



"Big data"

- Electronic medical records have revolutionized the ability to perform observational studies.
- Relatively efficient and fast queries of medical information
- Databases can have breadth and/or depth of information
- Cannot establish cause-and-effect relationships with retrospective data, but large databases can be used to study descriptive statistics, predictive capacity, and/or casual inferences.

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Different sources of "big data"

- Kaiser Permanente (KP)
- American Academy of Ophthalmology's Intelligent Research in Sight (IRIS) Registry
- MarketScan Database
- Medicare claims data
- Vestrum
- National Health and Nutrition Examination Survey (NHANES)

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What makes KP "big data" unique

- Length of data collection
 - High patient retention
 - Diverse patient population
 - 100 million person-years with electronic medical data are available for research from 1981 to 2017
- Combination of systemic and ocular data
- Pharmacy dispensing database
- "Potential" access to ophthalmic images

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What are potential pitfalls of KP data?

- Accuracy of billing
- Vision and IOP data can be hard to extract
 - Laterality of procedures/interventions/medications difficult to discern

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Limitations of "big data" in general

- Variable data quality
- Risk of patient lost to follow-up/transfer of care
- "Exaggerated" statistical significance
 - Large n's can make statistical significance "easy" to find \rightarrow small and potentially practically meaningless differences may be statistically significant
- Confounding
- Appropriate reporting

What have we studied using KPSC "big data"

- Cataract
- Myopia
- Age related macular degeneration (AMD)
- Plaquenil toxicity
- Glaucoma
- Diabetic retinopathy (DR)

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Pre-operative vision and surgeon volume as predictors of visual outcomes following cataract surgery

- Purpose
- Evaluate the relationship between pre-operative vision and surgeon volume with visual outcomes following cataract surgery Methods

 - Retrospective cohort study of patients > 18 years enrolled in KPSC health plan and who underwent cataract surgery Conducted multivariate analysis to determine relationship between surgeon volume and post-op visual acuity, controlling for patient age, pre-op visual acuity, history of diabetes, and history of diabetic retinopathy
- Results
 - Patients whose surgeons performed more surgeries gained significantly more letters, but the difference between the lowest and highest volume groups was ~1.25 letters.

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Preoperative Topical Nonsteroidal Anti-inflammatory Drugs for Macular Edema Prophylaxis Following Cataract Surgery

Study Objective

Describe the effect of routine use of topical NSAIDs on the incidence of post-op macular edema after cataract surgery

- Methods
 - Retrospective matched cohort study of patients who underwent cataract surgery between Jan. 2007 Jun. 2014
 - Patients who had a perioperative prescription of topical NSAIDs filled in addition to topical steroids were compared to patients taking topical steroids only

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Public Health Burden and Potential Interventions for Myopia

Key Points

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- $-\,$ Currently, ~1.4 billion people (23%) in the world are myopic
- By 2050, ~4.8 billion people (50%) expected to have myopia
- Efforts to reduce the prevalence, progression, and severity of myopia could have a profound public health impact
- Strategies for preventing myopia include orthokeratology and low-dose atropine
- Another strategy for consideration is increasing outdoor time

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Myopia Prevalence and Risk Factors in Children



- Objective
 - Evaluate the prevalence of and risk factors for pediatric myopia

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Variables, N (%)	No Myopia 35,326 (58)	Myopia 25,453 (42)	P-value
Age at eye exam			<0.00
5 to < 8 years	8929 (25)	1548 (6)	
8 to <11 years	9610 (27)	4661 (18)	
11 to <14 years	8132 (23)	7941 (31)	
14 to <17 years	7486 (21)	9633 (38)	
17 to <20 years	1169 (3)	1680 (7)	
Female	19032 (54)	13756 (54)	0.72
Race			<0.00
White	14567 (41)	8337 (33)	
African American	3740(11)	2362 (9)	
Asian/Pacific Islander	3000 (8)	4570 (18)	
Other/Multiple/Unknown	14019 (40)	10194 (40)	
Hispanic	20453 (58)	13768 (54)	
Neighborhood household income (USD)			<0.00
Less than \$25,000	710 (3)	568 (3)	
\$25,000 - \$49,999	9328 (33)	6445 (31)	
\$50,000 - \$99,999	14896 (53)	11001 (53)	
\$100,000 or Higher	3018(11)	2705 (13)	
Body mass index percentile for age and sex ^a			0.7
Normal or under weight (<85 ⁿ)	20367 (60)	14238 (60)	
Overweight (85 th to <95 th)	6112(18)	4340 (18)	
Moderately obese (95 th to 1.2 x 95th)	6634 (20)	4394 (19)	
Extremely obese (21.2 x 95 ⁿ)	630 (2)	718 (3)	
Exercise per day			<0.00
Less than 60 minutes	14685 (60)	11114 (65)	
At least 60 minutes	9957 (40)	5986 (35)	

