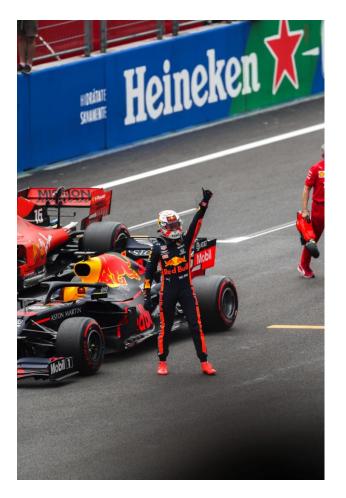
Get off my lawn! How to avoid trespassing in multidisciplinary collaboration.

Erik-Jan van Kesteren













stock images in this presentation from unsplash.com

About me

Education

- BA Social Sciences
- MSc Organisational & Social Psychology
- MSc Methodology & Statistics
- PhD Statistics / Data Science

Work

- Universitair Docent (Assistant Professor) Human Data Science at Utrecht University
- Team lead of *Social Data Science team* (i.e. a lot of trespassing)
- Ex-board member of YS!!

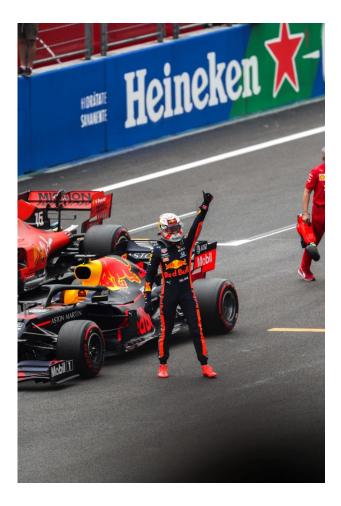


Topics I worked with

Regression

Structural equation modelling Mediation analysis Regularization High-dimensional data **High-performance computing** Data visualisation Computation graphs / optimization (tensorflow / torch) **Privacy / Federated learning** Software development **Bayesian workflow** Geostatistics / geodata Data science pipelines / open science

Example 1: Formula One Analysis Sports statistics



Formula One Analysis

Question

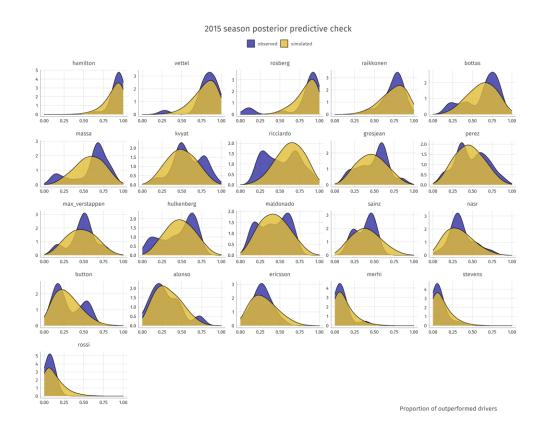
• Who is the best Formula One driver (skill, talent)?

Problem

- Success is in large part determined by the car
- We want driver skill conditional on car power

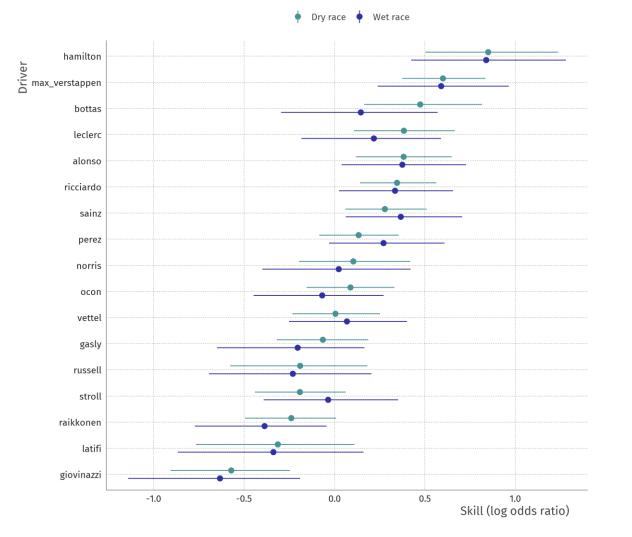
Solution

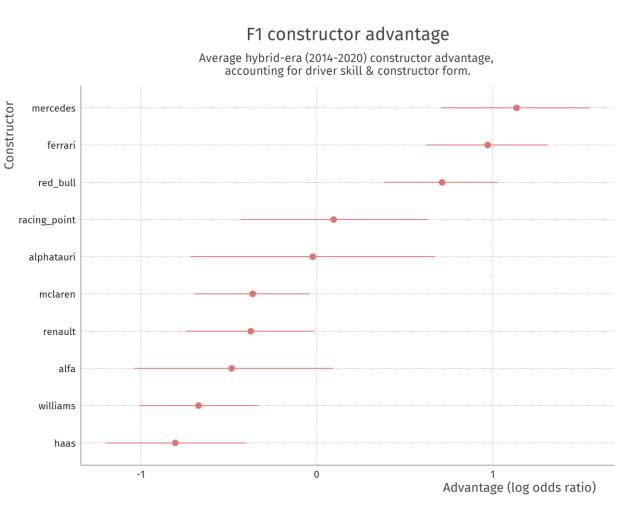
- Bayesian multilevel Beta regression model
- Outcome: proportion of competitors defeated in the race
- Log odds-ratio per driver, 0 means you are average



F1 driver skill

Average hybrid-era (2014-2020) driver skill, accounting for yearly constructor advantage.





