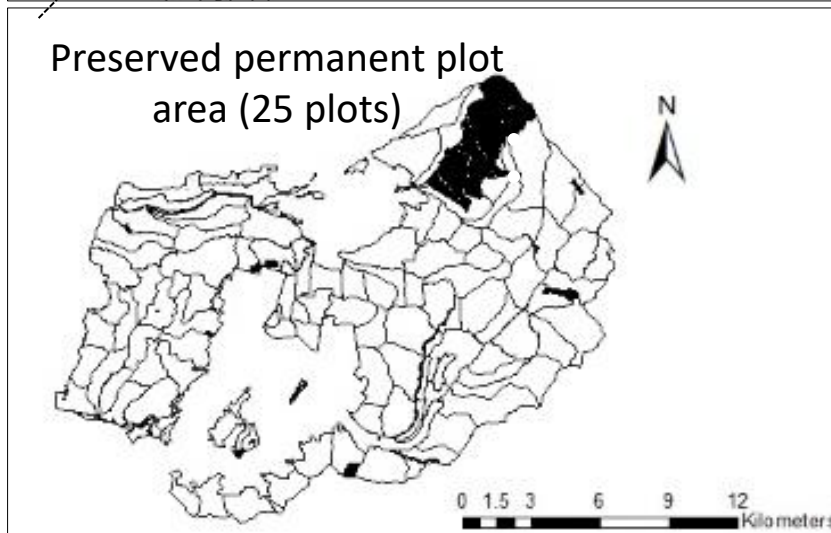
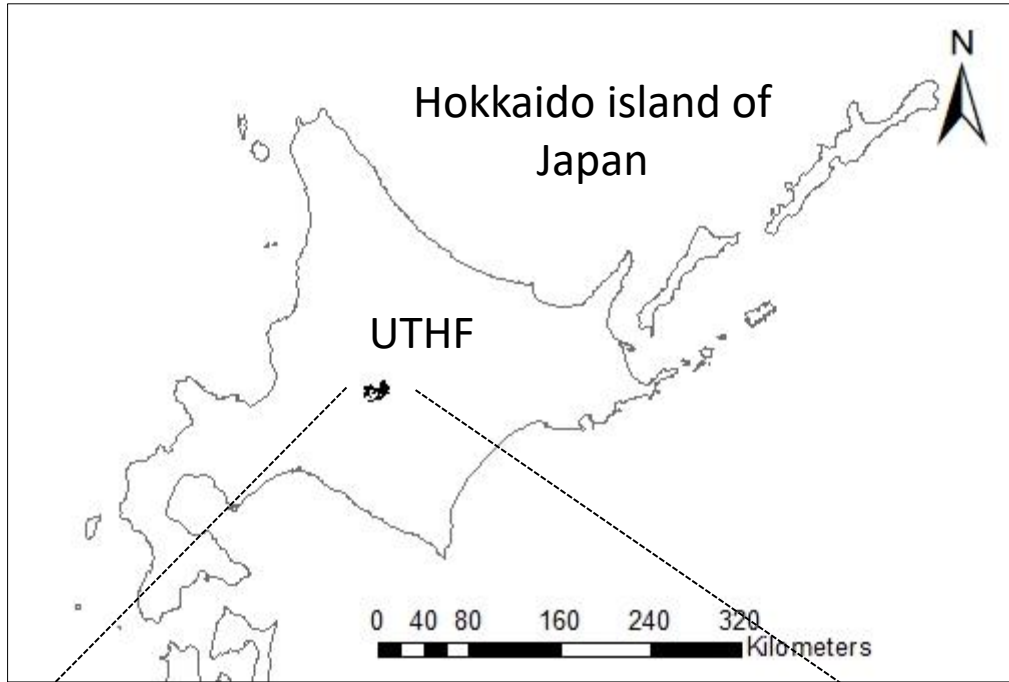
## **Aim of the study**

Estimate the survival probabilities of an uneven aged forest stand in northern Japan

## **Specific objectives of the study**

1. Estimate the mean lifetime of trees based on parametric analysis
2. Prediction of age distribution of living and dead trees

