

# Kaplan-Meier Survival Analysis

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## Univariable method: Kaplan-Meier survival analysis

- Accounts for censoring
- Generates the characteristic “stair step” survival curves
- Precise estimates of events are available by using Kaplan-Meier curves
- Does not account for confounding by other covariates
- For individual data – the probability of a terminal event is calculated at every occurrence of the event
- Useful for studies with few cases where the survival intervals are variable

Example:  
 Survival time of severely depressed patients

- Dataset: **Depress.sav**

	time	status
1	.5	1
2	1.0	0
3	2.0	0
4	3.0	1
5	5.0	1
6	7.0	0
7	9.0	1
8	12.0	0

Time (years) from diagnosis to death or censoring

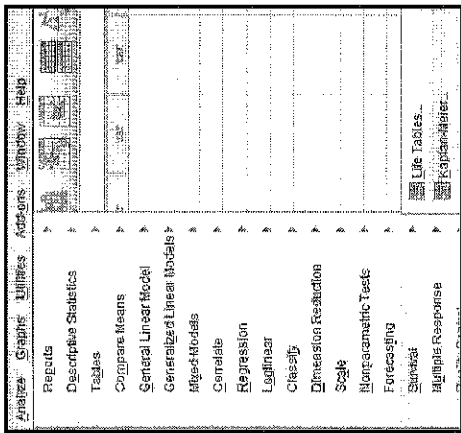
Survival status:  
 1=death  
 0=censored

## Research question

- A psychiatrist would like to estimate the survival time for a sample of severely depressed patients (n=8)

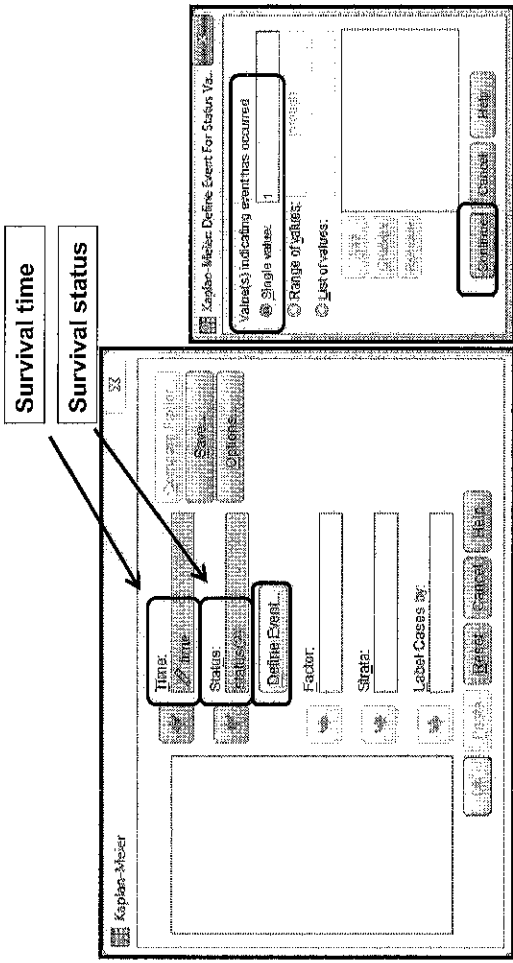
# Steps in getting a Kaplan-Meier survival curve

