Medical Diagnostic Systems

Previous Attempts at Artificial Intelligence in Medicine

Mycin- Stanford

- Doctoral dissertation of Edward Shortliffe designed to identify bacterial etiology in patients with sepsis and meningitis and to recommend antibiotics
- Had simple inference engine and knowledge base of 600 rules
- Proposed acceptable therapy in 69% of cases which was better than most ID experts
- Never actually used in practice largely due to lack of access and time for physician entry >30 minutes

 Caduceus – similar inference engine to Mycin and based on Harry Pope from U of Pittsburgh's interviews with Dr. Jack Myers with database of up to 1,000 diseases

Previous Attempts at Artificial Intelligence in Medicine

- Internist I and II Covered 70-80% of possible diagnoses in internal medicine, also based on Jack Myers' expertise
- Worked best on only single disease
- Long training and unwieldy interface took 30 to 90 minutes to interact with system
- Was succeeded by "Quick Medical Reference" which was discontinued ten years ago and evolved into more of a reference system than diagnostic system
- Each differential diagnosis includes linkes to origin evidence to provide meaningful use of EMR's and supports adoption of evidence based medicine/practice

Medical Diagnostic Systems

- Dxplain used structured knowledge similar to Internetist I, but added hierarchical lexicon of findings
- Iliad system developed in '90s added probabilistic reasoning
 - Each disease had associated a priori probability of disease in population for which it was assigned

Diagnostic Systems using Unstructured Knowledge

- ISABEL uses information retrieval software developed by "Autonomy"
- First CONSULT allows search of medical books, journals, and guidelines by chief complaints and age group
- PEPID DDX is diagnosis generator

Diagnosis Systems Using Clinical Rules

- Acute cardiac ischemia time insensitive predictive instrument uses ECG features and clinical information to predict probability of ischemia and is incorporated into heart monitor/defibrillator
- CaseWalker system uses four item questionnaire to diagnose major depressive disorder
- PKC advisor provides guidance on 98 patient problems such as abdominal pain and vomiting

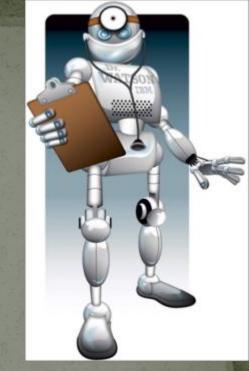
Reasons Current Diagnostic Systems Aren't Widely Used

- They aren't integrated into day to day operations and workflow of health organizations and patient information is scattered in outpatient clinic visits and hospital visits and their primary provider and specialists
- Entry of patient data is difficult requires too much manual entry of information
- They aren't focused enough on recommendations for next steps for follow up

 Unable to interact with practitioner for missing information to increase confidence and more definitive diagnosis

• Have difficulty staying up to date

Watson as Diagnostician



00		IBM Watson Medical		
atients		Patient Record		
Samantha Darrer	n - March 3, 2011			
listory of Present IIIn	ess			
Patient has <u>red eye</u> with	pain, inflammation, blurr	red vision, floating spots and sensit	ivity to lig	<u>ht</u> .
Question				
What condition has red	eye, pain, inflammatic	on, blurred vision, floating spots	and sensi	itivity to light?
Answer		Evidence		Ask Watson
		A state of the sta		