Myopia Prevalence and Risk Factors in Children







Variables	Adjusted OR (95% CI)	Variables	Adjusted OR (95% CI)
Race		Neighborhood household income (in USD)	
White	Reference	< \$25,000	Reference
African American	1.08 (1.03 – 1.13)	\$25,000 to < \$50,000	0.90 (0.83 - 0.97)
Asian/Pacific Islander	<mark>1.64 (1.58 – 1.70)</mark>	\$50,000 to < \$100,000	0.93 (0.86 - 1.01)
Other/Multiple/Unknown	<mark>1.18 (1.14 – 1.22)</mark>	\$100,000 or higher	1.03 (0.94 - 1.12)
Hispanic (vs. Not Hispanic)	0.99 (0.96 - 1.03)	Exercise per day	
Female (vs. Male)	1.00 (0.97 - 1.02)	Less than 60 minutes	Reference
		At least 60 minutes	0.87 (0.85 - 0.89)
		A load of minutes	0.00 (0.00 - 0.00)

Effect of IOP-Lowering Glaucoma Medications in Patients with Exudative AMD

Study Objective: Determine if intr

 Determine if intraocular pressure (IOP)-lowering glaucoma medications reduce the need for anti-VEGF injections in patients with exudative AMD

Methods

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- Retrospective, matched cohort of patients with exudative AMD and who received anti-VEGF injection(s) in 2010-2015
- Used medication dispenses to assess whether patient was prescribed an IOP-lowering medication
- Data on visual acuity, IOP, and number of anti-VEGF injections were abstracted from patient charts

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	Medication Non-Users (N=127)	Medication Users (N=127)
Baseline IOP Mean (SD) Median (IQR)	15.1 (3.6) 15 (13, 18)	15.6 (4.4) 15 (12, 18)
Switched anti-VEGF agents, N (%)	22 (17%)	29 (23%)
No. injections with bevacizumab before switch Mean (SD) Median (IQR)	4.4 (2.0) 4 (3, 7)	4.8 (1.7) 4 (4, 5)
Total no. injections Mean (SD) Median (IQR)	6.2 (3.0) 6 (4, 8)	6.2 (2.8) 6 (4, 8)
 Number of anti-VEGF injections were similar users among exudative AMD patients. Additional studies may be needed to assess associated with decreased number of anti-VE 	between glaucoma medic whether use of glaucoma EGF injections.	ation users vs. non- medications is



Effect of IOP-Lowering Glaucoma Medications in Patients with Exudative AMD











Coding Patterns by Ophthalmologists for Hydroxychloroquine Toxicity

- Paper currently in press
- Study Objective:
 - Characterize the ICD-9 coding patterns used by ophthalmologists in clinical practice for hydroxychloroquine (HCQ) retinal toxicity

Methods

- Retrospective cohort study of patients enrolled in KPSC health plan who were dispensed HCQ between 2001-2014
- Patients' were identified by ICD-9 codes for toxic maculopathy, non-exudative AMD, Drusen (degenerative), and/or (other) background retinopathy
- The charts of these patients were manually reviewed to validate the diagnosis

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Coding Patterns by Ophthalmologists for Hydroxychloroquine Toxicity

- Results
 - 23,362 patients were dispense HCQ between 2001-2014
 - 678 (2.9%) patients were diagnosed with at least one of the aforementioned ICD codes
 - Only 53 patients were confirmed to have HCQ toxicity on chart review
- Discussion

