

IBM Healthcare & Life Sciences

## Text Analytics and Chemical Annotation of Patents and Biomedical Literature in Biomarker-enabled Drug Discovery

International Chemical Information Conference (ICIC) Sitges, Spain, 21-24 October 2007 Michael Hehenberger, hehenbem@us.ibm.com

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1998: Silicon-on-Insulator

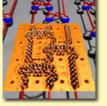
1998:

Microdrive

drain 2001:

**Nanotube Transistor** 

2002: Millipede



2002: Molecule Cascade Logic Circuit

2004: Blue Gene/L The fastest supercomputer in the world

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ICIC Sitges: Text Analytics and Chemical Annotation of Patents

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# Outline

- Pharma R&D Productivity and Pipeline
- Biomarkers
- Role of Unstructured Information
- Unstructured Information Mining (UIM)
- Chemical Names Annotation
- Brief DEMO
- Blue Gene Supercomputing
- in silico Drug Discovery

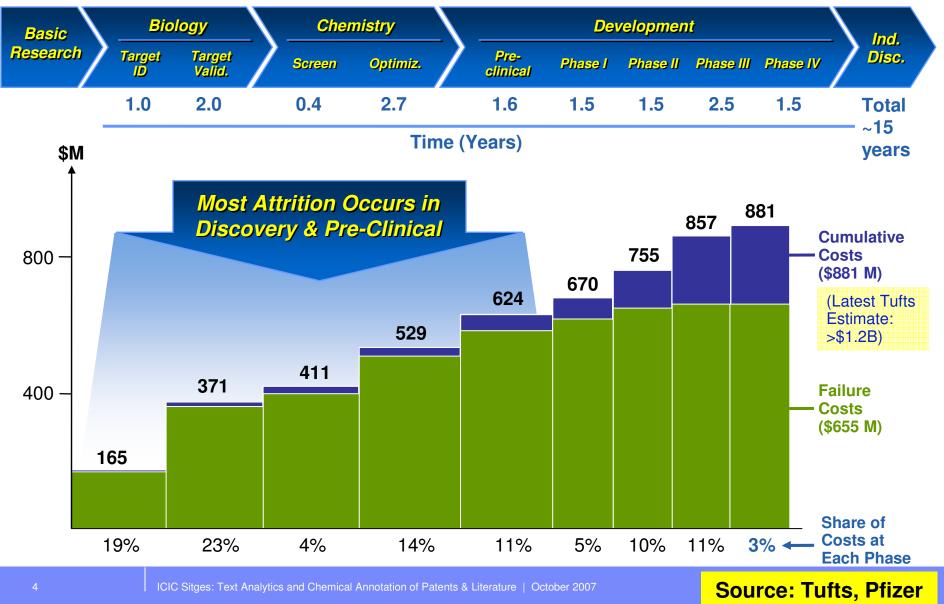


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### The current Pharma "Blockbuster" Model cannot be sustained:

Failure Costs Account for 75% of Drug R&D Costs: \$881M / NME in 2003



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### Patent Expirations are threatening Bio-Pharma Industry ...

Company	20	10	20	911	20	12	Share of Revenues (%)
AstraZeneca	Arimidex	(\$2.2bn)*	Seroquel	(\$4.7bn)	Symbicort	(\$3.7bn)	38**
BMS			US Plavix Avapro	(\$4.8bn) (\$1.3bn)	Abilify	(\$2.1bn)	30
GSK	Advair	(\$3.8bn)			Avandia	(\$2.5bn)	23
Eli Lilly			Zyprexa	(\$4.8bn)			22
Merck	Cozaar/ Hyzaar	(\$3.2bn)			Singulair	(\$4.5bn)	22
Novartis	Femara	(\$1.1bn)			Diovan	(\$6.0bn)	14
Pfizer	Aricept	(\$800m)	Lipitor Xalatan	(\$12.1bn) (\$1.6bn)	Viagra Detrol Geodon	(\$1.7bn) (\$860m) (\$1.1bn)	41
sanofi-aventis	Taxotere	(\$2bn)	US Plavix Avapro	(\$3.8bn) (\$2.1bn)	Lovenox	(\$3.1bn)	34

Source: AXA Framlington

Notes: \* Estimate of global sales in 12 months prior to patent signing

\*\* Value of products losing patent protection as a percentage of total company sales over next five years

Source: PwC Pharma2020

#### **IBM Healthcare & Life Sciences**



# Increased Bio-Pharmaceutical R&D Productivity will require joint action by Regulators, Industry & Academia / Public Sector



### Ongoing efforts focused on improving R&D productivity:

NIH Roadmap FDA Critical Path Pharmaceutical Innovation Steering Committee (PISC)

### Biomarkers

- Novel adaptive trial design
- Accelerating proof of concept
- Enriched patient population trial designs
- Rolling dose studies
- Exploratory IND

- Improving efficiency of late-stage clinical research
- SAE (Serious Adverse Events) datamining validation
- Best regulatory practices and sponsor/regulator communication
- Predictive models for safety and efficacy

