





### The Schedule for Today

### Wednesday 6th March 2024

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14:00 -- 14:10 Introduction and Motivations
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14:10 -- 14:50 Presentation and Q&A
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14:50 -- 15:00 10-minute Break
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15:00 -- 15:45 Practical Session
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15:45 -- 16:00 Final Wrap-Up





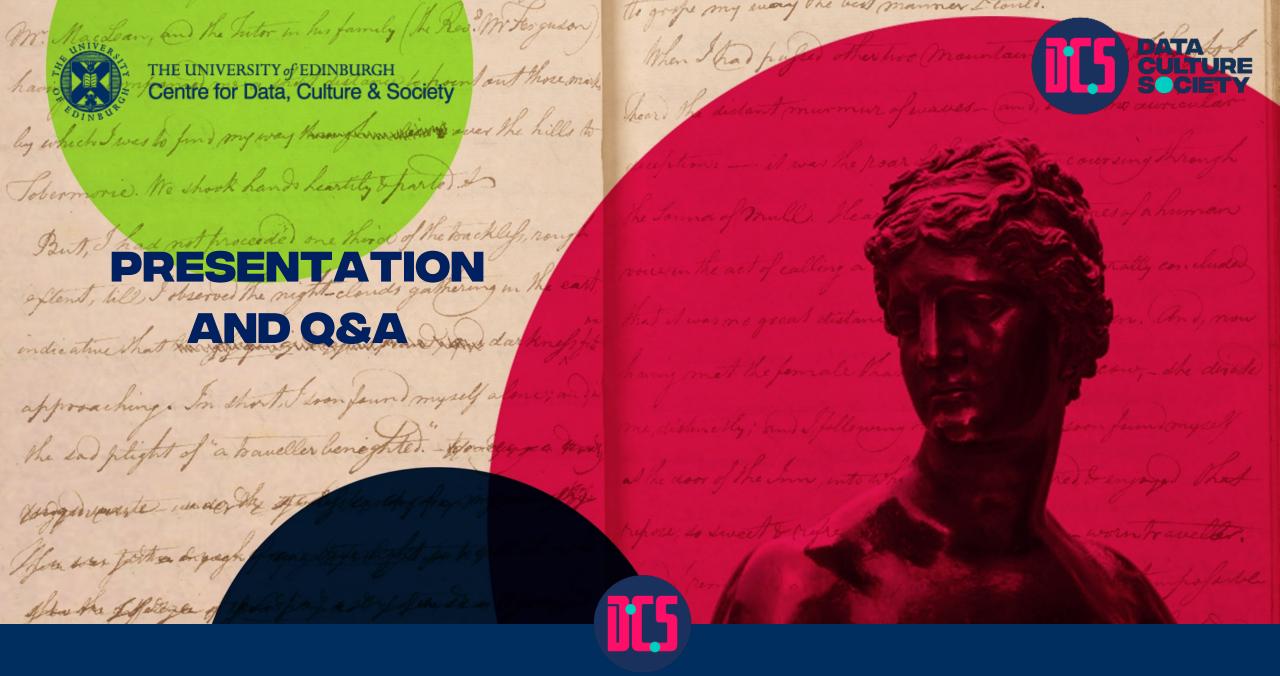


### Welcome!



**Chris Oldnall** 

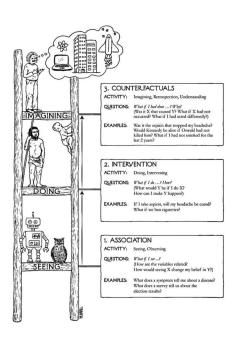








### Pearl's Ladder of Causality



What does a symptom tell me about a disease?

If I take a drug will the disease be cured?

Would the disease have continued had I not taken then drug?

