

## **Using Federated Networks to Generate RWE: Why Not Now?**

### **Dalia Dawoud**

**Senior Scientific Adviser** 

NICE, UK



@drddawoud

in

https://www.linkedin.com/in/dalia-dawoud-8b2478159/

dalia.dawoud@nice.org.uk

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### **REAL WORLD RESEARCH IS A CHALLENGING JOURNEY**





### Business (disruption)

**Ethics** Security

## **THE JOURNEY TO REAL WORLD EVIDENCE**



### **Reproducible data flow**

Documented manipulations and procedures. Automated, end-to-end analysis code.

### **Common Data Model & standardised vocabulary**

Two-step process: standardisation before analysis. ETL & source code separated from analysis. Re-use of data & analysis.







E

Start date: 1 Nov 2018 End date: 30 Apr 2024 **Duration**: 66 months



Almost €29 million







## THE EHDEN FEDERATED DATA NETWORK



EHDEN will develop new tools and dashboards.

### The EHDEN platform

Many different open source tools (cohort builder, estimation, incidence rate, ....)

## **BENEFITS OF A FEDERATED DATA NETWORK**

Data remains under the **control** of the data owner.

Locally required legal and ethical approvals apply.

No patient-level data leaves the owner's site; only aggregated counts, thereby ensuring patient privacy.

**GDPR** – 'Privacy by Design'.

Analysis is "brought to the data" rather than creating a central data repository.

Use of **common data model** allows for efficient search/analysis across multiple data sets.

Requires close collaboration with data owners, which builds trust.





### TRUSTED RESEARCH ENVIRONMENTS/DATA LAKES

- Allow individual patient level data analysis
- Avoiding potential loss of information in the mapping process
- Linkage of databases and pooling of data from different sources



7









**Prof. Daniel Prieto-Alhambera** Prof. of Device and Pharmacoepidemiology University of Oxford, UK

**Dr Alex Asiimwe** Head of Open Innovation Partnerships Bayer AG, Berlin, Germany

Dr Alan Lamb Scientific Adviser NICE, UK







# Using Federated Networks to generate RWE Why not now?



### Dani Prieto-Alhambra, MD PhD Prof of Pharmaco-epidemiology **Oxford University**







- Why RWD and Open Science?
- The EHDEN-OHDSI COVID-19 experience
- Characterisation
- Causal inference







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# Why RWE?









# Why 'real world' data? **1.RCTs are not always possible** ...

Hazard What this study adds Parachute use to prevent death and major trauma related to gravitational challenge: systematic review of No randomised controlled trials of parachute use randomised controlled trials **BMJ 2003** have been undertaken Gordon C S Smith, Jill P Pell The basis for parachute use is purely observational, and its apparent efficacy could potentially be explained by a "healthy cohort" effect

### The medicalisation of free fall

It is often said that doctors are interfering monsters obsessed with disease and power, who will not be satisfied until they control every aspect of our lives (Journal

# # OF RCTs = 0





# Why 'real world' data? 2.The data is out there ... and this enables replication studies

Changes in hip fracture rate before and after total knee replacement due to osteoarthritis: a population-based cohort study

Daniel Prieto-Alhambra,<sup>1–3</sup> M Kassim Javaid,<sup>1</sup> Joe Maskell,<sup>1,4</sup> Andrew Judge,<sup>1</sup> Michael Nevitt,<sup>5</sup> Cyrus Cooper,<sup>1,4</sup> Nigel K Arden<sup>1,4</sup>



Total hip fractures rate, cases vs controls

### Knee Arthroplasty and Risk of Hip Fracture: A Population-Based, Case–Control Study

Arief Lalmohamed · Frans Opdam · Nigel K. Arden · Daniel Prieto-Alhambra · Tjeerd van Staa · Hubertus G. M. Leufkens · Frank de Vries



Prieto-Alhambra D et al. Ann Rheum Dis 2011

### Prieto-Alhambra D et al. CTI 2012





# Why 'real world' data? **3.Generalizability**



Table 1 Comparison of the exclusion criteria in the FIT trial with the incident users of alendronate in the SIDIAP and DHR database

FIT exclusion criteria <sup>a</sup>	Operational definition/ICD-10 Codes	Incident users of Alendronated		
		SIDIAP N = 14,316 (%)	DHR N = 21,214 (%)	
Men	Sex according to administrative data	3818 (26.7 %)	3885 (18.3 %)	
Age <55 years old	Age at first ALD dispensation	1844 (12.9 %)	1654 (7.8 %)	
Age >80 years old	Age at first ALD dispensation	2347 (16.4 %)	5275 (24.9 %)	



# Why 'real world' data? 4.Efficacy vs Effectiveness ...





# or RD







- RWE can replicate RCTs ...
  - When the right data is available
  - When the right expertise is in place
  - When the best methods (for a given RQ) are applied

# UTMOST

Risk-benefit and costs of unicompartmental (compared to total) knee replacement for patients with multiple co-morbidities: a nonrandomised study, and different novel approaches to minimise confounding.

