# The impact of real-time high-resolution spatial health surveillance of COVID19 linked health data at scale

23<sup>rd</sup> June 2021

Dr Laura North, Dr Joe Hollinghurst and Dr Rich Fry

on behalf of the SAIL HDRUK COVID Team:

Prof Ronan Lyons, Ashley Akbari, Gareth Davies, Rowena Griffiths, Jane Lyons, and Fatemah Torabi





Analysis of linked de-identified data of the impact of COVID19 on the Welsh population using the Secure Anonymised Information Linkage (SAIL) system: A One Wales Approach

Creation of two total population linked cohorts derived from Wales Multimorbidity Cohort:

- C20 all alive and known to NWIS on 1st January 2020 followed up to present
- C16 all alive and known to NHS Wales (NWIS) on 1st January 2016 followed up to end December 2019 – counterfactual cohort
- Research now supported by a grant from the Medical Research Council
- Enhanced data collection in care homes, schools, pregnant women and teenagers
- **Advanced Spatial Analytics**
- Direct reporting to Welsh Government TAG and to SAGE
- https://bmjopen.bmj.com/content/10/10/e043010.info

























































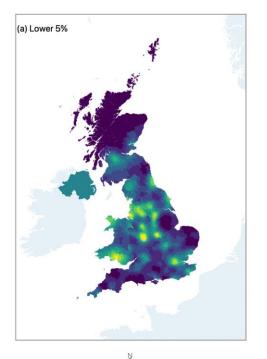


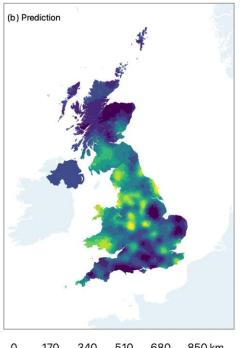


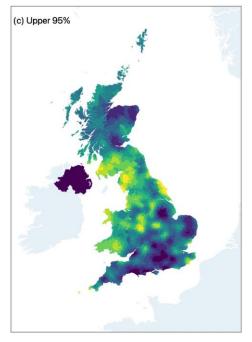
# **Predicting community prevalence**



- HDRUK Network Linkup with BREATHE, ZOE and geospatial expertise to develop high-resolution mapping of prevalence across the UK. April → Present International Journal of Medical Informatics:
  https://doi.org/10.1016/j.ijmedinf.2021.104400
- First UK wide scale mapping of prevalence at community level before testing data was available. Weekly updates to Welsh and Scottish Gov. Importantly shows intra-authority variation





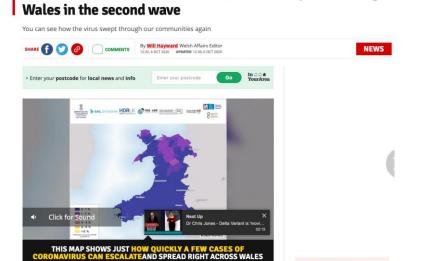


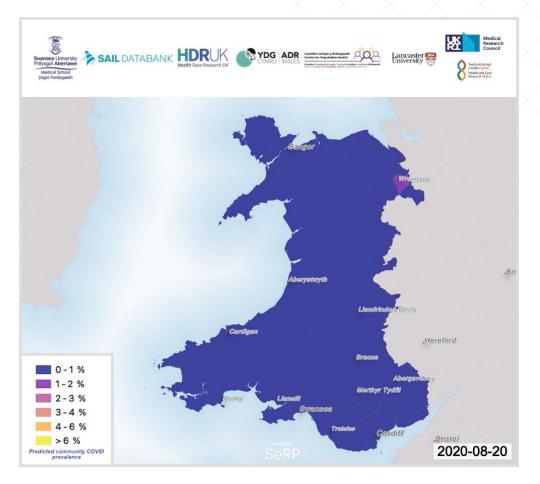
# Models adapted for COVID-19 testing data