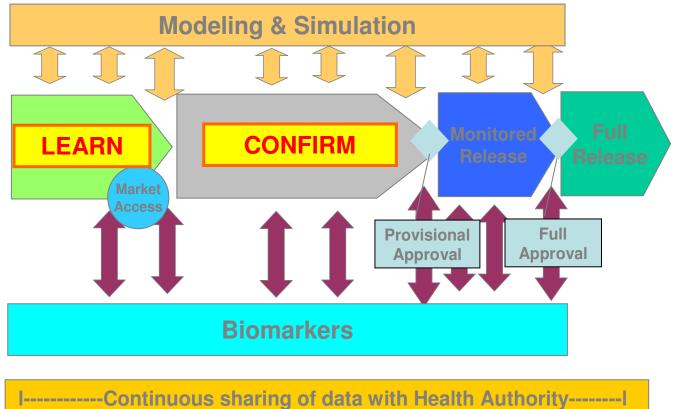
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**Source: Pfizer** 



## Key Drivers to transform the Pharma R&D Model

- Biomarkers
- <u>Modeling and</u>
  <u>Simulation</u>
- Rapid compound selection in man
- Innovative clinical trial design
- Innovative approaches to registration
- Integrated safety assessment & risk management
- Quality manufacturing



Source : Biomarker Summit III, Dr. Werner Kroll, 26 January 2007

**Source: Novartis** 

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## What is a Biomarker and why are Biomarkers important?

- What is a Biomarker?
  - "Objectively measured indicator of biological/ pathobiological process or pharmacologic response to treatment".
    - A substance or measurement whose detection indicates a particular disease state
    - Usually, a "biomarker" indicates a change in expression or the state of a protein that correlates with the risk or progression of a disease, or with the susceptibility of the disease to a given treatment
- What is a "Clinical Endpoint"?
  - "A Characteristic or variable that reflects patient feeling, function or survival"
  - Biomarkers can be "*Surrogate endpoints*":
    - Biomarker intended to substitute for a clinical endpoint (predict benefit or harm) based on epidemiologic, therapeutic, pathophysiologic or other scientific evidence
- Biomarker Examples: Cholesterol, Blood pressure levels for heart disease, PSA (antigen) for prostate cancer, HbA1c in diabetes, CD4 lymphocyte count for AIDS
- How are they used in drug development?
  - Once a proposed biomarker has been validated, it can be used to diagnose disease risk, presence of disease in an individual, or to tailor treatments for the disease in an individual
  - If a treatment alters the biomarker, which has a direct connection to improved health, the biomarker serves as a "surrogate endpoint" for evaluating clinical benefit.



### **Biomarkers can improve clinical research and patient care**

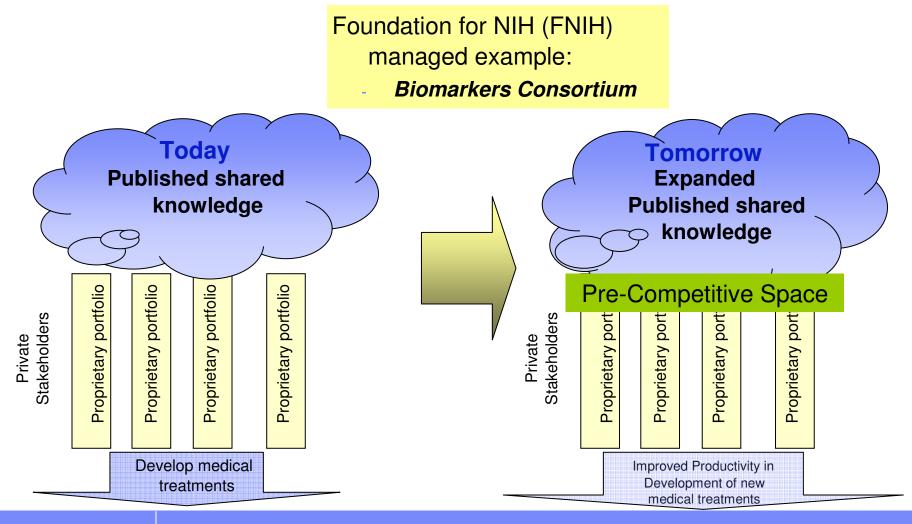
### **Biomarker varieties:**

- Genetics
- Genomics
- Other "- omics"
- Molecular Markers in Blood Serum
- Analysis of Cell Populations
- Physiological Properties
- Structural, Functional & Molecular Imaging

Improve Clinical Research & Patient Care via:

