Introduction to the Course

Sergio I. Garcia-Rios

Government 3990: Statistics in the Social Science

General info

Teaching team

- Professor: Sergio Garcia-Rios `garcia.rios@cornell.edu`

Required materials

- OpenIntro Statistics, 4th Edition:
  http://openintro.org/os
  - The textbook is freely available online. You're encouraged to read on screen but you can print it out. If you prefer a paperback version you can buy it at the cost of printing (around $20) on Amazon
- (optional) Calculator (just something that can do square roots)

Puzzle Solving with Data - GOVT 3990
`garciarios.github.io/govt_3990`

Course structure

Learning units and course outline

- Pictures and summaries of data
  - **Unit 1 - Intro to data:** Observational studies & non-causal inference, principles of experimental design & causal inference, exploratory data analysis, introduction to simulation-based statistical inference.
- Mathematics behind statistics
  - **Unit 2 - Probability & distributions:** Basics of probability and chance processes, Bayesian perspective in statistical inference, the normal and binomial distributions.
- Statistical inference
  - **Unit 3 - Framework for inference:** CLT, sampling distributions, and introduction to theoretical inference.
  - Midterm 1
  - **Unit 4 - Statistical inference for numerical variables**
  - **Unit 5 - Statistical inference for categorical variables**
  - Midterm 2
- Modeling
  - **Unit 6 - Simple linear regression:** Bivariate correlation and causality, introduction to modeling.
  - **Unit 7 - Multiple linear regression:** More advanced modeling with multiple predictors.
  - Final Exam

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Project

Objective: Give you independent applied research experience using real data and statistical methods.

- Proposal and presentation: due mid-semester
- Final Presentation: last week of semester

Exams

There will be one midterm.

- See course info for dates and times of the exams.
- Exam dates cannot be changed and no make-up exams will be given.
- Calculator + cheat sheet allowed

Office Hours

Visit the website if you need to schedule office hours

- At least 24 hrs in advance
- Please choose only one slot, if you need more time, email me first
- If you schedule office hours, please do show up

Students with disabilities who believe they may need accommodations in this class are encouraged to contact the Student with Disability Services Office telephone 607.254.4545; e-mail `sds_cu@cornell.edu` as soon as possible to better ensure that such accommodations can be made.

Academic Dishonesty

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Any form of academic dishonesty will result in an immediate 0 on the given assignment and will be reported to the Office of Academic Integrity. Additional penalties may also be assessed if deemed appropriate. If you have any questions about whether something is or is not allowed, ask me beforehand.

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- Do not procrastinate - don't let a unit go by with unanswered questions as it will just make the following unit's material even more difficult to follow.

To do

To do

- Download or purchase the textbook
  - Download: `http://openintro.org/os`
  - Purchase: `http://openintro.org/os/amazon`
- Go to the course website, read the syllabus, let me know if you have any questions.
- Get started with your labs
  - Lab 0 is due today

Let's get familiar with the website

An Example on the importance of (Good) Data Analysis and Presentation

The Challenger launch decision

In 1986, the Challenger space
shuttle exploded moments after
liftoff
Decision to launch one other
most scrutinized in history
Failure of O-rings in the solid-fuel
rocket boosters blamed for
explosion
Could this failure have been
foreseen?

The Challenger launch decision

Morton-Thiokol engineers made this table & worried about
launching below 53 degrees (Why?)

Flights with O-ring damage	
Flt Number	Temp (F)
2	70
41b	57
41c	63
41d	70
51c	53
61a	79
61c	58

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O-ring would erode or have "blow-by" (2 ways to fail) in cold temp

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Failed to convince administrators there was a danger

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(Counter-argument: "damages at low and high temps")

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Are there problems with this presentation? with the use of data?

The Challenger launch decision

Engineers did not consider successes, only failures;
selection on the dependent variable

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	All flights, chronological order		
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No	66	No	78
Yes	70	No	67
No	69	Yes	53
No	68	No	67
No	67	No	75
No	72	No	70
No	73	No	81
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Other problems?

The Challenger launch decision

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Other problems? Why sort by launch number?

The Challenger launch decision

O-ring damage pre-Challenger, by temperature at launch			
Damage?	Temp (F)	Damage?	Temp (F)
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The evidence begins to speak for itself.

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What if engineers had made this table before the launch?

Why didn't NASA make the right decision?

The Challenger launch decision

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But Edward Tufte thinks it may have been a matter of
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The Challenger launch decision

Why didn't NASA make the right decision?