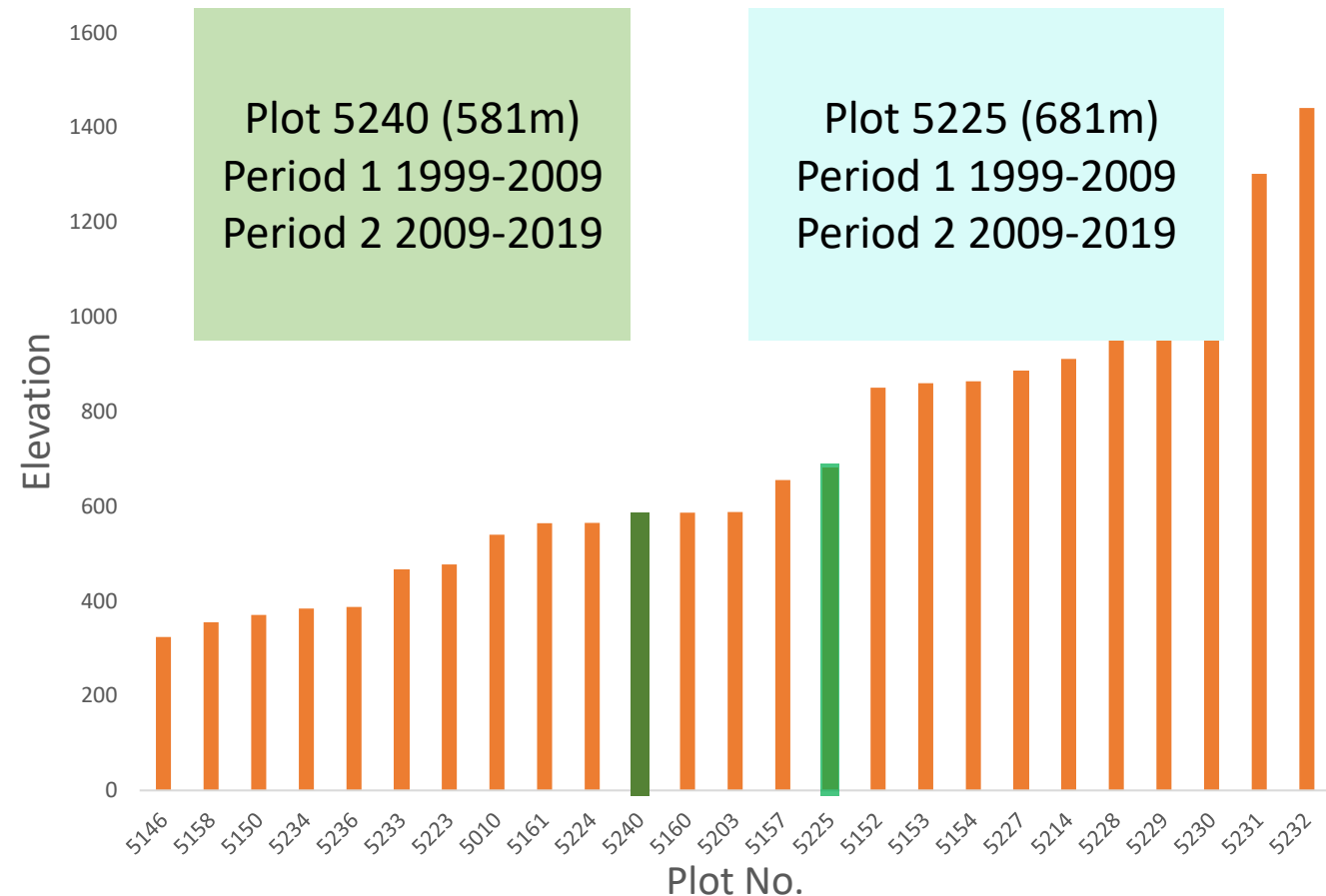
# Study area



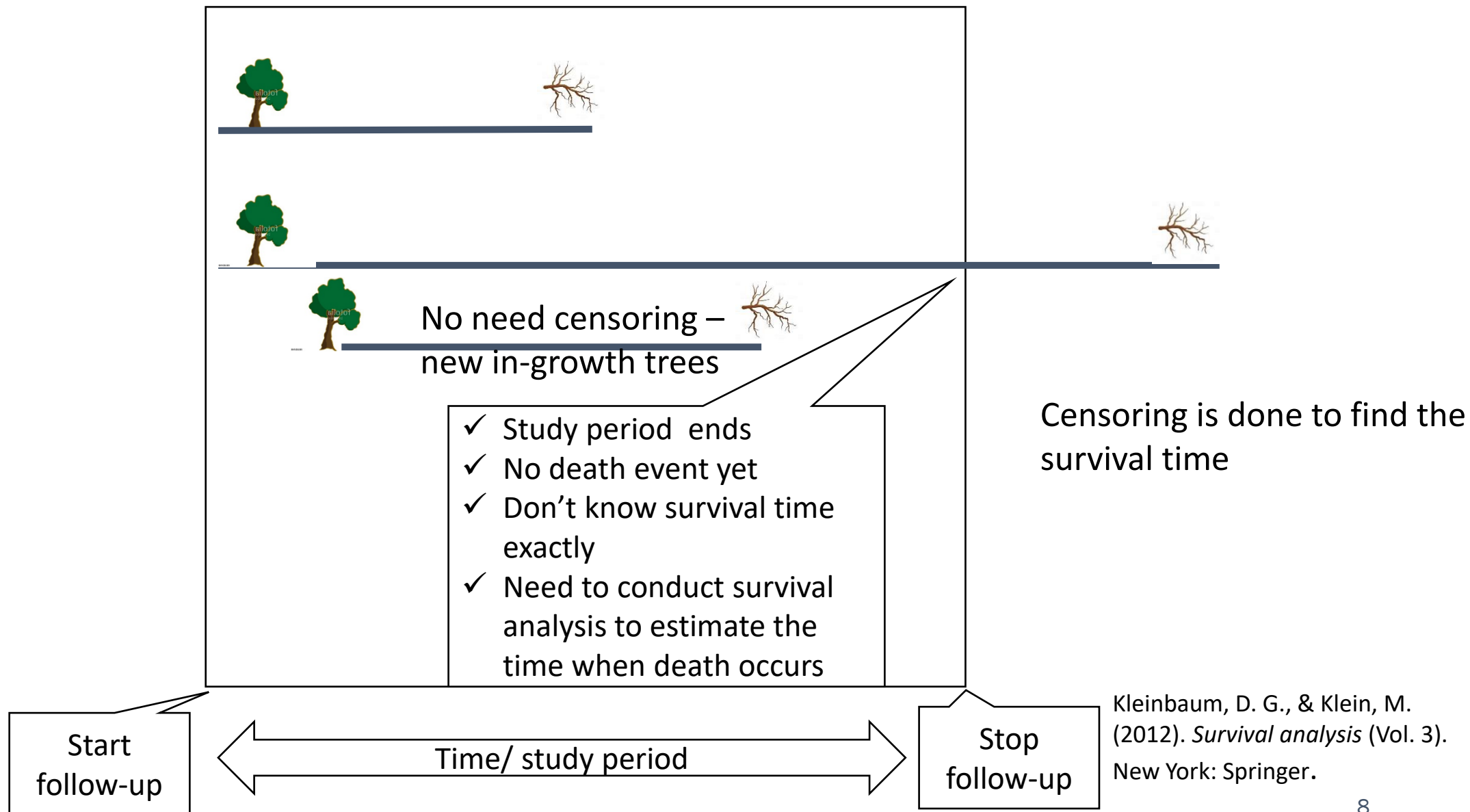
Two preserved permanent plots

## Study area cont.

- Main vegetation cover - **uneven-aged mixed forests** with coniferous and broad-leaved tree species
- Why preserved permanent plots for this study ?
  - Availability of **periodical measurements** (growing stock, cutting yield, and mortality )
  - No any management practice
  - Readiness of temporal dynamics
- Typhoon in 2016 – affected to northern part of the UTHF

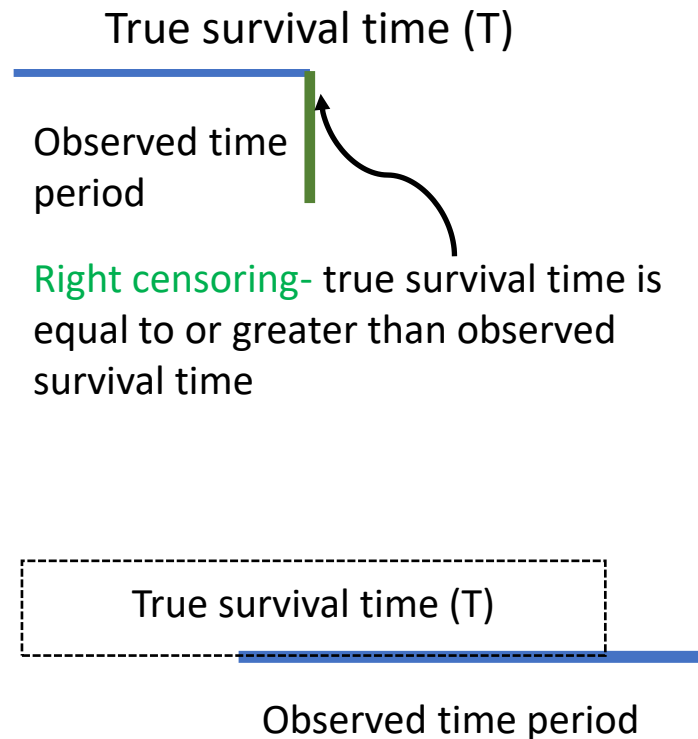


# Survival analysis





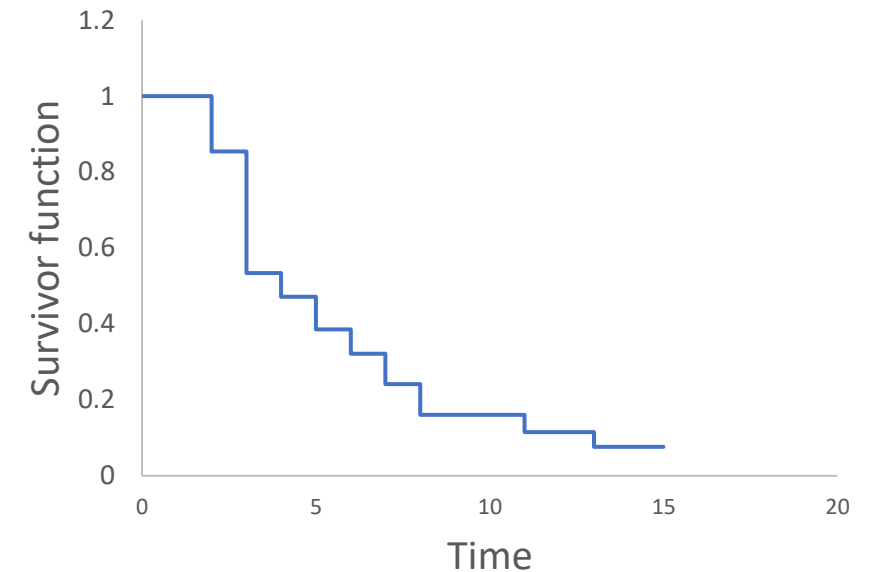
# Survival analysis cont.



**Left truncation** - an object is not observed from the start of the study but instead enters the study later

## Kaplan Meier survival curve (Kaplan, 1958)

- ✓ Explains how to deal with incomplete observations
- ✓ Use nonparametric tests (not rely on numbers, use rankings/ ranges/ order of sorts)



Kleinbaum, D. G., & Klein, M. (2012). *Survival analysis* (Vol. 3). New York: Springer.

