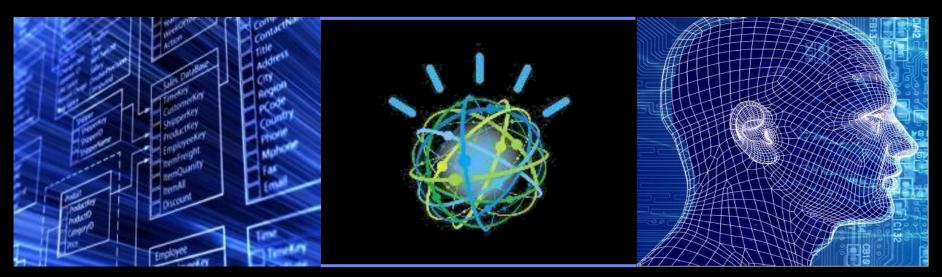


Update: <a href="https://linear.com/lengths.com/length

Jeffrey Betts
IBM Healthcare and Life Sciences

Kelowna Conference, June 19, 2012





On February 14, 2011, IBM Watson made history ...

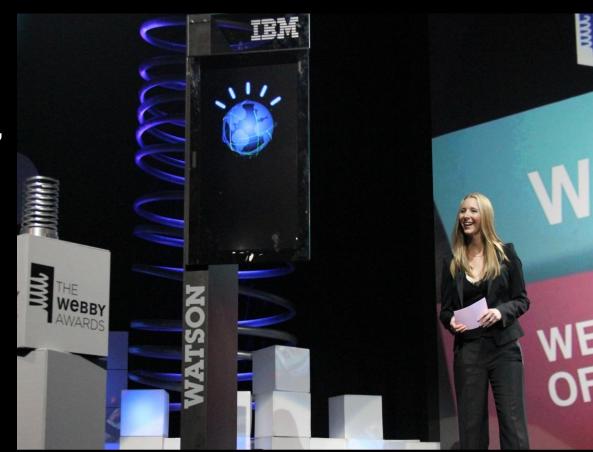




Actress Lisa Kudrow presents IBM's Watson with "Person Of The Year" at the 15th Annual Webby Awards

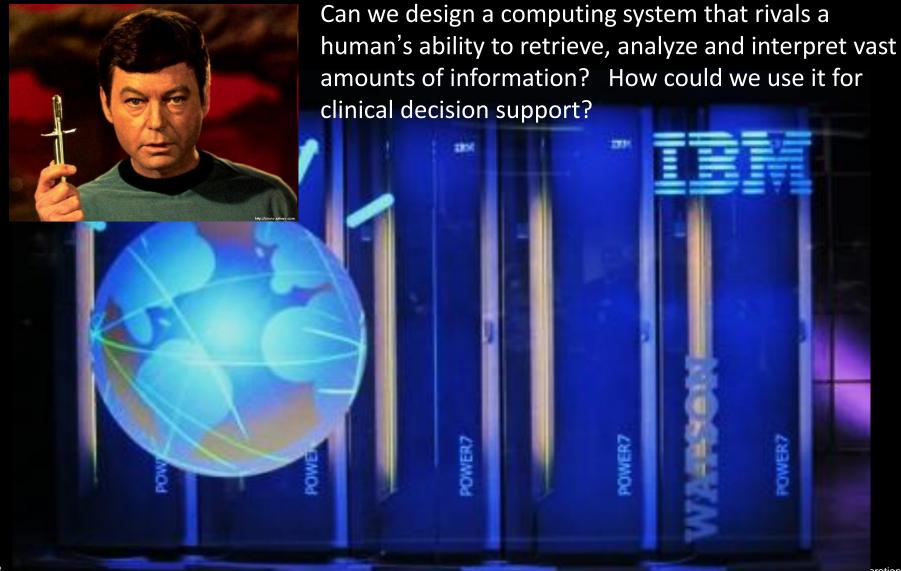
Watson's Acceptance Speech:

"Person of the Year....ironic."





What if our doctors had all the evidence they need to deliver highest quality care, every time?





Evidence: Evolving to support Personalized Healthcare



Evidencecentric Point of Care

Improve care delivery through consumable evidence at the point of care

Evidence Generation

Enable transformation of Data to Evidence

Evidence-Rich Care Coordination

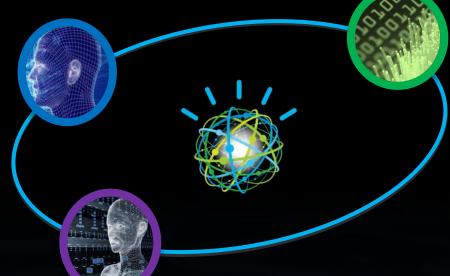
Orchestrate an efficient workflow to increase safety and reduce errors

Novel Incentives/ Payment Models

Provide incentives to enhance patient outcome and reduce cost

IBM Watson brings together a set of transformational technologies to drive optimized outcomes

1 Understands natural language and human speech



Generates and evaluates hypothesis for better outcomes



3 Adapts and Learns from user selections and responses

...built on a massively parallel probabilistic evidence-based architecture optimized for POWER7

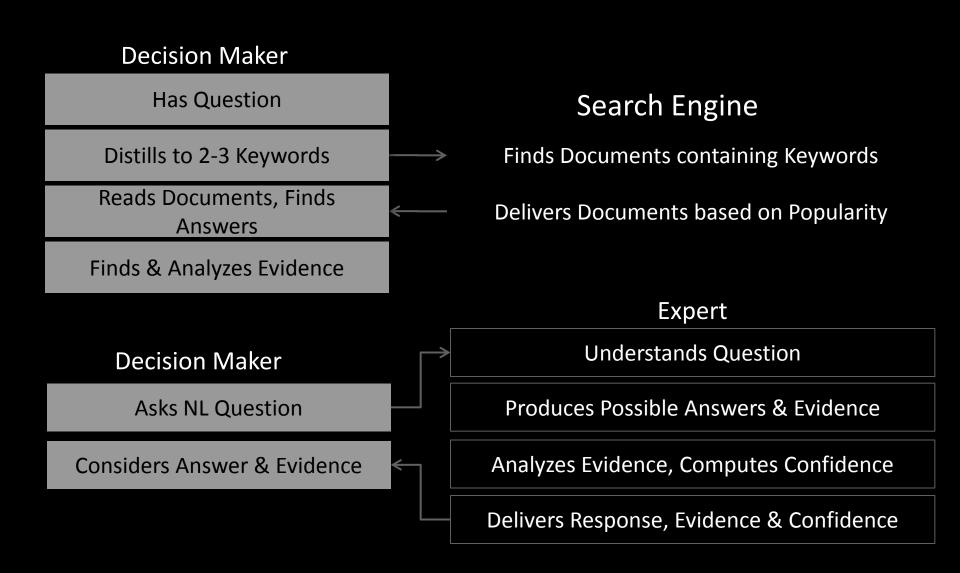
Why is it so hard for computers to understand humans?



