RWE and Pharmaceuticals Challenges and Approach

Christian Reich PRISME 16-October-2013



Insights from RWE Opportunities and Application





Assumption

We know exactly how to do it and we will find the insights

BMJ 2010; 341:c4444



RESEARCH

Oral bisphosphonates and risk of cancer of oesophagus, stomach, and colorectum: case-control analysis within a UK primary care cohort

Jane Green, clinical epidemiologist,¹ Gabriela Czanner, statistician,¹ Gillian Reeves, statistical epidemiologist,¹ Joanna Watson, epidemiologist,¹ Lesley Wise, manager, Pharmacoepidemiology Research and Intelligence Unit,² Valerie Beral, professor of cancer epidemiology¹

ORIGINAL CONTRIBUTION

JAMA 2010; 304(6): 657-663

JAMA

Exposure to Oral Bisphosphonates and Risk of Esophageal Cancer

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Context Use of oral bisphosphonates has increased dramatically in the United States and elsewhere. Esophagitis is a known adverse effect of bisphosphonate use, and recent reports suggest a link between bisphosphonate use and esophageal cancer, but this has not been robustly investigated.

Objective To investigate the association between bisphosphonate use and esoph-

BMJ Results

Table 2 | Relative risks (RRs) and 95% confidence intervals (CIs) for bisphospho nates

6

		Oesophagus	
Oral bisphosphonates	Prescriptions*	Cases/ controls	RR† (95%CI)
Not prescribed	NA	2864/14 376	1.00
Prescribed	13.6/2.4	90/345	1.30 (1.02to1.66)
No of prescriptions:			
1-9	3.6/1.0	40/214	0.93 (0.66to1.31)
≥10	21.6/3.5	50/131	1.93 (1.37to2.70)
Estimated duration of use‡:			
≤1 year	4.9/0.3	31/155	0.98 (0.66to1.46)
1-3 years	13.0/2.0	26/114	1.12 (0.73to1.73)
≥3 years	22.2/4.6	33/76	2.24 (1.47to3.43)

NA=not applicable.

*Prescriptions of bisphosphonates in cases; reported as mean number/mean ye †All relative risks adjusted for smoking status, alcohol intake, and body mass in ‡Time between first and last prescription.

Conclusions The risk of oesophageal cancer increased with 10 or more prescriptions for oral bisphosphonates and with prescriptions over about a five year period. In

JAMA Results

d	ence in t	he Bisphosphor	nate and	Matched Control	ol Cohorts				
					_	Ri	sk		
	Bisphosphonate			Control	Unadjust	ed	Adjusteda		
	Cases	Person-Years	Cases	Person-Years	HR (95% CI)	P Value	HP (05% CI)	P Value	
	79	165 400	72	163 480	1.08 (0.79-1.49)	.63	1.07 (0.77-1.49)	.67	
5									
	51	104 676	49	104 104	1.04 (0.70-1.53)	.86	1.05 (0.70-1.57)	.82	
	31	73364	35	73 170	0.88 (0.55-1.43)	.62	0.92 (0.56-1.51)	.74	
	22	40 3 26	22	40 492	1.00 (0.56-1.81)	.99	0.98 (0.53-1.81)	.95	
_	15	22813	14	22 891	1.08 (0.52-2.23)	.84	1.01 (0.48-2.12)	.99	
	35	62 922	27	63 648	1.31 (0.80-2.17)	.29	1.24 (0.74-2.09)	.41	
_	24	58 162	23	55 334	0.98 (0.55-1.74)	.94	1.03 (0.57-1.86)	.92	
	20	44316	22	44 497	0.91 (0.50-1.67)	.78	0.90 (0.48-1.68)	.74	
_	44	106 480	47	106 412	0.94 (0.62-1.41)	.75	0.96 (0.63-1.47)	.86	
3									
	30	70251	34	69 935	0.88 (0.54-1.44)	.61	0.93 (0.56-1.54)	.78	
	22	39 0 2 2	22	39 187	1.01 (0.56-1.82)	.99	0.98 (0.53-1.80)	.95	
	33	81 369	42	80 837	0.78 (0.50-1.23)	.29	0.77 (0.48-1.23)	.27	
6									
	22	52 308	31	51 741	0.70 (0.41-1.21)	.20	0.68 (0.39-1.19)	.18	
_	19	28 898	21	28 904	0.91 (0.49-1.68)	.75	0.85 (0.45-1.61)	.62	
_	35	58 920	25	57 068	1.35 (0.81-2.25)	.25	1.25 (0.73-2.12)	.37	