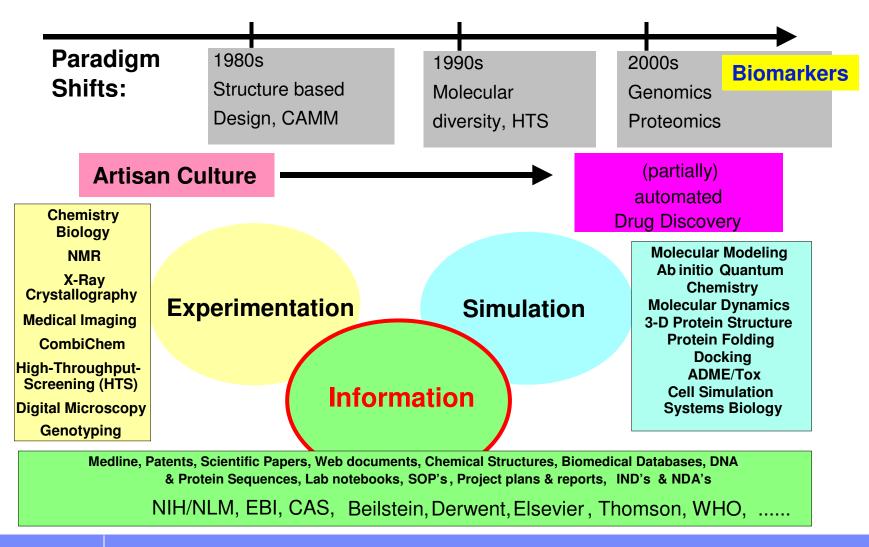
- Diagnostics
- Tracking of Biological Effect
- Risk assessment
- Patient selection based on safety factors
- Patient stratification based on response factors
- Monitoring of treatment
- Prognostic capability

# Public – Private Partnerships grow the shared knowledge while preserving Stakeholders' ability to build proprietary IP





## **Biomarker-enabled Drug Discovery requires the interplay of Experimentation, Simulation and Information**





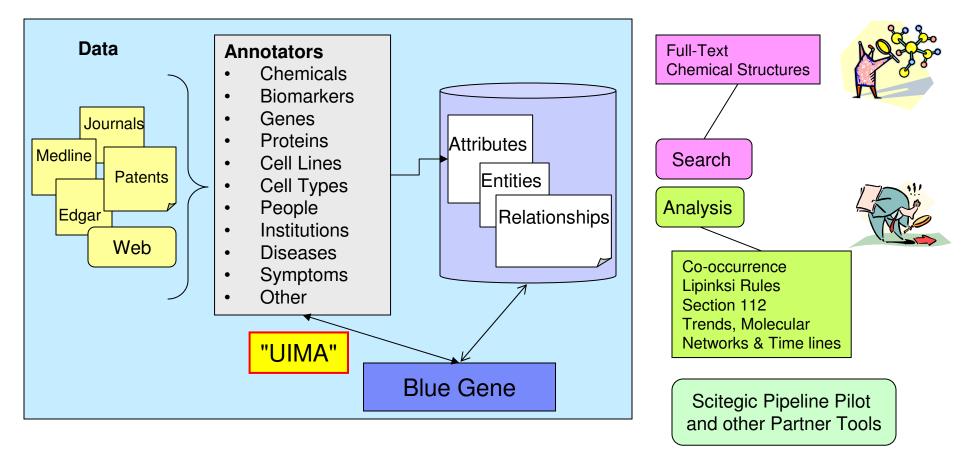
# "The pharmaceutical industry is an information industry"

# Peter Drucker



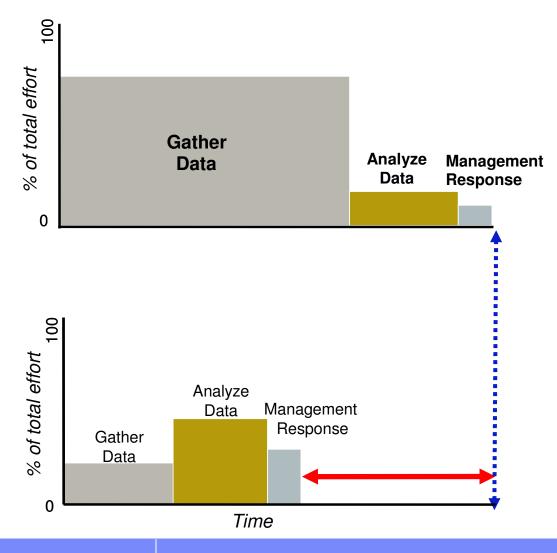
## **IBM's Unstructured Information Mgmt/Mining (UIM) Solution**

Data Warehouse Created.





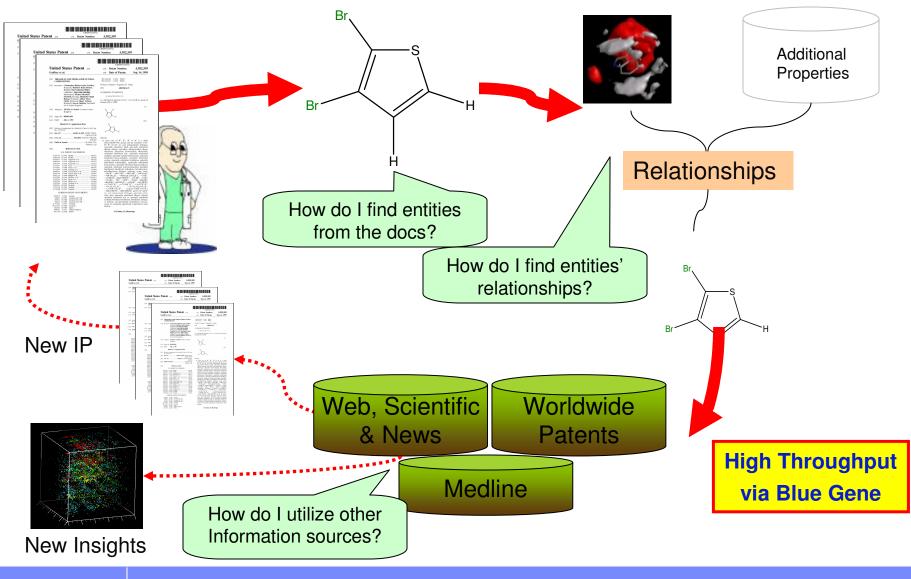
### Text Analytics can provide significant business value, IF we