Many answers in the literature:
bureaucratic politics; group think; bounded rationality, etc

But Edward Tufte thinks it may have been a matter of
presentation & modeling:

- Never made the right tables or graphics
- Selected only failure data
- Never considered a simple statistical model

What do you think? How would you approach the data?

The Challenger launch decision

How about a scatterplot? Better for seeing relationships than a table.

Vertical axis is an O-ring damage index (due to Tufte, who made the plot)

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(°F) of field joints at time of launch

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(°F) of field joints at time of launch
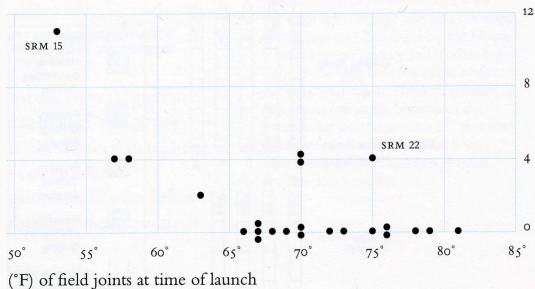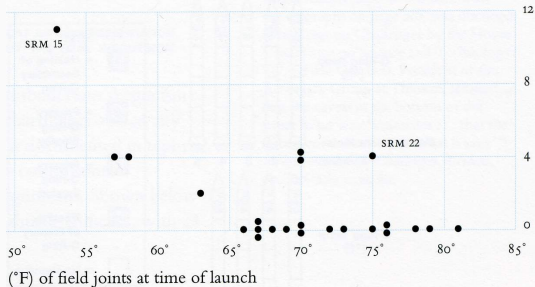
Suspicious. What was the forecast temperature for launch?

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What was the forecast temperature for launch? 26 to 29 °F!

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O-ring damage index, each launch

SRM 15

SRM 22

26°–29° range of forecasted temperatures (as of January 27, 1986) for the launch of space shuttle Challenger on January 28

Temperature (°F) of field joints at time of launch
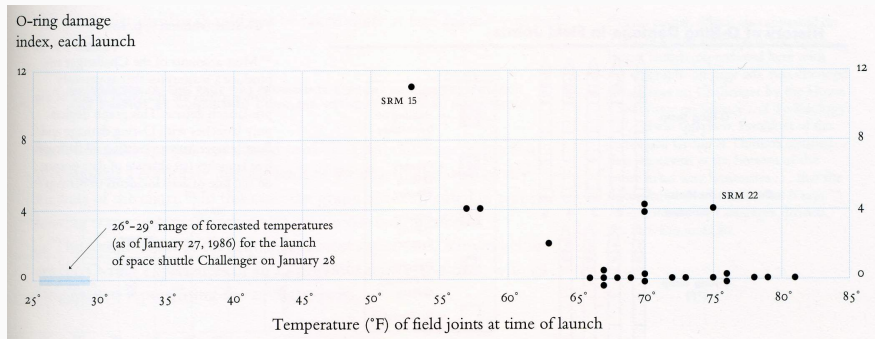
The shuttle was launched in unprecedented cold

The Challenger launch decision

Imagine you are the analyst making the launch recommendation.

You've made the scatterplot above. What would you add to it?

Put another way, what do you is the first question you expect from your boss?

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Clearly, we want a more precise way to state the probability of failure

We need a *model*, and a way to convey that model to the public.

The Challenger launch decision

Model the probability of O-ring damage as a function of temperature

We can use a statistical tool called "logit" for this purpose

The model is nonlinear: $\Pr(\text{damage}) = (1 - \exp(-\beta_0 - \beta_1 \text{temperature}))^{-1}$

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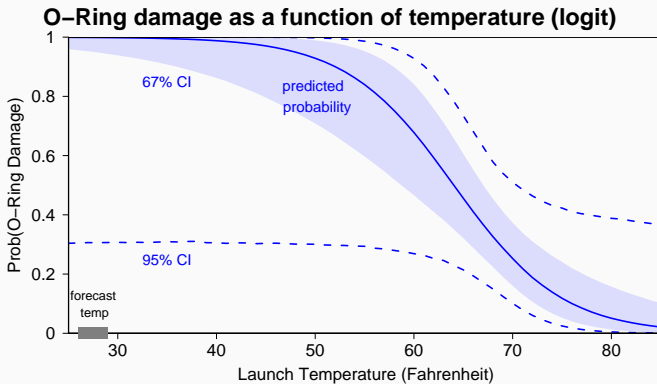| Variable	est.	s.e.	p
Temperature (F)	-0.18	0.09	0.047
Constant	11.9	6.34	0.062
N	22		
log-likelihood	-10.9		