## **UTMoST**

Risk-benefit and costs of unicompartmental knee replacement for patients with multiple co-morbidities

### Propensity Score analyses vs TOPKAT (RCT)- OKS Sensitivity analysis restricted to 'eligible' surgeons



method	Mean OKS	Difference		• • • • • • • • • • • • • • • • • • •	ES (95% CI)	l <sup>2</sup> , Chi-squared, Ta
ТОРКАТ			•		1.91 (0.20, 3.62)	
PSSwhole	All surgeons				0.56 (-0.03, 1.16)	53%, 0.14,0.48
PSSwhole	Eligible surgeons				1.37 (0.54, 2.20)	0%, 0.58,0.0
PSSexp	All surgeons				0.76 (0.15, 1.36)	35%, 0.21,0.23
PSSexp	Eligible surgeons		- - - - - -		1.37 (0.54, 2.20)	0%, 0.58,0.0
IPW	All surgeons	• -			0.58 (-0.19, 1.35)	48%, 0.17,0.43
IPW	Eligible surgeons		- - - - -		1.32 (0.32, 2.33)	0%, 0.56,0.0
	-1 (	0 1	2	3 4		







au²



### THE EU: BREADTH OF DATA FOR RESEARCH





# OPEN SCIENCE: Not Only About The Data...





NEWS & OPINION MAGAZINE SUBJECTS MULTIMEDIA CAREERS

Home / News & Opinion

### WHO Halts Hydroxychloroquine Testing Over Safety Concerns

A paper published in *The Lancet* reported that hospitalized COVID-19 patients taking the drug had a higher risk of death, although some researchers have raised questions about the data.



**Catherine Offord** *May 27, 2020* 



Update (June 18): The World Health Organization announced yesterday that it was dropping hydroxychloroquine from the Solidarity trial after new data suggest the drug is ineffective as a COVID-19 treatment or prophylaxis. A study published June

ABOVE: © ISTOCK.COM, ADAM SOOS









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# How can Open Science help?

- All artifacts of our analytics pipeline are made available to the public
- In doing so, we are encouraging others to do the same

- Transparency is key to
  - Reproducibility
  - Interpretability
  - Trustworthiness

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- Why RWD and Open Science?
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## DS **OBSERVATIONAL HEALTH DATA SCIENCES AND INFORMATICS**



Home > COVID-19 Updates Page

### **COVID-19 Updates Page**

The Observational Health Data Sciences and Informatics (OHDSI) international community will host a COVID-19 virtual study-a-thon this week (March 26-29) to inform healthcare decision-making in response to the current global pandemic.

Day 4

Early Call: Video Global Call: Video FINAL CALL: Use This Link To Watch Live (regardless of whether you registered)

Please take a look at the early calls, but we're going to save the exciting study-a-thon updates for our final call tonight! This link will work for anybody, regardless of whether you registered for the study-a-thon. We are so excited to share our studies and early

results with the world. Please share this link with people in your networks, so they can see the power of global collaboration in the OHDSI community.



**OHDSI Kicks Off COVID-19 Research Agenda** With 4-Day International Virtual Study-A-Thon



### What have we done?

### In only **88** hours, we did:

- Convene **351** participants from **30** countries
- Hold **12** Global Huddles, **>100** collaborator calls, >13,000 chat messages
- Engage **15** concurrent channels
- Review >10,000 publications
- Draft **9** study protocols
- Release **13** study packages
- Design 355 cohort definitions
- Assemble a distributed data network with **37** partners signed on to execute studies

Day 3 Updates

https://www.ohdsi.org/covid-19-updates/







4 things that we did in 4 days that nobody had ever done before

- First large-scale characterization of COVID patients in Europe, US and Asia
- First prediction model externally validated on COVID patients to inform shielding strategies
- Largest study ever conducted on the safety of hydroxychloroquine...
- And a MASSIVE NETWORK for research

### Methods The power of a community

### USA

Columbia University Irving Medical Center (CUIMC, February to December 2020)

IQVIA Hospital CDM (February to October 2020)

STAnford medicine Research data Repository (STARR-OMOP from February to May 2020)

Premier (from February to August 2020)

Optum-EHR (February to October 2020)

Tufts Medical Center Clinical Academic Research Enterprise Trust (TRDW, February to May 2020)

Department of Veterans Affairs (VA-OMOP, February to June 2020).