- Analyze > Survival > Kaplan-Meier

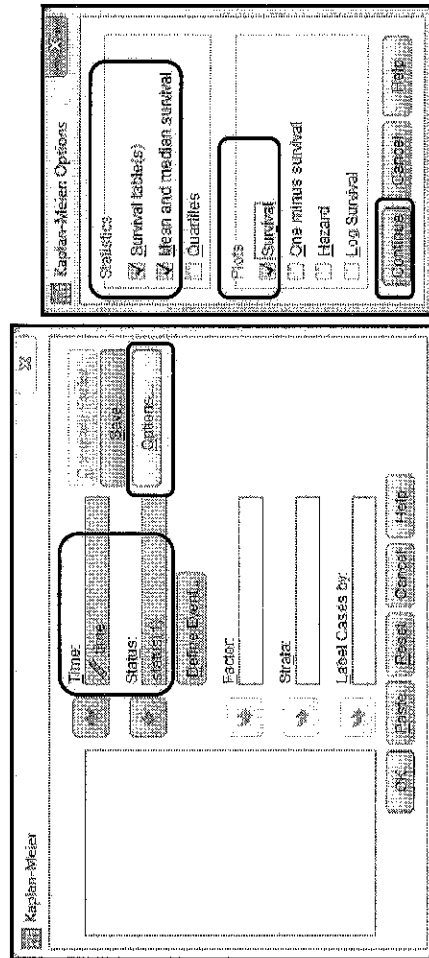


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Case Processing Summary		
	N	Percent
Total N	8	
N of Events	4	
Censored	4	50.0%

- Total N** – the number of cases in the dataset
- N of Events** – the number of cases experienced events
- Censored** – the number of censored observations

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Survival Table				
Time	Status	Cumulative Proportion Surviving at the Time		N of Remaining Cases
		Estimate	Std. Error	
1	death	.875	.117	7
2	censored			6
3	censored			5
4	death	.700	.182	4
5	death	.525	.204	3
6	censored			2
7	death	.263	.212	1
8	censored			0

Cumulative survival probability

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## Median survival time

Means and Medians for Survival Time				
Estimate	Mean <sup>a</sup>			Median
	Std. Error	95% Confidence Interval Lower Bound	Upper Bound	Estimate
6.875	1.635	3.771	10.179	9.000
				Std. Error
				2.905
				95% Confidence Interval Lower Bound
				3.306
				Upper Bound
				14.684

a. Estimation is limited to the largest survival time fit is censored.

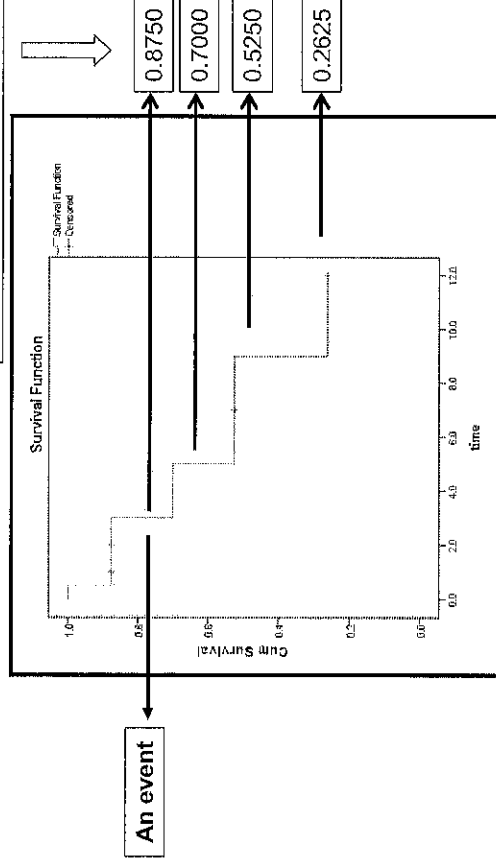
- Median survival time – first observed time at which cumulative survival is 50% or less (time when half of the patients die)
- Median survival time = 9 years