Conclusion Among patients in the UK General Practice Research Database, the use of oral bisphosphonates was not significantly associated with incident esophageal or gastric cancer.

Assumption

We can treat RWE like Clinical Trials

We know how to run RWE because we know clinical studies

Clinical study = roughly equivalent to RWE

• Cut data:

- Inclusion and exclusion criteria
- Treatment, control arm Create cohorts/cases
- Detect "end points":
- Remove bias:
- Reject null hypothesis: Calculate *p*-value
- Do it correctly:

- Algorithms for outcomes
- Adjust for confounding
- Use existing machinery and governance



Typical inclusion/exclusion criteria

Open-label Study of TH-302 and Dexamethasone With or Without Bortezomib in Subjects With Relapsed/Refractory Multiple Myeloma

Inclusion Criteria:

- At least 18 years of age.

- Ability to understand the purposes and risks of the study and has signed a written informed consent form approved by the investigator's IRB/Ethics Committee.
 Relapsed/refractory multiple myeloma for which no standard therapy options are anticipated to result in a durable remission.
 Subjects with refractory disease are allowed to participate on study. (Refractory disease is defined as progressive disease within 60 days of last therapy or progression while on therapy).
- Receipt of at least two prior therapies (induction therapy with stem cell transplant with or without maintenance is considered a prior therapy) including prior therapy with a bortezomib-containing regimen
- Receipt of at least two prior therapies (induction therapy with stem cell transplant with or without maintenance is consider (and did not discontinue due to toxicity) and a lenalidomide- or thalidomide-containing regimen Subjects with measurable disease defined as at least one of the following: Serum M-protein ≥ 0.5 mg/dl Urine M-protein ≥ 0.5 mg/dl Urine M-protein ≥ 0.0 mg/24 h Serum FLC assay: Involved FLC level ≥ 10 mg/dl (≥ 100 mg/l) Measurable plasmacytoma (should be measured by CT or PET/CT within 28 days of initial investigational agent dosing). ECOG performance status of less than or equal to 2 (see Appendix B) Accordable liver function:

- Acceptable liver function:
- Total bilirubin ≤ 1.5 times upper limit of normal (x ULN). If total bilirubin is elevated, check direct and if normal then the subject is eligible
 Aspartate aminotransferase (AST) or alanine aminotransferase (ALT) ≤ 3.0 x ULN (≤ 5.0 x ULN if due to myeloma involvement).
 Alkaline phosphatase ≤ 3.0 x ULN (≤ 5.0 x ULN if due to leukemic involvement)

- Acceptable renal function: Serum creatinine $\leq 1.5 \times$ ULN or calculated creatinine clearance above 40 mL/min using the formula of Cockcroft and Gault, or a 24 hr creatinine clearance if borderline

- Setum creatinine $\leq 1.5 \times 0$ LN or calculated creatinine clearance above 40 mL/min using the formula of Cockcroit and Gault, or a 24 hr creatinine clearance if borderline Acceptable hematologic status (without hematologic support): ANC $\geq 1000 \text{ cells/µL}$ (growth factors may not be used within 7 days prior to evaluation) Platelet count $\geq 75,000/\mu$ L (for subjects in whom < 50% of bone marrow nucleated cells are plasma cells); platelet count $> 50,000/\mu$ L for subjects in whom $\geq 50\%$ of bone marrow nucleated cells are plasma cells (without transfusion during the previous 14 days prior to evaluation) Hemoglobin $\geq 8.0 g/d$ L (without transfusion during the previous 14 days prior to evaluation). All women of childbearing potential must have a negative serum pregnancy test and women and men subjects must agree to use effective means of contraception (surgical sterilization or the use or barrier contraception with either a condom or diaphragm in conjunction with spermicidal gel or an IUD) with their partner from entry into the study through 6 months after the last dose