### South Korea

Health Insurance Review and Assessment (HIRA, February to April 2020)

### China

Nanfang Hospital and Southern Medical University (NFHCRD database, January to April 2020)

### Spain

HM Hospitales (March to April 2020)

Hospital del Mar (February to August 2020)



### **EHDEN-OHDSI COVID-19 RWE Collaboration**



EUROPE (9)	Ŷ	H			
# CPRD (EHR)	3,864	NR		>	
IQVIA DA Germany (EHR)	11,500	NR			
E HM Hospitales (Hospital Billing)	NR	2,544			
Hospital del Mar (EHR)	NR	2,686		/	
Integrated Primary Care Information (EHR)	3,306	60	in the		
IQVIA LPD France (EHR)	23,592	NR		0	
<ul> <li>IQVIA LPD Italy (EHR)</li> </ul>	4,816	NR		9	
Information System for Research in Primary					
Care (SIDIAP) (EHR)	124,305	18,369		1	2
SIDIAP-H (EHR Hospital linkage)	43,441	7,197			
					_

USA (13)	<b>%</b>	H	
Columbia University Irving Medical Center (EHR)	10,437	3,439	i
Department of Veterans Affairs (EHR)	57,937	10,951	
HealthVerity (Claims with diagnostic testing)	587,683	22,887	
IQVIA Open Claims (Claims)	2,875,812	533,997	
IQVIA Hospital Charge Data (Hospital Billing)	153,477	57,062	
Optum EHR (EHR)	217,772	36,717	
Optum SES (EHR with socio-economic data)	7,863	4,336	
Oregon Health & Sciences University (EHR)	11,187	627	
Premier (Hospital Billing)	417,650	156,187	
Stanford University (EHR)	4,788	744	
<ul> <li>Tufts Medical Center (EHR)</li> </ul>	1,250	326	
CUniversity of Colorado Anschutz Medical Campus- Health Data Compass(EHR)	9,481	1,874	
QUniversity of Washington School of Medicine (EHR)	3.245	733	Ĩ.

Health Insurance Review & Assessment Service (Claims)

Daegu Catholic University Medical Center (EHR)

Nanfang Hospital (EHR)

Persons diagnosed with COVID-19 or lab confirmed tested positive (no prior observation required) Persons hospitalized with diagnosed with COVID-19 or lab confirmed tested positive (no prior observation required) IR = Not Reported

### Kostka K et al. ResearchSquare



### 4.5 m tested+ 1.2 m hospitalized EU countries 3 US, 3 Asian nodes

	Ϋ́	H
)	NR	7,599
	559	46
	403	304











- Why RWD and Open Science?
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# Hacking COVID-19 and its management globally in 2020

Check for updates



ARTICLE

https://doi.org/10.1038/s41467-020-18849-z OPEN

Deep phenotyping of 34,128 adult patients hospitalised with COVID-19 in an international network study

Edward Burn tet al.#

https://www.nature.com/articl es/s41467-020-18849-z

OPEN ACCESS

Check for updates

### Use of repurposed and adjuvant drugs in hospital patients with covid-19: multinational network cohort study

Albert Prats-Uribe,<sup>1</sup> Anthony G Sena,<sup>2,3</sup> Lana Yin Hui Lai,<sup>4</sup> Waheed-Ul-Rahman Ahmed,<sup>5,6</sup> Heba Alghoul<sup>7</sup> Osaid Alser.<sup>8</sup> Thamir M Alshammari.<sup>9</sup> Carlos Areia.<sup>10</sup> William Carter.<sup>11</sup> Paula Casajust,<sup>12</sup> Dalia Dawoud,<sup>13,14</sup> Asieh Golozar,<sup>15,16</sup> Jitendra Jonnagaddala,<sup>17</sup> Paras P Mehta,<sup>18</sup> Mengchun Gong,<sup>19</sup> Daniel R Morales,<sup>20,21</sup> Fredrik Nyberg,<sup>22</sup> Jose D Posada,<sup>23</sup> Martina Recalde, <sup>24,25</sup> Elena Roel, <sup>24,25</sup> Karishma Shah,<sup>5</sup> Nigam H Shah,<sup>23</sup> Lisa M Schilling,<sup>11</sup> Vignesh Subbian,<sup>26</sup> David Vizcaya,<sup>27</sup> Lin Zhang,<sup>28,29</sup> Ying Zhang,<sup>19</sup> Hong Zhu,<sup>30</sup> Li Liu,<sup>30</sup> Jaehyeong Cho, <sup>31</sup> Kristine E Lynch, <sup>32</sup> Michael E Matheny, <sup>33,34</sup> Seng Chan You. <sup>35</sup> Peter R Rijnbeek,<sup>3</sup> George Hripcsak,<sup>36</sup> Jennifer CE Lane,<sup>5</sup> Edward Burn,<sup>1,24</sup> Christian Reich,<sup>37</sup> Marc A Suchard.<sup>38</sup> Talita Duarte-Salles.<sup>24</sup> Kristin Kostka.<sup>37,39</sup> Patrick B Rvan.<sup>2,40</sup> Daniel Prieto-Alhambra<sup>1</sup>

ABSTRACT For numbered affiliations see end of the article. OBJECTIVE Correspondence to: P B Ryan rvan@ohdsi.org (ORCID 0000-0002-9727-2138) Additional material is published online only. To view please visit DESIGN the journal online Cite this as: BMI 2021:373:n1038 http://dx.doi.org/10.1136/bmi.n1038

across three continents. Multinational network cohort study. SETTING مرجا والمعادية