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## Survival plot

Cumulative survival probability

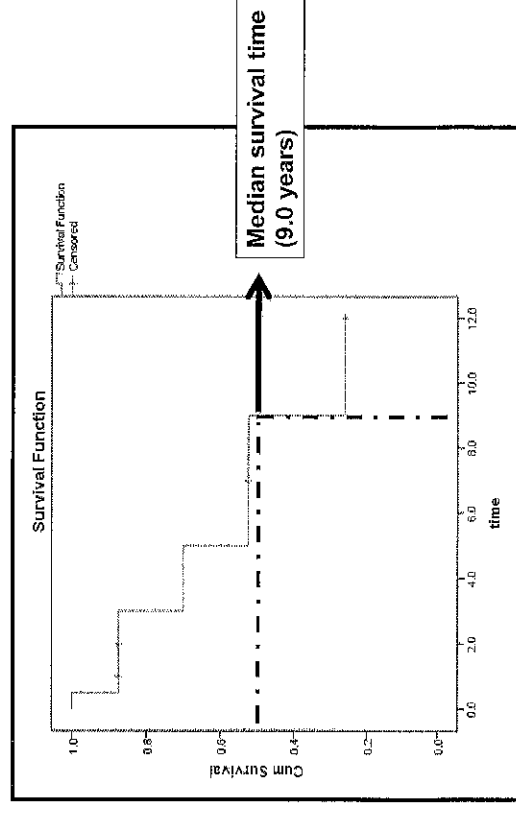


An event

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## Survival plot



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## Comparison between two Kaplan-Meier curves

- Log-rank test can be used to compare survival curves (test of equality of survival)
- Less-commonly used tests: Breslow, Tarone-Ware
- Hypothesis test (test of significance)
  - $H_0$ : the curves are statistically the same
  - $H_A$ : the curves are statistically different

## Research question

- The comparison of survival of patients of two treatment groups (BCG and C.parvum)

Example:

- Dataset: melanomaexample.sav

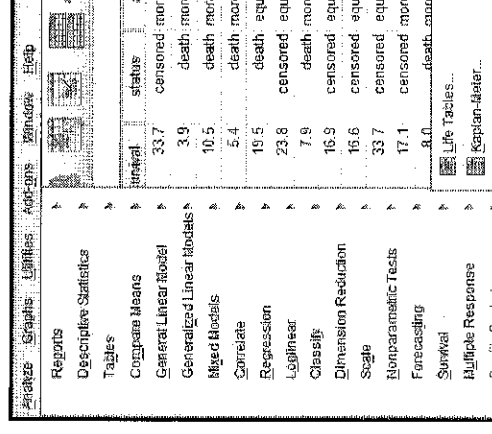
Sex	stage	treatmt	sumval	status	agegrp
2	3	1	33.7	0	1
2	3	1	3.9	1	1
1	3	1	10.5	1	1
2	3	1	5.4	1	1
1	3	1	19.5	1	0
2	3	1	23.8	0	0
2	3	1	7.9	1	1
1	3	1	16.9	0	0

**Variables:**

- Sex: 1=male, 2=female
- Stage 2, 3, 4
- Treatment: 1=BCG, 2=C.parvum
- Survival time in months
- Survival status: 0=censored, 1=died
- Age group: 0=equal or less than 40, 1=more than 40

## Steps in getting two Kaplan-Meier survival curves

- Analyze > Survival > Kaplan-Meier



Survival time

Survival status

Kaplan-Meier Define Event For Status Va...

Values indicating event has occurred

Single value: 1

Range of values:

List of values:

Factor: Status

Strata:

Label Cases by:

Continue Cancel Help

Put categorical variable in Factor box:  
-Treatment  
-Sex  
-Stage  
-Agegp

Kaplan-Meier Compare Factor Levels

Test Statistics

Log rank  Tarone-Ware

Linear trend for factor levels  Pooled over strata  Pairwise over strata  Pairwise for each stratum