- Subjects must adhere to the study visit schedule and other protocol requirements and receive outpatient therapy and laboratory monitoring at the institute that administers the study drug

Exclusion Criteria:

- Subjects with non secretory or hyposecretory MM
- POEMS syndrome (polyneuropathy, organomegaly, endrocintopathy, monoclonal gammothy and skin changes,
- Plasma cell leukemia
- Waldnestrom's macroglobinemia
- Subject with known or suspected amyloidosis
- Corticosteroid therapy in a dose equivalent to dexamethasone > 1.5 mg/day or prednisone > 10 mg/day within 2 weeks prior to first dose, Subjects may be receiving chronic corticosteroids if they are being given for disorders other than multiple myeloma if they meet the above

- Defining given for disorders other than multiple investion in they meet the above Planned radiation therapy that occurs after the start of therapy Localized radiation therapy to only measurable disease site(s) within 4 weeks of treatment New York Heart Association (NYHA) Class III or IV, cardiac disease, myocardial infarction within 6 months prior to Day 1, or unstable arrhythmia Significant neuropathy (Grade 3 or 4, or Grade 2 with pain) at the time of enrollment or within 14 days before enrollment Symptomatic brain metastases (unless previously treated and well controlled for a period of ≥ 3 months)

- Symptomatic brain metastases (unless previously treated and well controlled for a period of ≥ 3 months) Severe chronic obstructive pulmonary disease with hypoxemia or in the opinion of the investigator any physiological state leading to hypoxemia Major surgery, other than diagnostic surgery, within 4 weeks prior to Day 1, without complete recovery Active, uncontrolled bacterial, viral, or fungal infections, requiring systemic therapy within 14 days prior to the first dose Previously treated malignancies, except for adequately treated non-melanoma skin cancer (basal cell or squamous cell), in situ cancer, or other cancer from which the subject has been disease-free for at least 5 years

- Subjects who participated in an investigational drug or device study within 2 weeks prior to study entry Known or suspected active infection with HIV, hepatitis A, hepatitis B, or hepatitis C Subjects who have exhibited allergic reactions to a similar structural compound, biological agent, or formulation similar to TH-302, bortezomib or pimonidazole Females who are pregnant or breast-feeding
- Concomitant psychiatric disease or medical condition that could interfere with the conduct of the study, or that would, in the opinion of the investigator, pose an unacceptable risk to the subject in this study
- Unwillingness or inability to comply with the study protocol for any reason All previous cytotoxic therapies for multiple myeloma must have been completed at least 3 weeks prior to start of study. Biologic, novel therapy or corticosteroids must have been completed at least 2 weeks prior to start of study.
- Subjects who have been on hormone replacement less than 2 months (subjects on hormone replacement for at least 2 months will not be excluded provided the HRT regimen remains unchanged during the conduct of the study)
- Prior peripheral stem cell transplant within 12 weeks of the start of study
- gpilepsy or other convulsive disorder requiring active management



Comparator Selection

- All patients
- All patients but treated
- Matched patients by co-variates
 - Age
 - Gender
 - Co-morbidity
 - Conmediation
 - Smoking status