### https://www.bmj.com/c ontent/373/bmj.n1038

RESEARCH

To investigate the use of repurposed and adjuvant drugs in patients admitted to hospital with covid-19 in Spain), azithromycin (from 15 (4.9%) in China to 1473 (57.9%) in Spain), combined lopinavir and ritonavir (from 156 (<2%) in the VA-OMOP US to 2,652 (34.9%) in South Korea and 1285 (50.5%) in Spain). and umifenovir (0% in the US, South Korea, and Spain and 238 (78.3%) in China). Use of adjunctive drugs varied greatly, with the five most used treatments being enoxaparin, fluoroquinolones, ceftriaxone, vitamin D, and corticosteroids. Hydroxychloroguine



**Open collaboration requires FULL transparency** in every step of the research process



- Protocol and analysis source code freely available and directly downloadable: https://github.com/ohdsi-studies/Covid19HospitalizationCharacterization
- Phenotype definitions are both human-readable and computer-executable using ATLAS against any OMOP CDM: https://atlas.ohdsi.org/
- Manuscript posted on Medrxiv while awaiting peer-review: https://www.medrxiv.org/content/10.1101/2020.04.22.20074336v1
- All analysis results available for public exploration through interactive R shiny application: http://evidence.ohdsi.org/Covid19CharacterizationHospitalization/



# **KEY FINDINGS**



- 34,128 participants from 3 continents:
  - North America (US) 8,362
  - Asia (South Korea) 7,341
  - Europe (Spain) 18,425
- 81,596 influenza 'controls' as benchmark
- 4,811 to 11,643 features extracted and summarised in an interactive web app
- Preprint available in MedRXiv on 22<sup>nd</sup> April 2020



# **KEY FINDINGS (2)**



- COVID is no flu
- Healthier
- Less drug usage
- Exceptions incl. obesity OR diabetes





# Drug Utilisation within 30d of hosp.



**Drug use (% of hospitalized patients with COVID-19)** 



### A Prats-Uribe et al. BMJ 2021 [in press]



### The rise and fall of HCQ ... -> before trials





4 February Wang et al - Remdesivir and chloroquine effectively inhibit covid-19 in vitro



Fig 4 | Time trends in hydroxychloroquine use on days 0 to 30 after hospital admission in patients with a positive test result for or diagnosis of covid-19 by month. CUIMC=Columbia University Irving Medical Center; HIRA=Health Insurance Review and Assessment; OMOP=Observational Medical Outcomes Partnership; Optum-EHR=Optum deidentified electronic health record dataset; STARR=STAnford medicine Research data Repository; TRDW=Tufts Research Data Warehouse; VA=Veterans Affairs

December







- Why RWD and Open Science?
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## 1. Safety Risks of HCQ ± AZM

## a multinational, network cohort and selfcontrolled case series study

	Articles
Risk of hydroxychloroquine alone and in combination with azithromycin in the treatment of rheumatoid arthritis: a multinational, retrospective study	
Jennifer C E Lane <sup>*</sup> , James Weaver <sup>*</sup> , Kristin Kostka, Talita Duarte-Salles, Maria Tereza F Abrahao, Heba Alghoul, Osaid Alser, Thamir M Alshammari, Patricia Biedermann, Juan M Banda, Edward Burn, Paula Casajust, Mitchell M Conover, Aedin C Culhane, Alexander Davydov, Scott L DuVall, Dmitry Dymshyts, Sergio Fernandez-Bertolin, Kristina Fister, Jill Hardin, Laura Hester, George Hripcsak, Benjamin Skov Kaas-Hansen, Seamus Kent, Sajan Khosla, Spyros Kolovos, Christophe G Lambert, Johan van der Lei, Kristine E Lynch, Rupa Makadia, Andrea V Margulis, Michael E Matheny, Paras Mehta, Daniel R Morales, Henry Morgan-Stewart, Mees Mosseveld, Danielle Newby, Fredrik Nyberg, Anna Ostropolets, Rae Woong Park, Albert Prats-Uribe, Gowtham A Rao, Christian Reich, Jenna Reps, Peter Rijnbeek, Selva Muthu Kumaran Sathappan, Martijn Schuemie, Sarah Seager, Anthony G Sena, Azza Shoaibi, Matthew Spotnitz, Marc A Suchard, Carrmen O Torre, David Vizcaya, Haini Wen, Marcel de Wilde, Junqing Xie, Seng Chan You, Lin Zhang, Oleg Zhuk, Patrick Ryan, Daniel Prieto-Alhambra, on behalf of the OHDSI-COVID-19 consortium	


# *Primum non nocere* (First, do no harm)



< Share

# Hydroxychloroquine ...

- Cheap, generic drug
- Indicated for RA, SLE and malaria prophylaxis
- Relatively safe, but:
  - Retinal toxicity
  - QT lengthening
- "In vitro" activity vs SARSCov2
- Great publicity ...