For each stratum  Continue Cancel Help

Use "Pooled over strata" when the factor involved 2 levels only

Kaplan-Meier Options

Statistics

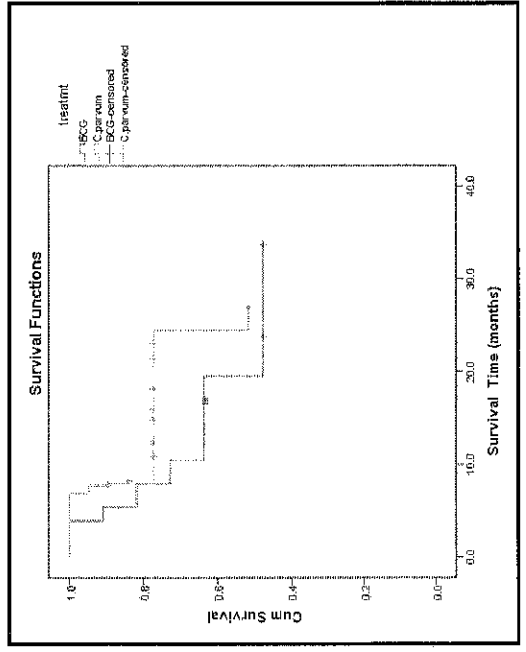
Survival table(s)  Mean and median survival  Unadjusted

Plots

Survival  One minus survival  Hazard  Log Survival

Continue Cancel Help

# Two Kaplan-Meier survival curves



## Log rank test result

- Equality of survival distributions for variable "TREATMT"

Overall Comparisons			
Log Rank (Mantel-Cox)	Chi-Square	df	Sig.
	.747	1	.387

Test of equality of survival distributions for the different levels of treatment.

- There is no significant difference of survival time between two treatment groups

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## Other research questions

- The comparison of survival of patients of two different gender (males and females)
- The comparison of survival of patients of two different age groups ( $\geq 40$  years and  $< 40$  years)

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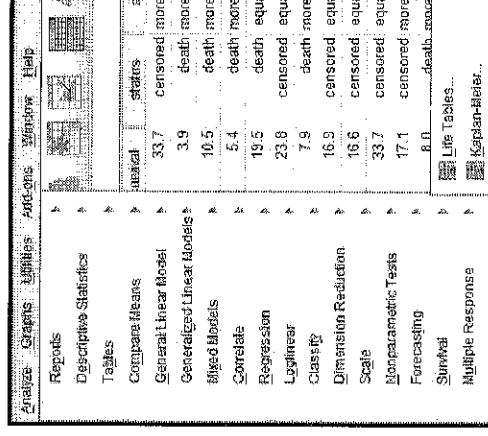
## Comparing multiple Kaplan-Meier curves

- Multiple pair-wise comparisons produce cumulative Type I error – **multiple comparison problem**
- Instead, compare all curves at once
- Then use pairwise testing with multiple Bonferroni correction:
  - Correct  $\alpha$ :**  $0.05 / \text{number of pairs}$  **OR**
  - Correct p-value:**  $p\text{-value} * \text{number of pairs}$

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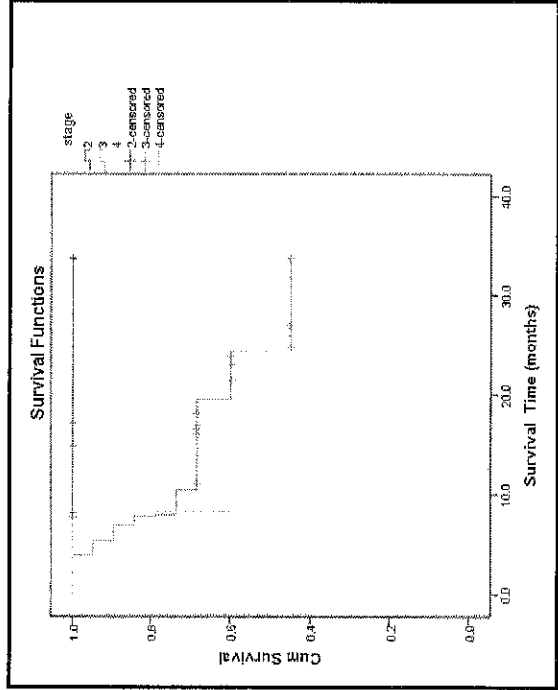
## Steps in comparing multiple Kaplan-Meier survival curves

- Analyze > Survival > Kaplan-Meier



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# Multiple Kaplan-Meier survival curves



## Exercise

The following is the statistical findings of the study where three stages of a particular cancer were compared with regard to survival time of the individual patients. The Log Rank test was performed.