Pick co-variates manually/automatically

Treat missing data



Algorithms for Outcomes: Acute Renal Failure

Citation	Diagnosis Codes	Procedure Codes	Laboratory Results
Beard K, Perera DR, Jick H. Drug-induced parenchymal renal disease in outpatients. J Clin Pharmacol. May 1988;28(5):431-435.	For newly diagnosed parenchymal drug-induced renal disease: • acute renal failure: 5851 • acute glomerulonephritis: 5800 • nephrotic syndrome: 5810 • glomerulonephritis NOS: 5830 • renal sclerosis: 5840 • acute tubular necrosis: 5850 • water-losing nephritis: 5861 • renal failure NOS: 5859 • renal cotical necrosis: 5931 • renal disease NEC: 5935 • oliguria and anuria: 7837	None	None
Evans JM, McGregor E, McMahon AD, McGilchrist MM, Jones MC, White G, McDevitt DG, MacDonald TM .Non- steroidal anti-inflammatory drugs and hospitalization for acute renal failure. QJM. 1995 Aug;88(8):551-7.	• 583.8 • 584.5 • 584.7 • 584.8 • 584.9	None	None
Perez Gutthann S, Garcia Rodriguez LA, Raiford DS, Duque Oliart A, Ris Romeu J. Non-steroidal anti- inflammatory drugs and the risk of hospitalization for acute renal failure. Archives of Internal Medicine. 1996;156:2433- 2439.	 580.9 acute nephritis NOS 581 nephrotic syndrome 583.2 membranoproliferative nephritis NOS 583.6 renal cortical necrosis 583.7 nephritis NOS with medullary necrosis 583.8 nephritis NOS with other lesions 583.9 nephritis NOS39 584 acute renal failure 586 renal failure NOS 593.9 disorder of kidney and ureter NOS 	None	Serum creatinine, BUN or urea increased above normal values
Griffin MR, Yared A, Ray WA. Nonsteroidal anti- inflammatory drugs and acute renal failure in elderly persons. Am J Epidemiol. 2000 Mar 1;151(5):488-96.	 Acute renal failure plus other renal conditions 584, 580-583, 585-589, 403, 404, 250.4, 590.0, 590.8, 274.1, 753.1, 593.9 (page 489) 	None	None
Bellomo R, Kellum JA, Ronco C. Defining acute renal failure: physiological principles. Intensive Care Med. Jan 2004;30(1):33-37.			Risk: Increased SCreat x 1.5 or GFR decrease > 25%, (OR) Urine output < 0.5ml/kg/h x 6 hr. Injury: Increased SCreat x 2 or GFR decrease > 50%, (OR) urine output < 0.5ml/kg/h x 12 hr Failure: Increased SCreat x 3, GRF decrease 75%, or SCreat≥4mg/dl (acute rise ≥0.5 mg/dl) (OR) urine output < 0.3ml/kg/h x 24 hr or anuria x 12 hrs Loss: Persistent ARF = complete loss of kidney function > 4 weeks
Clinard F, Sgro C, Bardou M, et al. (2004). "Association between concomitant use of several systemic NSAIDs and an excess risk of adverse drug reaction. A case/non-case study from the French Pharmacovigilance system database." Eur J Clin Pharmacol 60(4): 279-83	• 0618	None	None
Wistaratain A.C. Mainar ID. Johns TE. Hattan DC	- EOA see	- Dialusia	Algorithm 2: 509/ increases of corrum creatining

Acute Renal Failure – cont.