Google Search

C B B S C	red eye, pain, inflammation, blurred vision, floating spots, sensitivity to light ${\bf I}$				
Search	About 54,700 results (0.33 seconds)				
Everything	Eve Diseases Pictures Slideshow: Recognize These Common Eve				
	www.medicinenet.com > home > eyesight center > eyesight az list +1				
Images	Aug 3, 2011 – Blepharitis is an inflammation of the eyelids Symptoms of a corneal ulcer include red eyes, pain, feeling like something is in Floaters are deposits of				
Maps	condensation that cause people to see floating spots redness and irritation,				
Videos	blurred vision, eye pain, increased sensitivity to light, and floating spots				
News	Eye Problems FamilyDoctor.org				
Shopping	familydoctor.org/familydoctor/en/health-tools//eye-problems.html 🐖				
More	Eye pain or redness and changes in your vision may be signs of a problem that of spots and strings floating in your field of vision;; flashes of light in 1 or both eyes; Your symptoms may be a sign of a serious inflammatory condition called Are your eyes red or sensitive to light, are you experiencing eye pain, and do you				
Severna Park, MD	Catagori Camplications				
Change location	Cataract Surgery Complications www.cataractfreeamerica.org/cataracts/complications.htm +/				
	Treatment is commonly anti-inflammatory eye drops or tablets Symptoms include				
Show search tools	pain, red eye, and/or severe and rapid decrease of vision redness of the eye, blurred vision, sensitivity to light (photophobia), dark floating spots within the				
	Eve Health Guide - Eve Diseases, Eve Problems and Eve Conditions www.allaboutvision.com/conditions/				
	Itchy, red, swollen, tearing eyes may mean eye allergies Flashes of light and floating spots are classic warning signs of a detached retina — get them Painful inflammation of the uvea causes light sensitivity, floaters and blurred vision				
	Getting A Regular Eye Exam From An Ophthalmologist Is Important www.bayridgeeyes.com/ophthalmologist.shtml				
	Floating spots are alarming when they first appear and an eye exam by an people who have had eye surgery, eye injuries or serious eye inflammatory conditions The sudden development of a red eye can be due to a variety of causes, some of tearing, foreign body sensation, eye pain, light sensitivity, or blurry vision				
	Dr. Kenneth Sparks - Uveitis www.laretinasurgeon.com/uveitis.aspx •/ Uveitis refers to the inflammation of the uvea, the middle layer of the eye. It also may Blurry vision, eye pain, and sensitivity to light may also be present, with some patients experiencing dark, floating spots in their field of vision. Uveitis may A case of simple "red eye" may in fact be a serious problem of uveitis. If your eye				

https://www.google.com/search?gcx=c&q=red+eye,+pain,+inflammation,+blurre...

000 IBM Watson Medical	and the second
Patient Record	3724
Samantha Darren - March 3, 2011	
History of Present Illness	
Patient has red eye with pain, inflammation, blurred vision, floating spots and sensitivity to light.	
Symptoms	
Question	in the with
What condition has red eye, pain, inflammation, blurred vision, floating spots and sensitivity to light?	
Evidence Ask Watson	
Answer	
Uveitis	91%
Iritis	48%
Keratitis	29%
Anterior Uveitis	16%
Photophobia	13%

000	Photos Madred	Sa 1 -	
	IBM Watson Medical		
Patients	Patient Record		all of the set
Samantha Darren - March 3, 2011			
History of Present Illness			
The patient has a confirmed case of uveitis.			A. C. S.
			14
			1 - to start
			it it is
Present Illness			1
Question			in the setting
What disease or condition can cause uveitis i	in a patient?		
	Evidence	Ask Watson	at a the
Answer			all and a second
Behcet's Disease		45%	1-1-1
Sarcoidosis		32%	
Ankylosing Spondylitis		30%	to an all all
Arthritis		13%	2 2 2 2
Iritis		11%	and the second

Google Search: Uveitis Cause

e	what disease or condition can cause uveitis in a patient	Ŷ	٩
Search	About 3,000,000 results (0.25 seconds)		
Search Everything Images Maps Videos News Shopping More Severna Park, MD Change location Show search tools	Ad-Why this ad Uveitis and Vision preventblindness.org www.preventblindness.org/uveitis ** Uveitis patient resources - information on uveitis treatment ***********************************		Ads - Why this ad? Uveitis Cause www.everydayhealth.com <pre>cm</pre> Learn Causes, Symptoms, Treatment and Prevention on Any Health Issue. See your ad here >
	Oct 10, 2011 – For many years, uveitis was considered a single disease entity; therefore, the Patients with uveitis can present with some of the most challenging Conditions causing retinal vasculitis are a beterogeneous group of		

6	000	IBM Watson Medical		
4	Patients	Patient Record		
K	Samantha Darren - March 3, 2011			
3	History of Present Illness			
ľ	The patient has a confirmed case of uveitis.			
	She reports a family history of arthritis.			
	On physical examination a <u>circular rash</u> is obse	erved. She complains of fever and heada	che.	
k	Present Illness Family History Finding			
	Question			
	What disease or condition can cause uveitis of arthritis?	in a patient with circular rash, fever, h	neadache, and family history	
	Answer	Evidence	Ask Watson	
ľ	Lyme Disease		62%	
	Systemic Lupus Erythematosus		17%	
	Juvenile Rheumatoid Arthritis		12%	
	Erythema Migrans		7%	
	Rocky Mountain Spotted Fever		6%	