As the test gave statistically significant result, multiple comparison was performed. P-values of the tests are shown below.

<b>Stage of the cancer</b>	<b>stage 2</b>	<b>stage 3</b>	<b>stage 4</b>
		<b>0.021</b>	<b>0.045</b>

In results of multiple comparison amongst groups, how do you interpret the results?

Use "Pairwise over strata" when the factor involved more than 2 levels

## Pairwise comparison

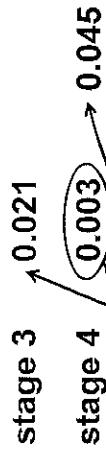
stage	2		3		4	
	Chi-Square	Sig.	Chi-Square	Sig.	Chi-Square	Sig.
Log Rank (Mantel-Cox)	2.232	.135	2.232	.135	1.925	.165
	1.925	.165	.067	.795	.067	.785

• Stage 2 vs. Stage 3,  $p=0.135$   
 • Stage 2 vs. Stage 4,  $p=0.165$   
 • Stage 3 vs. Stage 4,  $p=0.795$

None is significant after Bonferroni correction  
 Bonferroni correction of  $\alpha$  compare to p-value:  $0.05/3=0.017$

## Pairwise Comparisons

Stage of the cancer    stage 2    stage 3



Bonferroni correction of  $\alpha$  compare to  
p-value:  $0.05/3=0.017$

There is a significant difference of survival between stage 2 and 4 after Bonferroni correction

## Limitations of Kaplan-Meier survival analysis

- What happens when you have several covariates that you believe contribute to survival?
- Example
  - Smoking, hyperlipidemia, diabetes, hypertension, contribute to time to myocardial infarct
- Need another approach – multiple **Cox proportional hazards regression** is most commonly used

## Reporting results

- Graphical presentation is more common for Kaplan-Meier curves
- Can present also by tabular format

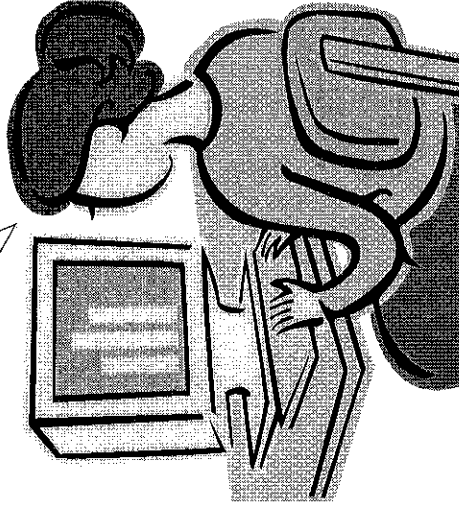
## Example

Table (1) Tabular summary of Kaplan-Meier estimates for a sample of 145 patients

Time	% Survival	95% CI	Number of deaths	Number of censored
6 months	97.9	95.5-100.0	3	0
1 year	97.2	94.5-100.0	4	0
2 years	95.1	91.6-95.1	7	3
3 years	85.2	79.7-90.7	21	68
5 years	77.6	68.0-87.2	26	118



Time for hands-on!!!!



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## Questions for hands-on Exercise

- Compute and plot Kaplan-Meier survival curves to do a comparison of survival of patients between two treatment groups (BCG and C.parvum)
- Compute and plot Kaplan-Meier survival curves to do a comparison of survival of patients between male and female
- Compute and plot Kaplan-Meier survival curves to do a comparison of survival of patients between two age groups

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