- Using objective measures of COVID test outcomes (PCR tests) linked to homes
- Able to develop high resolution models of COVID spread
- Importantly able to visualise change over time
- Directly informed Welsh Government decision making processes on lockdowns and fire break via Technical Advisory Cell (Welsh SAGE equivalent)
- Used in public media briefings by First Minister Mark Drakeford and Health Minister Vaughan Gething to help explain some of the decisions around lockdown and firebreaks
- Demonstrated to the general public how their anonymised data was being used – widely reported in the media

Powerful video shows how coronavirus has spread through





# **Geographical linkages**

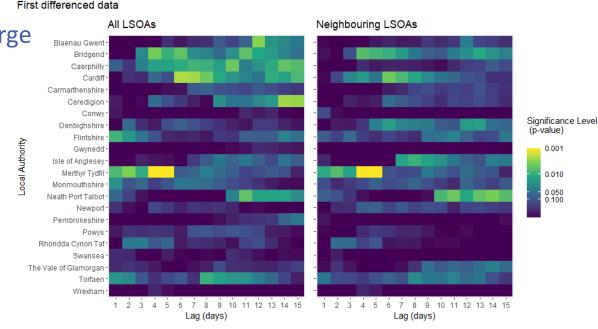


# SAGE SCWG, TAC, Welsh Government Task and Finish Group

- Enhanced Care Home Index total care home linkage plus enhanced variables to capture lived environments (e.g. Floor space, linked care homes, shared space, services offered, access to primary and secondary care)
- Initial analysis: excess mortality (all cause)
- Hospital discharge analyses : small effect of discharge
- Impacts of vaccines on CH population

## Ongoing work:

- Looking at COVID specific mortality
- Change in resident population characteristics
- Impact of community prevalence on outbreaks
- Impact on specialist care settings (e.g. dementia)
- Care home workforce analysis



https://doi.org/10.1093/ageing/afaa207

# Modelling school transmission in primary and secondary educational settings



TAG, Welsh Government Task and Finish Groups

 Mixed Methods approach: Quantitative health and administrative data plus school survey data linked by location data

#### Quantitative Data

- Enhanced School Anonymised Linking Field (S-ALF)
   school characteristics, size, year groups, building age
- Administrative education data e.g. attendance, school bus usage plus staff information
- Linked to health data and households

#### Qualitative Data

- HAPPEN survey extended to capture children, parents and teacher views
- Helps understand some of the nuances of the quantitative data

	5 x early career researchers will give a short (4 minute) presentation on their exciting new research.
	Chair: Fatemeh Torabi, HDR UK Wales and Northern Ireland and Swansea University
	<ol> <li>Predicting emergency admissions in the Scottish population?     James Liley, University of Edinburgh/Alan Turing Institute</li> <li>Assessment of the likelihood of test positivity in pupils and staff in relation to other recent cases in linked pupils, staff or their households     Daniel Thompson, Swansea University</li> <li>Assessment of how accurately telephone triage services identified those who suffered an adverse outcome needing an emergency 111 or 999 response     Carl Marincowitz, University of Sheffield</li> <li>A spatial time series modelling approach for tracking COVID-19 cases in England at the Lower Tier Local Authorities level Claudio Fronterre, Lancaster University</li> <li>The UK Biobank COVID-19 Serology Study Jelena Besevic, University of Oxford</li> </ol>
12:40	IOI LUNCH BREAK

# **TEAM SCIENCE!**





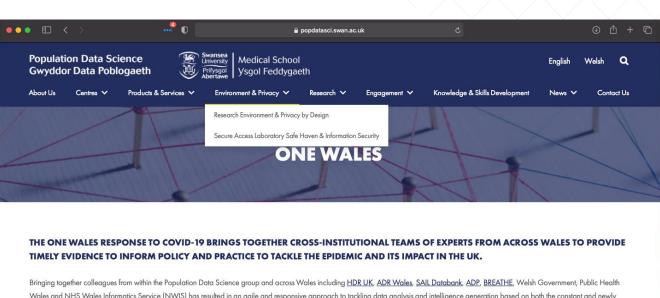
# Thanks for listening!