- Automate the aggregation & search process
- Enhance quality using advanced text analytics and other analysis tools - to help determine relevance
- Base the solution on an Open and Scalable Architecture
- Significantly reduce time dependencies to mission critical information
- > for DECISION SUPPORT



## **Example IP Challenge**



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# Why use Blue Gene?

- Find and compute the 3D structure of every molecule on every page of every patent (and Medline abs.)
- Identify every protein (from our dictionary of >350K proteins) on every page of every patent (and Medline abs.)
- Identify every disease (from our list of 14,500) on every page of every patent and map it to Medline MeSH codes
- Identify the occurrence of every biomarker (e.g. from a dictionary of biomarkers) on every page of every patent
- .....other entities / annotators (UIMA)



Compute properties & find relationships

Data warehouse

### Equivalent to 240K simultaneous Google searches!



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# Can you find the "key molecule(s)" in an "unstructured", complex scientific journal or patent?

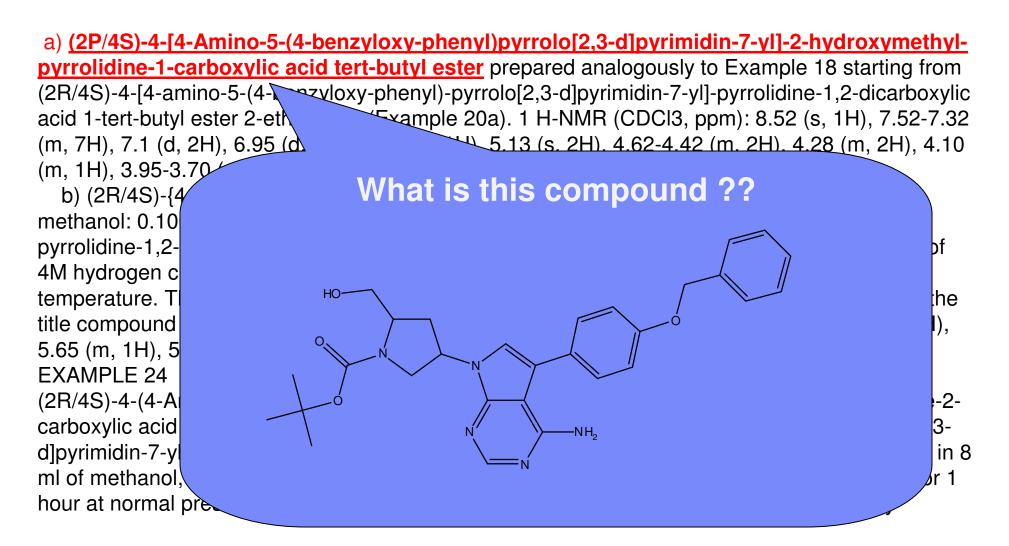
a) (2P/4S)-4-[4-Amino-5-(4-benzyloxy-phenyl)pyrrolo[2,3-d]pyrimidin-7-yl]-2-hydroxymethylpyrrolidine-1-carboxylic acid tert-butyl ester prepared analogously to Example 18 starting from (2R/4S)-4-[4-amino-5-(4-benzyloxy-phenyl)-pyrrolo[2,3-d]pyrimidin-7-yl]-pyrrolidine-1,2-dicarboxylic acid 1-tert-butyl ester 2-ethyl ester (Example 20a). 1 H-NMR (CDCl3, ppm): 8.52 (s, 1H), 7.52-7.32 (m, 7H), 7.1 (d, 2H), 6.95 (d,1 H), 5.50 (m, 1H), 5.13 (s, 2H), 4.62-4.42 (m, 2H), 4.28 (m, 2H), 4.10 (m, 1H), 3.95-3.70 (m, 1H), 2.75 (m, 1H), 2.50 (m, 1H), 1.49 (s, 9H).

