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of the underlying variable. The density estimate could be plotted as an alternative to the histogram, and is usually drawn as a curve rather than a set of boxes. Histograms are nevertheless preferred in applications, when their statistical properties need to be modeled. The correlated variation of a kernel density estimate is very difficult to describe mathematically, while it is simple for a histogram where each bin varies independently. An alternative to kernel density estimation is the average shifted histogram,^[8] which is fast to compute and gives a smooth curve estimate of the density without using kernels. A cumulative histogram: a mapping that counts the cumulative number of observations in all of the bins up to the specified bin. That is, the cumulative histogram M_i of a histogram m_j can be defined as: $M_i = \sum_{j=1}^i m_j$. There is no "best" number of bins, and different bin sizes can reveal different features of the data. Grouping data is at least as old as Graunt's work in the 17th century, but no systematic guidelines were given^[9] until Sturges's work in 1926.^[10] Using wider bins where the density of the underlying data points is low reduces noise due to sampling randomness; using narrower bins where the density is high (so the signal drowns the noise) gives greater precision to the density estimation. Thus varying the bin-width within a histogram can be beneficial. Nonetheless, equal-width bins are widely used. Some theoreticians have attempted to determine an optimal number of bins, but these methods generally make strong assumptions about the shape of the distribution. Depending on the actual data distribution and the goals of the analysis, different bin widths may be appropriate, so experimentation is usually needed to determine an appropriate width. There are, however, various useful guidelines and rules of thumb.^[11] The number of bins k can be assigned directly or can be calculated from a suggested bin width h as: $k = \frac{\max x - \min x}{h}$. The braces indicate the ceiling function. $k = \lceil \sqrt{n} \rceil$ which takes the square root of the number of data points in the sample and rounds to the next integer. This rule is suggested by a number of elementary statistics textbooks^[12] and widely implemented in many software packages.^[13] Sturges's rule^[10] is derived from a binomial distribution and implicitly assumes an approximately normal distribution. $k = \lceil \log_2 n + 1 \rceil$. Sturges's formula implicitly bases bin sizes on the range of the data, and can perform poorly if n