Email: l.north@Swansea.ac.uk r.j.fry@swansea.ac.uk



@richfry





Wales and NHS Wales Informatics Service (NWIS) has resulted in an agile and responsive approach to tackling data analysis and intelligence generation based on both the constant and newly developing priorities for tackling COVID-19 in Wales.

The One Wales team will continue to work together to identify gaps in knowledge and streamline efforts to deliver vital intelligence to help policymakers understand and plan around the issue of COVID-19 in Wales and across the UK.



#### GEOSPATIAL MODELLING TO PREDICT COVID PREVALENCE AT COMMUNITY **LEVEL**

New real time analysis demonstrating the spread of Covid-19 in Wales has directly informed the One Wales response to Covid-19 in Wales.

https://popdatasci.swan.ac.uk/news/one-wales/



# FAIR use of data at scale (Findable, Accessible, Interoperable and Reusable)

# Whole-population pandemic response research in the NHS Digital TRE for England

Jonathan Sterne
University of Bristol, UK
HDR UK South West













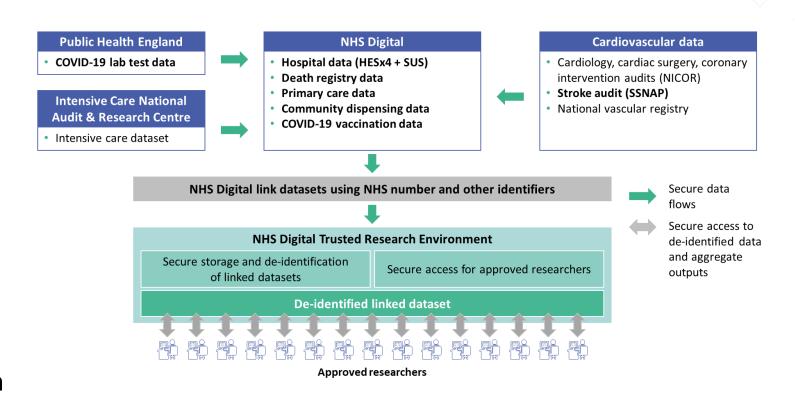
# CVD-COVID-UK: building UK-wide infrastructure to accelerate UK-wide research



Objective – enable whole population research whilst ensuring data security and privacy and maintaining public trust

**Design -** linked person-level records from national healthcare settings accessible within NHS Digital's new Trusted Research Environment

**Participants** - 54.4 million people alive on 1<sup>st</sup> Jan 2020, registered with an NHS general practitioner, comprising <u>~96% of population</u>



