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Data analysis is a **process** of inspecting, cleaning, transforming, and modeling data with the goal of uncovering information, supporting decision making, and *telling stories*.

Human Perception as the Foundation for Effective Visualizations

- Data Visualization for Human Perception http://www.interaction-design.org/encyclopedia/data_visualization_for_human_perception.html
- Visual encoding (data types, color, shape, value)
<http://www.targetprocess.com/articles/visual-encoding.html>
- Process for creating data visualization
<http://blog.visual.ly/the-process-of-creating-data-visualizations/>

Principles for Effective Graphical Displays

- ACCENT
 - **Apprehension:** Can you perceive the relationship among the variables?
 - **Clarity:** Can you visually distinguish all of the elements of the graph?
 - **Consistency:** In a series of graphs, are the meanings of elements, shapes and symbols the same?
 - **Efficiency:** Do you portray a complex relationship in the simplest way possible?
 - **Necessity:** Do you need the graph, or will another format (text, table) be more effective?
 - **Truthfulness:** Are the elements accurately positioned and scaled?

From D. A. Burn (1993). Designing Effective Statistical Graphs, in Rao (Ed.) Handbook of Statistics.

Graphic Design Principles

- Sort data before graphing
- Make effective use of graph titles
- Maintain appropriate aspect ratios
- Limit the use of pie charts
- Avoid fancy formatting
 - Avoid use of colors in the background or plot area. Reserve color for key data points in the graph.
 - Avoid 3D effects.
 - Avoid fancy visual effects, such as gradients, shadows, patterned fill, and soft edges.
 - Avoid the tendency to enhance the graph with clip art or pictures.
- Eschew Chartjunk
 - Remove gridlines and borders.
 - Avoid overloading the graph with data labels. Focus only on key data points.
 - Use legends only when necessary. Sometimes it is apparent.
 - Remove axes that do not add information.

Information Design

- Information Design for Advocacy http://www.opensocietyfoundations.org/sites/default/files/visualizing_20080311.pdf
- Edward Tufte: <http://www.edwardtufte.com/>
- Michael Friendly: <http://www.datavis.ca/>

Inspiration

- <http://flowingdata.com/>
- <http://eagereyes.org/>
- <http://thewhyaxis.info/>
- <http://visualisingdata.com/>
- <http://visual.ly/>

Types of Visualizations

- Classification Charts <http://charts6.excelcharts.com/blog/wp-content/uploads/2013/11/classification-chart-types.png>
- Common Visualization Types http://guides.library.duke.edu/vis_types

Selecting a Graph Type

- Juice Analytics Chart Choose <http://labs.juiceanalytics.com/chartchooser/index.html>
- Choose a Good Chart <http://extremepresentation.typepad.com/files/choosing-a-good-chart-09.pdf>
- Effective Chart Design http://www.perceptualedge.com/images/Effective_Chart_Design.pdf

Popular Tools

- Cleaning data
 - Open Refine <http://openrefine.org/>
 - Data Wrangler <http://vis.stanford.edu/wrangler/>
 - Mr. Data Converter <http://shancarter.github.io/mr-data-converter/>
- Statistical Analysis
 - R and (RStudio) <http://www.rstudio.com/>
 - Python (scipy & numpy & pandas) <http://datacommunitydc.org/blog/2013/07/python-for-data-analysis-the-landscape-of-tutorials/>
 - StatWing <https://www.statwing.com/>
- Geospatial tools
 - QGIS (QuantumGIS) <http://qgis.org/en/site/>
 - TileMill <https://www.mapbox.com/tilemill/>
 - CartoDB <http://cartodb.com/>
- Visual analytics/Business Intelligence
 - Tableau Public <http://www.tableausoftware.com/public/>
 - Google Fusion Tables <http://www.google.com/drive/apps.html#fusiontables>
 - ManyEyes <http://www-958.ibm.com/software/data/cognos/manyeyes/>
- Excel
 - Jorge Camoes's Excel Charts Blog <http://www.excelcharts.com/blog/>
 - Learn to use:
 - Power Pivot <http://www.microsoft.com/en-us/bi/powerpivot.aspx>
 - Power View <http://www.microsoft.com/en-us/bi/Products/PowerView.aspx>
 - Analysis Toolpak http://www.add-ins.com/Analysis_ToolPak.htm
 - Python + Excel = DataNitro <https://datanitro.com/>

Useful Software for Visualization

- Selected Tools from Datavisualization.ch
<http://selection.datavisualization.ch/>
- 86 Helpful Tools for the Data Professional <http://infospace.ischool.syr.edu/2011/10/19/86-helpful-tools-for-the-data-professional-plus-45-bonus-tools/>
- 22 free tools for data visualization and analysis
[http://www.computerworld.com/s/article/9215504/22 free tools for data visualization and analysis](http://www.computerworld.com/s/article/9215504/22_free_tools_for_data_visualization_and_analysis)

Mapping, GIS & Geospatial analysis

- A Gentle Introduction to GIS http://download.osgeo.org/qgis/doc/manual/qgis-1.0.0_a-gentle-gis-introduction_en.pdf
- QGIS basics for journalists <http://multimedia.journalism.berkeley.edu/tutorials/qgis-basics-journalists/>

Resources

- IMLS
 - Statistical Collection Data Files <https://www.imls.gov/research-tools/data-collection>
 - Data Portal <https://data.imls.gov/>
 - Publications <https://www.imls.gov/publications>
- IMLS Funded Projects
 - iMap Libraries <http://www.imaplibraries.org/index.html>
 - Digital Inclusion Study Tool <http://digitalinclusion.umd.edu/content/interactive-map>

Places to get data

- Government
 - FedStats.gov <http://www.fedstats.gov/>
 - TIGER <http://www.census.gov/geo/www/tiger/>
 - American Fact Finder <http://factfinder2.census.gov/faces/nav/jsf/pages/index.xhtml>
 - Data portals and data catalogs
 - Data.gov & others <http://www.data.gov/opendatasites>
- Universities, research, and institutional repositories
 - FigShare <http://figshare.com/>
 - DataCite <http://www.datacite.org/repolist>
 - Cornell's Data Sources for Social Scientists <http://ciser.cornell.edu/info/datasource.shtml>
- Library specific data
 - USAC e-rate data <http://www.slforms.universalservice.org/DRT/Default.aspx>
 - NTIA National Broadband Data <http://www.broadbandmap.gov/data-download>

Recommended Books:

- [Tufte, E. \(2001\). *The visual display of quantitative information*. Cheshire, Conn: Graphics Press.](#)
- [Cleveland, W. \(1993\). *Visualizing data*. Murray Hill, N.J. Summit, N.J: At & T Bell Laboratories Published by Hobart Press.](#)
- [Few, S. \(2012\). *Show me the numbers : designing tables and graphs to enlighten*. Burlingame, Calif: Analytics Press.](#)
- [Yau, N. \(2011\). *Visualize this : the FlowingData guide to design, visualization, and statistics*. Indianapolis, Ind: Wiley Pub.](#)
- [Wilkinson, L. & Wills, G. \(2005\). *The grammar of graphics*. New York: Springer.](#)