

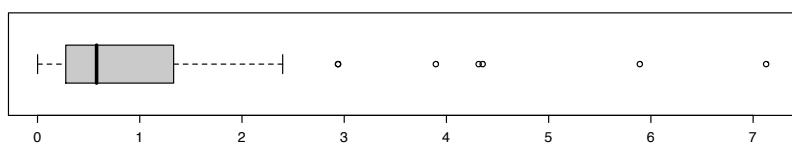
# Letter Value Boxplot

Heike Hofmann, Karen Kafadar, Hadley Wickham  
IOWA STATE UNIVERSITY

## Outline

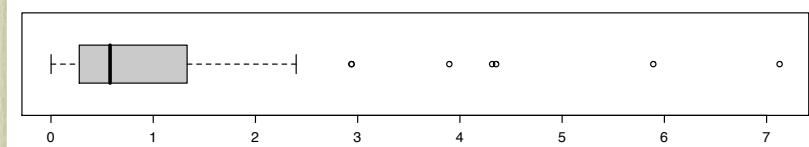
- Boxplots: Definition, Strengths & Weaknesses
- Letter Value Statistics
- Letter Value Boxplots
- Examples
- Conclusion

## Boxplots



- Early Version: Tukey 1972 (Snedecor Festzeitschrift, at Iowa State University)
- Most common version in EDA (1977):
  - Median (Center Line), Fourths (Box Edges), adjacent values (ends of whiskers) and extreme values
  - All marks correspond to actual data values

## Boxplot: Strengths

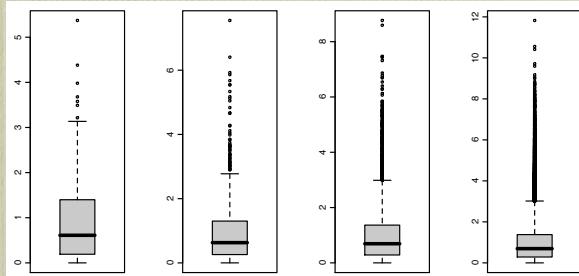


- Quick summary without overwhelming amount of detail
- Approximate location, spread, shape of distribution
- Outlier identification
- Associations among variables

## Boxplots: Weaknesses

- Expected rate of labeled outliers approx  $0.4 + 0.007n$
- For  $n = 100000$  expect approx. 700 outliers!

Exponential Distribution,  
 $n = 100, 1000,$   
 $10000, 100000$



## Modifications

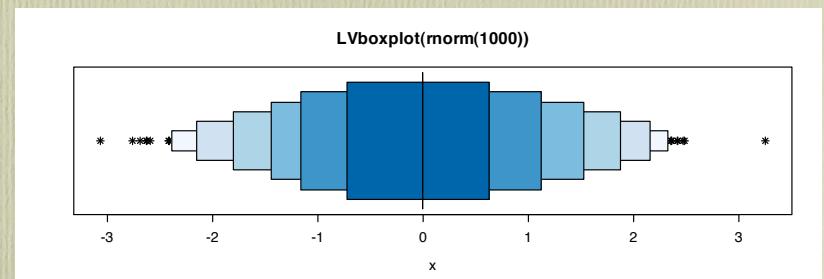
- Notched box-and-whisker (McGill, Larsen, Tukey 1987)
- Nonparametric density estimates
  - Vase plots (Benjamini, 1988)
  - Violin plots (Hintze, Nelson 1998)
  - Box-percentile plots (Esty, Banfield 2003)

Implementations: *S routines* (David James), package *vioplot* (Adler, Romain), package *Hmisc* *bpplot* (Harrell, Banfield), examples at *R Graph Gallery*

## Letter Value Statistics

- Estimate quantiles corresponding to tail areas  $2^{-j}$ 
  - Median ( $1/2$ ): depth =  $d_M = (1+n)/2$
  - Fourths ( $1/4$ ): depth =  $d_F = (1 + \lfloor d_M \rfloor)/2$
  - Eights ( $1/8$ ): depth =  $d_E = (1 + \lfloor d_F \rfloor)/2$
- Boxplots show median, fourths
- Large Data Sets: tail quantiles become more reliable  
→ include LVs beyond Fourths

## Letter Value Boxplot



- How many boxes to show?
- Outlier identification?
- All marks are based on actual data values