Winterstein AG, Weiner ID, Johns TE, Hatton RC. Validation of Automated Database Algorithms to Identify Hospital-Acquired Renal Failure. [University of Florida, Gainesville, FL, USA. ISPOR 2004] [Abstract] Value Health 2004 7 (3): PUK13 [, PG. 366]. Cziraky MJ, Willey VJ, McKenney JM, et al. Statin safety: an assessment using an administrative claims database.	 584.xx 584.xx (acute renal failure/acute tubular necrosis) 	• Dialysis None	Algorithm 2: 50% increase of serum creatinine (SCr) within 3 days Algorithm 3: 50% SCr decrease between peak and discharge None
Am J Cardiol. Apr 17 2006;97(8A):61C-68C.	Penal impairment including acute renal failure:	None	(Baseline) creatinine > I II N. (OB) sediment
Johansson S, Herings RMC. Results from a rosuvastatin historical cohort study in more than 45,000 Dutch statin users, a PHARMO study. Pharmacoepidemiol Drug Saf. 2006 Jul;15(7):435-43.	 580.9 581.9 583.4 583.6 583.7 584 586 		present and low urine volume and blood urea nitrogen >100 mg/dL
Schneider V, Levesque LE, Zhang B, Hutchinson T, Brophy JM. Association of selective and conventional nonsteroidal anti-inflammatory drugs with acute renal failure: A population-based, nested case-control analysis. Am J Epidemiol. Nov 1 2006;164(9):881-889.	• 584 • 586	Not stated	None
Waikar SS, Wald R, Chertow GM, Curhan GC, Winkelmayer WC, Liangos O, Sosa MA, Jaber BL. Validity of International Classification of Diseases, Ninth Revision, Clinical Modification Codes for Acute Renal Failure. J Am Soc Nephrol. 2006 Jun;17(6):1688-94. Epub 2006 Apr 26.	For acute renal failure: • 584.5, • 584.6 • 584.7 • 584.8 • 584.9	For acute renal failure that requires dialysis: • 39.95 (hemodialysis) • V45.1 (renal dialysis status) • V456.0 (extracorporeal dialysis) • V56.1 (fitting and adjustment of dialysis catheter)	None
McAfee, A. T., E. E. Ming, et al. (2006). "The comparative safety of rosuvastatin: a retrospective matched cohort study in over 48,000 initiators of statin therapy." Pharmacoepidemiol Drug Saf 15(7): 444-53.	Acute renal failure, 584.x; other renal dysfunction, 580.x, 581.x, 583.x, 585.x, 586.x,	ICD-P: 39.95 (hemodialysis), 54.98 (peritoneal dialysis) CPT: 90935-90940 (hemodialysis procedures), 90945-90999 (miscellaneous dialysis procedures).	None
Winkelmayer WC, Waikar SS, Mogun H, Solomon DH. Nonselective and cyclooxygenase-2-selective NSAIDs and acute kidney injury. Am J Med. Dec 2008;121(12):1092- 1098.	• 584.5 • 584.6 • 584.7 • 584.8 • 584.9	None	None

Value of *p*-value

Typical GI study

- Opatrny et al., Br J Clin Pharmacol Jul 2008
- Data source: General Practice Research Database
- Study design: Case-control Case definition:
- First episode of upper GI hemorrhage 10 controls per case, matched on index date, age, and practice
- Exposure definition: Prescription issues in 90 days before index date
- Exclusion criteria: < 3 years of observation
- "RR" estimated with conditional logistic regression
- Covariates: sex, BMI, BP, smoking, comorbidities, concomitant medications

Agent	Cases (n = 4028)	Controls (n = 40 171)	Crude rate ratio	Adjusted rate ratio*	95% confidence interval
Antidepressant	s				
SSRI	335 (8.3%)	1780 (4.4%)	1.97	1.33	1.09, 1.62
TCA	262 (6.5%)	1764 (4.4%)	1.52	1.04	0.83, 1.30
Venlafaxine	56 (1.4%)	229 (0.6%)	2.48	1.85	1.34, 2.55
Anticoagulant					
Warfarin	281 (7.0%)	1130 (2.8%)	2.64	2 17	1.82, 7 59
Clopidogrel	160 (4.0%)	532 (1.3%)	3.16 🔇	2.07	1.66, 2.58

Null distribution



Null distribution



Null distribution



Negative Control for Null Hypothesis

	Positive		Negative		
	controls		controls	otal	
Acute Liver Injury	8	1	37	1	L18
Acute Myocardial Infarction	3	5	66	1	L02
Acute Renal Failure	2	4	64		88
Upper Gastrointestinal Bleeding	2	4	67		91
Total	165	5	234	3	399

Criteria for negative controls:

- Event not listed anywhere in any section of active FDA structured product label
- Drug not listed as 'causative agent' in Tisdale et al, 2010: "Drug-Induced Diseases"
- Literature review identified no evidence of potential positive association