Google Search: Uveitis, Arthritis, Circular Rash, Headache

e	uveitis arthritis circular rash fever headache	Ŷ	٩
Search	About 52,100 results (0.25 seconds)		
Everything Images Maps Videos News Shopping More	Watson and healthcare www.ibm.com/developerworks/industry/library/ind/index.html?ca ••• Apr 12, 2011 – Question: This disease can cause uveitis in a patient with family history of arthritis presenting circular rash, fever, and headache. Answer: 76% Arthritis of the Eyes www.innvista.com > Health > Common Ailments > Arthritis ••• Uveits Arthritis is usually thought of as a disease of the joints, only and rarely thought of including headaches, injuries, infections (as tuberculosis, herpes, or syphilis), numbness or weakness, vitiligo (patches of depigmentation), skin rashes, The iris is the circular, coloured part of the eye behind the cornea, which also		Ads - Why these ads? Fever Headache Rash www.healthline.com +1 Symptoms, Causes, Treatments of Fever Headache Rash. Diagnosed with Uveitis? www.uveitisclinicaltrials.com +1 Get information about uveitis. See your ad here »
Severna Park, MD Change location	Lyme Disease Clinical Presentation - Johns Hopkins Arthritis Center www.hopkins-arthritis.org > Arthritis Info > Lyme Disease +7 Johns Hopkins Arthritis Center Johns Hopkins Medicine This rash begins as a small red papule at the site of a tick bite, generally 3-30 Headache 40-50% It was		
All results Related searches More search tools	previously thought that all target-shaped rashes (i.e., circular-shaped with red the eye (e.g., follicular conjunctivitis, keratitis, and rarely uveitis or vitritis) Behcet's Syndrome (Behcet's Disease) Causes, Diagnosis www.medicinenet.com > > behcet's syndrome index *? by +Dr. William Shiel 2 days ago – A reddish, scaly rash often located over the surfaces of the elbows, knees, scalp, and Managing Osteoarthritis Pain: Coping with Arthritis The inflammation of the area of the eye that is around the pupil is called uveitis (meninges) include headaches, neck stiffness, and is often associated with fever Q&A Behcet's Disease www.niams.nih.gov/Health_Info/Behcets_Disease/ *? In some people, the disease also results in arthritis (swollen, painful, stiff joints), skin problems, and Meningitis can cause fever, a stiff neck, and headaches Vasculitis, Symptoms - Gerneral Help - Vasculitis ca		

www.vasculitis.ca/vasculitissymptoms/.../vasculitis-symptoms.html

People with meningoencephalitis may have **fever**, **headache**, stiff neck, and difficulty Other symptoms include **rashes**, **arthritis**, conjunctivitis or **uveitis**. ...

Syphilis: Sexually Transmitted Diseases (STD): Merck Manual ... www.merckmanuals.com/professional/infectious.../syphilis.html +1

000	IBM Watson Medical		
Patients	Patient Record		
Samantha Darre	n - March 3, 2011		
History of Present IIIn	ess		
The patient has a confir	Evidence Profile Close		1-1-1
She reports a family his	Lyme Disease		
On physical examinatio	Negative Positive		C. Martin
The patient lives in Cor	Present Illness		
Present llinese Family Histo	Family History		
Question	Finding		The soften
What disease or cond	Demographics	dache, family history of	1- to the
arthritis, who lives in	Finding - Evidence Sources		
	Textbook: For people who live in areas where Lyme disease most often occurs-in the United States along the Atlantic coast, the Midwest, and parts of Oregon and California-the circular rash can be a sign of Lyme disease, especially when it appears during the summer months.	Ask Watson	
Answer Lyme Disease	Journal: For the initial systemic Lyme disease, on the other hand, the symptoms include fatigue, pains in the joint and muscle, mild fever, headache, drowsiness and swollen lymph glands. For the majority of people, once a tick has bitten its human host, a slow growing circular rash called erythema	73%	
Juvenile Rheumatoid	migrans appears around the site of the bite. <u>Web Site</u> : One of the early symptoms of Lyme disease is development of a circular rash, known as erythema migrans (EM). This rash is seen in about 70-80% of infected people and it starts within duration of three days to one	12%	
Rocky Mountain Spot	month.	9%	
Dengue		8%	
Erythema Migrans		6%	Contra de

000	IBM Watson Medical	
Patients	Patient Record	
Samantha Darren - March 3, 2011		
History of Present Illness		
The patient has <u>Lyme disease</u> . The treatment p	lan is antibiotics.	
Present Illness		
Question		the second the
What antibiotics are prescribed for treating	Lyme disease?	
Answer	Evidence Ask	Watson
Doxycycline		97%
Amoxicillin		68%
Ceftriaxone		30%
Cefuroxime		29%
Tetracycline		29%