# Survival analysis cont.

## Survival analysis on target trees

□ The survival time distribution (1-5 equations) was decided by following Kleinbaum and Klein (2011).

✓ Probability function of trees died at the age class  $t$  in the observation period;

$$\Pr(t - 1 < T \leq t | T > t - 1) \quad (1)$$

( $T$  represents age after in-growth)

✓ Trees survived age class  $t$  in the observation period;  $\Pr(T > t | t > t - 1)$  (2)

✓ Survival probability ( $r_t$ );  $\Pr(T > t - 1) = r_t$  (3)

✓ Mortality probability ( $q_t$ );  $\Pr(t - 1 < T \leq t) = q_t$  (4)

✓ Mortality rate ( $p_t$ );  $p_t = \frac{q_t}{r_t}$  (5)

□ Likelihood function ( $L$ ) of the observation for whole trees (Hiroshima 2006)

$$L = \prod_t \Pr(t - 1 < T \leq t | T > t - 1)^{d_t} \Pr(T > t | T > t - 1)^{a_t} \quad (6)$$

$$\text{ML estimator ; } \log L = 0 \quad \hat{P}_t = \frac{d_t}{a_t + d_t} \quad \hat{r}_t = \prod_{k < j} (1 - \hat{P}_k)$$

$$= \prod_{k < t} \left[ 1 - \frac{d_t}{a_t + d_t} \right]$$

# Survival analysis cont.

- **Log rank test** (Mantel, 1966) - to find the statistical significance between periods and plots

$$\text{Log rank statistic} = (O - E)^2 / \text{Var} (O - E)$$

Expected No. of deaths (E), Observed No. of deaths (O)

- **Parametric analysis**

- ✓ Use to assume probability distribution function (PDF) tree mortality ; e.g. **Weibull**

- ✓ Analyze future age distribution of living and dead trees

$$f(T; m, k) = \frac{k}{m^k} T^{k-1} e^{-\left(\frac{T}{m}\right)^k}$$

PDF parameters of  $m$  and  $k$  of the Weibull distribution

$$c_t = (a_{t-1} + d_{t-1})(p_{t-1}) \quad c_t = \text{No. of dead trees of relevant period}$$

$$b_t = (a_{t-1} + d_{t-1})(1 - p_{t-1}) \quad b_t = \text{No. of dead trees of relevant period}$$

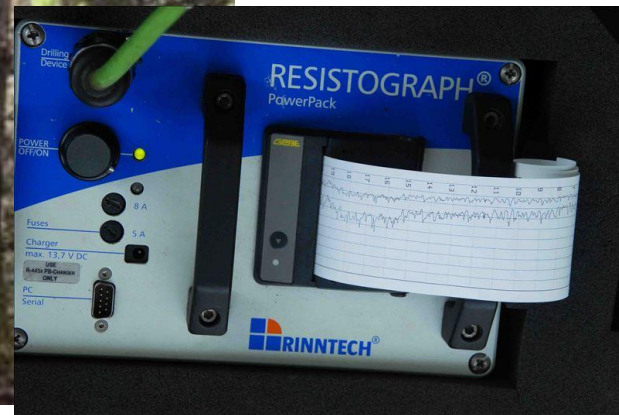
# Field data – How to detect tree age?

Trees DBH $\geq$ 5cm	5225		5240	
	Period 2000-2009	Period 2010-2019	Period 2000-2009	Period 2010-2019
Living trees	192	189	184	187
Dead trees	21	48	34	27
	<b>213</b>	<b>237</b>	<b>218</b>	<b>214</b>



## To detect tree age

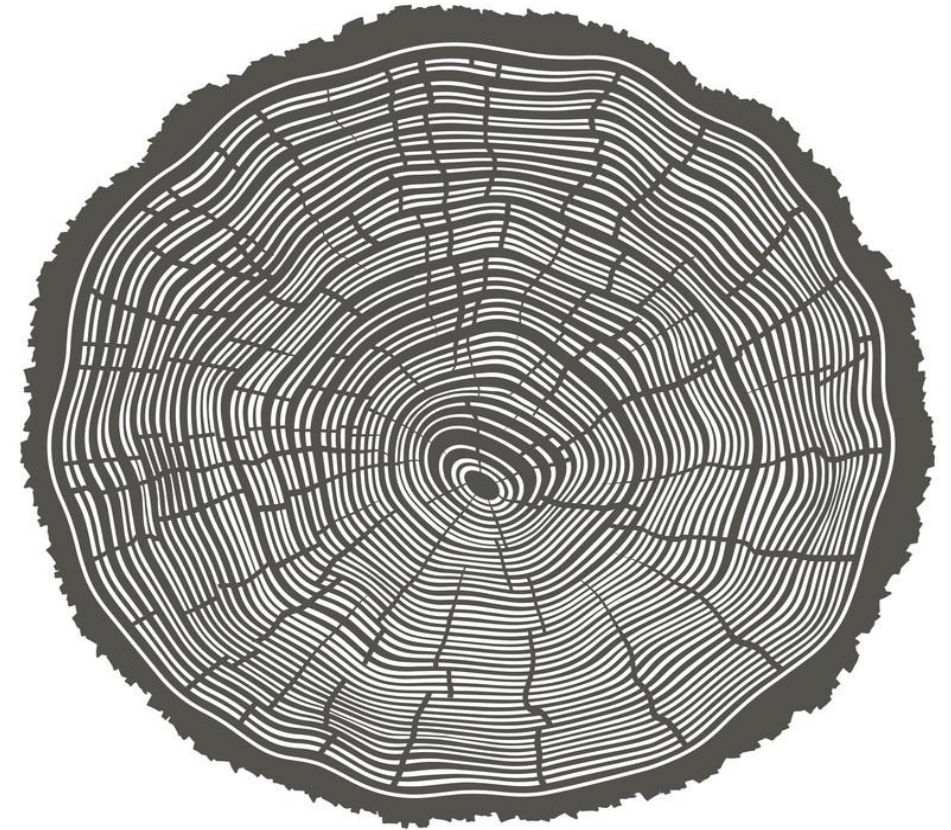
- Conventional destructive methods (e.g. increment borer) ❌
- RESISTOGRAPH
  - ↓
  - ✓ Semi-nondestructive method
  - ✓ Resistance drilling measurement