Negative controls & the null distribution



Negative controls & the null distribution



Negative controls & the null distribution



Assumption

For established drugs, we know the true effects

Metoprolol

Structured Product Label – Warnings and Precautions

- METOPROLOL SUCCINATE- metoprolol succinate tablet, film coated, extended release Wockhardt Limited
- Anaphylactic Reactions
- Bradycardia
- Bronchospastic Disease
- Diabetes and Hypoglycemia
- Heart Failure
- Ischemic Heart Disease
- Major Surgery
- Pheochromocytoma
- Thyrotoxicosis

- TOPROL XL- metoprolol succinate tablet, extended release AstraZeneca LP
- Anaphylactic Reactions
- Bronchospastic Disease
- Calcium Channel Blockers
- Diabetes and Hypoglycemia
- Heart Failure
- Hepatic Impairment
- Ischemic Heart Disease
- Major Surgery
- Peripheral Vascular Disease
 Pheochromocytoma
- Thyrotoxicosis

Assumption

We know how to handle data and analyses

We know how to do compliant research Governance and Systems

Assumption: Data and Findings are regulated

- Quality of data
- Collection and submission of data
- Statistical Programming
- Validation of systems
- Oversight committees
 - Whether or not
 - What data
 - What design
 - What parameter choices

No record verification, no access to data generation

Data are publicly available

Anemic systems for size of data

Impossible against unknown "predefined specs"

No parameters for right answer



Problems with RWE Summary list

- Reproducibility problem
 - Effect estimates affected by choice of design and analysis parameters
- P-value calculations affected by bias
- No Gold Standards for outcome algorithms
- No Gold Standard for drug effects
- Data not collected for research, but "dirty" 2nd hand
- Inadequate Data Management and Compliance framework of clinical trial world



How do you want to do this right? OMOP

OBSERVATIONAL MEDICAL OUTCOMES PARTNERSHIP

Standard Data Format Standard Data Content (Coding) Standard Data Characterization Standard Methods Systematic Research

Community Vendor Ecosystem



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OMOP Data Community



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Standard Data Format



Claims and EHRs

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Optimized for large-scale analytics

http://omop.fnih.org/CDMvocab

- nco but
- Conceived for active medical product surveillance, but extensible for other use cases
- Applied successfully across OMOP data community