b) (2R/4S)-{4-[4-Amino-5-(4-benzyloxy-phenyl)-pyrrolo[2,3-d]pyrimidin-7-yl]-pyrrolidin-2-yl}methanol: 0.100 g of (2R/4S)4-[4-amino-5-(4-benzyloxy-phenyl)-pyrrolo[2,3-d]pyrimidin-7-yl]pyrrolidine-1,2-dicarboxylic acid 1-tert-butyl ester is dissolved in 4 ml of tetrahydrofuran; 10 ml of 4M hydrogen chloride in diethyl ether are added, and stirring is carried out for 1 hour at room temperature. The product is filtered off and dried under a high vacuum. The dihydrochloride of the title compound is obtained. 1 H-NMR (CD3 OD, ppm): 8.4 (s, 1H); 7.60 (s, 1H), 7.5-7.10 (m, 9H), 5.65 (m, 1H), 5.18 (s, 2H), 4.32 (m, 1H), 4.00-3.65 (m, 4H), 2.60 (m, 2H). EXAMPLE 24

(2R/4S)-4-(4-Amino-5-phenyl-pyrrolo[2,3-d]pyrimidin-7-yl)-1-(2,2-dimethyl-propionyl)-pyrrolidine-2carboxylic acid ethyl ester 0.130 g of (2R/4S)-4-(4-benzyloxycarbonylamino-5-phenyl-pyrrolo[2,3d]pyrimidin-7-yl)-1-(2,2-dimethyl-propionyl)-pyrrolidine-2-carboxylic acid ethyl ester is dissolved in 8 ml of methanol, and the solution is hydrogenated over 0.030 g of palladium-on-carbon (10%) for 1 hour at normal pressure. The catalyst is removed by filtration, the filtrate is concentrated by



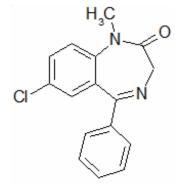
# **Use Text Analytics / Chemical Names Annotation!**





### **Problem** – I need to find information about Valium

Valium \_ Diazepam \_ CAS # 439-14-5 (Trade Name) (Generic Name) (Chemical ID #)

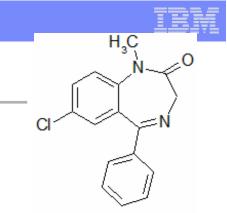


Valium has > 149 "names"

ALBORAL, ALISEUM, ALUPRAM, AMIPROL, ANSIOLIN, ANSIOLISINA, APAURIN, APOZEPAM, ASSIVAL, ATENSINE, ATILEN, BIALZEPAM, CALMOCITENE, CALMPOSE, CERCINE, CEREGULART, CONDITION, DAP, DIACEPAN, DIAPAM, DIAZEMULS, DIAZEPAN, DIAZETARD, DIENPAX, DIPAM, DIPEZONA, DOMALIUM, DUKSEN, DUXEN, E-PAM, ERIDAN, EVACALM, FAUSTAN, FREUDAL, FRUSTAN, GIHITAN, HORIZON, KIATRIUM, LA-III, LEMBROL, LEVIUM, LIBERETAS, METHYL DIAZEPINONE, MOROSAN, NEUROLYTRIL NOAN NSC-77518 PACITRAN PARANTEN PAXATE PAXEL PLIDAN QUETINIL QUIATRIL QUIEVITA RELAMINAL RELANIUM RELAX RENBORIN RO 5-2807 S.A. R.L. SAROMET SEDAPAM SEDIPAM SEDUKSEN SEDUXEN, SERENACK SERENAMIN SERENZIN SETONIL SIBAZON SONACON STESOLID STESOLIN, TENSOPAM TRANIMUL TRANQDYN TRANQUASE TRANQUIRIT, TRANQUO-TABLINEN, UMBRIUM UNISEDIL USEMPAX AP VALEO VALITRAN VALRELEASE VATRAN VELIUM, VIVAL VIVOL WY-3467

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There are many different chemical names for Valium