which most social scientists read as "a statistically significant negative relationship b/w temperature and probability of damage"
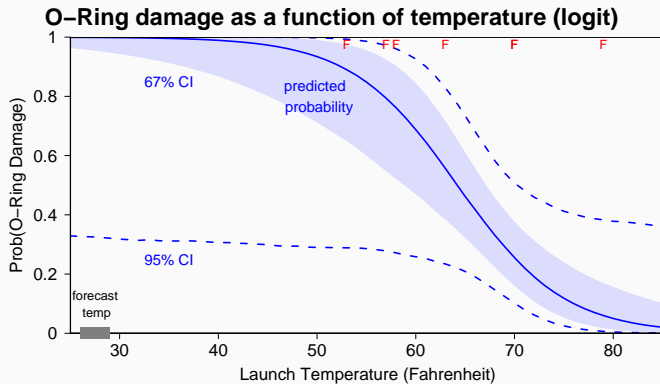
But that's pretty vague too.

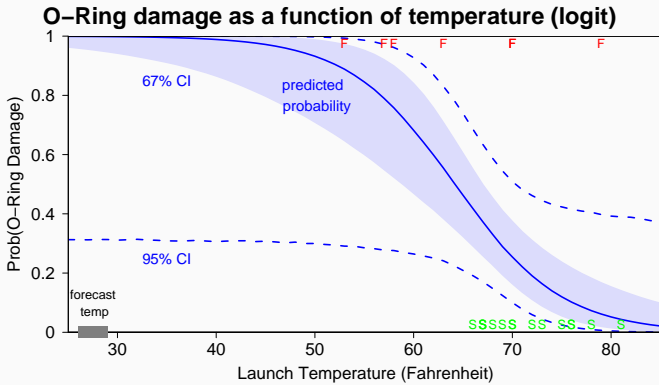Is there a more persuasive/clear/useful way to present these results?

O–Ring damage as a function of temperature (logit)
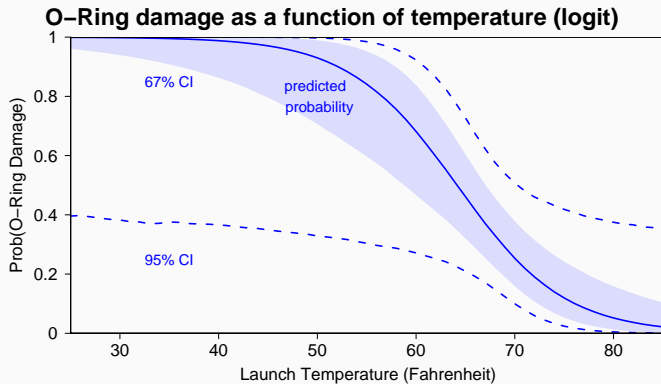
A picture clearly shows non-linear model predictions *and* uncertainty

O–Ring damage as a function of temperature (logit)

And gives a more precise sense of how foolhardy launching at 29 F is.

O–Ring damage as a function of temperature (logit)

It's also good to show the data giving rise to the model.

O–Ring damage as a function of temperature (logit)

Remembering that the Failures are only meaningful compared to Successes

O–Ring damage as a function of temperature (logit)
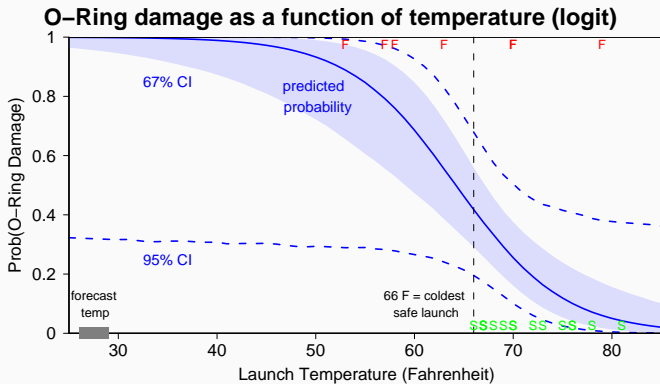
Looking just at the data might show that launches under 66 F likely O-ring failures.

O–Ring damage as a function of temperature (logit)

This inference is based on an unstated model.

In a hearing, Richard Feynmann dramatically showed O-rings lose resilence when cold by dropping one in his ice water.

Experiment cut thru weeks of technical gibberish concealing flaws in the O-ring

But it shouldn't have taken a Nobel laureate:
any scientist with a year of statistical training could have used the launch record to reach the same conclusion

And it would take no more than a single graphic to show the result