BMJ 2021; 373 doi: https://doi.org/10.1136/bmj.n826



# Defining COVID-19 infection and severity: preliminary data from 54 million patients



Johan Th<del>yg</del>esen



Chris Tomlinson



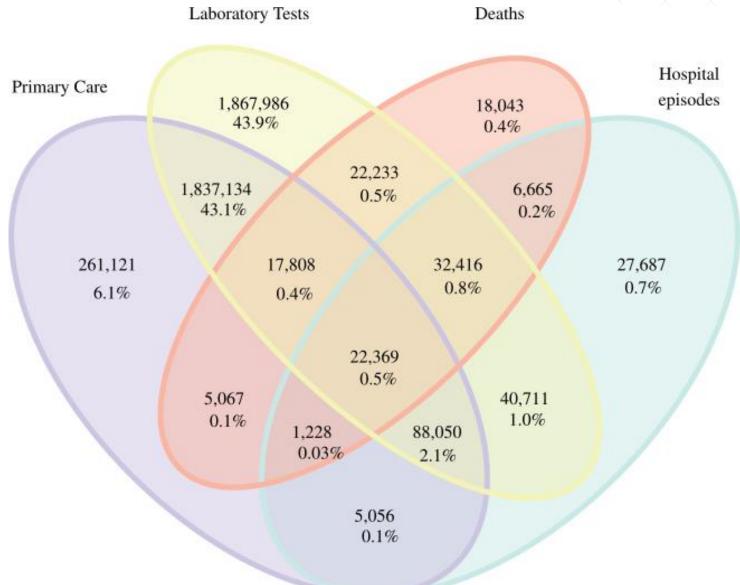
Spiros Denaxas

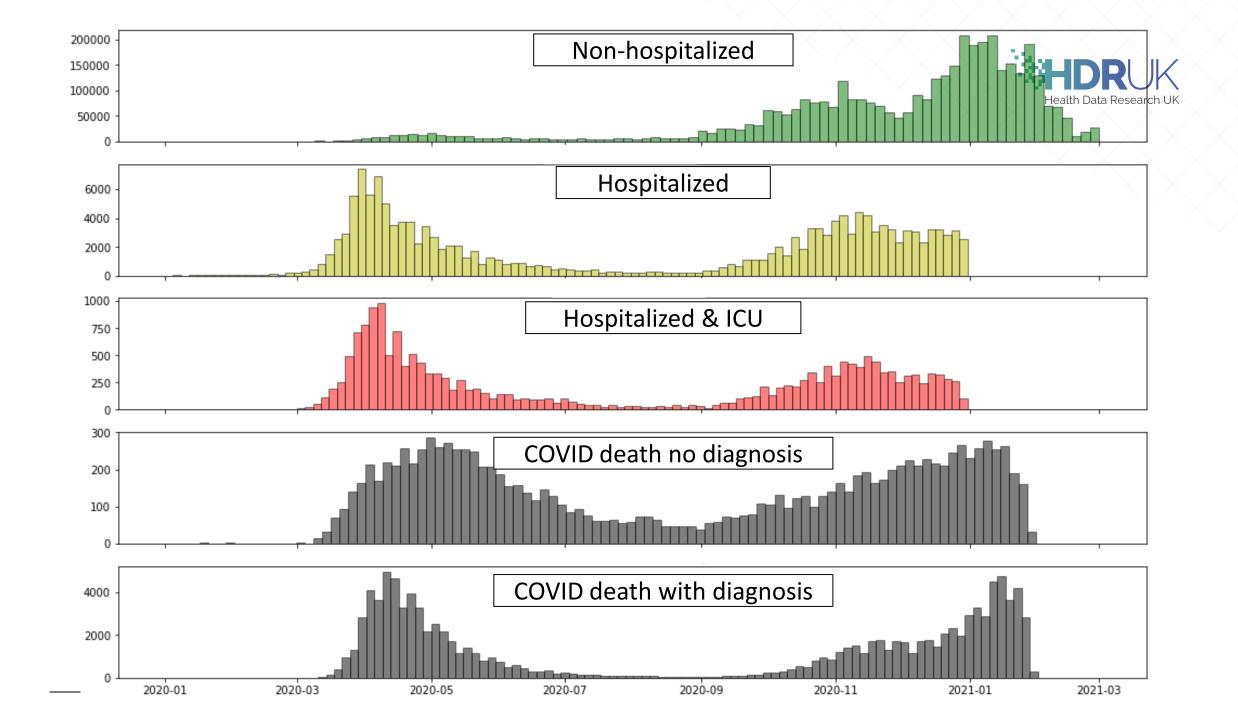
and many more colleagues



# N=4,273,182 COVID-19 infections





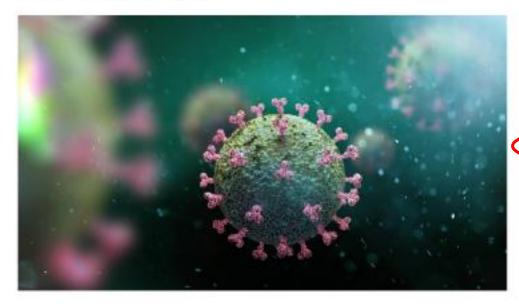


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#### Project

#### CVD-COVID-UK

CVD-COVID-UK aims to understand the relationship between COVID-19 and cardiovascular diseases such as heart attack, heart failure, stroke, and blood clots in the lungs through analyses of de-identified, linked, nationally collated healthcare datasets across the four nations of the UK.