	Structured Data		Unstructured Data
Where was Einstein born?	Physicist A. Einstein	Birth Place Ulm	"One day, from among his city views of Ulm, Otto chose a
	N. Bohr	Copenhagen	water color to send to Albert Einstein as a remembrance of Einstein's birthplace"
	M. Curie	Warsaw	
	Source: Excel File, Database, etc.		Source: http://www.schaeffenacker-ulm.de/en/otto.html
Welch ran this?	Person	Organization	
	L. Gerstner	IBM	"If leadership is an art then surely Jack Welch has proved himself a master painter during
	J_Welch	GE	
	W. Gates	Microsoft	his tenure at GE"
	Source: Excel File, Database, etc.		Source: <i>Jack Welch and the GE Way,</i> Robert Slater

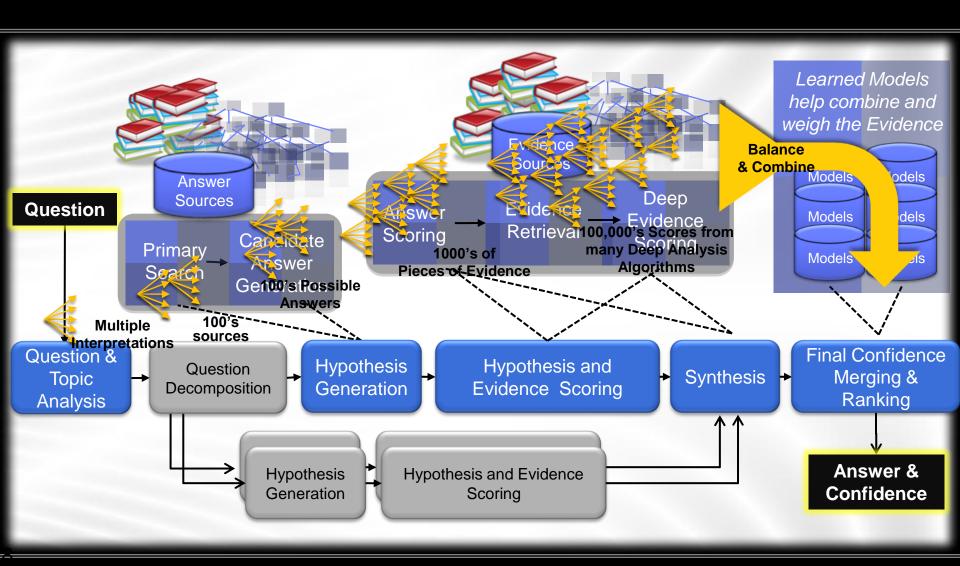


IBM Watson Goes Way Beyond Search





How Watson Works





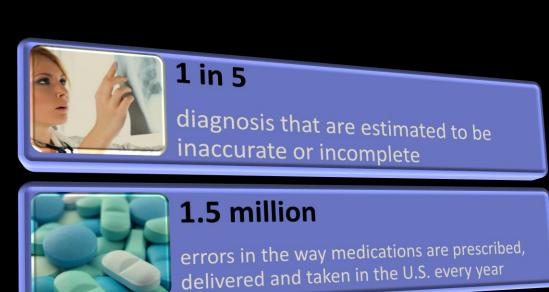
Healthcare Industry is beset with some of the most complex information challenges we collectively face



Medical information is doubling every 5 years, much of which is unstructured



81% of physicians report spending 5 hours or less per month reading medical journals





44,000 -98,000

of Americans who die each year from preventable medical errors in hospitals alone



Cognitive Dispositions to Respond (CDRs) That May Lead to Diagnostic Errors...

Aggregate bias

Anchoring

Ascertainment bias

Availability

Base-rate neglect

Commission bias

Confirmation bias

Diagnosis momentum

Feedback sanction

Framing effect

Fundamental attribution error

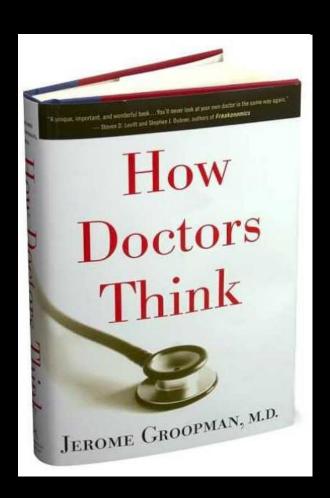
Gambler's fallacy

Gender bias

Hindsight bias

Multiple alternatives bias

Omission bias



Bias Blind Spot: we recognize cognitive bias in others but...

Medical Transcription Discharge Summary Sample # 2: DATE OF ADMISSION: MM/DD/YYYY

DATE OF DISCHARGE: MM/DD/YYYY

CHIEF COI UNISTER LE COLUMN STER LE

HISTORY OF PRESENT ILLINESS. This is an (XX)-year-old male with a past medical history of coronary artery disease, CARG done a few years ago. In 18 billion, cohemic transport of the past of the past

s of 25 pounds in the last 6 **Echocardiogram Sample Report:**

DATE OF STUDY: MM/DD/YYYY

PROCEDU DATE OF INTERPRETATION OF STUDY:

Echocardiogram was obtained for assessment of left ventric Medications, diseases

function. The patient has been admitted CONSULT

syncope. Overall, the study was subop

FINDINGS:

months.

appetite.

thickenin

pattern.

PAST ME

REVIEW

and feet.

PHYSICAL

Appearai

masses.

rhythm.

smooth n

within no

LABORA1

neutroph

1.6, PTT 3

hyperten 1. Aortic root appears normal.

2. Left atrium is mildly dilated. No gros recognized, although subtle abnormalit **FAMILY H** atrium is of normal dimension.

3. There is echo dropout of the interat

SOCIAL H could not be excluded.

4. Right and left ventricles are normal ventricular systolic function appears to ALLERGIE fraction is around 55%. Again, due to p abnormalities in the distribution of late

excluded. Aortic valve is sclerotic with normal hemorrho

Doppler study demonstrates trace aort 6. Mitral valve leaflets are also scleroti

imaging and Doppler study demonstrat regurgitation.