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- Study underscores the imprecise nature of ICD coding
- Future work can focus on uniform coding standards among clinicians, particularly for rare conditions
- Study illustrates the limitations of relying on ICD codes only when conducting research utilizing electronic databases

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Two-Year Incidence of Retinal Intervention in Patients with Minimal or No Diabetic Retinopathy

- Presented as an abstract at AAO 2017
- Study Objective
 - Determine the two-year incidence of retinal intervention in patients with minimal or no diabetic retinopathy

Methods

- Retrospective chart review of patients who had non-widefield DR screening photographs
 Patients were identified by CPT codes for vitrectomy, intravitreal injections, and retinal
- lasers – Chart review was performed to validate procedures

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Retinal Intervention Introvitreal Injection Anti-VEOF for branch retinal visin occlusion with macular edema Anti-VEOF for monical redoma Anti-VEOF for monical redoma Anti-VEOF for monical redoma	DED- Related 2 0 2	Not DED- Related	DED- Related	Not DED- Related	Total
Intravitreal Injection Anti-VECF for branch retinal vein occlusion with macular edema Anti-VECF for macular edema Anti-VECF for non-clearing vitreous hemorrhage Ocriptamin for macular hole	2 0 0 2	0	1	2	5
Anti-VEGF for branch retinal vein occlusion with macular edema Anti-VEGF for macular edema Anti-VEGF for non-clearing vitreous hemorrhage Ocriptasmin for macular hole	0 0 2	0			_
	0	0	1	1 0 0 1	1 1 2 1
Laser	3	4	4	2	13
Focal macular laser Pan-retinal photocoagulation Retinopexy	1 2 0	0 1 3	1 3 0	0 0 2	2 6 5
Pars Plana Vitrectomy	2	15	4	27	48
CMV retinits / rhogmatogenous retinal detachment Epiction membrane Lymphona Macular hole / epicehain membrane Macular hole / epicehain membrane Melanoma Non-clearing vitrous hemorrhage Posteric soleritis	0 0 0 0 0 0 0 0 0 0 0 0	0 1 4 1 0 1 8	000004000	1 4 0 7 3 1 4 1 4	1 4 11 4 1 11 11 12

Patients with <u>Minimal Diabetic Retinopathy</u>					
	Year 1 DED: Not DED:		Year 2		
Retinal Intervention	Related	Related	Related	Related	Total
Intravitreal Injection	3	2	1	0	6
Anti-VEGF for exudative age-related macular degeneration Anti-VEGF for macular edema	0 3	1	1 0	0	2
Laser	5	1	2	0	8
Focal macular laser Pan-retinal photocoagulation Retinguexy	0 5 0	0 0 1	1 1 0	0	1 1 1
Pars Plana Vitrectomy	2	2	0	1	5
Epiretinal membrane Non-dearing vitreous hemorrhage Rhegmatogenous retinal detachment Tractional retinal detachment	0 1 0 1	1 0 1 0	0 0 0	1 0 0 0	1 1 1
DED = diabetic eye disease; VEGF = vascular endothelial growth factor 11 patients required intervention for DED during first 2 years; 1 patient req Injection. 5 patients required intervention for non-DED during first 2 years; 1 patient	uired both PF	V and Laser, PPV and Las	1 patient req	uired both Las	erand





A Model to Predict the 3-Year Risk of Needing Treatment for Diabetic Macular Edema

- Presented at ASRS 2018
- Study Objective
 - Predict who will develop DME
- Methods

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- Retrospective cohort of patients from the Diabetes Case Identification Database who were: ≥18 years of age, ≥3 years of follow-up, no prior history of DME, no severe DR on baseline retinal photos
- Outcomes: (1) diagnosis of DME, (2) diagnosis of DME with anti-VEGF injection
- Employed a Cox proportional hazard model to calculate DME risk
- Used model-fitted values to set thresholds for risk calculator

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A Model to Predict the 3-Year Risk of Needing Treatment for Diabetic Macular Edema

Conclusions

- Further modeling can be done to explore additional risk factors and add more granular detail
- » Time-dependent variables / repeated measures were not used in this model
- Risk stratification could be integrated into electronic medical records
 High risk patients may benefit from more intense systemic management and closer ophthalmic monitoring

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