# Coronavirus: Trump says he is taking unproven drug hydroxychloroquine











We had historical data from >900,000 previous users of HCQ for other indications (RA) to learn:

- What is the risk of serious adverse events (leading to hospital admission) associated with HCQ (vs SSZ as active comparator)?
- What is the risk of serious adverse events associated with the addition of AZM (vs AMX as active comparator) amongst users of HCQ?







Data source/s: Routine data (electronic medical records and claims) from Germany, Japan, Spain, S Korea, US, and the UK

Design: Comparative cohort analysis (+ SCCS, not covered today)

Participants:

- Age 18+ , 1+ years of data 'visibility'
- Diagnosis of Rheumatoid Arthritis + use of one of the study drugs/ combinations



# Patient counts



Data source	HCQ	SSZ
AmbEMR	57,140	15,268
CCAE	65,935	22,173
Clinformatics	50,698	17,221
CPRD	9,114	11,388
DAGermany	3,884	5,045
IMRD	8,843	8,452
MDCD	7,982	2,177
MDCR	15,690	5,150
OpenClaims	617,628	182,776
OptumEHR	76,844	21,549
VA	31,824	14,276
Meta-analysis	945,582	305,475



# Short-term (30-day) main event/s safety



HCQ vs SSZ

Outcome	Database	CalHR (95% CI) [I2]
CV-related mortality	Clinformatics	1.04 (0.31-3.41)
	VA	2.47 (0.45-13.69)
	Meta-analysis	1.36 (0.51-3.63) [<0.01]
Chest pain or angina	AmbEMR	1.08 (0.71-1.66)
	CCAE	0.91 (0.72-1.14)
	Clinformatics	0.82 (0.66-1.01)
	CPRD	0.90 (0.36-2.23)
	DAGermany	0.41 (0.08-2.06)
	IMRD	1.11 (0.39-3.17)
	MDCD	0.96 (0.58-1.59)
	MDCR	0.93 (0.66-1.30)
	OpenClaims	0.91 (0.83-1.00)
	OptumEHR	1.15 (0.95-1.40)
	VA	1.04 (0.73-1.48)
	Meta-analysis	0.96 (0.84-1.09) [<0.01]
Heart failure	AmbEMR	1.17 (0.56-2.45)
	CCAE	1.40 (0.50-3.90)
	Clinformatics	1.20 (0.74-1.95)
	CPRD	1.32 (0.09-19.00) <
	DAGermany	0.65 (0.10-4.06)
	IMRD	5.14 (0.29-89.87)
	MDCD	1.83 (0.36-9.40)
	MDCR	0.75 (0.42-1.34)
	OpenClaims	0.94 (0.80-1.11)
	OptumEHR	1.25 (0.91-1.73)
	VA	1.28 (0.70-2.34)
	Meta-analysis	1.05 (0.89-1.25) [<0.01]
		0.175 0.25 0.5 1 2 4 6 Favors HCQ CalHR Favors SSZ



# Short-term (30-day) main event/s



AZM vs AMX CalHR (95% CI) [l2] CalHR (95% CI) [12] Outcome Database Clinformatics 1.04 (0.31-3.41) 1.76 (0.56-5.57) CV-related mortality VA 2.47 (0.45-13.69) 1.98 (1.00-3.91) Meta-analysis 2.19 (1.22-3.95) [<0.01] 1.36 (0.51-3.63) [<0.01] Chest pain or angina AmbEMR 1.08 (0.71-1.66) 1.42 (0.78-2.59) CCAE 0.91 (0.72-1.14) 1.02 (0.82-1.25) Clinformatics 0.82 (0.66-1.01) 1.22 (0.98-1.52) CPRD 0.90 (0.36-2.23) DAGermany 0.41 (0.08-2.06) IMRD 1.11 (0.39-3.17) MDCD 0.96 (0.58-1.59) 0.98 (0.57-1.69) MDCR 0.93 (0.66-1.30) 1.10 (0.77-1.56) OpenClaims 0.91 (0.83-1.00) 1.23 (1.10-1.36) OptumEHR 1.15 (0.95-1.40) 1.08 (0.84-1.40) VA 1.04 (0.73-1.48) 0.81 (0.51-1.28) Meta-analysis 0.96 (0.84-1.09) [<0.01] 1.15 (1.05-1.26) [<0.01] Heart failure AmbEMR 1.17 (0.56-2.45) 1.08 (0.51-2.31) CCAE 1.40 (0.50-3.90) 1.01 (0.55-1.86) Clinformatics 1.20 (0.74-1.95) 1.18 (0.77-1.80) CPRD 1.32 (0.09-19.00) DAGermany 0.65 (0.10-4.06) IMRD 5.14 (0.29-89.87) MDCD 1.83 (0.36-9.40) 0.96 (0.39-2.35) MDCR 0.75 (0.42-1.34) 1.33 (0.79-2.22) OpenClaims 0.94 (0.80-1.11) 1.29 (1.11-1.51) OptumEHR 1.25 (0.91-1.73) 0.97 (0.66-1.42) VA 1.28 (0.70-2.34) 1.89 (1.13-3.15) Meta-analysis 1.05 (0.89-1.25) [<0.01] 1.22 (1.02-1.45) [0.23] 0.175 0.25 0.175 0.25 0.5 2 0.5 4 6 Favors HCQ CalHR Favors SSZ CalHR Favors AZM

HCQ vs SSZ







- Findings:
  - In history use in RA population, HCQ alone is generally safe but in combination with AZ it shows a doubling of risk of 30-day cardiovascular mortality.