Valium = Diazepam = CAS # 439-14-5

7-CHLORO-1-METHYL-5-PHENYL-2H-1,4-BENZODIAZEPIN-2-ONE

7-CHLORO-1-METHYL-5-PHENYL-3H-1,4-BENZODIAZEPIN-2(1H)-ONE

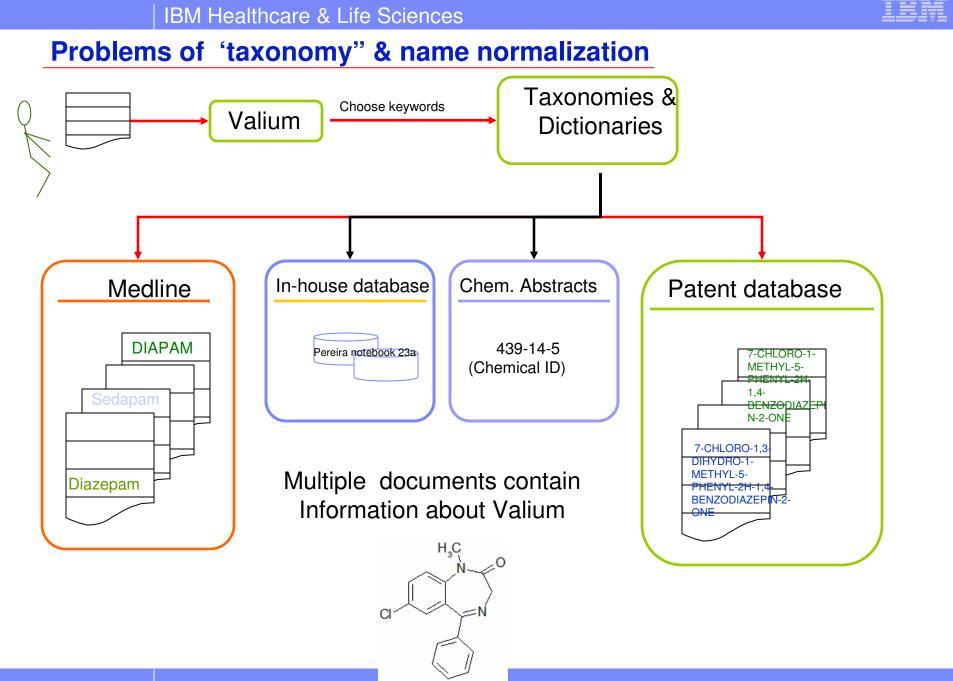
7-CHLORO-1-METHYL-5-PHENYL-1,3-DIHYDRO-2H-1,4-BENZODIAZEPIN-2-ONE

7-CHLORO-1-METHYL-2-OXO-5-PHENYL-3H-1,4-BENZODIAZEPINE

1-METHYL-5-PHENYL-7-CHLORO-1,3-DIHYDRO-2H-1,4-BENZODIAZEPIN-2-ONE

7-CHLORO-1,3-DIHYDRO-1-METHYL-5-PHENYL-2H-1,4-BENZODIAZEPIN-2-ONE

7-CHLORO-1-METHYL-5-3H-1,4-BENZIODIAZEPIN-2(1H)-ONE





## **Chemical Structure Annotation DEMO:**

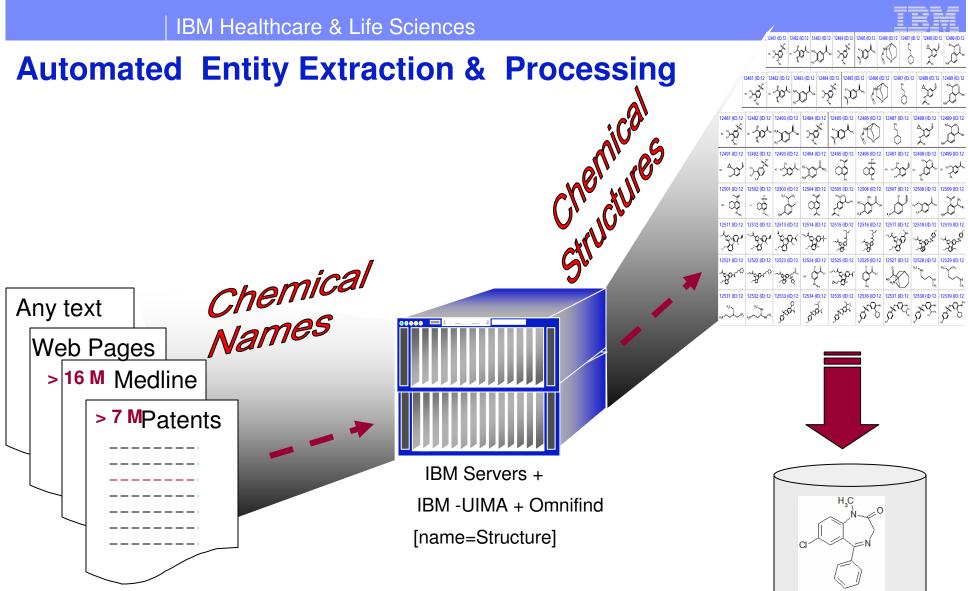
Example:

US6051577: N-7-heterocyclyl pyrrolo[2,3-D]pyrimidines and the use thereof

Title: "New 7-(pyrrolidinyl or piperidinyl)-pyrrolo[2,3-d]pyrimidine derivatives - useful as protein-tyrosine-kinase inhibitors for treatment of e.g. osteoporosis, Paget's disease, cardiovascular diseases and cancers"