000	IBM Watson Medical	A	
Patients	Patient Record		
Samantha Darren - March 3, 2011			
History of Present Illness			
The patient has Lyme disease. The treatment pla	an is antibiotics.	-B	
The patient is pregnant. She has a penicillin aller	rgy.		
Present lilness Current Condition			
Question			
What is the recommended antibiotic prescript allergy?	tion for Lyme disease in a woman during	pregnancy with penicillin	
	Evidence	Ask Watson	
Answer			
Cefuroxime		95%	
Ceftriaxone		17%	
Lyme Disease Vaccines		7%	
Amoxicillin		6%	
Steere		5%	

User Information Design for Decision Support

			Ö IBMWATS	ON
Samanth	a Darren		Profile Card Dashboar	rd
Evidence Profile: Dia	agnosis		Back to Resu	ilts
Uveitis 91%	_			
Iritis 48%				
Keratitis 42%				
Factors				
SYMPTOMS				
Red eye				
Eye pain				
Eye inflammation	Symptoms	Family History	Demographics	
Blurred vision	Sources and Factors for Uveitis Symp	otoms		
Floating spots	Sources	Factors		
Sensitivity to light				_
FAMILY HISTORY	Textbook Uveitis specifically refers to inflammatic	n of the middle layer of the eye, termed the "uvea"	but in common usage may ***	\$
Arthritis	refer to any inflammatory process involvi	ng the interior of the eye.		
ALLERGIES	Website	erally affects only one eye. Signs and symptoms m	ay include any or all of the 급급급	÷
Penicillin		, worsened eye pain when exposed to bright light		14
DEMOGRAPHICS				
34 years old		arior uveitis, which involves inflammation in the fro affects the iris, the colored part of the eye.	ont part of the eye. It is $\overrightarrow{r} \overrightarrow{r} \overrightarrow{r} \overrightarrow{r}$	☆
Female	Textbook Uveits is often marked by moderate to in	tense pain and usually involves impaired eyesight	4 Å Å Å	\$

My Involvement in Helping to Train Dr. Watson



- Initial research and grant to help educate Watson in medical domain
- Could Watson software for Jeopardy! be successfully ported into the medical domain?
 Began discussing challenge associated with NEJM Clinico-Pathological Conference
 Talked about books and journals and other sources that could augment the general knowledge built into the Jeopardy! playing software

After Jeopardy! Match: Initial Reactions/Expectations



• E-mails and interviews from all over the world:

Most were incredibly impressed with potential for medicine and opportunities for the future

Some however:

- SKYNET and end of world as we know it
- Pre-medical students speculating that it really doesn't make sense to attend medical school any more
- Physicians writing blogs predicting that they would be replaced by the computer within a short period of time

Taking Watson to Medical School



University of Maryland, Baltimore SCHOOL OF MEDICINE

- Want 3 components similar to medical students education
 - Book knowledge
 - Sim Human Model
 - Experiential learning from actual EMR



UNIVERSITY OF MARYLAND SCHOOL OF MEDICINE

Book Learning

- Textbook, journal, and Internet resource knowledge. Quiz materials
- Like medical student this alone not enough don't want to make hypochondriac

Advancing Deep Q/A's Medical Knowledge

Continue to develop medical knowledge database
Harrison's

- Merck
- Current Medical Diagnosis and Treatment
- American College of Physicians Medicine
- Stein's Internal Medicine
- medical Knowledge Self Assessment Program NLM's Clinical Question Repository

Advancing Deep Q/A's Medical Knowledge

- Use New England Journal of Medicine 130 CPC cases and quiz material
 - Additional CPC cases at U of Maryland
- Begin developing interactive capability to develop hypotheses and refine them depending on the answer to those questions
- Develop a tool that allows for physician feedback to the system for various hypotheses so community can interact and teach Watson

SIM Human

SIM Human model of physiology – work done at the University of Maryland School of Medicine and UMBC by Dr. Bruce Jarrell and colleagues Want to have understanding from model of physiology Work has been done to create simulations of disease processes and then observe how it affects other physiology in the body

Clinical/Hospital "Experience"

- Consumption of electronic medical record which is largely just paper represented digitally, cannot search for "rash" for example
- Access to records at U of Maryland and VA but also larger repositories from the VA in de-identified manner