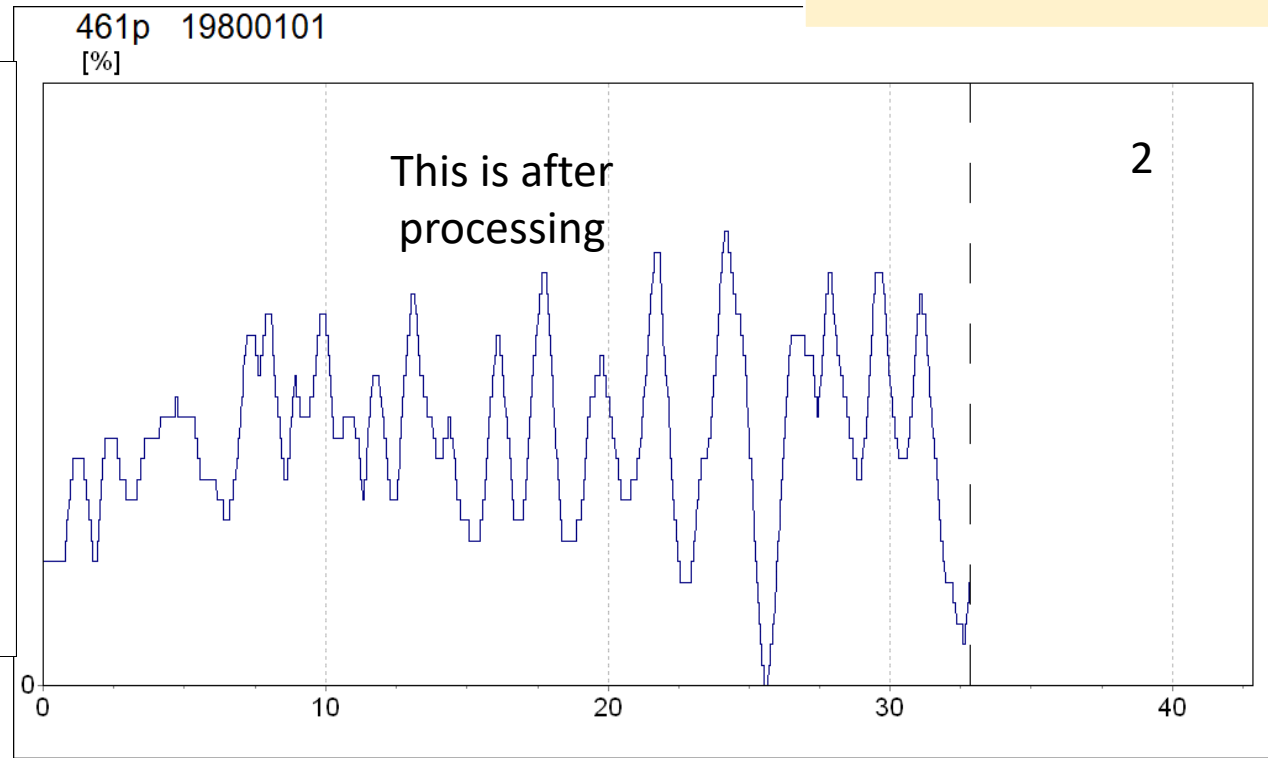
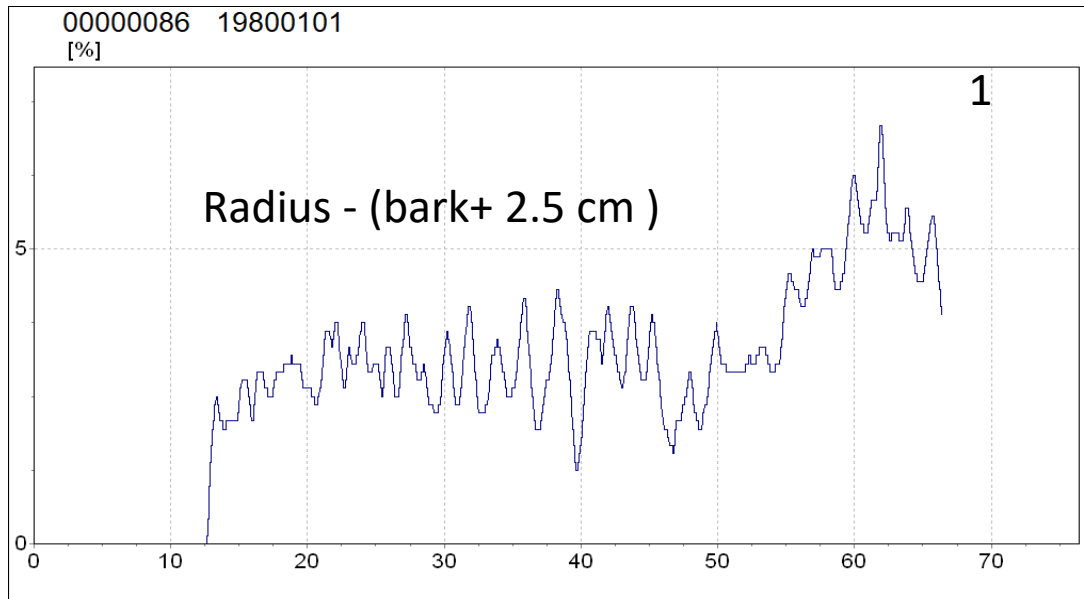


$\geq$  5 cm DBH trees (Living trees, dead trees, new in-growth trees)

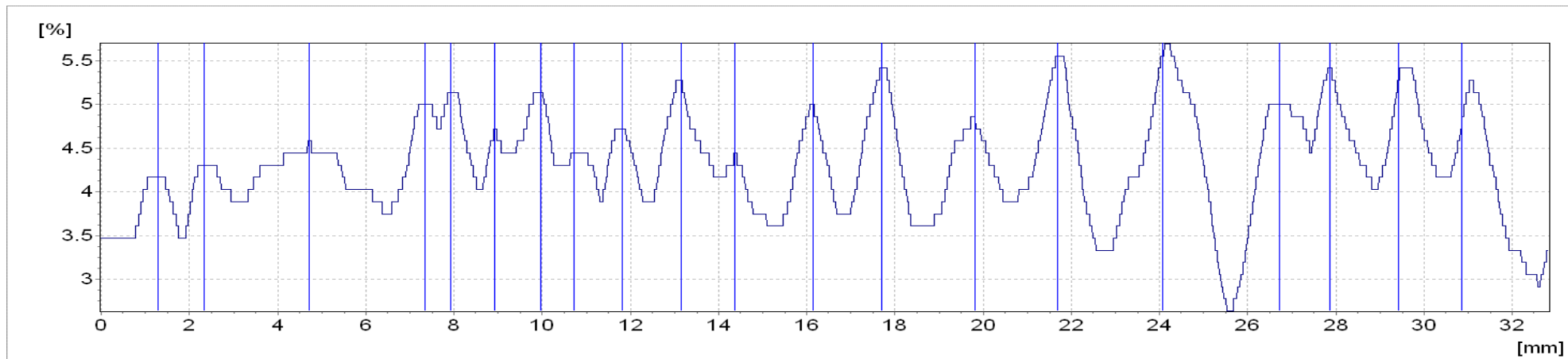
## Field data cont.

- RESISTOGRAPH measurements
  - ✓ Processing
  - ✓ analyzing
- **DECOM™** - A specific software to read tree rings
- Tree ring limits are automatically or manually marked by DECOM™.





This is after analyzing



# Age class estimation

- Estimations done using simple three-dimensional equations

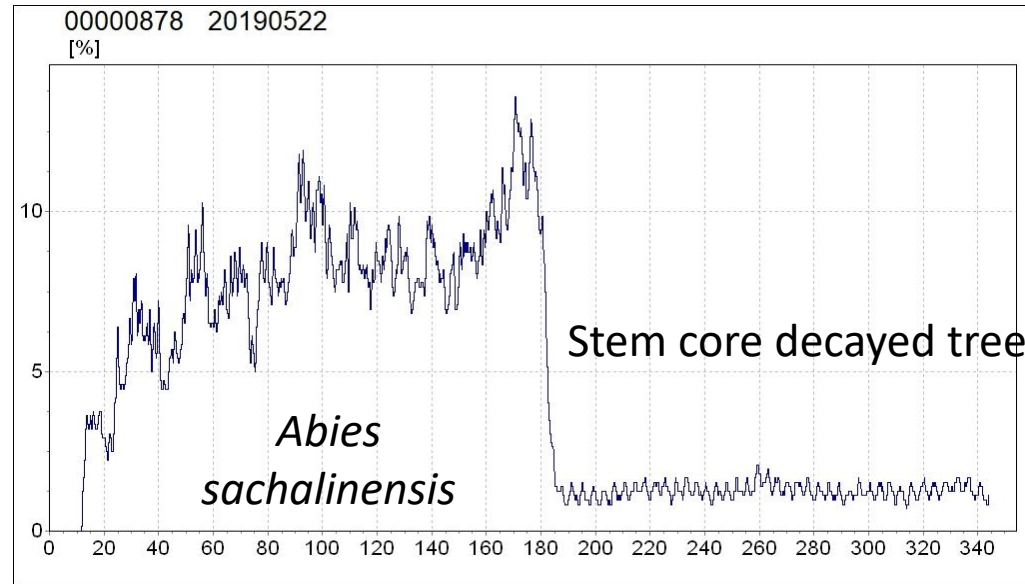
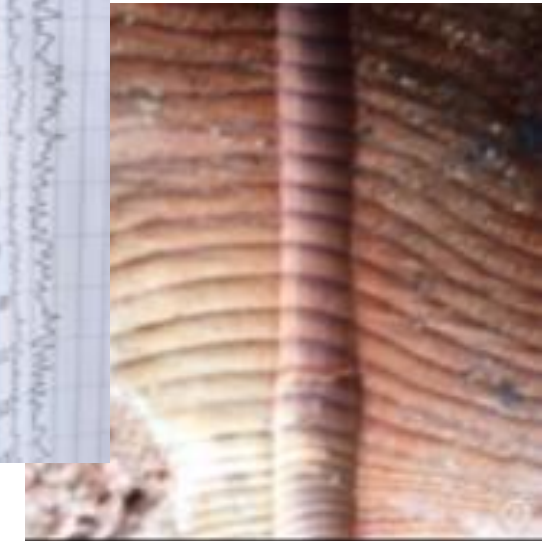
Plot 5240 – 45/214

