Introduction	Tables	Graphs	Color	Common mistakes
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# Visualization and Data Presentation 1

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Introduction	Tables	Graphs	Color	Common mistakes
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Introduction	Tables	Graphs	Color	Common mistakes
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Research				

## Critical!

A critical part of research is *communicating* your findings to an *audience*.

Introduction	Tables	Graphs	Color	Common mistakes
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# Communication Methods

#### Text

- Math / Logic / Code
- Tables
- Graphs
- Diagrams
- Illustrations
- Animation
- ...

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- Text
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- Text
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- Text
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# Communication Methods

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- Text
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# General remarks

#### Style

Always check the journal  $\,/$  conference and author instructions for the general style of tables and figures.

#### Captions

Captions should make it possible to understand completely what a table or figure shows.

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## General remarks - cont.

#### Completeness

By highlighting and discussing the important parts of tables and figures, the text should be understandable just by reading the text.

#### Early

Consider the kind of visualizations you want to use when you are designing your experiment.

Introduction	Tables	Graphs	<b>Color</b>	Common mistakes
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Variable <sup>-</sup>	Types			

Experimental variables:

- Independent: Variable that is not changed by the other variables (e.g. age).
- Oppendent: Measured variable that is affected by others (e.g. cancer risk).

Data types:

- Nominal / Categorical: Discrete data that cannot be ordered (e.g. people).
- Ordinal: Quantities with a natural order (e.g. Likert questions).
- Interval: Ordinal + the interval between each value is equal (e.g. Fahrenheit).

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**Q Ratio**: Interval + a natural zero point (e.g. elevation).

Introduction	Tables	Graphs	Color	Common mistakes
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Tables				

Table: Caption (often above table).

Stub	Column heading	Column heading
Row variable 1	×%	×%
Row variable 2	×%	×%
Row variable 3	×%	×%
Row variable 4	×%	×%
Total	×%	×%

Introduction	Tables	Graphs	Color	Common mistakes
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## Multivariate table

#### Attitude towards uranium mining by age and gender (hypothetical data)

	Number of respondents												
	<2	5	25-	-34	35	-44	45-	-54	1	55+		Tota	ıl
Attitude towards uranium mining	F	м	F	м	F	м	F	м	F	м	F	м	т
Strongly favourable	0	0	1	1	3	1	5	2	3		12	4	16
Favourable	0	0	1	2	3	2	3	1	0	0	7	5	12
Uncertain	0	0	0	0	1	1	2	2	0	0	3	3	6
Unfavourable	1	1	4	3	1	0	0	0	0	0	6	4	10
Strongly unfavourable	4	8	17	7	8	7	2	3	0	0	31	25	56
Total	5	9	23	13	16	11	12	8	3	0	59	41	100

Figure: Table 16.4 from the book.

Introduction	Tables	Graphs	<b>Color</b>	Common mistakes
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# Confusion matrix

		Predicted		
		True	False	
Actual	True	tp	fn	
Actual	False	fp	tn	

	A	В	С	D
Α				
В				
С				
D				

Introduction	Tables	Graphs	Color	Common mistakes
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Table us:	ave			

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Use a table when:

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- Detailed data and text
- Large volume\*
- No trend or pattern

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# 2D Chart Anatomy



Responses of lake algae to addition of nutrients

Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N=50 lakes.

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Figure: Adapted from University of Wisconsin-La, Crosse (2001).

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# 2D Chart Anatomy



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# 2D Chart Anatomy - Axis Offset

Responses of lake algae to addition of nutrients.



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N = 50 lakes.

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# 2D Chart Anatomy - Axis Offset

Responses of lake algae to addition of nutrients.



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits N = 50 lakes.

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# 2D Chart Anatomy - Axis Offset

Responses of lake algae to addition of nutrients.



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits N = 50 lakes.