7. Tricuspid valve is delicate and opens clearly seen. No evidence of pericardia

CONCLUSIONS:

1. Poor quality study.

- 2. Eveball ejection fraction is 55%.
- 3. Trace to mild degree of mitral regur

4. Trace aortic regurgitation.

The patient had a chest x-ray, which showed cardiomega effusion, a left costophrenic angle which has not change

head CT, which showed atrophy with old ischemic chang

octitis and secondary to decreased

sclerotic heart disease, pleural

Cardiology Consultation Transcribed Medical Transcription Sample Reports

DATE OF CO Symptoms, non-symptoms, CONSULTING PHYSI

REASON FOR CONSU HISTORY OF PRESENTAD MEASUREMENTS, ROCIAL disease. She underwer lab measurements, social

with a cardiac catheter history, family history and ventricular function was hypokinesis. In view of th

1. Coronary artery di

she has been relative

- Dyslipidemia.
- Hypertension. Status post breast lumpectomy for cancer with followup radiation therapy to the chest.

ALLERGIES: None. MEDICATIONS: Aspirin 81 mg daily, Plavix 75 mg daily, Altace 2.5 mg daily, metoprolol 50 mg b.i.d. and Lipitor 10 mg

SOCIAL HISTORY: She quit smoking approximately 8 months ago. Prior to that time, she had about a 35- to 40-pack-year

history. She does not abuse alcohol. FAMILY MEDICAL HISTORY: Mother died prematurely of breast cancer. Her father died prematurely of gastric

REVIEW OF SYMPTOMS: There is no history of any CVAs, TIAs or seizures. No chronic headaches. No asthma, TB, hemoptysis or productive cough. There is no congenital heart abnormality or rheumatic fever history. She has no

palpitations. She notes no nausea, vomiting, constipation, diarrhea, but immediately prior to adsome diffuse abdominal discomfort. She says that since then, this has resolved. No diabetes or no depression or psychiatric problems. There is no musculoskeletal disorders or history of gout. problems or blood dyscrasias. No bleeding tendencies. Again, she had a history of breast cancer lumpectomy procedures for this with followup radiation therapy. She has been followed in the past mammography shows no evidence of any recurrent problems. There is no recent fevers, malaise

PHYSICAL EXAMINATION: Her blood pressure is 120/70, pulse is 80. She is in a sinus rhythm monitor. Respirations are 18 and unlabored. Temperature is 98.2 degrees Fahrenheit. She weig

4 inches. In general, this was an elderly-appearing, pleasant female who currently is not in acute distress. Skin color and turgor are good. Pupils were equal and reactive to light. Conjunctivae clear. Throat is benign. Mucosa was moist and noncyanotic. Neck veins not distended at 90 degrees. Carotids had 2+ upstrokes bilaterally without bruits. No lymphadenopathy was appreciated. Chest had a normal AP diameter. The lungs were clear in the apices and bases, no wheezing or egophony appreciated. The heart had a normal S1, S2. No murmurs, clicks or gallops. The abdomen was soft, nontender, nondistended. Good bowel sounds present. No hepatosplenomegaly was appreciated. No pulsatile masses were felt. No abdominal bruits were heard. Her pulses are 2+ and equal bilaterally in the upper and lower extremities. No clubbing is appreciated. She is oriented x3. Demonstrated a good amount of strength in the upper and lower extremities. Face was symmetrical. She had a normal gait. IMPRESSION: This is a (XX)-year-old female with significant multivessel coronary artery disease. The patient also has a

left main lesion. She has undergone several PTCA and stenting procedures within the last year to year and a half. At this point, in order to reduce the risk of any possible ischemia in the future, surgical myocardial revascularization is recommended.

PLAN: We will plan to proceed with surgical myocardial revascularization. The risks and benefits of this procedure were explained to the patient. All questions pertaining to this procedure were answered.

Cardiology Consultation Transcribed Medical Transcription Sample Reports REFERRING PHYSICIAN: John Doe, MD

CONSULTING PHYSICIAN: Jane Doe, MD HISTORY OF PRESENT ILLNESS: This (XX)-year-old lady is seen in consultation for Dr. John

whether she can be cared from the cardiac standpoint. PAST CARDIAC HISTORY: Bypass surgery. She underwent echocardiography and cardiac catheterization prior to the operation. Echocardiography showed an ejection fraction of 50%. There ventricular hypertrophy with septal wall 1.60 cm and posterior wall 1.55 cm. iography showed 90% stenosis in the anterior descending artery, situated distally

Doe. She has been under consideration for ventral hernia repair and has a background of aortic

valve replacement and known coronary artery disease. The patient was admitted with complaints of abdominal pain, anorexia, and vomiting. She underwent a CT scan of the abdomen and pelvis

nowed the ventral hernia involving the transverse colon, but without strangulation. There kidney. She had bilateral renal cysts. The hepatic flexure wall was thickened. verticulosis without diverticulitis. It has been recommended to her that she ne ventral hernia. For this reason, cardiology consult is obtained to assess

just before the apex of the left ventricle. Only mild to moderate narrowing was seen elsewhere in CORONARY RISK FACTORS: Her father had an irregular heartbeat and her brother had a fatal heart attack. She herself has had high blood pressure for 20 years. She has elevated cholesterol

and takes Lipitor. She has had diabetes for 20 years. She is not a cigarette smoker. She does little physical exercise. REVIEW OF SYMPTOMS: CARDIOVASCULAR AND RESPIRATORY: She has no chest pain. She sometimes becomes short of breath if she walks too far. No cough. She has occasional swelling of

her feet. Occasionally, she gets mildly lightheaded. Has not lost consciousness. She tends to be aware of her heartbeat when she is tired. She has no history of heart murmur or rheumatic fever. GASTROINTESTINAL: Recent GI symptoms as noted above, but she does not usually have such ems. She has had no hematemesis. She has no history of ulcer or jaundice. She sometimes

> le pains and has a history of gout. HEMATOLOGIC: No anemia, us blood transfusion. GYNECOLOGIC: No gynecologic or breast She has had shoulder and hand injuries and has had carpal tunnel

tic and has been on insulin. She has chronic renal insufficiency with as had hypothyroidism. She has had morbid obesity. She has chronic uses BiPAP. She has had hysterectomy and oophorectomy in the past. spital, she was taking glipizide XL 2.5 mg daily, metoprolol 50 mg torvastatin 40 mg daily, Synthroid 75 mcg daily, aspirin 81 mg daily,

irrently, she is taking Lipitor 40 mg daily, Lantus 10 units at bedtime, pprolol 50 mg b.i.d., and Zosyn 2.25 grams q.6h. es not drink alcohol.

tion and no blood in the stool. GENITOURINARY: She tends to have

up once at night to pass urine. No dysuria, incontinence. She has had

lo stones noted. NEUROLOGIC: She has occasional headaches. No on, hearing, or speech. No limb weakness. MUSCULOSKELETAL: She

is not currently dyspneic, in no distress. She is alert, oriented, and

d react normally. No icterus. Mucous membranes well colored. nopathy. Jugular venous pressure not elevated. Carotids equal. per minute and regular and the blood pressure 132/78. The cardiac . There is a grade 3/6 ejection systolic murmur heard medial to the with well heard radiation to the neck vessels.

