### Bootstrap Confidence Intervals

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#### Overview

- ▶ What and why?
- ► How?
- ► Always good?

### Bootstrapping



➤ The saying "to pull oneself up by one's bootstraps" was already in use during the 19th century as an example of an impossible task.

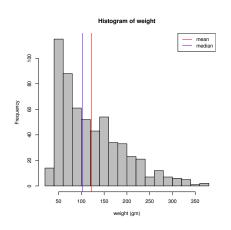
### Bootstrapping



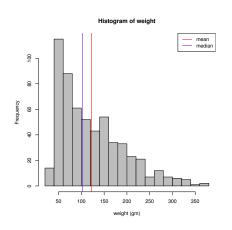
- The saying "to pull oneself up by one's bootstraps" was already in use during the 19th century as an example of an impossible task.
- Bootstrap as a metaphor, meaning to better oneself by one's own unaided efforts, was in use in 1922.



▶ 578 observations



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- Right-skewed



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- ▶ median=103

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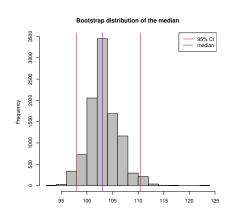
- a random sample;
- same size;
- sample with replacement.

### Construct a Bootstrap confidence interval

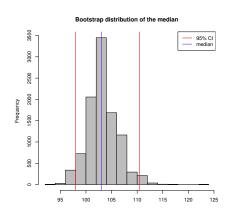
Take a large number N (for example, N = 10000). For  $1 \le i \le N$ ,

- 1. Get a bootstrap sample  $(x_1^{*(i)}, \dots, x_n^{*(i)})$ ;
- 2. Calculate the bootstrap statistic  $T^{*(i)}$  with the bootstrap sample in the first step.

Then we can use the quantiles of these N bootstrap statistics to construct a bootstrap confidence interval.



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- ► bootstrap confidence interval: (98.0, 110.5)

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- need a 'good' sample to start;
- 'cannot' improve our point estimator.