Share this page In 🔰

The CVD-COVID-UK project, led by Professor Cathie Sudlow, Director of the BHF Data Science Centre, is one of the six National Flagship Projects approved by the NIHR-BHF Cardiovascular Partnership.

#### CVD-COVID-UK: Cardiovascular disease and COVID-19

UK-wide linked routine healthcare data to address the impact of cardiovascular diseases on COVID-19 and the impact of COVID-19 on cardiovascular diseases

> **Study Protocol** Version 1 1 June 2020

#### **OBJECTIVES**

To interrogate nationally collated, population level, linked healthcare data across the UK population to address the following questions:

- 1) What are the effects of cardiovascular diseases, their risk factors and medications on susceptibility to and outcomes from COVID-19 disease?
- What is the direct impact of SARS-CoV-2 infection on acute cardiovascular complications as well as on medium and longer term cardiovascular risk?
- 3) What is the indirect impact of the COVID-19 pandemic and the government and NHS response to it on the presentation, diagnosis, management and outcomes of cardiovascular diseases?



# Investigating the effects of angiotensin-converting enzyme inhibitors (ACEi) and angiotensin receptor blockers (ARB) on COVID-19 outcomes

Venexia Walker



# England

Jonathan Sterne

Jennifer Cooper

Rachel Denholm

**Ross Booton** 

Spiros Denaxas

Tom Palmer

**Neil Davies** 

**Richard Martin** 

Rupert Payne

John Macleod

# **NHS** Digital

Sam Hollings

Efosa Omigie

# Scotland

Ray Carragher

Clea du Toit

**David Moreno Martos** 

Sandosh Padmanabhan

**Huan Wang** 

Kim Kavanagh

## Wales

Ashley Akbari

Hoda Abbasizanjani

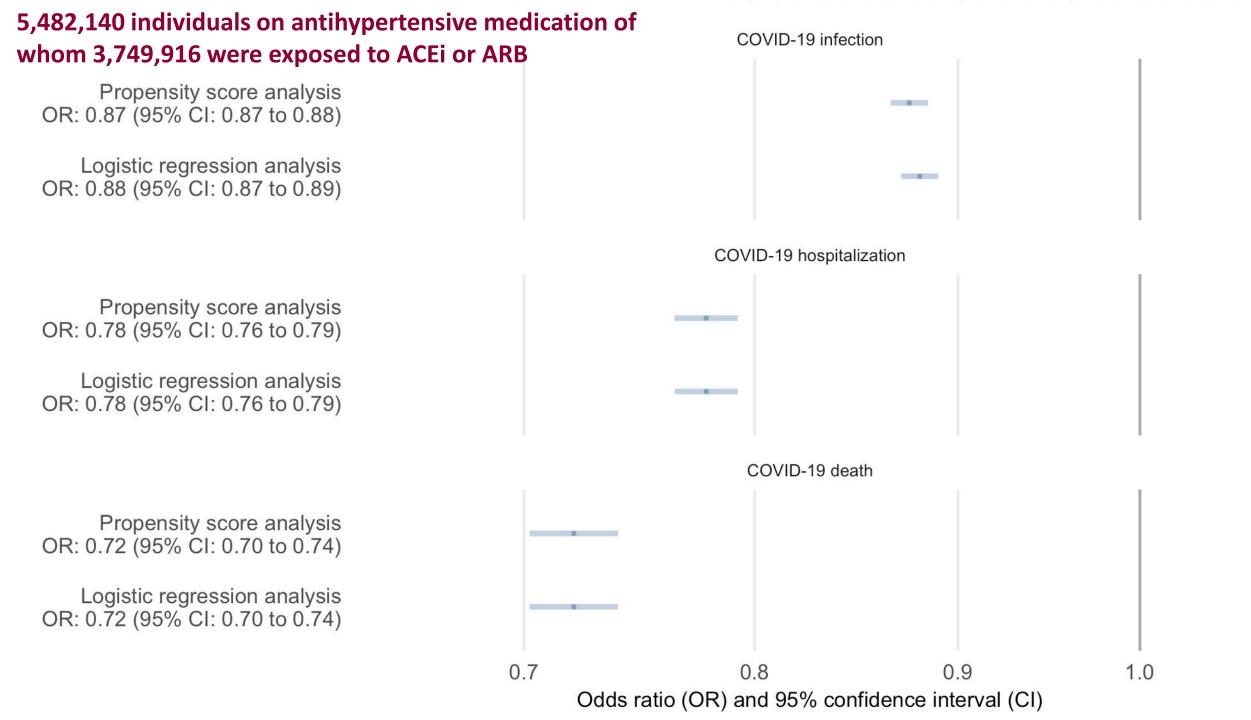
Fatemeh Torabi

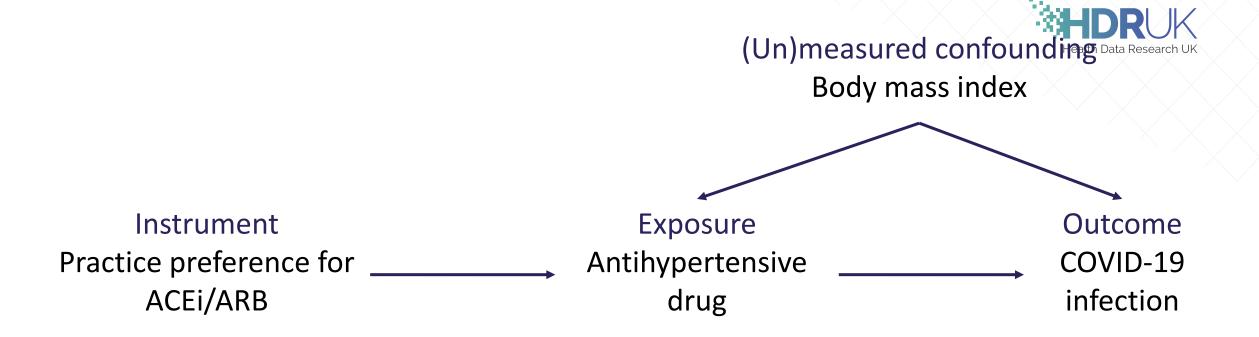
... and many others from the

CVD-COVID-UK consortium

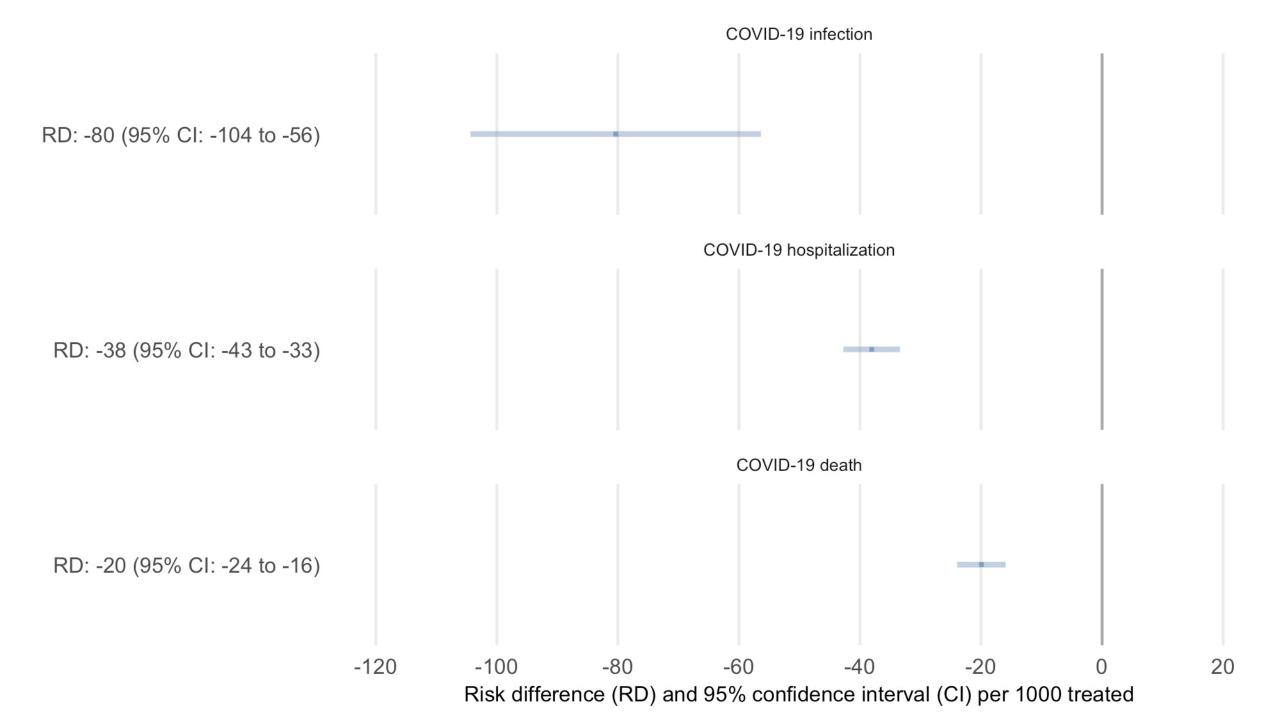