Electronic Medical Record Challenges and Limitations

- Epic system at the University of Maryland
- VA's VISTA System
- University of Maryland EPIC system
 EMR
 - Electronic version of paper records
 - Review large number of discharge summaries
 - Review progress notes and structured and unstructured additional information from EMR

IBM and VA Team Review of EMR

• Patient EMR such as VA's highly publicized and praised VISTA revealed numerous challenges



Despite the fact that virtually 100% of patient information is available in the electronic EMR with records going back more than 15 years

 Not possible to search for a term within or among patient records such as "rash"

- Majority of data is unstructured and in free text format
- Much of the text in progress notes and other types of notes is highly redundant since interns and residents and attending physicians typically cut and paste information from lab and radiology and other studies and other notes
- Information is entered with abbreviations that are not consistent and misspellings

Patient Problem List

Patient problem list has no "sheriff" and each physician is free to add "problems" but very few delete them for "problems" that are temporary

The problem lists themselves often have contradictory information

🔄 VistA CPRS in use by: User,Nurse (vista.medsphere.com)										
<u>File E</u> dit <u>V</u> iew <u>A</u> ction <u>T</u> ools	<u>File Edit View Action Tools Help</u>									
PATIENT, TEST ONLY MED1 4S401-1 Primary Care Team Unassigned Primary Care Team Unassigned Posting Attending: Manager, System Attending: Manager, System AD								Postings AD		
		Problems (9 of 9)			Oraceh Diete	Lastilada	Descides		l c is	
Both active and inactive	A *	Description Myasthenia Gravis with	(Acute) Exacerbation		Feb 11 2006	Last Upda Feb 11 2006			Servic	;e
Removed	A A×	Postherpetic neuralgia Stroke				Sep 19 2006 Sep 26 2006			Audiok	ogu & Spe
New problem	A A	Silica Pneumocon NEC			Aug 18 2006	·	Manager		~4400	ogy a ope
	A	Hypertension				Dec 12 2006	User,Med	dsphere Ti		
	A	Immune Thrombocytope	enic purpura		Feb 21 2007	Feb 21 2007	User,Mei	dsphere Ti		
	A	Diabetes Mellitus Primary Diagnosis			Jan 08 2006	Nov 02 2007	Manager	,System		
	A	Chronic ischemic heart Secondary Diagn			Jan 08 2006	Nov 02 2007	Manager	System,		2
	A	CAD				Feb 12 2008	User,Med	dsphere Ti		27

Medical Domain Adaptation

 5000 questions from American College of Physicians Doctor's Dilemma competition

• E.g.

The syndrome characterized by joint pain, abdominal pain, palpable purpura, and a nephritic sediment • Henoch-Schonlein Purpura Familial adenomatous polyposis is caused by mutations of this gene: APC gene Syndrome characterized by narrowing of the extrahepatic bile duct from mechanical compression by a gallstone impacted in the cystic duct: Mirizzi's Syndrome

3 Areas of Adaptation for Deep QA

Content

Organizing domain content for hypothesis and evidence generation such as textbooks, dictionaries, clinical guidelines, research articles

Tradeoff between reliability and recency

• Training

Adding data in the form of sample training questions and correct answers from the target domain so system can learn appropriate weights for its components when estimating answer confidence

Functional

Adding new question analysis, candidate generation, and hypothesis evidencing analytics specialized for the domain

Content Adaptation

 Text content is converted into XML format used as input for indexing

Text analyzed for medical concepts and semantic types using Unified Medical Language System terminology to provide for structured query based lookup
"Corpus expansion technique" used by DeepQA searches web for similar passages given description of symptoms for example and generates pseudo documents from web search results

Medical Content Sources for Watson Include

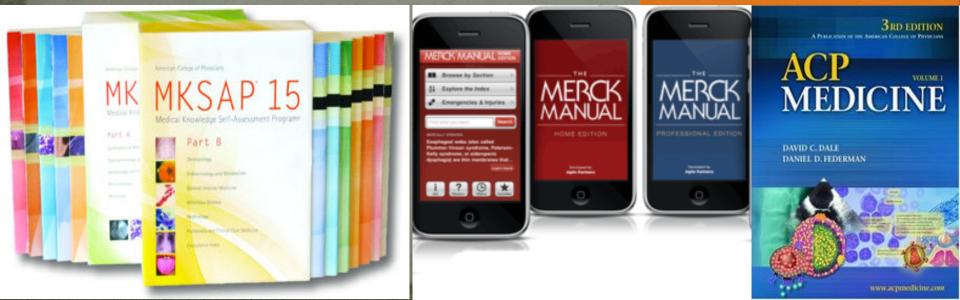
ACP (American College of Physicians) Medicine Merck Manual of Diagnosis and Therapy PIER (collection of guidelines and evidence summaries) MKSAP (Medical Knowledge Self Assessment Program study guide from ACP)