Chloroquine and hydroxychloroquine are known to potentially cause heart rhythm problems, and these could be exacerbated if treatment is combined with other medicines, such as the antibiotic azithromycin, that have similar effects on the heart.

Recent studies<sup>1,2</sup> have reported serious, in some cases fatal, heart rhythm problems with chloroguine or hydroxychloroguine, particularly when taken at high doses or in combination with the antibiotic azithromycin.

News & events V

Partners & networks



daniel.prietoalhambra@ndorms.ox.ac.uk





**The European Network of Excellence** for Big Data in Prostate Cancer

# Session: Using Federated Networks to Generate RWE: Why Not Now? PIONEER – BD4BO IMI Project Alex Asiimwe BAYER AG, EFPIA Lead PIONEER

www.prostate-pioneer.eu @ProstatePioneer @ @Pioneer-big-data-in-prostate-cancer







- **PIONEER** is part of the Innovative Medicine Initiative's (IMI's) "Big × Data for Better Outcomes" (BD4BO) programme
- The **BD4BO** mission is to improve health outcomes and healthcare systems in Europe by maximising the potential of Big Data
- **PIONEER aims** to transform the field of prostate cancer care with particular focus on:
  - improving prostate-cancer related outcomes
  - health system efficiency
  - the quality of health and social care across Europe









### **THEMES/ENABLERS:**

	Design sets of standard outcomes and demonstrate value	Increase access to high quality outcomes data	Use data to improve value of HC delivery	Increa throu
	DISEASE-SPECIFIC PROJECTS:			
ROADMAP: Alzheimer's disease				
HARMONY: Haematologic malignancies				
BigData@Heart: Cardiovascular diseases				
PIONEER: Prostate cancer				
(	CO-ORDINATING PROJECTS:			

DO->IT: Coordination & support actions

**OVERARCHING:** 

European Health Data Network (EHDEN)

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### ase patient engagement Igh digital solutions







- Prostate Cancer (PCa) is the **second leading cause of cancer death** among men ×
- Insufficient knowledge on risk factors and patient characteristics ×
- Need for integration of real-world clinical data into disease classification and care pathways
- Missing standardisation of **PCa-related outcomes** X
  - Lack of appropriate **patient stratification**
  - Insufficient engagement of stakeholders including patients
  - **Suboptimal care** for prostate cancer patients







By applying advanced data analytics, and developing a data-driven platform of unparalleled scale, quality and diversity,

- PIONEER will empower meaningful improvement in clinical practice, PCa disease-related outcomes, and health-economic outcomes across the European healthcare landscape
- PIONEER will assemble, standardise, harmonise and analyse high-quality big data from diverse populations of PCa patients across different stages of the disease to provide evidence-based data for improving decision-making by key stakeholders



## BIG DATA PLATFORM

**RESEARCH QUESTIONS** 

### THE EUROPEAN NETWORK OF EXCELLENCE FOR BIG DATA IN PROSTATE CANCER

Together we can ensure each individual patient receives the right treatment for them at the right time.

Clinical benefit of determining patients' genetic risk profile

Tumour- & patient-specific variables that affect prognosis

What differentiates patients with lethal vs. non-lethal disease

Best therapeutic window & approach for recurrent prostate cancer

Impacts of comorbidities & life expectancy on patient outcomes

Upfront chemotherapy: who benefits & real-life side effects





**KNOWLEDGE GAPS** 

DATA SOURCES

**BIG DATA PROCESSING** 

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Answers to the most important prostate cancer questions

Invididualised evidence based medicine

Improved decision-making & optimise care for prostate cancer patients and their families

**PIONEER OUTCOMES** 

# **PIONEER**

# The PIONEER network of excellence



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### 

### Mapping completed (\*) or in progress/prep phase (#)







PIONEER, in collaboration with IMI2 EHDEN and the OHDSI community conducted a focused five-day meeting (study-a-thon) to generate medical evidence on Prostate Cancer patients undergoing non-interventional management.



- 245 participants
- 4 patients
- 875 team engagements



- 20 countries
- 5 time zones
- 5 days



- 4 teams
- 5 cohorts
- 64 phenotypes



17 datasets & counting

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3 analytics tasks



# **PIONEER – Study-A-Thon: Group dynamics**

### What is your background?



### How many study-a-thons have you attended?



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# **Studyathon Objectives**

To investigates the natural history and outcomes of prostate cancer patients managed with watchful waiting (WW) using an international network of real-world data

Watchful waiting is a conservative management option for prostate cancer patients with a life expectancy < 10 years at time of diagnosis.