Instruments must satisfy three assumptions: (1) relevance - the instrument must associate with the exposure; (2) independence - the instrument and the outcome must have no common causes; and (3) the exclusion restriction - the instrument must only affect the outcome through the exposure.





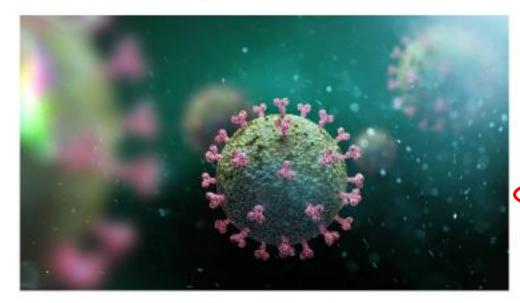
COVID-19 Access to Health Data Helping with Health Data Using Health Data Careers in Health Data Science News, Opinion and Events About us

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# **COVID-19 vaccines and thrombotic events**





Analyses conducted in the NHS Digital Trusted Research Environment for England (~54 million people)

Multi-institutional, inter-disciplinary team: Will Whiteley, Cathie Sudlow, Angela Wood, Jonathan Sterne, Tom Bolton, Jennifer Cooper, Spiros Denaxas, Rachel Denholm, Sam Hollings, Samantha Ip, Spencer Keene, Venexia Walker and others

Protocol on GitHub

Cox models, follow-up from 8 Dec 2020 to mid March 2021, exposure split pre and post-vaccination, control for baseline but not time-varying confounding