 $\mathbb{P}(y \mid x)$ 

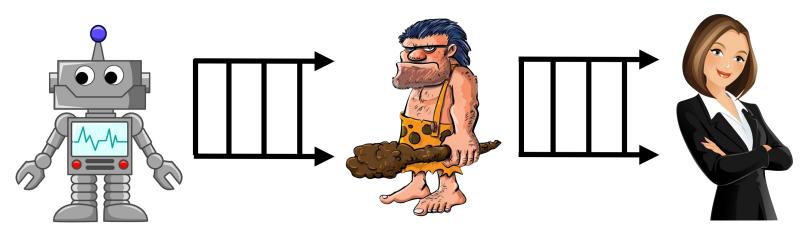
 $\mathbb{P}(y \mid do(x), z)$ 

 $\mathbb{P}(y_x|x',y')$ 

Association

Intervention

Counterfactuals

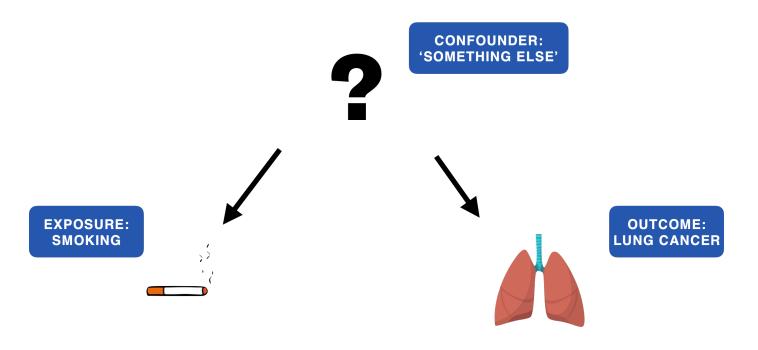








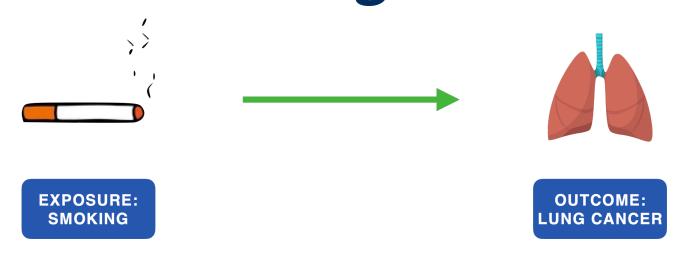
## Smoking in the multiverse of madness







# How do we calculate the average causal effect?



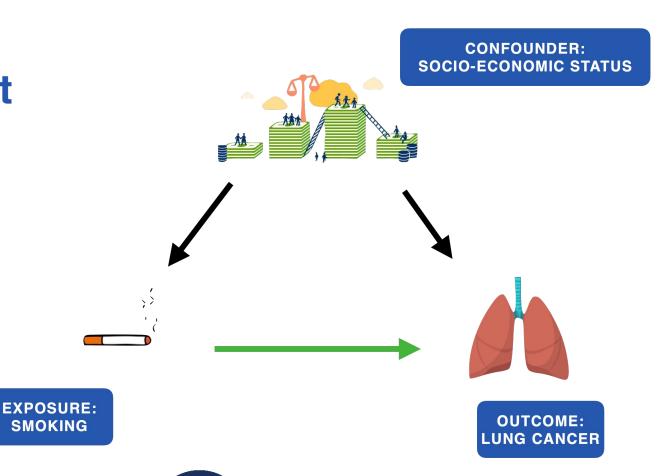
$$\psi = \mathbb{E}_X[Y|X]$$







How do we measure the effect of smoking on lung cancer with the influence of socio-economic status?









# Well...how do we deal with confounding in general?

- 1. Randomisation / Study Design
- 2. Matching / Accounting
- 3. Instrumental Variables







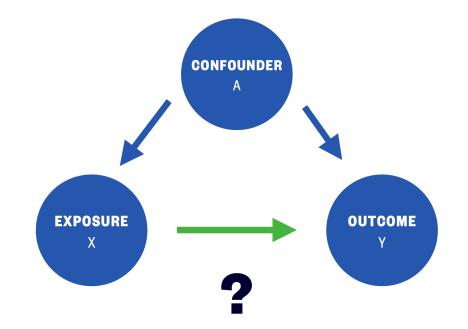
# Average causal effect with confounding

 $\mathcal{M} = (X, A, Y)$ 

X - Exposure

A - Confounder

Y - Outcome



$$\psi = \mathbb{E}_X[\mathbb{E}_A[Y|X,A]]$$







### What about mediators? What do I do?

Workplace Policies as a Mediator for Employee Well-Being:

**Independent Variable (X):** Implementation of workplace policies to reduce stress.

**Mediator (M):** Employee satisfaction with work-life balance.

**Dependent Variable (Y):** Employee well-being and job performance.

The implementation of stress-reducing workplace policies (X) may affect employee well-being (Y) through the mediator of employee satisfaction with work-life balance (M). This mediator helps explain how the policies influence employee outcomes.