80% of medical information

7.7. TSH 1.82. Troponin I was normal on three occasions. ged heart with postoperative changes, but no evidence of acute ble left atrial enlargement. Low voltage QRS, probable inferior wall erior wall infarction, age undetermined.

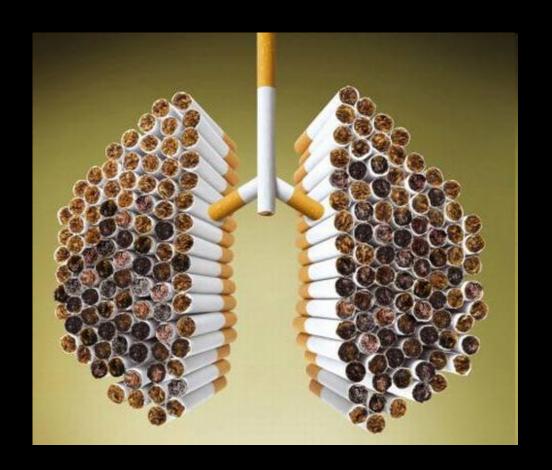
with bioprosthetic valve. Residual systolic murmur. ase with severe stenosis in anterior descending artery, but this is s only a small mass of myocardium. cular systolic function. The EKG appearance of previous myocardial

indicating multiple other medical problems as listed above the chart. It appears that she does not wish to proceed with the if such surgery is not



Text Analytics – Social History / Smoking Status

NLP of unstructured physician notes found 40% more smokers than previously identified in the structured social history smoking data.





Why is Watson Technology ideal for healthcare?

Understands natural language questions



What condition has red eye, pain, inflammation, blurred vision, floating spots and sensitivity to light?

Analyzes large volumes of structured and unstructured data



Physician Notes, Medical Journals, Clinical Trials, EMRs, Pathology Results, Blogs, Wikipedia

Generates and evaluates hypothesis



Possible DiagnosisConfidenceUveitis91%Iritis48%Keratitis29%

Presents responses with confidence



Supports iterative dialogue to refine results



Family History, Patient Interview, Physical Exam,
Current Medications

Learns from results over time



What actions were taken? What treatments were prescribed? What was the outcome?



IBM and Memorial Sloan-Kettering adapting Watson for Oncology

1 in 4

individuals will die from cancer



rate cancer cost climbs vs. std. health costs or 15-18% / yr.









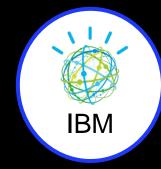
of cancer cases receive the wrong diagnosis initially with some as high as 44%



Annual cancer deaths in Canada

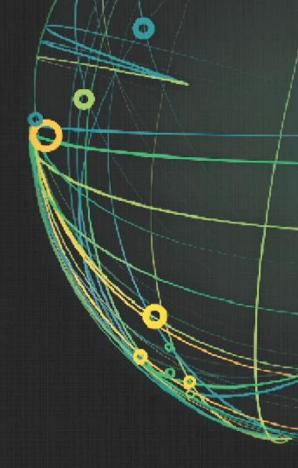




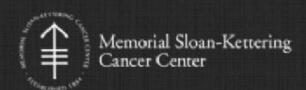


Source: American Cancer Society, National Health Institute, Canadian Cancer Society

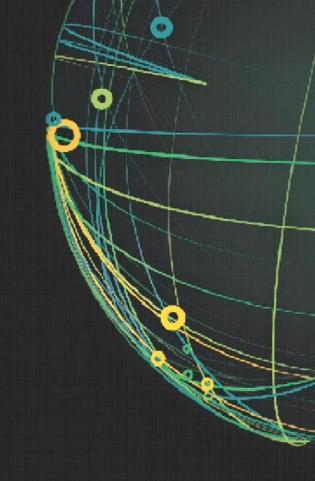
The vision for this demonstration was created with the guidance of the physician experts at Memorial Sloan-Kettering Cancer Center.

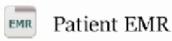


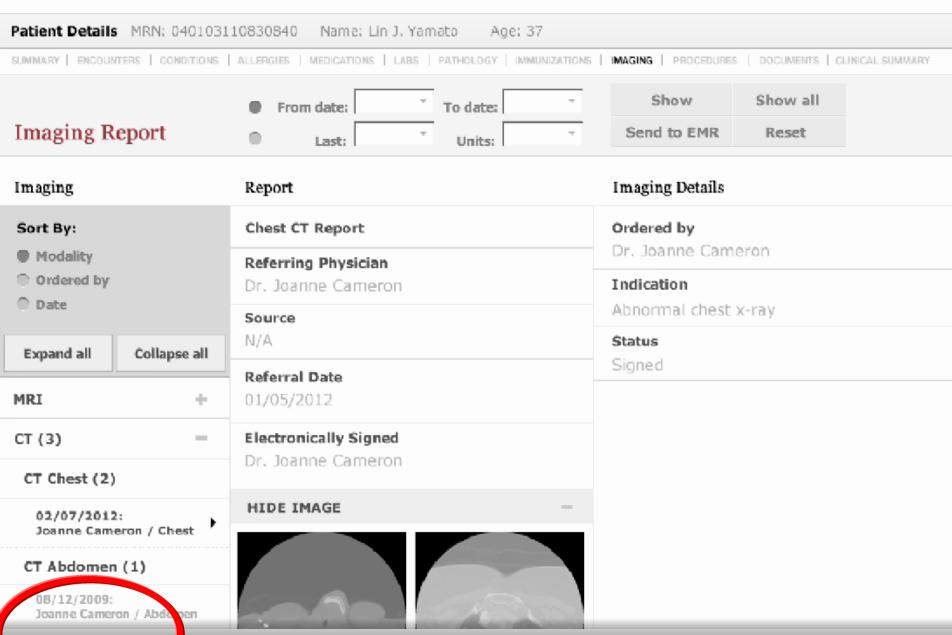




Preparation for Doctor's First Consultation with Patient

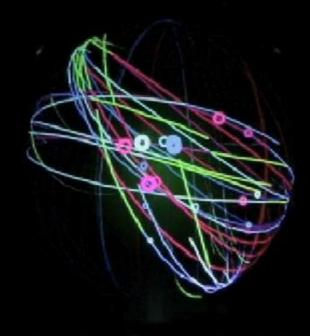








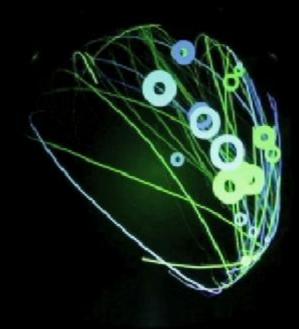
Watson is evaluating patient info against Watson knowledge base... 234 Textbooks