Plot 5225 – 55/237

e.g. *Abies* spp.  $y = 0.000005w^2 - 0.0052w^2 + 0.9707w$  ( $R^2 = 0.6438$ )

*Picea* spp.  $y = 0.000005w^3 - 0.0032w^2 + 0.9122w$  ( $R^2 = 0.8264$ )

- Validated with actual wood discs for each species



# Inventory data

- ✓ Preserved permanent plots,
  - DBH measured at 5 or 10 - year intervals
  - In growth and mortality is recorded
  - Tree characteristics/ defects identified

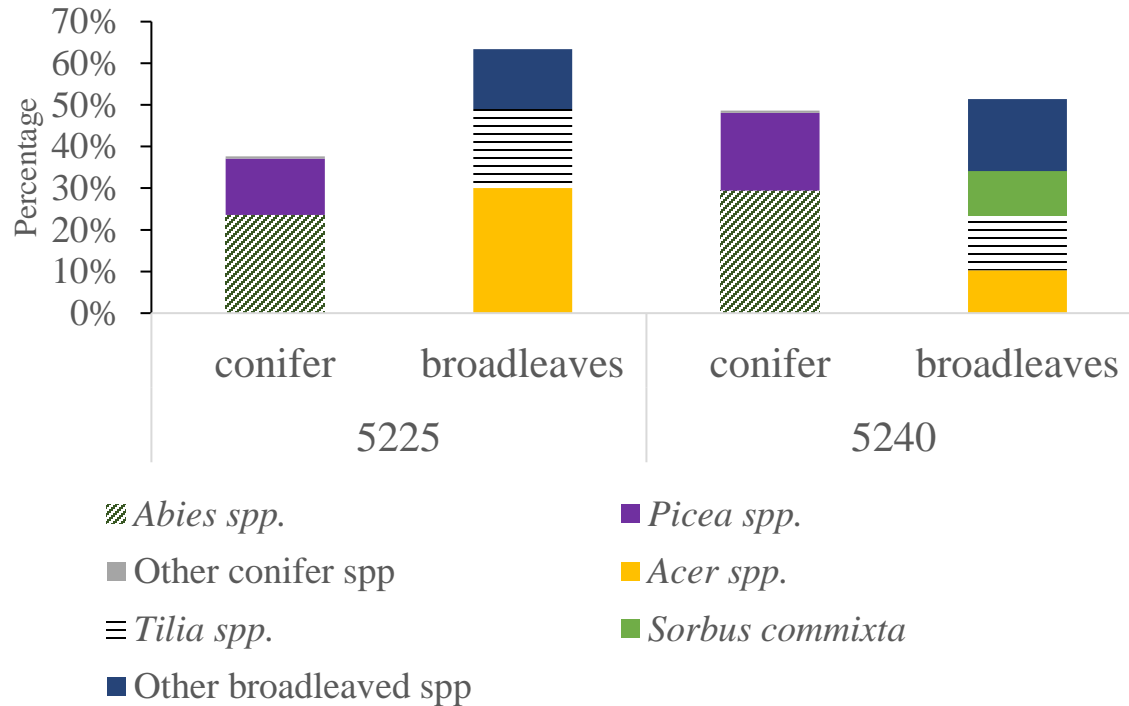
Tree ID	Species	19740614	Alive/dead	Traits	19790926	Alive/dead	Traits	19840712	Alive/dead	Traits	19890810	Alive/dead	Traits	19940715
1	81	220		0	238		0	262		0	271		0	290
4	2	217		0	235		0	257		0	275		0	292
6	4	241		0	244		0	256		0	257		17	262

Tree id	Spp.	tree defects	Wind/ Non wind
7		2standing dead tree	NW
19		standing dead tree, break at	
32	72	root part	W
38	72	tilt	W
59	3	Falling	W
61	72	Falling	W
62	72	Falling	W
82	3	Falling	W
86	3	standing dead tree	NW
90	72	tilt	W
93	3	standing dead tree	NW
97	2	standing dead tree	NW
106	72	Falling	W
122	2	standing dead tree	NW
134		Falling	W