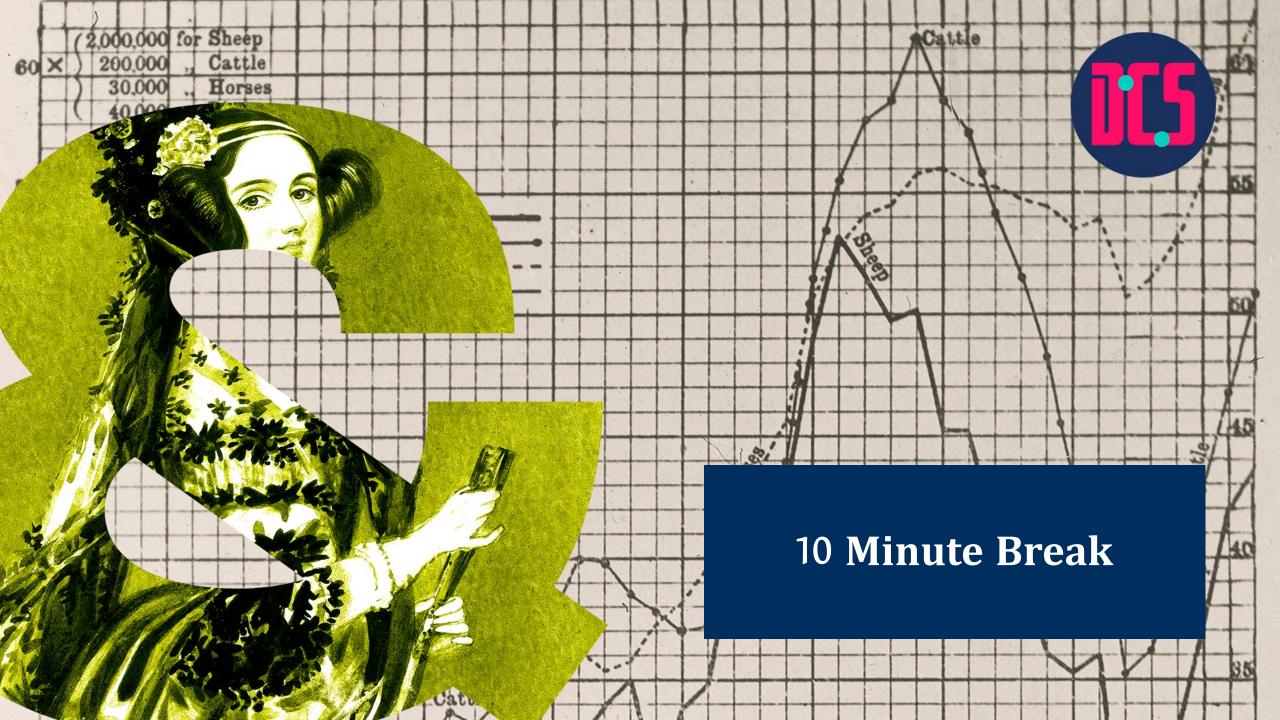






### Ultimately, leave them alone!



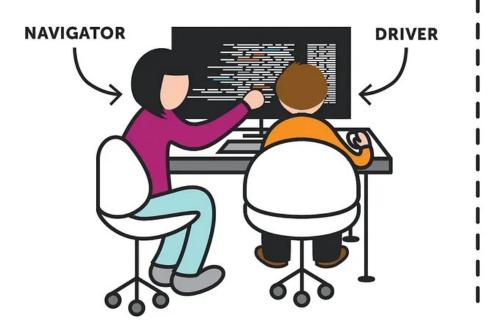








#### PAIR PROGRAMMING





#### Image from:

https://medium.com/@tomspencer\_uk/pairprogramming-and-problem-solving-4531ef3bf171







### **Pair Programming**

- find a partner
- switch driver & navigator roles regularly, e.g., after every task in the notebook
- you can work with the same partner throughout the course, or switch between sessions
- ask us for help! (yes, even for small things)







### Let's get programming

### For Python:

- 1.Go to https://noteable.edina.ac.uk/login
- 2.Login with your EASE credentials
- 3.Select 'Standard Notebook (Python3)' as a personal notebook server and press start
- 4.Click the '+GitRepo'
- 5.Copy and Paste this repository URL <a href="https://github.com/DCS-training/IntroCausalInference">https://github.com/DCS-training/IntroCausalInference</a> as the Repository URL you do not need to add in any other fields.
- 6.Decide where to locate the folder. By default, it will locate it in your home directory
- 7.Press 'Clone' Congratulations you have now pulled the content of the repository on your Notable server space.

#### For R:

- 1. Go to https://noteable.edina.ac.uk/login
- 2. Login with your EASE credentials
- 3. Select RStudio as a personal notebook server and press start.
- 4. Go to File > New Project> Version Control > Git
- 5. Copy and Paste this repository
  URL <a href="https://github.com/DCS-training/IntroCausalInference">https://github.com/DCS-training/IntroCausalInference</a> as the Repository URL (The Project directory name will filled in automatically but you can change it if you want your folder in Notable to have a different name).
- 6. Decide where to locate the folder. By default, it will locate it in your home directory.
- 7. Press Create Project Congratulations you have now pulled the content of the repository on your Notable server space.





#### Feedback for us...

- We hope you've enjoyed the course as much as we did.
- It is really useful for us to hear your feedback

https://forms.office.com/r/YYNrqvuNr8
Should be really quick and only take 5 mins (maximum!)







### Thank you from us!



 Do consider joining us for more CDCS course in the future!

Check out www.cdcs.ed.ac.uk