Journals and Textbooks

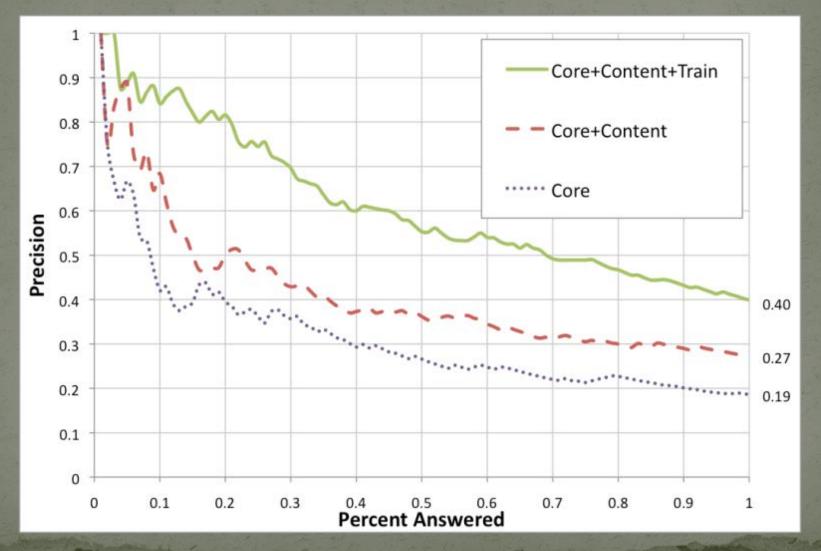




ing Winner Tellul Link Lines of Street of Parks



Training Adaptation: **188** Unseen ACP Doctor's Dilemma Questions Precision: % of questions correct for top answer when chooses to answer



36

Discovering the Untapped, Disconnected Gold Mines of Clinical and Research Data

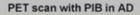
Despite all of the advances in computer technology we are arguably still at the paper stage of research as far as ability to discover and combine important data

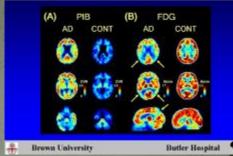
- Research data including those associated with major medical journals and clinical trials are typically created for a single purpose and beyond a one or two manuscripts, remain largely locked up or inaccessible
- Even when the data are made accessible, they are typically associated with limited access through a proprietary Internet portal or even by requesting data on a hard drive Often requires submission of a research plan and data and then a considerable wait for permission to use the data which is often not granted





ADNI





Alzheimer's Disease Neuroimaging Initiative
Excellent example of patient data and associated images with great sharing model
However requires access through their own portal and requires permission from ADNI Data Sharing and Publications Committee

CTEP (NIH Cancer Therapy Evaluation Program) Pediatric Brain Tumor Consortium One of the Better Sources of Data

• As an NCI funded Consortium, the Pediatric Brain Tumor Consortium (PBTC) is required to make research data available to other investigators for use in research projects

Pediatric Brain

Tumor

Consortium

- An investigator who wishes to use individual patient data from one or more of the Consortium's completed and published studies must submit in writing:
 - Description of the research project
 - Specific data requested
 - List of investigators involved with the project
 - Affiliated research institutions
 - Copy of the requesting investigator's CV must also be provided.
- The submitted research proposal and CV shall be distributed to the PBTC Steering Committee for review
 - Once approved, the responsible investigator will be required to complete a Material and Data Transfer Agreement as part of the conditions for data release
 - Requests for data will only be considered once the primary study analyses have been published