Cause of mortality categorized based on cross-sectional data/field observation

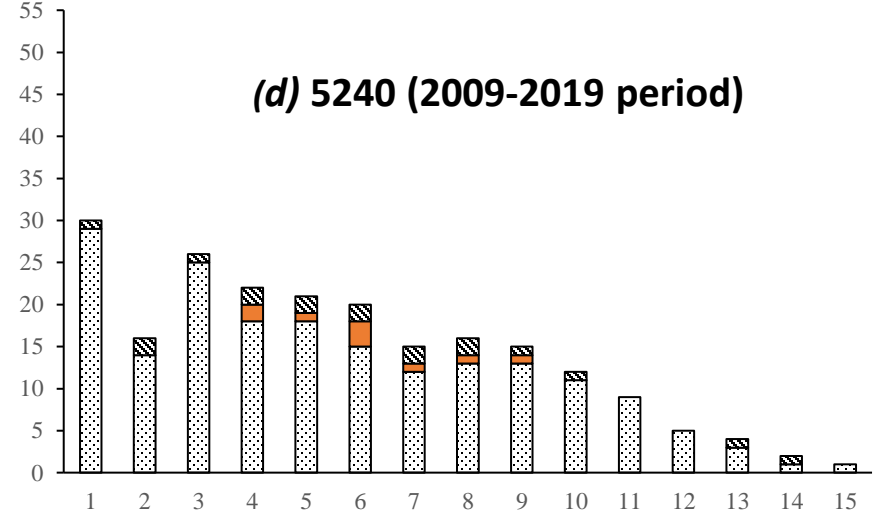
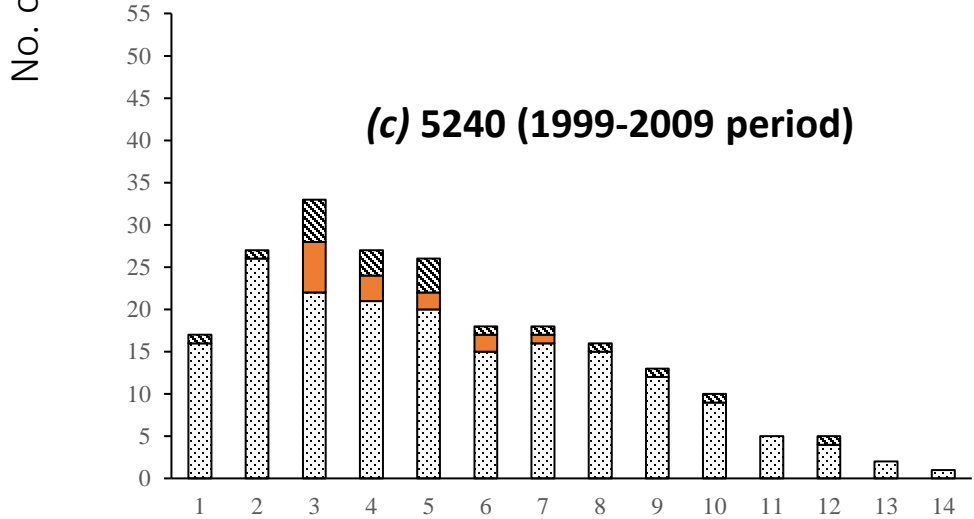
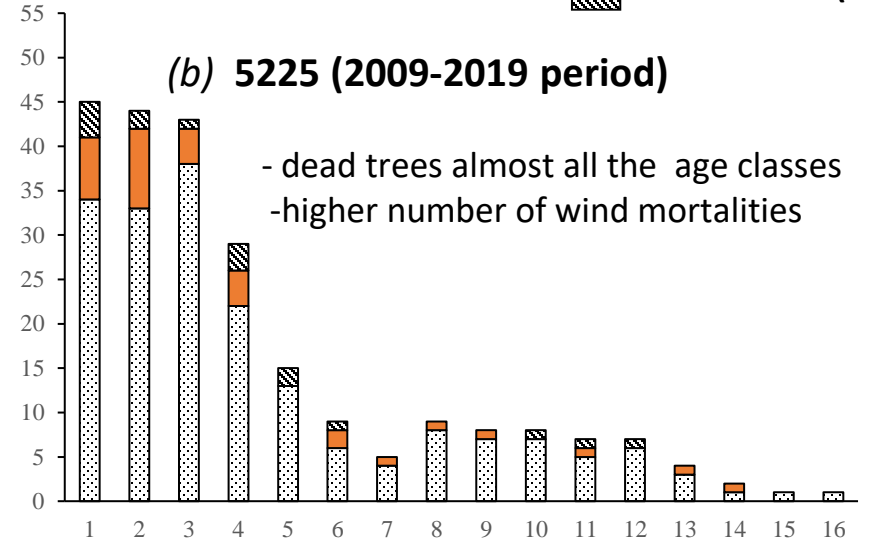
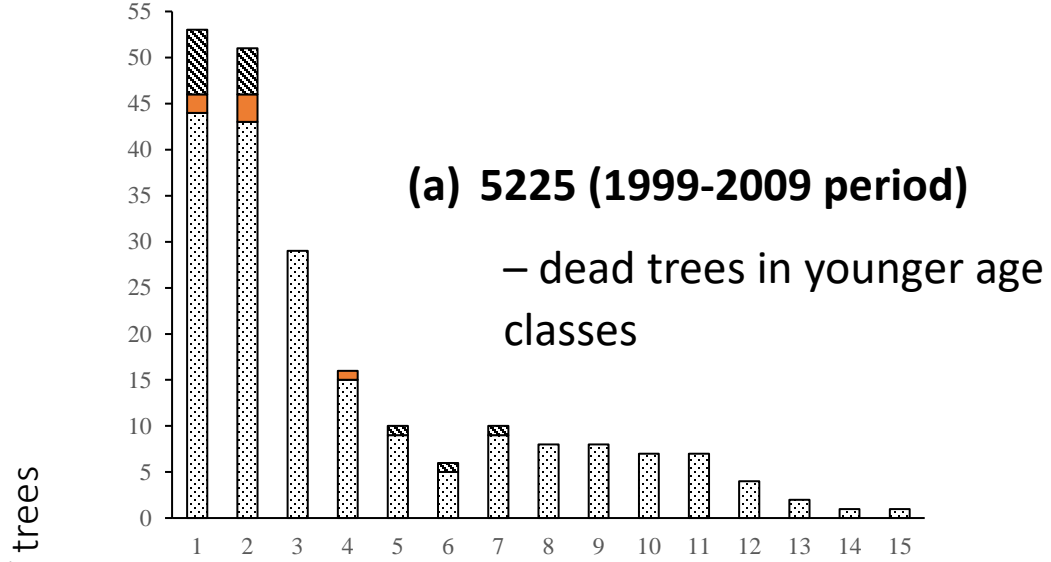
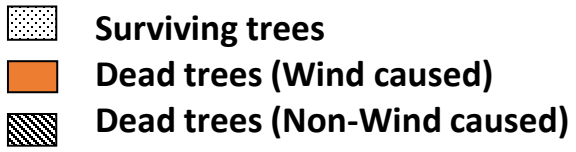


# Species composition



- Observation period 2 (2010-2019)
- 5225 – 237 trees (13 species),  
major species - *Acer urkrunduense* (29.1%)  
*Abies sachalinensis* (23.6%)
- 5240 – 214 trees (16 species),  
major species - *Abies sachalinensis* (29.4 %)  
*Picea jezoensis* (19.2%)