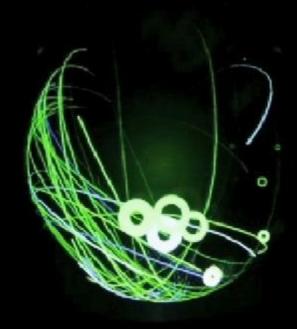
Watson is evaluating patient info against Watson knowledge base...
1,973 Guidelines



Watson is evaluating patient info against Watson knowledge base... 20,274 Journal articles



Watson is evaluating patient info against Watson knowledge base...
4,843 Drug info documents



Watson is evaluating patient info against Watson knowledge base...
1,578 Other clinical documents

Case Information





The IBM Watson case information does not obviate the need to review the EMR record in detail



Diagnosis

Adenocarcinoma of lung origin

PATIENT Lin J. Yamato Patient ID: 000-0000 Provider ID: 00-0000-0

DEMOGRAPHICS Gender: Female

DOB: Jan 15, 1975 (37) Place of Birth: Osaka, Japan CURRENT CONDITION DX: Lung Adenocarcinoma Smoking History: Never smoker

Adenocarcinoma of lung origin

3.1 cm lesion in the right

adrenal gland

Location

1.7 cm lesion in the right

upper lobe of the lung

Stage

IV Adenocarcinoma

Key Points

2/16/12 - Pathology report from CT biopsy of right adrenal gland: Metastatic adenocarcinoma; morphologically consistent with specimen 312-647







2/07/12 - CT chest/abdomen/pelvis with contrast: 1.7 cm lesion right adrenal gland suspicious for a metastatic deposit





2/05/12 - CT chest without contrast: 3.1 cm lesion right upper lobe of lung suspicious for neoplasm



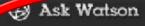
IBM WATSON

EMR













Case Information





The IBM Watson case information does not obviate the need to review the EMR record in detail



PATIENT Lin J. Yamato Patient ID: 000-0000 Provider ID: 00-0000-0 DEMOGRAPHICS

Gender: Female DOB: Jan 15, 1975 (37) Place of Birth: Osaka, Japan CURRENT CONDITION

DX: Lung Adenocarcinoma Smoking History: Never smoker

morphologically consistent with specimen 312-647

EVIDENCE

2/07/12 - CT chest/abdomen/pelvis with contrast: 1.7 cm lesion right adrenal gland suspicious for a metastatic deposit



EMB.

2/03/12 - POP to the standard cough - labored breathing







Has the patient experienced any hemoptysis?





Does the patient have normal hearing?