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Bar chart	S			

- Use when you want to compare how values of 1 or 2 discrete independent variables affect a numeric dependent variable or count.
- Actual numbers and/or error bars can be added on top of the bars.
- For ordinal data, a histogram may also be used.
- With 2 independent variables, a stacked bar chart can also be used, but this is not recommended for comparisons.







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Box plots

- Box plots are like bar charts with extra information.
- They generally show the 1st, 2nd and 3rd quartile of the data, the range and outliers.



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Introduction	Tables	Graphs	<b>Color</b>	Common mistakes
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# Histograms

- Use when you want to show the distribution of items over a small number of values of a quantitative variable.
- For ordinal data, a bar chart may also be used.
- Ratio or interval data can be divided into buckets/intervals; otherwise you can use a area chart.
- With multiple variables, use a 3D effect or an overlapping area chart.
- The book calls drawing a line over the histogram a "frequency polygon".







(a) < (a) < (b) < (b)

Common mistakes

## Stem-and-leaf display

Tables

A stem-and-leaf display let's you show fairly detailed distribution information in the shape of a histogram.

Example (Data)								
37,	33,	33,	32,	29,	28,	28,	23,	
22,	22,	22,	21,	21,	21,	20,	20,	
19,	19,	18,	18,	18,	18,	16,	15,	
14,	14,	14,	12,	12,	9,6	3		

Example from Lane @ OnlineStatBook.

Example (S&L display 1)	Examp	le (S&L	. display	1)
-------------------------	-------	---------	-----------	----

3 2337	
--------	--

- 2|001112223889
- 1 2244456888899

0|69

Example (S&L display 2)
3 7
3 233
2 889
2 001112223
1 56888899
1 22444
0 69

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Introduction	Tables	Graphs	Color	Common mistakes
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# Static composition charts

- If the composition doesn't vary, you can use a pie chart.
- If the composition also contains negative items, you can use a waterfall chart.



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Common mistakes

# Stacked bar charts

- Use to show the composition of a thing varying along some discrete dimension.
- Use a 100% bar chart if the absolute value doesn't matter.



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Tables 0000 Common mistakes

## Area charts

- Area charts can be used to show distributions under a continuous independent variable.
- Stacked area charts can also be used to show how compositions vary with such a variable.







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Introduction	Tables	Graphs	<b>Color</b>	Common mistakes
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Line char	ts			

Line charts can be used to show how several numeric quantitative variables change with another variable (e.g. time).



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Radar or spider charts can be used as cyclical line charts or to show how various items compare to each other on a number of dimensions.



#### Figure: From Wikipedia.

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Introduction	Tables	Graphs	<b>Color</b>	Common mistakes
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# Scatter plots

- Scatter plots are useful for seeing the relationship between two quantitative variables.
- Bubble plots let you add another dimension.







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Common mistakes

## Heat maps

Heat maps can correlate large amounts of data to specific locations. Image from Rogowitz & Treinish (1996)



Introduction 00000	Tables 0000	Graphs 0000000000000000	Color •ooooooooooooooooo	Common mistakes 00000000
Color				

#### Journal

Always check the style of the journal!

#### Legibility

Keep everything legible!

#### Account for B&W

Even if you use color, make sure your figures are interpretable if someone prints them without or is color blind. (Don't refer to the color in the text.)

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## Bar chart color

Responses of lake algae to addition of nutrients



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N=50 lakes.

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Figure: Adapted from University of Wisconsin-La, Crosse (2001).

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## Bar chart color

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Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N=50 lakes.

Figure: Adapted from University of Wisconsin-La, Crosse (2001).,

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# Bar chart color - Hatching

Responses of lake algae to addition of nutrients



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N=50 lakes.

Figure: Adapted from University of Wisconsin-La Crosse (2001).

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# Bar chart color - Hatching

Responses of lake algae to addition of nutrients



Figure 3. Responses of lake algae to addition of nutrients. Error bars are 95% confidence limits. N=50 lakes.

Figure: Adapted from University of Wisconsin-La, Crosse (2001).