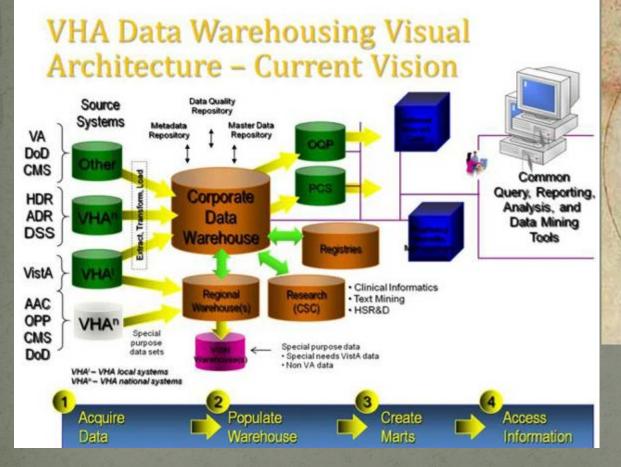
Institutional Database General Pract Research Database

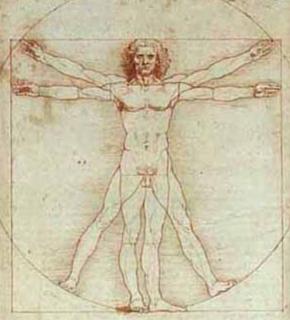
Much more than *the* database

GPRD News	Bibliography	Customer Area			
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The Database GPRD, the most published, most used and validated database. Read more»		Archived I	News		
		Select a Top			GPRD Not for Profit The Gold Standard History
Global More than jus Read more?			Pharmacoepidemiology Course	5	Facts and Figures Services and Products On-Line GPRD Pharmacovigilance Drug Utilisation
Interventional Randomised trials		with GPRD	hool of Hygiene and Tropical Medicine in collaboration are running a short course entitled ' Practical miology ' from Monday 12th to Thursday 15th 1. The course is designed for students with a basic		Health Outcomes Verification Services Consulting
Patient Repor Genetic studi Read more		grounding in epi prior knowledge	1. The course is designed for students with a basic demiological methods and concepts and/or some of pharmacoepidemiology. Is and to apply please click here	[Pharma - Biotech Devices Research Academic Research
Links Hospital data Disease Regi	sters	User Group M	▲ Back to top eeting Update		Primary Care Services and Cost Access under MRC licence
Read more			User Group Meeting is scheduled for the 2011 and will be held in Chicago to follow on from	1	Information for GPs FAQs Contribute
Research Full pharmac epidemiologia Advice servic Read more	o- cal service ce	the 27 th Interna Therapeutic Risk These meetings	tional Conference on Pharmacoepidemiology and	1	ISAC Members Minutes Annual Reports
Risk Mana		projects. This me with members of with other users	eeting will also provide users the opportunity to meet GPRD's research team and engage in discussions	(Contact Us Enquiry Form Our People MHRA
Complete ne system- ExEt Read more	rac		ead a discussion group by contacting:	1	Vacancies

GPRD

Institutional Database: VA's Corporate Data Warehouse Vinci





Disease Specific Databases Alzheimer's, Parkinson's, Schizophrenia

Disease-specific databases: AlzGene, PDGene, SzGene

Lars Bertram, MD

Assistant Professor of Neurology (HMS) Assistant in Genetics (MGH)



Genetics and Aging Research Unit MassGeneral Institute for Neurodegenerative Diseases Massachusetts General Hospital Harvard Medical School



Cornucopia of Sources of Data for Dr. Watson



- University hospital databases
- Large medical system e.g. Kaiser Permanente data warehouse
- Insurance databases such as WellPointState level databases

Discovering and Consuming Databases

- At best, freely sharable databases are accessed using their own idiosyncratic web portal
- Currently no index of databases or their content
- No standards exist to describe how databases can "advertise" their content and availability (free or business model) and their data provenance and sources and peer review, etc.
- Would be wonderful project for AMIA or NLM to investigate the creation of an XML standard for describing the content of databases
- This will be critical to the continuing success of the Dr. Watson project in my opinion

Medical Guidelines

- Medical guidelines are increasingly being put into machine intelligible form although this is not an easy process
- Incorporating these into Watson software could serve multiple purposes including health surveillance, could factor into diagnostic decision making, and could be an early implementation of the Watson technology

Peleska et al: General Graphic Model Making Guidelines "Formal" and Machine Readable 2003 **European Guidelines on Cardiovascular Disease Prevention** and 2003 ESH/ESC Hypertension Guidelines

stablished	CVD	(CHD.	perip	heral	artery o	disease, ceret	orova	scular	ather	osclei	otic dis	sease)
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[mmrig] 160	2	3	3	4		[mmrig] 160	5	*		11	13	5% - 9%
160	2					160					1.1	3% - 4%
140	1	2	2	3	-4	140	4	5	8	8	10	2%
										-		1%
			2	2	3	120	3	3	- 4		1	- 19/
120 TC:HDL			6	7	8	TC:HDL		5			8	< 1%