# **COVID-19 vaccines and thrombotic events**

British Heart Foundation Data Science Centre

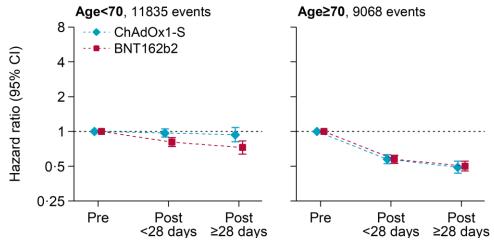
Led by Health Data Research UK



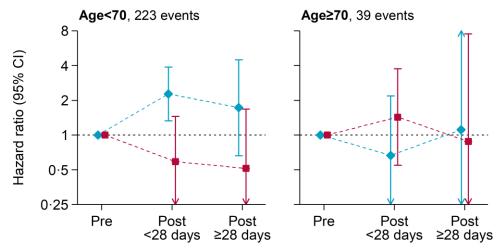


Adjusted hazard ratios (95% CIs) 0-28 and ≥28 days after vaccination, vs pre vaccination

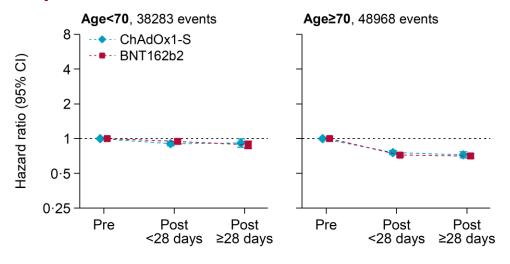
## Any venous thrombosis



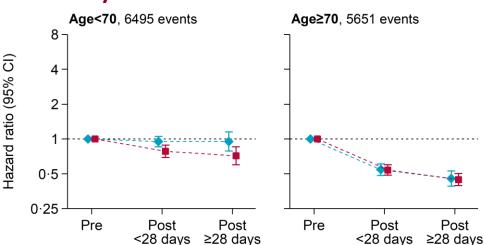
#### Intracranial venous thrombosis

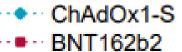


#### **Any arterial thrombosis**



## **Pulmonary embolism**





# **COVID-19 vaccines and thrombotic events**

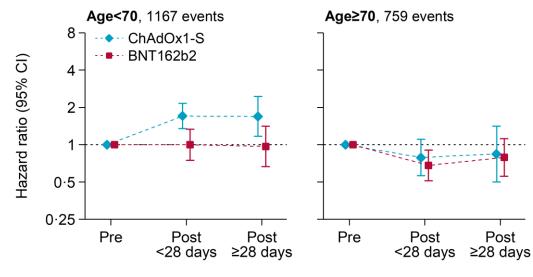
NATIONAL CORE STUDY



Led by Health Data Research UK

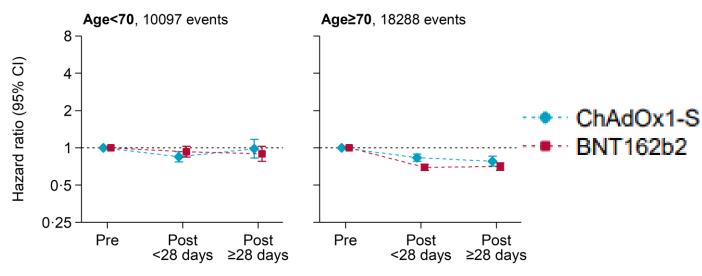
Fully adjusted hazard ratios (& 95% CIs): pre vaccination (HR=1), 0-28 days, ≥28 days)

### **Thrombocytopenia**



#### **Lower limb fracture**

Post



# COVID-19 Longitudinal Health and Wellbeing National Core Study





# Reflections on whole-population pandemic response research

Unprecedented collaboration across multiple institutions, accessing unprecedented la la Research Un and detailed datasets

- Essential to retain public understanding of and consent for the use of these data for research in the public interest, during and after the pandemic
- Collaborative team science approach is crucial
- Trusted Research Environments (in England) were developed as part of the pandemic response:
  - Substantial computational resources required, and these may not be scalable as the number of users increases
  - Need to explain how patient confidentiality is protected through disclosure controls, and minimise the
  - For FAIR use, we need to integrate open science approaches in all aspects of the NHS Digital TRE for England