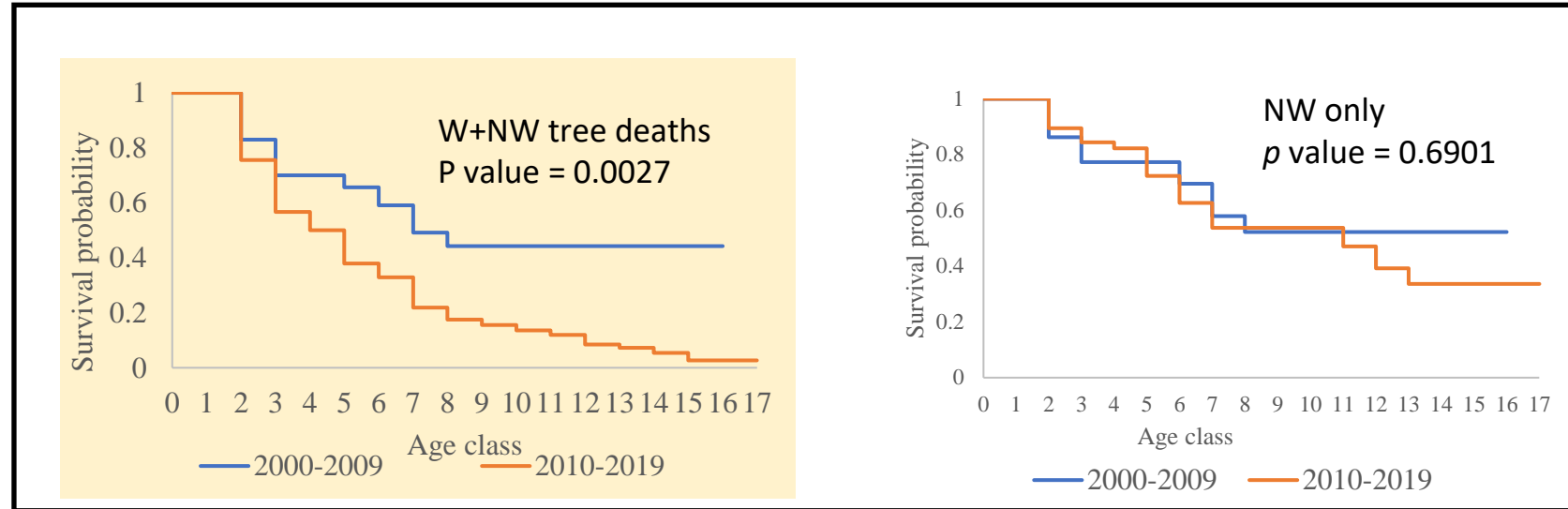
# Age class distribution – 2 plots



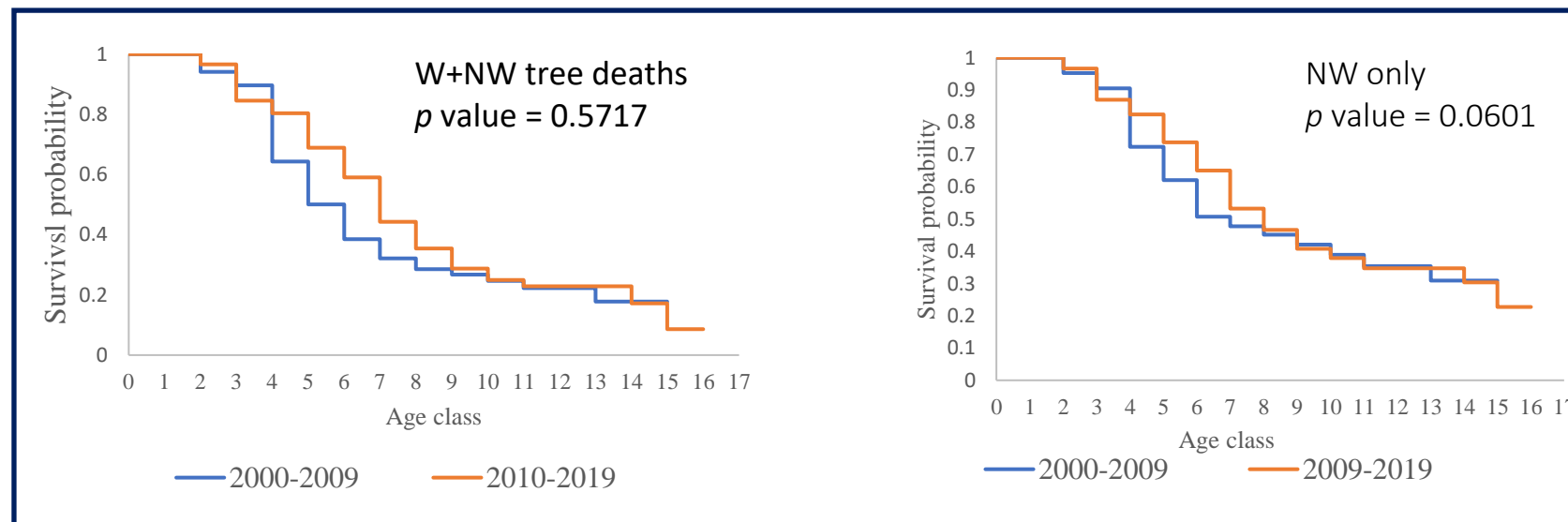
Age class

# Stand stability between periods

5225

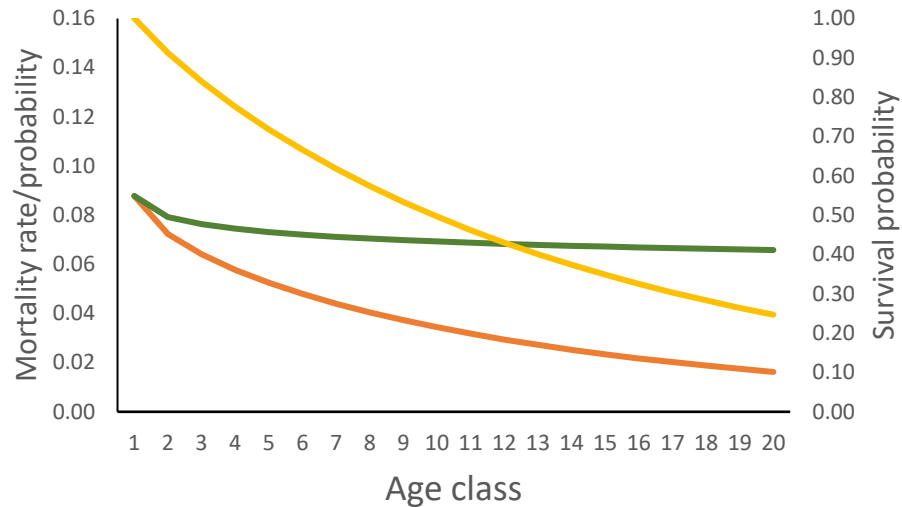


5240



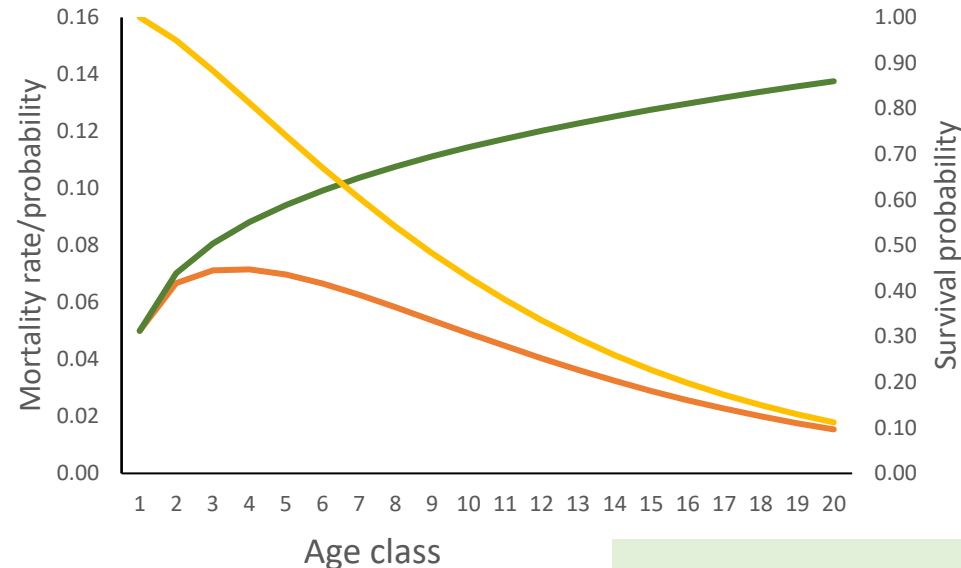
- Only plot 5225 affected with 2016 typhoon during period 2
- Abiotic factors affected on different typhoon effects even with proximity (5240 located on the foot of small plateau – so it could avoid severe wind damage)
- Therefore, Kaplan Meier curves were not stable over the time
- Wind caused deaths were excluded – during further analysis

# Parametric analysis – non wind (NW) mortalities of period 2009-2019



— Mortality probability  
 — Mortality rate  
 — Survival probability

- ✓ 5225 period 2 (NW tree deaths)
- ✓ Mean 13.7
- ✓ Variance 219.9
- ✓ Scale parameter – 13.21
- ✓ shape parameter ( $k$ ) – 0.925