- 1
- Standards-based, conforming to ONC Meaningful Use Stage 2 recommendations

Standard Data Content



Standard Data Characteristics

Records Over Time



Month

Standard Data Characteristics Prevalence by Age and Gender



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PERSON_PCT

2

Standard Data Characteristics Spotting Prevalence Differences

Regenstrief Co								Color by								
Respirator	piratory, thoracic and mediastinal disorders Metabolism and nutrition disorders Surgical and medical procedures							Inv	estigatio	ons	Sum(RR)					
Cough	Chest	pain	Act res	ute upper spiratory ifection	Hyperlipidemia	Pu hyperch oler	re olester nia	Hypothyroidis m	Needs influer immunizatio	Infective hepatitis immunizati n Pneum	Pre- surgery evaluati on Physical	Vaccina tion for diphther ia, pe Varicella	Adult health examination	Radiog imag proce Genera examina	Abnormal BCG L Medic Abnor at al ex	3.00 - Max (6.7 1.50 - 3.00 1.25 - 1.50 0.80 - 1.25 Min (0.00) - 0.80
						Obesi	ty Eo	dema Mixed hyperli pidemi a	Lona-term dri	ococca l vacci H combi s	aem philu infl	o Immu niza		ion of Ophtha mic examin.	Elevat Heart ed bl	
Acute pharyngitis	Acute bronchitis	Allerg rhiniti	jic is	Dyspnea	Diabetes mellitus	Type II diabetes mellitus - poor	Iron defici enc	Abnor Hypo mal kalem gluc ia	therapy	immuni zatio n	leasi Poli es- omy nu eli	anu mu s di niz	Laboratory procedure	Blood chemis. Nerv	Abnor Hy Li mal po- ve	
	Chronic Bro	onchitis	Chronic	Disorder	type 2	Swelling of limb	Dehy dratio n	Abnor Hy	Tobacco	Anxiety	Attentio n deficit hypera	Eruptio	n Acne vulga	uc ari	Headache	
Acute sinusitis	e lung disease	Acut	sinusitis te Dia	aphra Atelec	Va	iscular disc	rders	Dizzine	dependence syndrome	Insom Child	Gen Sle	Neopla sm of	Sebo Epid Ser rrheic ermo e	nil	kin	
	Pneumon ia Alle	Exac	Acut e t	ati tasis Influ Chro en nic	Essential hyperte	ension	Coron: arteriosc is	ary ss and cleros giddine ss		nia Alco Dysph	Irrita Dist ble ur	uncer Onycho mycosis	der id hy. Disord Ingro Urt er of wi ari	ic distr	sation Seizure urba	
Asthma	Streptoco ccal sore	Hype Hype rso dia Hypo	Ac Pre	Pl P Cr Ac Ch A	Looonnar hyport		Migraine	Perip Old heral myoc vas ard	Depressive disorder	agia Rec ur Dysthy Bipo mia lar	Psy choAlt erR ecAdj ustCli nicSi ng	due t Actinic keratosi	Benig Hai A n ne Cellulit is an De Di.	cr prot	ait Carpa Spi blem I tun nal atica Se Idi Ep nso op ile	
	throat ted	xe	Co	Ac ron c			Contu	He Low Acu	Reproductive	system an F	Renal and u	rinary dis	Cardiac disor	ders	General disord	
Musculosk	Arthralgia o the lower le	of Nec	ue diso k pain	rders Shoulder joint pain	Benign essen hypertensio	tial n	Chro A nic 9 Preinf E	An Pu H gin Tr Be pi Di M	Breast lump Benign	initi Female nd genital o orga Dvs Prim	Urinary tract dise	infectious ase	Conduc tion disorde r of t Atrial fibrilla tion	Palpi tation s	Malaise and fatigue	
Pain in limb	Arthralgia	Lumbo O	steop	Nonal Sprai	Gastro	intestinal o	arct s lisorders	sta <mark>G s</mark> al	prost lar Excess Disor	m ar Uter Pa	Dysuria st	idne Findi y ng of tone fre	tive valv heart failure	di	Fever	
	ankle s and/or f	sacrai spon o Nonall Jo	orosis pint N	hic ankle		Diarrhea	Const or	tipati Nausea n vomiting	Cyst Leuk orr	Pri Im I m Fib	Hematuri A syndr te	cu Uri Bl e r nar oc id infesta	Pregnancy, Routine	Ear and Impacte	d Ia Social c ed Dy sf live bith	
Low back pain	Osteoarth ritis	Displa sp	ain <mark>o</mark> eck S orain	pat al s Spas Locali m zed,	Abdominal pain	Vomitin	Nausea	Gastr Right o- lower	P	resb opia s	Otitis media	Viral	Delive Patien ry t	Otalgi	a cti on Menop	
Backache	Arthralgia of the pelvic re A Disorder of bone and arti	Arthro pathy Arthral gia Co t	an Art hral ou Cur rent	Deg en Lum b Sp E De Di Spr M	Gastroesophageal reflux disease	g Divertic ular disease of colon	Epigastri c pain Right upper	eso qu Gene Left lower d a qu De Es Ga ntal op Ac	Myopia V di a Hypermetr opia	isual Acute sturb conju ncti i Te Gla s fil Op V	Acute Ir suppurati e re otitis Ir	disease ifectiv Chr otit oni ntes Acu	Blood and ly Anemia ph ad	Accider t Injury o head Open	n Benign Pla neoplas Pla f Immu He All Ch Di C erg se hr	

Systematic Evaluation with Test Cases



Systematic Evaluation of Methods



- When using all-time pre-exposure as covariate eligibility window, 100 confounders, propensity stratification with 20 strata, and comparator class of all drugs with same indication not in same class...
- HDPS produces significant, positive effect for bisphosphonates-aplastic anemia when surveillance window is 'all time post-exposure' (RR=1.25)...
- ...but shows no effect when time-atrisk defined by exposure length Relative risk