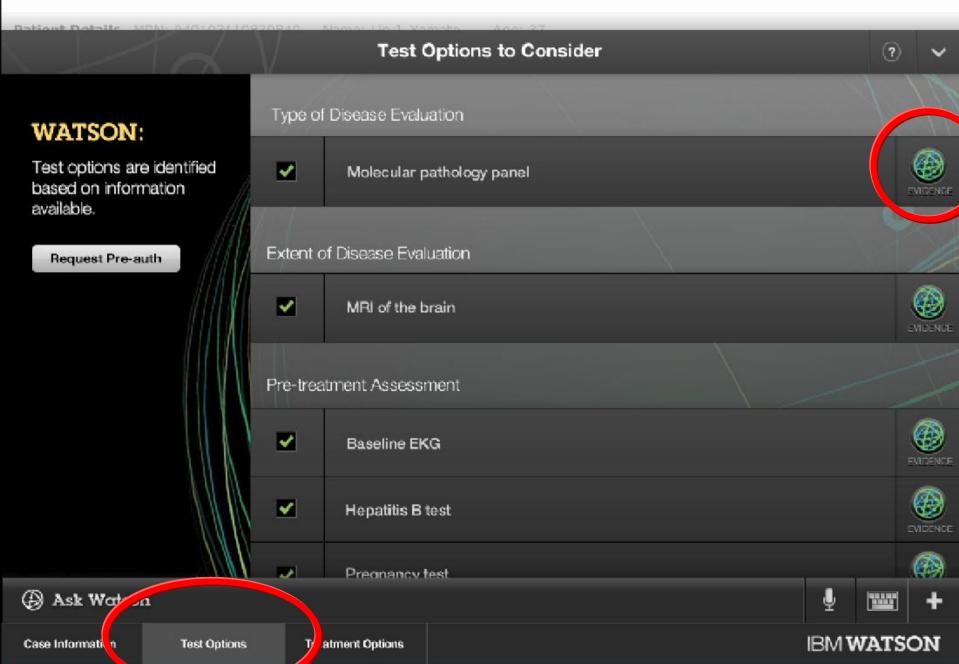
Ask Watson

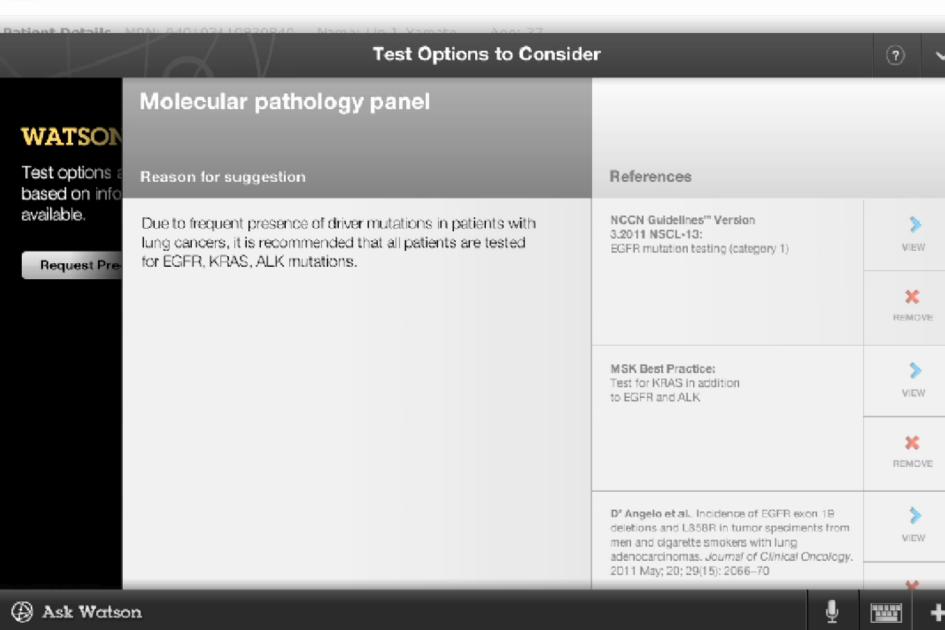






2/05/12 – CT chest without contrast: 3.1 cm lesion right upper lobe of lung suspicious for neoplasm





Test Options to Consider





WATSON

Test options based on info available.

Request Pre

Molecul

Reference

Reason for

Due to freque lung cancers for EGFR, KF

Purpose: EGFR mutations underlie the sensitivity of lung cancers to erlotinib and gefitinib and can occur in any patient with this illness. Here we examine the frequency of EGFR mutations in smokers and men.

Results: We tested 2,142 lung adenocarcinoma specimens for the presence of EGFR exon 19 deletions and L858R, EGFR mutations were found in 15% of tumors from former smokers (181 of 1.218; 95% Cl. 13% to 17%), 6% from current smokers (20 of 344; 95% Cl. 4% to 9%), and 52% from never smokers (302 of 580; 95% Cl, 48% to 56%; P < .001 for ever v never smokers). EGFR mutations in former or current smokers represented 40% of all those detected (201 of 503; 95% CI, 36% to 44%), EGFR mutations were found in 19% (157 of 827; 95% Ct, 16% to 22%) of tumors from men and 26% (346 of 1,315; 95% ČI, 24% to 29%) of tumors from women (P < .001). EGFR mutations in men represented 31% (157 of 503; 95% CI, 27% to 35%) of all those detected.

Conclusion: A lo or Earl In Intutations are found in additional since minen and people who smoked digarettes. If only women who were never smokers were test 57% of all EGFR mutations would be missed. Testing for EGFR mutations should be considered for all patients with adenocarcinoma of the lung at diagnosis, regardless of clinical characteristics. This strategy can extend the use of EGFR tyrosine kinase inhibitors to the greatest number extential for substantial benefit individuals will

Ask Watson







Treatment Options to Consider





WATCON

Insufficient information is available to provide treatment options

the high confidence. See the rest options tab for additional tests that would provide the needed information.

Request Pre-auth

Identified Options

Treatment plan 1
Systemic Chemo: Cisplatin,
Pemetrexed, Bevacizumab

Confidence

32[%]

TBD

match with patient preferences



Treatment plan 2

Systemic Chemo: Carboplatin, Paclitaxel, Bevacizumab



TBD

match with patient preferences



Treatment plan 3

Systemic Chemo: Erlotinib

28[%]

TBD

match with patient preferences



Radiation and Surgery are unlikely to be appropriate.





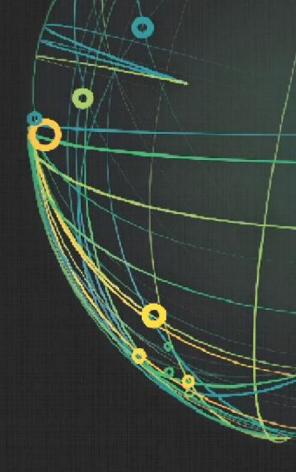






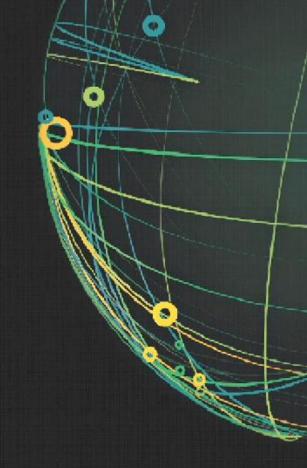
First Consultation

- Case is discussed with patient
- Patient preferences discussed
- Patient is examined
- Tests are ordered



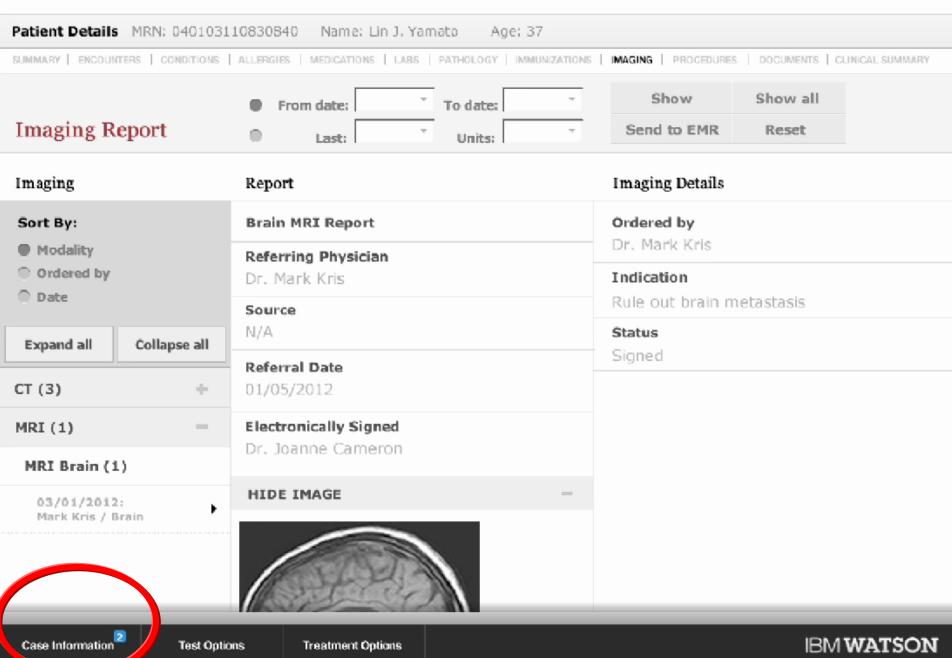
Preparation for Doctor's Second Consultation with Patient

- 10 days have elapsed since the first consultation
- Test results are now available



