Playing with Data

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Reproducibility and Real Data

1.1 Some Truth

"All models are wrong, but some are useful."

- George Box, 1976, Journal of the American Statistical Association

1.2 Critical Thinking, Analytics, and Reproducibility

Today's agenda

- Vaccines
- Stanford's President
- Target
- Dataset 1 (Marathon Kids; size, means and correlation?)
- Dataset 2 (Starwars, BMIs by homeworld?)
- Dataset 3 (NFL; 4th down?)
- See if we've had fun

Marathon Kids

"Compare the means and correlations across trainers."

3.1 About this data

| $\operatorname{trainer}$ | pre | post |
|--------------------------|---------|---------|
| 1 | 55.3846 | 97.1795 |
| 1 | 51.5385 | 96.0256 |
| 1 | 46.1538 | 94.4872 |
| 1 | 42.8205 | 91.4103 |
| 1 | 40.7692 | 88.3333 |
| 1 | 38.7179 | 84.8718 |

3.2 More about this data

| trainer | n |
|---------|-----|
| 1 | 142 |
| 2 | 142 |
| 3 | 142 |
| 4 | 142 |
| 5 | 142 |
| 6 | 142 |
| 7 | 142 |
| 8 | 142 |
| 9 | 142 |
| 10 | 142 |
| 11 | 142 |
| 12 | 142 |
| 13 | 142 |
| | |

3.3 Some fun data for you

Marathon Kids Data

3.4 The Hard Way

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| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | | 51.4103000 |
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| $\begin{array}{c ccccccccccccccccccccccccccccccccccc$ | 1 | 44.10260 | 52.9487000 |
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| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 61.28210 | 62.1795000 |
| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 61.53850 | 66.4103000 |
| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 61.79490 | 69.1026000 |
| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 57.43590 | 55.2564000 |
| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 54.87180 | 49.8718000 |
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| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 1 | 42.82050 | 32.5641000 |
| $\begin{array}{c ccccccccccccccccccccccccccccccccccc$ | 1 | 38.71790 | 31.4103000 |
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| 1 30.00000 29.1026000 1 32.05130 26.7949000 1 35.89740 25.2564000 1 41.02560 25.2564000 | | | |
| 1 32.05130 26.7949000 1 35.89740 25.2564000 1 41.02560 25.2564000 | | | |
| 1 35.89740 25.2564000 1 41.02560 25.2564000 | | | |
| 1 41.02560 25.2564000 | | | |
| | | | |
| 1 + 44.10260 + 25.6410000 | 1 | 44.10260 | 25.6410000 |
| 1 47.17950 28.7180000 | | | |

Starwars

4.1 Data

Starwars Data

Which homeworlds have the greatest number of individuals with BMI's greater than the average for each homework?

| name | height | mass | hair_color | skin_color | eye_color | birth_year | sex | gender | ho |
|----------------|--------|------|-------------|-------------|-----------|------------|--------|-----------|----|
| Luke Skywalker | 172 | 77 | blond | fair | blue | 19.0 | male | masculine | Ta |
| C-3PO | 167 | 75 | NA | gold | yellow | 112.0 | none | masculine | Ta |
| R2-D2 | 96 | 32 | NA | white, blue | red | 33.0 | none | masculine | Na |
| Darth Vader | 202 | 136 | none | white | yellow | 41.9 | male | masculine | Ta |
| Leia Organa | 150 | 49 | brown | light | brown | 19.0 | female | feminine | Al |
| Owen Lars | 178 | 120 | brown, grey | light | blue | 52.0 | male | masculine | Ta |

NFL

5.1 Data

NFL Data

NFL Descriptions

- 5.2 Whoa, when do I go for it on 4th down?
- 5.3 Reproducibility: Building is better

nflfastr

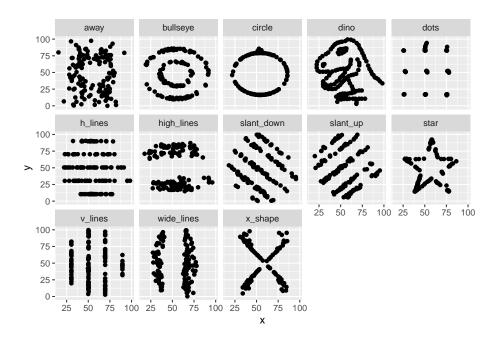
Some Final Thoughts

6.1 Marathon Kids

6.1.1 Mean and correlation Results

| dataset | mean(x) | mean(y) | cor(x, y) |
|------------|----------|----------|------------|
| away | 54.26610 | 47.83472 | -0.0641284 |
| bullseye | 54.26873 | 47.83082 | -0.0685864 |
| circle | 54.26732 | 47.83772 | -0.0683434 |
| dino | 54.26327 | 47.83225 | -0.0644719 |
| dots | 54.26030 | 47.83983 | -0.0603414 |
| h_lines | 54.26144 | 47.83025 | -0.0617148 |
| high_lines | 54.26881 | 47.83545 | -0.0685042 |
| slant_down | 54.26785 | 47.83590 | -0.0689797 |
| slant_up | 54.26588 | 47.83150 | -0.0686092 |
| star | 54.26734 | 47.83955 | -0.0629611 |
| v_lines | 54.26993 | 47.83699 | -0.0694456 |
| wide_lines | 54.26692 | 47.83160 | -0.0665752 |
| x_shape | 54.26015 | 47.83972 | -0.0655833 |

6.1.2 A picture is worth a thousand words (or a dinosaur)



6.1.3 Reference

Same Stats, Different Graphs: Generating Datasets with Varied Appearance and Identical Statistics through Simulated Annealing. Matejka, Fitzmaurice. Proceedings of the 2017 CHI Conference on Human Factors in Computing Systems. May 2017 Pages 1290–1294 https://doi.org/10.1145/3025453.3025912.

6.2 Starwars

6.2.1 Missing values by variable

| name | height | mass | homeworld | birth_year | species |
|------|--------|------|-----------|------------|---------|
| 0 | 6 | 28 | 10 | 44 | 4 |

6.2. STARWARS 19

6.2.2 BMI summary

| name | height | mass | homeworld | BMI |
|----------------|--------|------|-----------|----------|
| Luke Skywalker | 172 | 77 | Tatooine | 26.02758 |
| C-3PO | 167 | 75 | Tatooine | 26.89232 |
| R2-D2 | 96 | 32 | Naboo | 34.72222 |
| Darth Vader | 202 | 136 | Tatooine | 33.33007 |
| Leia Organa | 150 | 49 | Alderaan | 21.77778 |
| Owen Lars | 178 | 120 | Tatooine | 37.87401 |

| mean_bmi | median_bmi | max_bmi | min_bmi |
|----------|------------|----------|----------|
| 32.01696 | 24.56749 | 443.4286 | 12.88625 |

6.2.3 Top contenders...

6.2.4 And the winners are...

6.2.5 NFL, one option

Just one person's thoughts