2

Parameter settings explored in OMOP:

True -

False +

True +

Washout period (1): 180d Surveillance window (3): 30 days from exposure start; exposure + 30d ; all time from exposure start **Covariate eligibility window (3):** 30 days prior to exposure, 180, all-time pre-exposure # of confounders (2): 100, 500 covariates used to estimate propensity score Propensity strata (2): 5, 20 strata Analysis strategy (3): Mantel-Haenszel stratification (MH), propensity score adjusted (PS), propensity strata adjusted (PS2) Comparator cohort (2): drugs with same indication, not in same class; most prevalent drug with same indication, not in same

Comparing accuracy of cohort and selfcontrolled designs, after empirical calibration

Error

CM: 21000214 New user cohort, propensity score stratification, with active comparator (drugs known to be negative controls for outcome)



Discrimination





Coverage

SCCS: 1955010 Multivariate selfcontrolled case series, including all events, and defining time-at-risk as alltime post-exposure









Bias:

Coverage



OS: 403002 Self-controlled cohort design, including all exposures and outcomes, defining time-at-risk and control time as length of exposure +





Vision for a risk identification and analysis system 'causal dashboard'



Systematic Exploratory Framework for studying effects

Urticaria

ants V Outcome Acute myocardial infarction V Drug Tricyclic anti Strength of association Consistency by data sourc by outcome definit by method and parar 30 Temporality Specificity Plausibility **Biological gradient** الليالليسيد Coherence Analogy Experimental evidence ntial confoundin and treatments 5-**118**-8 and and and a 10 -and the second second

Drug Tricyclic antid ants V Outcome Acute myocardial infarction Strength of association Consistency by outcome definition by data source by method and parameters 10-Temporality Specificity Plausibility **Biological gradient** ••••• ····· Analogy Experimental evidence Coherence 4.4.4 ter Barante ----1118 秘密

ants V Outcome Acute myocardial infarction V Drug Tricyclic antide Strength of association Consistency by data source by outcome definition method and parar 30 Temporality Specificity Plausibility **Biological gradient** ····· -Analogy **Experimental evidence** Coherence 计计算机 10 -And and a subscription of the local division of the local division

Angioedema

Analogy

nts V Outcome Acute myocardial infarction Drug Tricyclic anti Strength of association Consistency by data sourc by outcome definit y method and parar 10-Temporality Specificity Plausibility **Biological gradient** • الليالليسي Coherence Analogy **Experimental evidence** intial confound and treatments and and a second 1011 e nja and the second second Drug Tricyclic antid sants V Outcome Acute myocardial infarction Strength of association Consistency by data source by method and parameters by outcome definition 10-Temporality Specificity Plausibility **Biological gradient**

Anaphylactic reactions



Drug	Tricyclic antidep	oressants 🔻	Outcome	Acute myocardial infarction	7		
Strength of assoc	iation	by data so	urce	Consistency by method and parameter	rs by outcome definition		
Palatise risk		And the fact					
Temporality		Specificity	: I	Plausibility eractive patient profiles	Biological gradient		
				D/M/WithMinister			
Analogy Explore related conditions and treatments	Exper Decha	imental evid	ence	Cohere Inderstand data and cohort to as	ence sess potential confounding		
			there are set of the				



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Experimental evidence

Coherence

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ACE inhibitors

ARBs

Summary What RWE Research do we need?

- Systematic
 - Common data model
 - Empirical evaluation of solutions
 - Creations and sharing of Gold Standards
- Fully transparent
 - Open source methods
 - No restrictions on scientific questions ("afraid how the public could interpret the finding")
- Interdisciplinary
 - Industry
 - Academics
 - Government
- OMOP provides a platform
 - Standardization, community, ecosystem
 - Systematic analysis
 - Ability to compare across data sources



Come to the OMOP-IMEDS Symposium 2013

November 5 – 6, 2013 Hyatt Regency Bethesda