Test Options

Treatment Options



IBM WATSON

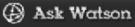
Case Information The IBM Watson case information does not obviate the need to review the EMR record in detail PATIENT DEMOGRAPHICS CURRENT CONDITION Lin J. Yamato Gender: Female DX: Lung Adenocarcinoma Patient ID: 000-0000 DOB: Jan 15, 1975 (37) Smoking History: Never smoker Provider ID: 00-0000-0 Place of Birth: Osaka, Japan Diagnosis Location Stage T2N0M1 Adenocarcinoma of lung origin 3.1 cm lesion in the right upper lobe of the lung Adenocarcinoma of lung origin 1.7 cm lesion in the right adrenal gland **Key Points** *2 Updates * 03/06/12 - Molecular pathology shows EGFR exon 20 insertion





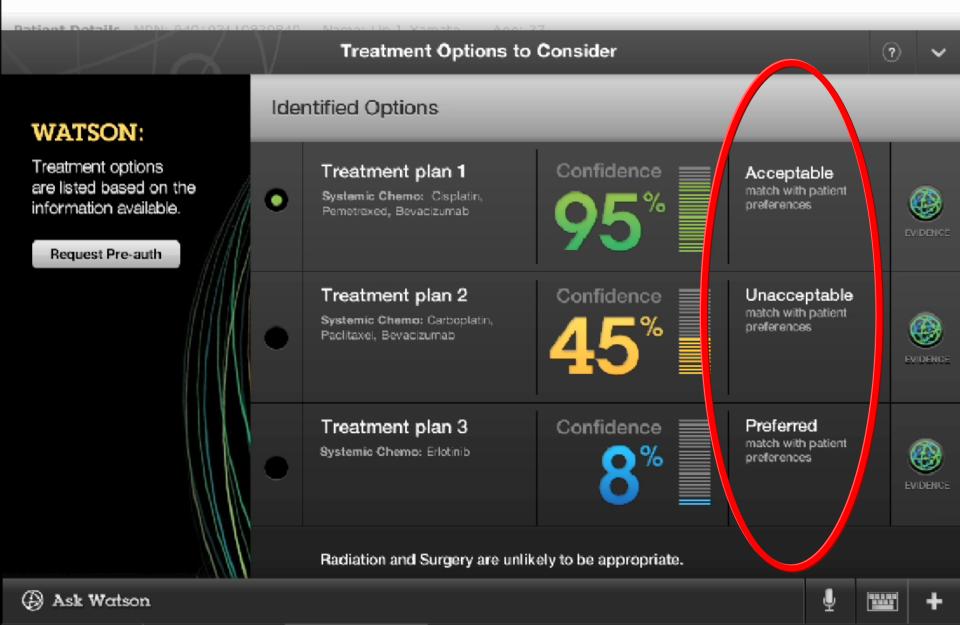








* 03/01/12 - Brain MRI is negative for metastases



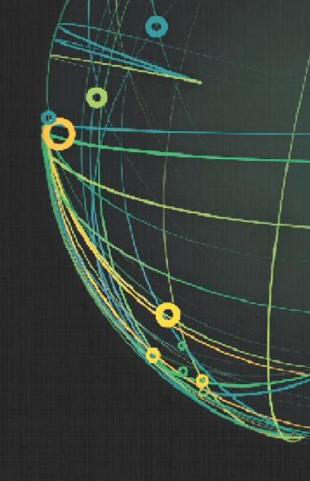
Treatment Options to Consider Treatment plan 1 WATSON Treatment op References Reason for suggestion are listed basinformation as Stage IV disease requires systemic therapy. Since the tumor NCCN Guidelines™ Version 3.2011 NSCL-14: Adenocarcinoma, Large Cell, harbors EGFR TKI resistant mutation, the recommended VIEW NSCLC NOS: EGFR mutation negative OR Request Pre treatment is Cisplatin, Pemetrexed, and Bevacizumab. unknown × Surgery: not recommended for this patient due to the REMOVE presence of metastatic disease. Wulet al. Lung Cancer with Epidermal Growth RT: not recommended for this patient due to the presence Factor Receptor Exon 20 Mutations is VIEW of metastatic disease. Associated with Poor Gefitinib Treatment. Response, Clinical Cancer Research, 2008. 14:4877-4882 × Of the medically appropriate regimens, this treatment REMOVE is least likely to cause alopecia. Wu et al. Effectiveness of tyrosine kinase Usage Statistics: inhibitors on "uncommon" epidermal growth This treatment plan has been selected 154 times out VIEW factor receptor mutations of unknown clinical of 257 similar patient cases. significance in non-small cell lung cancer. Clinical Cancer Research, 2011 Jun 1: 17(11):3812-21. REMOVE







Second Consultation



Treatment Options to Consider Identified Options WATSON: Treatment options Confidence Treatment plan 1 Acceptable are listed based on the match with patient 0 Systemic Chemo: Cisplatin, information available. preferences Pemetrexed, Bevacizumab Request Pre-auth Confidence Treatment plan 2 Unacceptable match with patient Systemic Chemo: Carboplatin, preferences Paclitaxel, Bevacizumab Treatment plan 3 Confidence Preferred match with patient Systemic Chemo: Erlotinib preferences Radiation and Surgery are unlikely to be appropriate.

Ask Watson

Treatment Options to Consider







Ask Watson





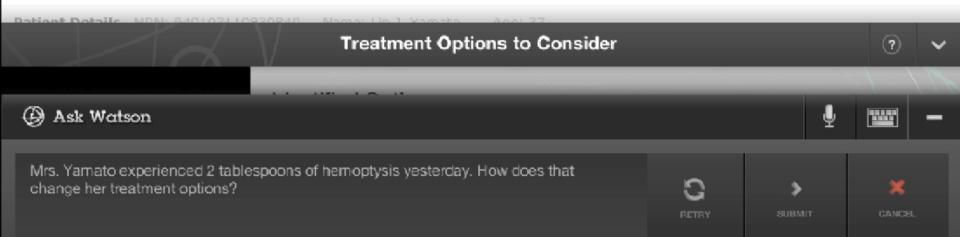


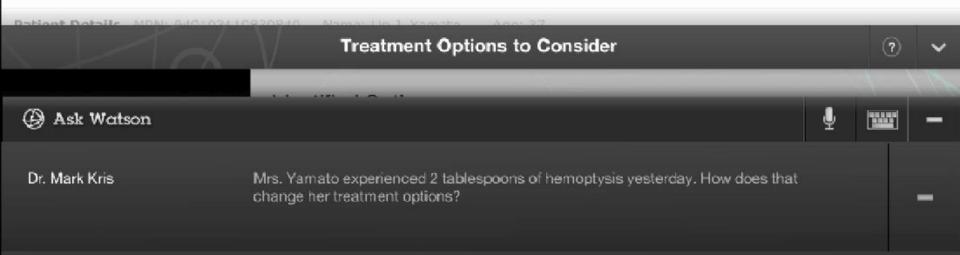
Watson is listening...