The Electronic Medical Record

- The transition to the 3rd year of medical school begins a new phase in education from theoretical to empirical
- Medical students are exposed for the first time to the wards and of course, importantly, to one of their major jobs for the next few years:
 - Maintenance and review of patient charts, nowadays the Electronic Medical Record

Introducing Dr. Watson to the Electronic Medical Record

VistA CPRS in use by: Michals	ski,Tj (CAMPCPRS2)			
<u>F</u> ile <u>E</u> dit <u>V</u> iew <u>T</u> ools <u>H</u> elp				
CLUTIER,OUTPATIENT 111-11-1741 Dec 19,1922 (75)	RAIN Mar 30,98 13 Provider: MICHALSKI,1			Postings CAD
Active Problems	Allergies / Adverse	Reactions	Postings	
Diabetes mellitus Coronary Artery Disease Angina Copd	▲ Strawberries Chocolate Tylenol		Crisis Note Allergies Advance Directive Advance Directive	• 200000000 II
Active Medications Halcinonide 0.1% Cream 60gm Fluoxetine (prozac) 20mg Cap Tetracycline 250mg Cap Calcium Lactate 325mg C.T. Isosorbide Dinitrate 40mg S.A. Tab	▲ ▼	Clinical Reminders Influenza Immunizat Pneumovax Fecal Occult Blood Problem Drinking So Flexisigmoidoscopy	Test	Due Date Oct 07,97 Apr 22,98 Apr 22,98 Apr 22,98 Apr 22,98
Lab Results - Past 30 Days	Vitals	Appoint	ments / Visits / Admis	sions
Prothrombin Time Blood Plasma Routii Glucose Blood Serum Routine-Not For S Cbc,Plt,Diff Blood Routine-Not For Sal	Sat,Sun,Holi P 82	Ma Rainbo Ma Rainbo 76 Ma Rainbo	w I (primary Care) w I (primary Care) w I (primary Care) w I (primary Care) w I (primary Care)	visited: Apr 09, visited: Apr 02, visited: Mar 30, visited: Mar 29, visited: Mar 18
∼Cover Sheet (Problems (Meds (Orde	ers (Notes (Consults (D/	/C Summ (Labs (Rep	orts/	

Watson and the EMR

- Despite the tremendous strides we have made toward an electronic medical record, we are really just at the 1.0 stage and arguably most current EMR systems really represent just a digital form of paper
- The Watson development team was really surprised when we reviewed the EMR at how primitive it was, even in 2011
 - Lack of ability to search for terms within a patient's record
 - Lack of ability to search across patient records
 - Lack of ability to perform basic statistics or have access to basic decision support tools in EMR

EMR

- The diagnosis of a specific type of pneumonia, for example, can be made according to patient signs and symptoms using journal articles and textbooks
- But it can also be made more reliably by a system such as Watson by also mining the local EMR database as to what diagnoses have been made over the past few days, weeks, months, etc. locally

EMR

- It can then be further refined by not necessarily being constrained to tentative diagnoses that have been made but the microbiology/pathology proven causes of pneumonia
- The EMR provides empirical data about the association of these signs and symptoms with diagnoses and the means to verify what was found by lab tests etc.

EMR Challenges

• Challenges mining EMR

- Unstructured free text with abbreviations, variable terms (e.g. MRI terminology)
- Difficulty in having Watson technology analyze large databases such as VA's EMR due to PHI concerns and need to stay within the firewall

Watson needs to incorporate the concept of changing signs and symptoms in a patient over time which creates added dimension to diagnosis of a single patient presentation

Challenge is the **fragmentation** of electronic medical records by multiple hospitals, clinics, outpatient settings, etc.

EMR Opportunities

- Watson can gain empirical knowledge of vast numbers of physicians and patients in a way that would not be possible for any single practitioner
- Watson could use EMR to perform research and discovery in healthcare such as unanticipated drug responses and interactions and factors impacting patient response to therapy

 Watson can be impetus to medical community for the development of more structured EMR in a more friendly machine readable format Personal Health Records May Help Ameliorate Fragmentation of EMR's Hospital and Clinics and Offices



PHR's will enable Watson to get all information in one place when patients centralize and take control of their own electronic health records
Patients will be able to control level of access to their information