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# Line chart color - Notches and Line Types



#### Figure: Use different notches and line types.

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Introduction	Tables	Graphs	Color	Common mistakes
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Zero cros	ssing			



Figure: From Rogowitz & Treinish (1996).

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Spatial co	ontrast			



Figure: From Moreland (2009).

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Introduction	Tables	Graphs	Color	Common mistakes
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# Color theory - Color wheel



Figure: From Wikipedia.

Introduction Tables Graphs Color Common mistakes

# Color theory - Opponent colors



Figure: From Wikipedia.

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Color the	eory - HS	SL		



Figure: From Rogowitz & Treinish (1996).

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Choosing	a color	map		

- Isomorphic: represent data structure faithfully
  - Segmentation: divide data into distinct categories
  - Highlighting: call attention to particular features

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Common mistakes

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# Choosing a color map - Ratio

Data	Spatial	Representation Task			
Туре	Frequency	Isomorphic	Segmentation	Highlighting	
Ratio (true zero)	Low	Luminance: uniform Hue: opponent or complementary pairs Saturation: monotonically in- creasing from gray	Even number of seg- ments Many segments OK	Larger range for high- lighted features	
	High	Luminance: monotonically in- creasing Hue: opponent or complementary pairs Saturation: monotonically in- creasing from gray	Even number of seg- ments Fewer segments	Smaller range for highlighted features	

Figure: From Bergman, Rogowitz & Treinish (1995).

Common mistakes

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# Choosing a color map - Interval

Data	Spatial	Representation Task			
Туре	Frequency	Isomorphic	Segmentation	Highlighting	
Interval	Low	Luminance: uniform Hue: opponent pairs Saturation: monotonically in- creasing from gray	Many segments OK	Larger range for high- lighted features	
	High	Luminance: monotonically in- creasing Hue: uniform or small hue varia- tion Saturation: monotonically decreas- ing	Fewer segments	Smaller range for highlighted features	

Figure: From Bergman, Rogowitz & Treinish (1995).

Common mistakes 00000000

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# Choosing a color map - Ordinal

Data	Spatial	Representation Task			
Туре	Frequency	Isomorphic	Segmentation	Highlighting	
Ordinal	Low	Luminance: uniform Hue: variation around hue circle Saturation: monotonically decreas- ing	Fewer segments	Increase luminance of highlighted area	
	High	Luminance: monotonically in- creasing Hue: variation around hue circle Saturation: uniform	More segments	Increase saturation of highlighted area	

Figure: From Bergman, Rogowitz & Treinish (1995).

Graphs 000000000000000 Common mistakes 00000000

## Choosing a color map - Nominal

Data	Spatial	Representation Task			
Туре	Frequency	Isomorphic	Segmentation	Highlighting	
Nominal	Low	<i>Luminance:</i> uniform <i>Hue:</i> variation around hue circle <i>Saturation:</i> uniform	Fewer segments than 7	Increase luminance or saturation of high- lighted area	
	High				

Figure: From Bergman, Rogowitz & Treinish (1995).

Introduction	Tables	Graphs	Color	Common mistakes
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Figure: From Moreland (2009).

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# **Truncated Y-Axis**



Figure: Via Parikh @ Gizmodo.

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# Different Y-Axis

#### Same Data, Different Y-Axis



Figure: From Parikh @ Gizmodo.

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## **Different Y-Axis**



#### Figure: From Cliff @ Washington Post.

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Figure: Via Robbins @ Forbes.

Introduction	Tables	Graphs	Color	Common mistakes
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## Different Order



Figure: Via Robbins @ Forbes.

Common mistakes

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# Poorly used cumulative graph



#### Figure: From Parikh @ Gizmodo.

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## Ignoring conventions and expectations

# Gun deaths in Florida



Number of murders committed using firearms

Source: Florida Department of Law Enforcement

C. Chan 16/02/2014

REUTERS

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etc.				

- Poorly used colors.
- "Creative" use of percentages.