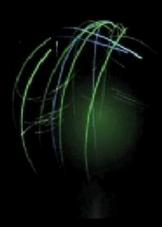


FINISHED SPEAKING

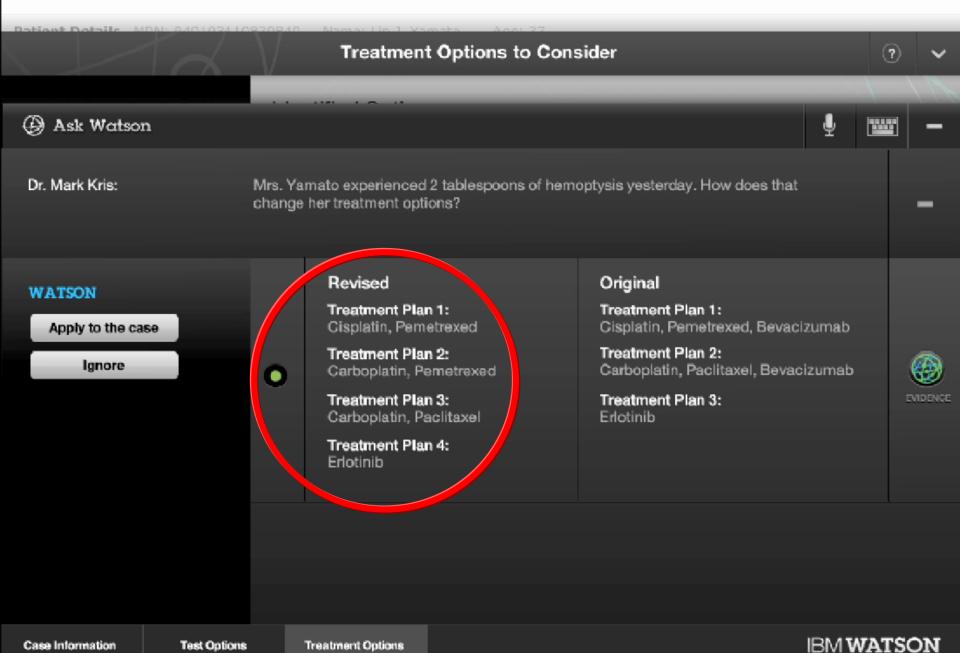








Watson is gathering information...





5442XK21-412

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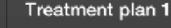


WATSON:

Treatment options are listed based on the information available.

Order

Identified Options



Systemic Chemo: Cisplatin, Pemetrexed



Acceptable

match with patient preferences



Treatment plan 2

Systemic Chemo: Carboplatin, Pemetrexed



9 ≣

Acceptable match with patient preferences



Treatment plan 3

Systemic Chemo: Carboplatin, Paclitaxel





Unacceptable

match with patient preferences



Treatment plan 4

Systemic Chemo: Erlotinih





Preferred

match with patient

senfarana



Ask Watson

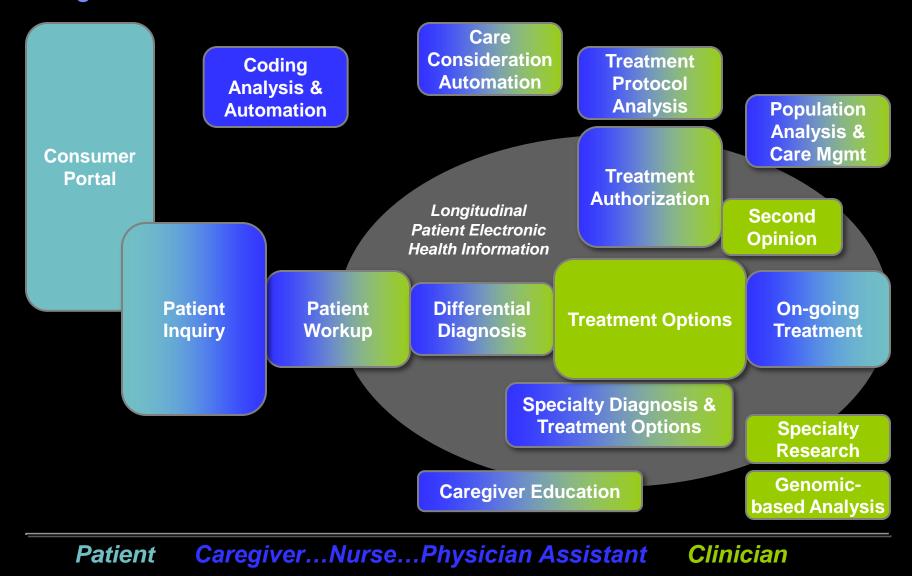








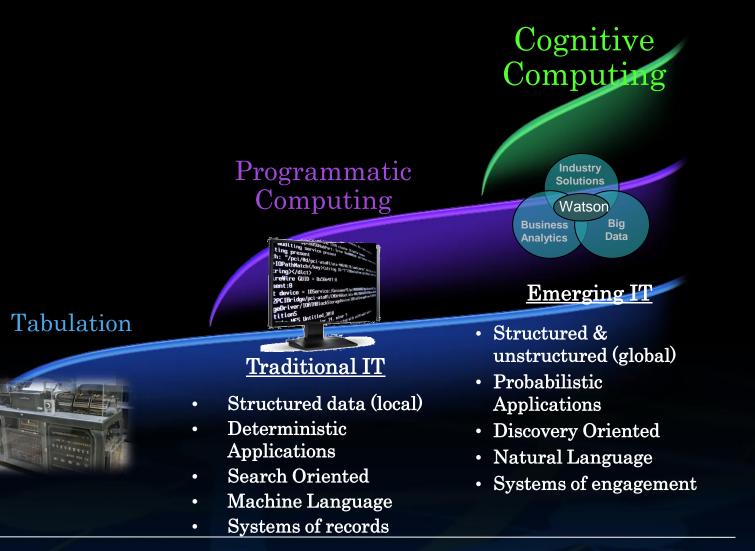
A Range of Watson-enabled Healthcare Solutions



42



Learning systems are ushering a new era of computing







44