Develop and validate risk scores & prediction models that quantify time to death, symptomatic progression and initiation of palliative treatment following WW

With the outcomes of this work we hope to inform shared healthcare decision-making for prostate cancer patients managed by watchful waiting.

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We prepared in advance: Data; Cohorts; Final draft Protocol(s)







Sub-teams	Objectives
Clinical characterisation	Describe the demographic and clinical characteristics of patie cancer under watchful waiting (WW) & estimated clinical out patients including those who initiated treatment.
Phenotyping	Define the study phenotypes clearly, unambiguously and accur generate meaningfully evidence considering differences/nuar databases
Prediction	Develop a prediction model, in the context of WW, that prediction (symptomatic progression, death, death without symptoms) a moment in time (6, 12, 24 months) based on a combination of characteristics.
Data sources & study execution	Identify & recruit appropriate databases to the study; develop run analyses for clinical characterisation and to compile result install <u>R package</u>



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PCa = prostate cancer; WW = watchful waiting; AS = active surveillance; t = index date

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Patients on conservative management experience two main outcomes:

- Death 1.
- 2. Progression after which they receive treatment



**Characterization Study:** describe patients' characteristics and their outcomes **Prediction Study:** identify patients likely to experience <u>death before progression</u>

### @ProstatePioneer

### Death



# **Phenotype-Cohort Development Process**



- 62 new cohorts were defined: 20 target, 7 outcomes and 35 strata ٠
  - All cohorts are loaded in PIONEER ATLAS (<u>https://pioneer-atlas.thehyve.net/#/home</u>
- Cohort Diagnostics results from ten different databases were reviewed ٠

**Finalized and disseminate** the study package



Final phenotype definition



# **Studyathon Data Overview**



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### CPRD (Total: 58,603, Pca: 7,945)

OPTUM (Total: 651,765, Pca: 114,697)

> MarketScan Merged Pca: 223,144

MarketScan CCAE Pca: 211,274

MarketScan MDCR\*

Pharmetrics Pca: 197,478

**Open Claims** Pca: 1,010,093

Onco EMR Pca: 27,397

GP data from Spain Pca: 26,000



### **PIONEER**

PIONEER / EHDEN / ≡

About

Cohorts

**Cohort Counts** 

Database

Cohort

Show 25 v entries

🕹 Download 🗸

0

Cohort Characterization				CPRD	CUIMC	MAITT
		Cohort	🗣 Strata	Subjects 🔷	Subjects 🔶	Subject
Time To Front	•	[PIONEER T1] Newly diagnosed PCa	All	6,163	3,736	6
Time to Event	•	[PIONEER T1a] Newly diagnosed PCa broad	All	6,163	4,108	6
Metrics Distribution	•	[PIONEER T2] PCa treated right away	All	3,377	1,272	3
Compare Cohort Char.	•	[PIONEER T3.1] PCa high/intermediate risk conservative management	All		217	
	•	[PIONEER T3.1a] PCa high/intermediate risk conservative management broad	All		304	
Database information		[PIONEER T3] PCa under conservative management	All	2,311	1,656	1
		[PIONEER T3a] PCa under conservative management broad	All	2,311	1,743	1
Change Log		[PIONEER T4.1] Delayed Curative Management	All	69	372	
Database		[PIONEER T4.1a] Delayed Curative Management broad	All	69	399	
CPRD, CUIMC, MAITT, MktSc		[PIONEER T4.2] Delayed Palliative Management	All	607	283	
		[PIONEER T4.2a] Delayed Palliative Management broad	All	607	352	
Cohort		[PIONEER T5a] Symptom post conservative management broad	All	451	953	
[PIONEER T1] Newly diagno		[PIONEER T3a sen1] new PCa conservative management sensitivity_1	All	4,640	3,519	2
		[PIONEER T3a sen2] new PCa conservative management sensitivity_2	All	2,904	2,457	2
Strata		[PIONEER T3a sen3] new PCa conservative management sensitivity_3	All	2,155	1,794	1
All, with Full 365-day follow	-	[PIONEER T3a sen4] new PCa conservative management sensitivity_4	All	1,993	1,649	1
		[PIONEER T3a sen5] new PCa conservative management sensitivity_5	All	1,749	1,492	1

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	Search:		
ſ	MktScan	Optum	тмс
ts 🔶	Subjects 🔷	Subjects 🔶	Subjects 🔷
662	223,144	121,266	315
668	223,144	122,262	358
394	134,164	67,000	125
25		1,181	
27		1,324	19
161	40,049	27,382	132
163	40,049	27,525	143
19	14,905	10,795	21
19	14,905	10,810	23
59	5,293	4,439	
60	5,293	4,525	14
31	17,809	16,289	64
456	176,562	97,501	320
253	77,594	47,274	194
162	35,344	25,195	149
148	30,075	21,607	139
119	23,221	16,635	121