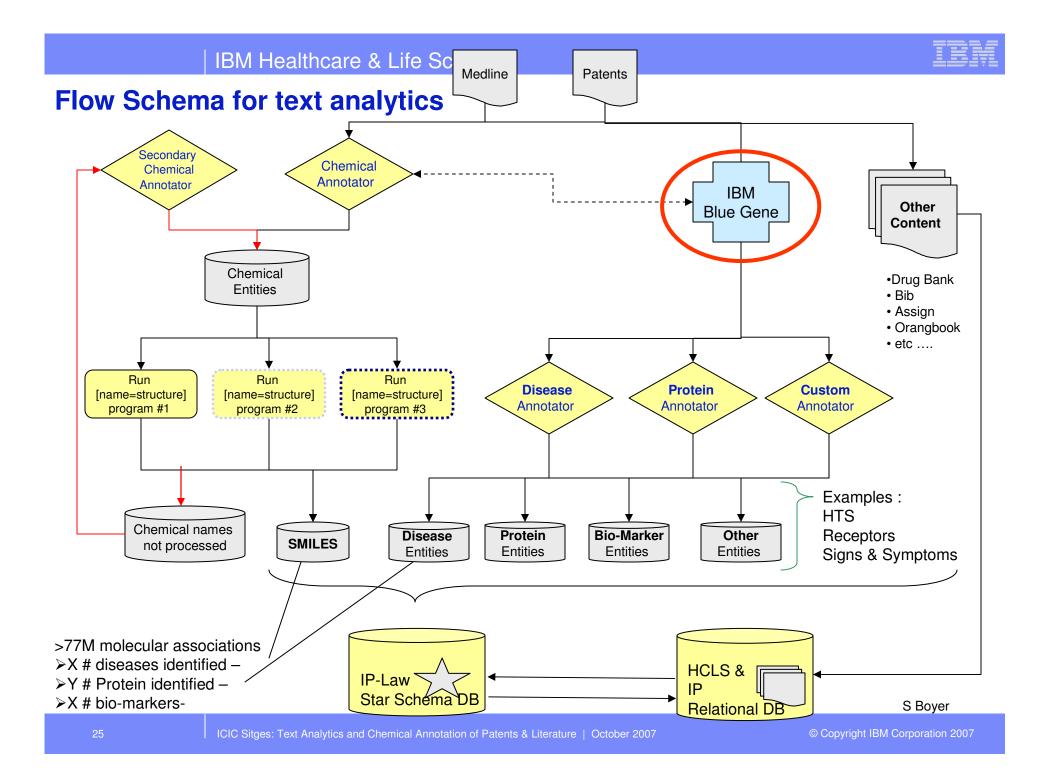
Assignee: Novartis

Inventor: Altmann, Eva; Reinach, Switzerland



Build large chemical data bases - & selectively monitor literature for chemical entities

S Boyer



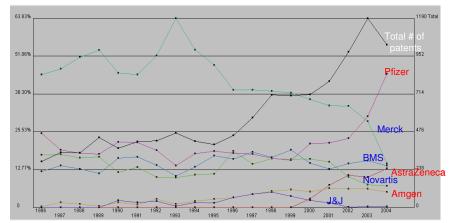


## **Example: Identify Emerging IP/Patent Patterns (using UIM)**

- Looked at 18 years of US patent data to show how pharmaceutical market positioning
- Pfizer, AZ, and Amgen are increasing their patent activity
- Comparing most relevant words/terms in patent data emerging patterns identified
- Genentech is staking out white space in the areas not covered by the other major pharmaceuticals.

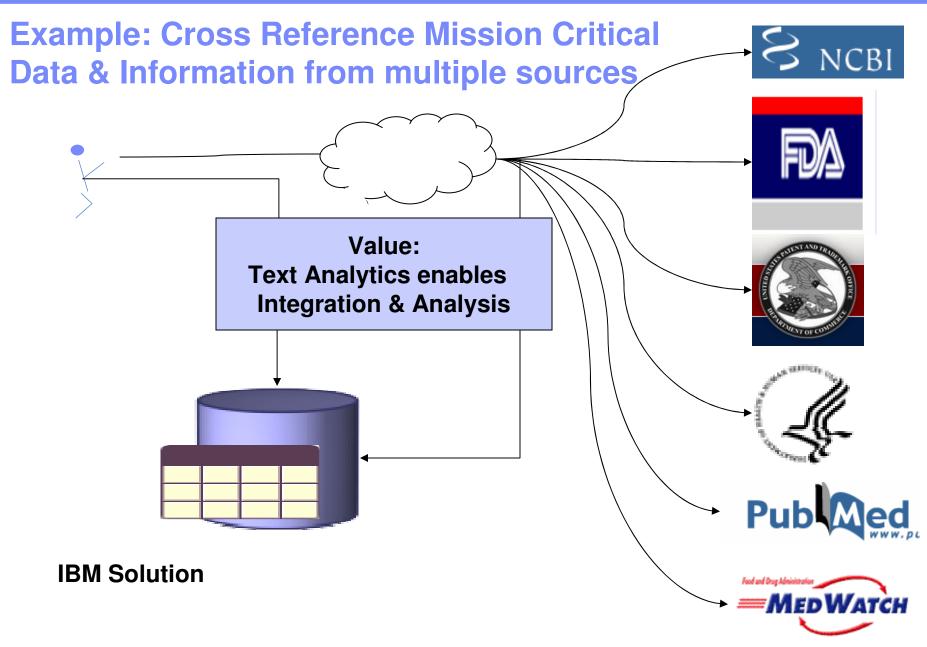
### • Value:

- Identify potential new market areas
- Competitive intelligence
- Make Go / No Go Decisions