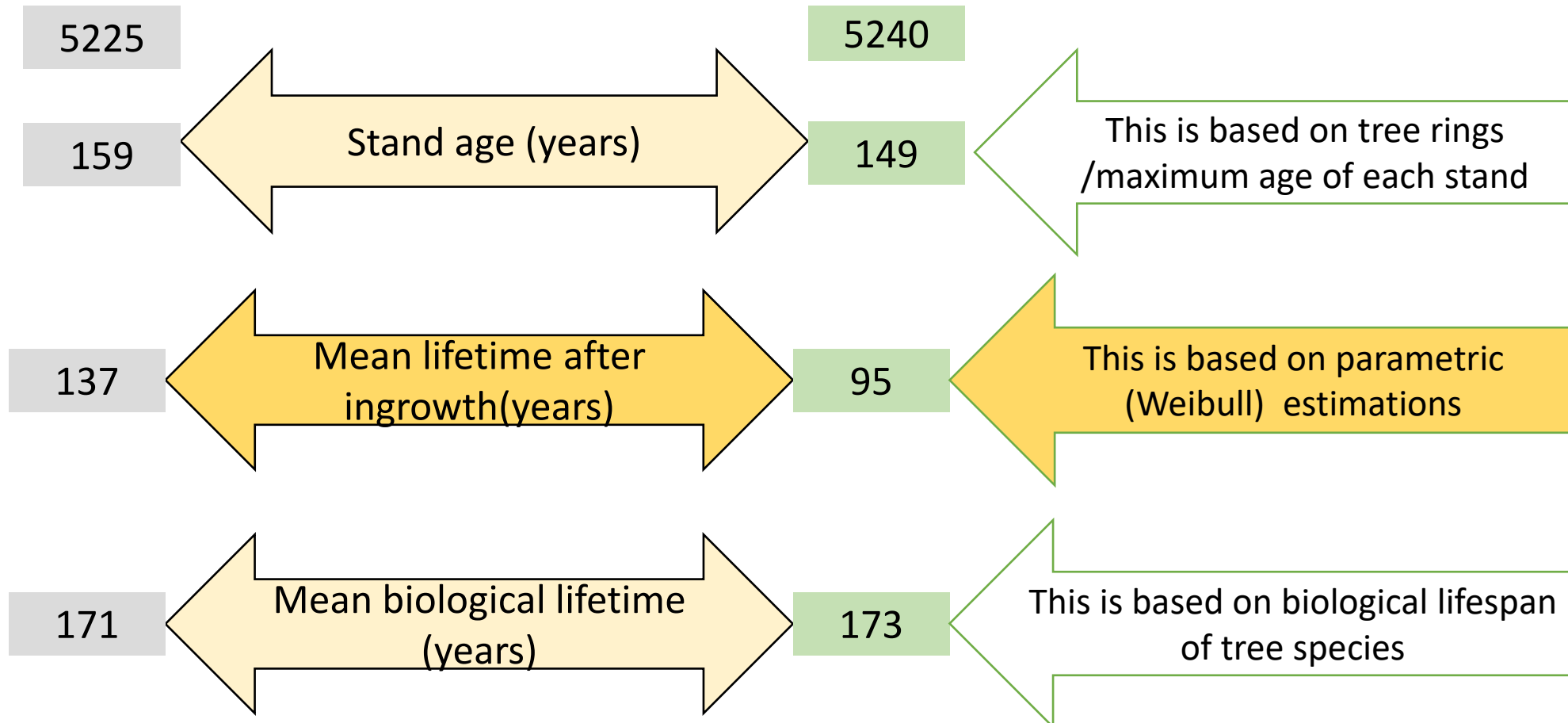


— Mortality probability  
 — Mortality rate  
 — Survival probability

- ✓ 5240 period 2 (NW tree deaths)
- ✓ Mean 9.5
- ✓ Variance 56.6
- ✓ Scale parameter – 10.27
- ✓ shape parameter( $k$ ) – 1.275

- Probability density function represents
  - ✓ Mortality probability (shape and scale parameters)
  - ✓ Mean
  - ✓ Variance
- Form of the survival probability – determined by  $k$
- **Mean** value equivalent to **mean lifetime of the stand**

# Maturity state of the stand



Mean lifetime and stand age - near to mean biological lifetime,

- matured state of the stand
- the estimated survival probability is stable over time
- Therefore, future age distribution can be projected based on estimated probabilities

# Validation of predicted age class distribution compared with observed one

- Period 2010-2019 of 5225 (NW tree deaths)
- Observed and Weibull predictions
- Error ratio
  - ✓ Living trees 1.29 %
  - ✓ Dead trees 16.67 %



■ surviving trees (observed)    ■ surviving trees (Weibull)  
■ dead trees (observed)      ■ dead trees (Weibull)

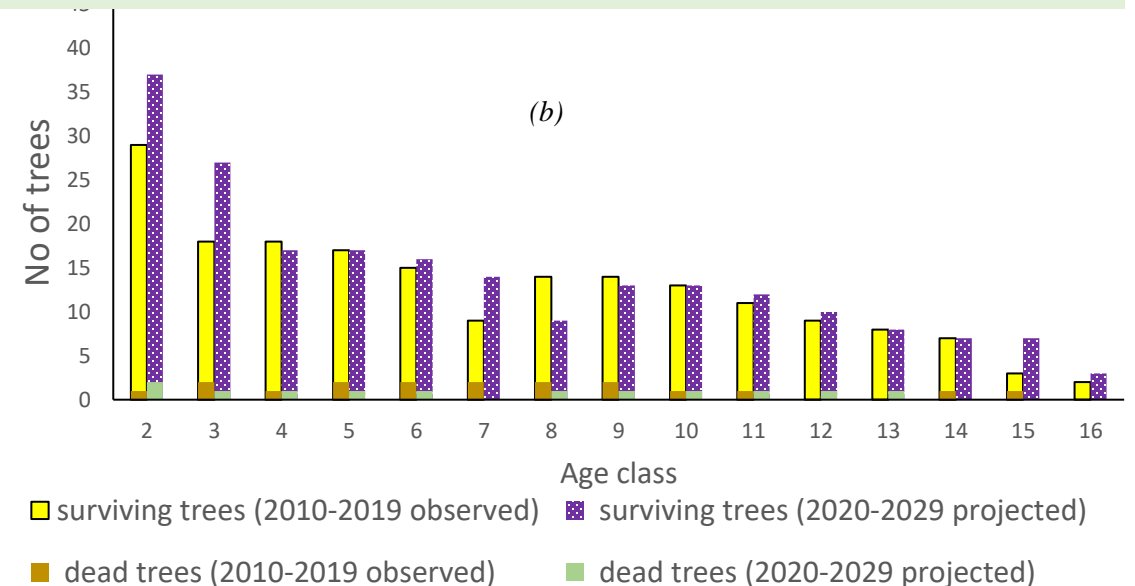
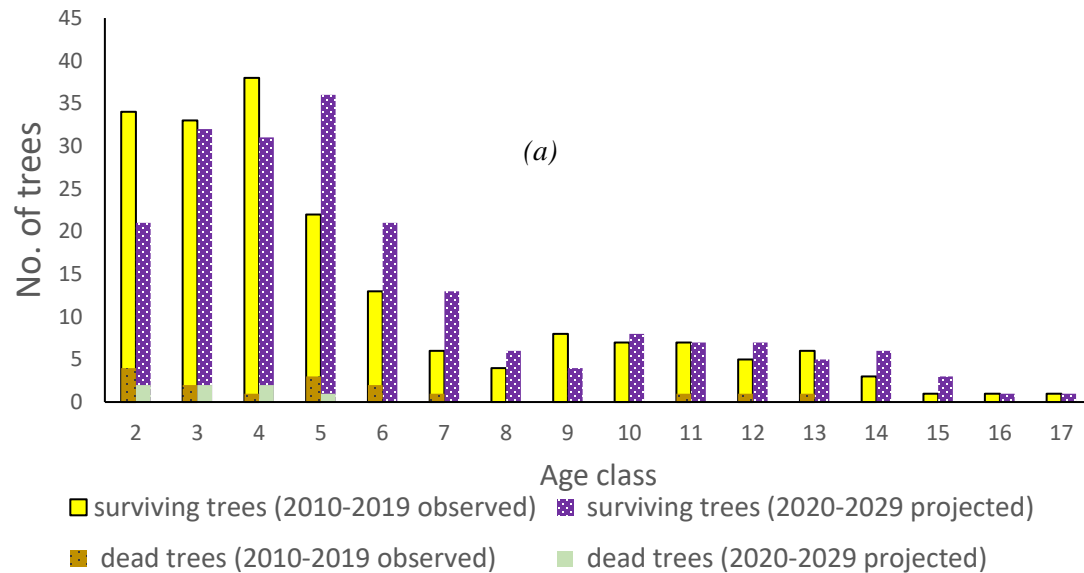
- Period 2010-2019 of 5240 (NW tree deaths)
- Observed and Weibull predictions
- Error ratio
  - Living trees 0.63 %
  - Dead trees 0 %



■ surviving trees (observed)    ■ surviving trees (Weibull)  
■ dead trees (observed)      ■ dead trees (Weibull)

# Future predictions

- Forest managers can rely on decision making such as harvesting tree selection based on SSMS
- Facilitate as a harvesting indicator prior to the death of tree
- can be used as site-specific management plans to identify living and dead trees of each age class



# Conclusion

- The estimated mean lifetime derived from survival analysis can be used to facilitate management decisions of SSMS of UTHF
- The survival probabilities estimated in this study should be used carefully for long-term predictions of forest dynamics because they do not include the effect of catastrophic disturbances, which can often have significant influences on forests
- In our future work, it is essential to incorporate these variables to enhance survival probability models' practical applicability.



Thank you