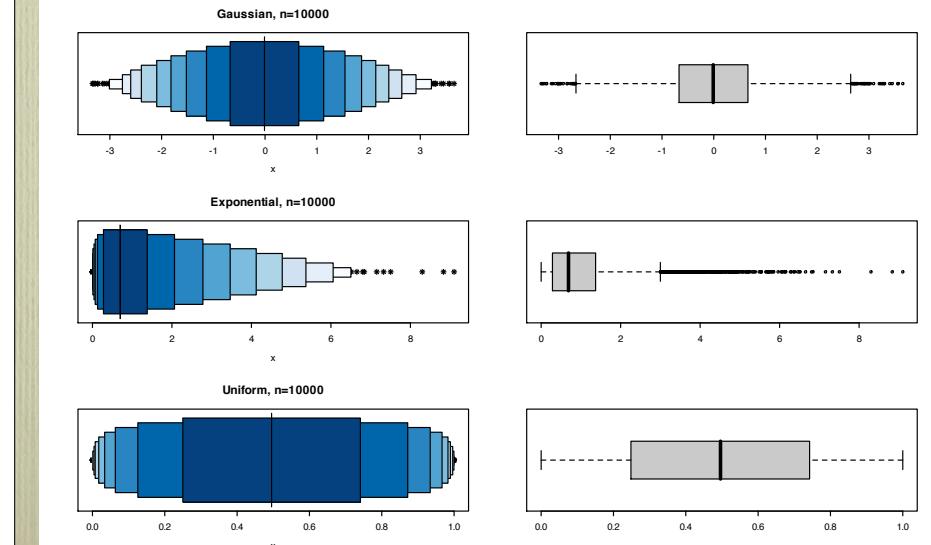
# Stopping Rules & Outliers

- EDA: 5-8 outliers  $\longrightarrow k = \lfloor \log_2 n \rfloor - 4$
- Percentage of data, e.g. 0.5-1%
- uncertainty in  $LV_i$  extends beyond or into  $LV_{i-1}$   
(i.e. upper limit for  $LV_i$  crosses  $LV_{i-1}$ )  
 $\longrightarrow k = \left\lceil \log_2 n - \log_2 \left( 4z_{1-\alpha/2}^2 \right) \right\rceil + 1$

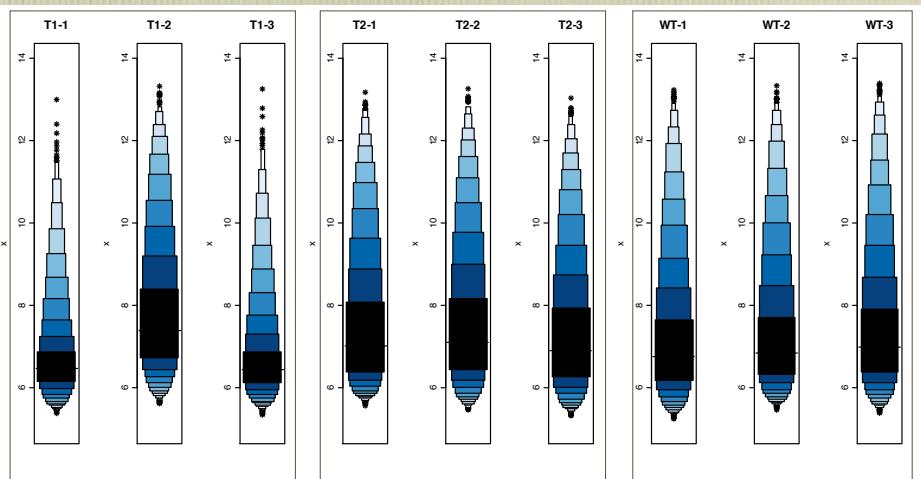
Rules lead to similar answers

... Examples

# Gaussian, Exponential & Normal



# Gene Expression Values



# Conclusion

Letter Value Boxplots are

- appropriate for large number of values
- based on actual data values
- simple to compute
- reduce number of labeled outliers shown in conventional boxplots
- do not depend on a smoothing parameter

Download (for now) at <http://www.public.iastate.edu/~hofmann>

# Graphical Displays of Large Data Sets

*"The greatest value of a picture is when it forces us to notice what we never expected to see"*  
(Tukey 1977)

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- Associations among variables