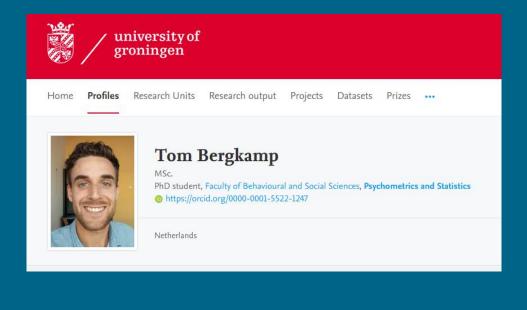
What went well?

I found a collaborator!

Tom Bergkamp, study friend & PhD in sports analytics / talent identification

Tom explained the rules

- Reorganised paper (e.g., more focus on question rather than method)
- Identified what is new/valuable to the field
- Rewrote to correct language (e.g., talent -> skill)



Find a collaborator close to the field They can tell you how things are done, the rules of engagement

Example 2: Opportunity atlas Microeconomics



Persoonlijk inkomen

KANSENKAART

Opportunity atlas

Question

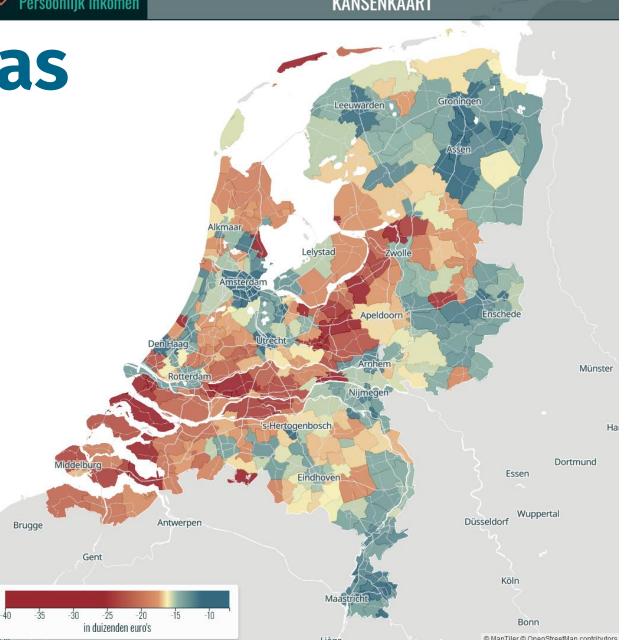
 Throughout NL, how does your parent's income, your migration background, your gender, affect your later life?

Problem

- There are many categories, many regions, many outcome variables
- This is too slow

Solution

• Estimation on a supercomputer



I have a collaborator from the field! Great, but...

What went wrong?

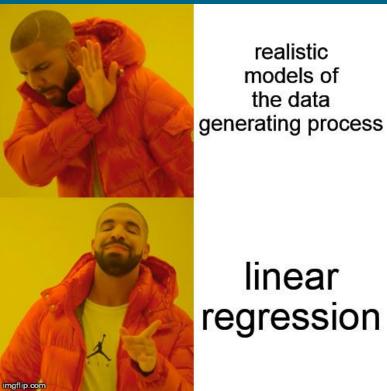
We spoke totally different languages

An economist from the perspective of a statistician:

- Economists like OLS regression
- Economists like robustness checks
- Economists dislike making assumptions
- Economists write really long papers
- Economists REALLY like OLS regression

NB: there are many good things about the economist's approach to data analysis







Replying to @jnaidoo_econ and @alexpghayes

This preference of economists also reflects a prioritisation of consistency over precision: i.e. "first let's get consistent estimators (of the causal effect we want), then worry about the standard errors later".

7:23 AM · Nov 22, 2019 · Twitter Web App

Learn the language of your hosts Establish a common way to speak about issues in the project

Example 3: Privacypreserving GLM Federated machine learning



Privacy-preserving GLM

Problem

- Alice & Bob have different variables for the same people
- They are not allowed to combine their dataset for privacy reasons
- They both measure the same outcome variable
- Can we do regression?

Solution

- Many options exist. We made a new option: blockwise coordinate descent
- Send residuals back & forth, re-estimate based on those residuals until convergence
- Extensions to GLM -> super useful, main focus
- Implemented in software package https://github.com/vankesteren/privreg

What did I do to fit in?

Worked with collaborators from computer science At Maastricht University's Institute of Data Science

Tried to speak the right language Translated all the mentions of "variables" into "features" etc. Used example data from the UCI Machine Learning repository

Submitted the paper...







How do authors generalizes for the case N>2 (lot of Alice and Bob)?

The novelty of this work is in my opinion low. The extension to generalized linear models is also rather straightforward.

Find out what is important and what is trivial to the field What should you focus on in your paper?



(Not) Trespassing, summarised

Be intellectually modest

- Find a collaborator close to the field
- Learn the language of your hosts
- Find out what is important and what is trivial to the field



(Not) Trespassing, summarised

Be intellectually modest

- Find a collaborator close to the field
- Learn the language of your hosts
- Find out what is important and what is trivial to the field



Some experiences

- Trespassing takes time & effort
- You will probably face rejection
- Worthwhile because you will learn a lot

Epistemic Trespassing

Nathan Ballantyne 🖂

Mind, Volume 128, Issue 510, April 2019, Pages 367–395, https://doi.org/10.1093 /mind/fzx042

Published: 12 February 2018

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Abstract

Epistemic trespassers judge matters outside their field of expertise. Trespassing is ubiquitous in this age of interdisciplinary research and recognizing this will require us to be more intellectually modest.

Thank you!