<b>PIONFFR</b> ——	Studyathon G	Goals & Achievement
Cohort diag 1.4M patie Shiny app:	gnostics: ents https://bit.ly/3v6Tnz6	Debugged and functional R package for federated data analytics: bit.ly/3aa1liy
<ul><li>Prediction models for</li><li>time to death</li></ul>		Communication channels bu & OHDSI
<ul><li>symptor</li><li>initiation</li></ul>	matic progression n of palliative treatment	Risk scores for risk of death, treatment
Study proto bit.ly/3vJI7	ocol available on: ZK	Characterisation results now bit.ly/3dTT8QK



# Patient voice included

## ailt with EHDEN

### progression or

### v on Shiny App:



# **PIONEER Study-A-Thon: Patient representatives**



**Gary Hooker** 



**Robert Greene** 



Ken Mastris



**Erik Briers** 

### How would you rate the impact of patient participation on the study with regards to:



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**Collaborative spirit bringing people & skills together – common goal** 

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# The European Network of Excellence for Big Data in Prostate Cancer



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Team Lead Contacts		
Clinical characterisation	Giorgio Gandaglia (giorgio.gandaglia@gmail.com)	
Phenotyping	Asieh Golozar (golozar@ohdsi.org) Shilpa Ratwani (shilpa@ohdsi.org)	
Prediction	Ronald Herrera (ronald.herrera@bayer.com)	
Data sources/study execution	Susan Evans Axelsson (susan.evans_axelsson@me	
General Contacts		
PIONEER	Carl Steinbeisser (carl@collaborate.eu) Emma Jane Smith (e.smith@uroweb.org)	
EHDEN	Nigel Hughes (nhughes@its.jnj.com)	
OHDSI	Peter Rijnbeek (rijnbeek@ohdsi.org)	



# RWE for decision making

# An HTA perspective

Virtual ISPOR 2021

Alan Lamb – Scientific Adviser

NICE National Institute for Health and Care Excellence





# Declarations

Alan Lamb is an employee of NICE and operational lead for WP2 of EHDEN. Views expressed are his own and do not necessarily reflect the views of NICE or the EHDEN consortium.







Reflections from an HTA use case





# **Use of RWE in HTA**

How do HTA agencies use evidence from observational studies?

NICE

1





### How will the use of RWE in HTA submissions develop?

# Use of RWE in HTA

# External control arms

NICE



## Historical control arm for estimating comparative effectiveness

Figure C2: Overall Survival in Perinatal/Infantile-onset HPP Patients Treated with asfotase alfa vs Historical-Control Patients





# Use of RWE in HTA

Managed access agreements

NICE



Managed access period – Cancer Drug Fund **Data collection – Systemic Anti Cancer** Database



### **Review of** health technology appraisal



# **EHDEN** and HTA

A COPD use case

NICE



# **Research question**

Estimate resource use in patients with COPD by disease severity in the UK and the Netherlands







**Methods** 

- Characterisation by severity using reported FEV1% •
- Estimate resource use by determining annual rates of ulletprimary care visits

# **Databases – mapped to OMOP-CDM**


# **EHDEN** and HTA

# A COPD use case challenges

NICE



# (nurse visits removed)

Outpatient



# **EHDEN** and HTA

A COPD use case challenges



### **Tools and dashboards**

**Current OHDSI tools** do not easily support estimation of some common HTA outcomes (eg costs)





### **Bespoke coding required!**



# **EHDEN** and HTA

# A COPD use case – addressing the challenges





### **Challenges should be surmountable!**

### Data processing and mapping

- Ensure use of data for HTA purposes is reflected in data ulletprocessing and mapping processes and ensure HTA experts are involved in the mapping process Map visits in a way that reflects specific types of  $\bullet$ healthcare delivery in different settings (eg
- distinguishing between primary and secondary care)

### **Tools and dashboards**

Development of analytical tools and dashboards to support common analyses in HTA

Kent, et al. *PharmacoEconomics* **39**, 275–285 (2021)



# What might HTA bodies need to have confidence in RWE?



Type of evidence



Data and study quality

- Identify data sources using systematic approaches
- Evidence relevant to key model parameters comparative effectiveness, resource use, quality of life
- Geographically relevant
- Transparent pre-registered studies
- Reproducible
- Understanding strengths and limitations of the data source missingness, etc
- Analysis risk of bias should be assessed, confounders should be adjusted for where possible and uncertainty should be characterised and quantified if possible

### NICE



# Polling question . . .

How confident are you that meaningful evidence can be generated from RWD for **HTA** purposes?

- Very confident
- Somewhat confident •
- Neither confident or unconfident ullet
- Somewhat unconfident •
- Very unconfident





NICE National Institute for Health and Care Excellence

# Thank you for listening.

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