	Very Hig	h Affinity =	Moderate Affi	nity= Li	ow Affinity =	No Affinity	=		
Term	Count	PFIZER I.	ASTRAZ	AMOEN	GENENT	Novartis+	MERCK	RISTOL	ohnson
alzheimer	321	204 (0.0)	7 (1.0)	18 (6.75384	1 (1.0)	2 (1.0)	36 (1.0)	43 (0.27108.	.0 (1.0)
anti-inflam	367	115 (1.3328.	11 (0.55007.	.10 (0.88916	5 (1.0)	0 (0.87330	130 (0.4197.	41 (1.0)	5 (0.521284.
arthritis	577	232 (1.3305.	.29 (8.89878.	.36 (2.71071	57 (1.0)	36 (1.0)	128 (1.0)	59 (1.0)	0 (1.0)
asthma	552	213 (1.4128	26 (8 12254	17 (0.48193	52 (1.0)	28 (1.0)	164 (1.0)	52 (1.0)	0 (1.0)
breast	1384	62 (1.0)	4 (1.0)	3 (1.0)	1238 (0.0)	3 (1.0)	41 (1.0)	23 (1.0)	0 (1.0)
cancer	785	253 (6.0049.	19 (1.0)	41 (2.63881	115 (1.0)	30 (1.0)	233 (1.0)	94 (0.64142	0 (1.0)
cardiovasc	416	156 (2.8534	15 (0.15002	1 (1.0)	23 (1.0)	5 (1.0)	140 (0.9309	76 (1.01206	.0 (1.0)
cartilage	474	8 (1.0)	0 (1.0)	1 (1.0)	449 (0:0)	(1.0)	7 (1.0)	5 (1.0)	0 (1.0)
cervical	985	5 (1.0)	0 (1.0)	0 (1.0)	979 (0.0)	(1.0)	0 (1.0)	1 (1.0)	0 (1.0)
coding_se	1782	11 (1.0)	1 (1.0)	12(1.0)	1740 (0.0)	0 (1.0)	7 (1.0)	2 (1.0)	0 (1.0)
colon	1307	48 (1.0)	2 (1.0)	7 (1.0)	1215 (0.0)	(1.0)	7 (1.0)	20 (1.0)	0 (1.0)
delivery	268	37 (1.0)	13 (0.01380.	25 (3.62070	14 (1.0)	26 (1.0)	108 (0.0167.	.34 (0.52423.	.11 (4.89102.
dna	2473	47 (1.0)	2 (1.0)	187 (0.0)	1907 (0.0)	7 (1.0)	196 (1.0)	57 (1.0)	0 (1.0)
gastrointes	397	177 (2.7908.	.33 (8.39105.	9 (1.0)	7 (1.0)	5 (1.0)	116 (1.0)	40 (1.0)	0 (1.0)
gene	1169	72 (1.0)	16 (1.0)	75 (3.03985	745 (0.0)	13 (1.0)	129 (1.0)	48 (1.0)	1 (1.0)
growth_hor	312	67 (0.26885.	4 (1.0)	8 (1.0)	113 (4.1137	2 (1.0)	112 (0.3564.	6 (1.0)	0 (1.0)
heart	461	207 (0.0)	2 (1.0)	3 (1.0)	37 (1.0)	32 (1.0)	132 (1.0)	44 (1.0)	4 (1.0)
immune	352	109 (8.5430.	1 (1.0)	18 (0.00292	82 (5.85665	7 (1.0)	85 (1.0)	50 (0.10208.	.0 (1.0)
kinase	245	48 (0.82418	10 (0 11448	26 (2.54970	44 (0 55085	10 (1 0)	44 (1.0)	41 (0.00900	2 (1.0)
liver	1329	47 (1.0)	2 (1.0)	12(1.0)	1204 (0.0)	(1.0)	41 (1.0)	15 (1.0)	0 (1.0)
tuna	1466	76 (1.0)	5 (1.0)	13(1.0)	1268 (0.05	7 (1.0)	68 (1.0)	19 (1.0)	0 (1.0)
pain	529	268 (0.0)	51 (2.14510.	21 (0.04642	2 (1.0)	27 (1.0)	138 (1.0)	19 (1.0)	3 (1.0)
rheumatoid	425	154 (6.2229.	.25 (7.12472.		53 (1.0)	22 (1.0)	99 (1.0)	42 (1.0)	0 (1.0)
stroke	405	216 /0 m	19 (0.00463	16 (0.08691	12 (1.0)	12(1.0)	82 (1.0)	48 (0.80072	0.01.05
tumor	1908	98 (1.0)	10 (1.0)	42 (1.0)	1333 (0.0)	12 (1.0)	183 (1.0)	200 (1.0)	0 (1.0)
vaccine	178	41 (0.17239.	3 (1.0)	7 (0.265987	17 (1.0)	3 (1.0)	107 (3.5736.	.0 (1.0)	0 (1.0)
vascular	350	118 (1.6240.	9 (0.944719.	2 (1.0)	91 (1.56106	7 (1.0)	82 (1.0)	28 (1.0)	3 (1.0)
virus	317	68 (0.26957.	0 (1.0)	10 (0.53945	27 (1.0)	33 (1.0)	137 (2.0156.	42 (0.31203.	.0 (1.0)
Total	17701	3370	445	462	2930	2362	5922	2028	182





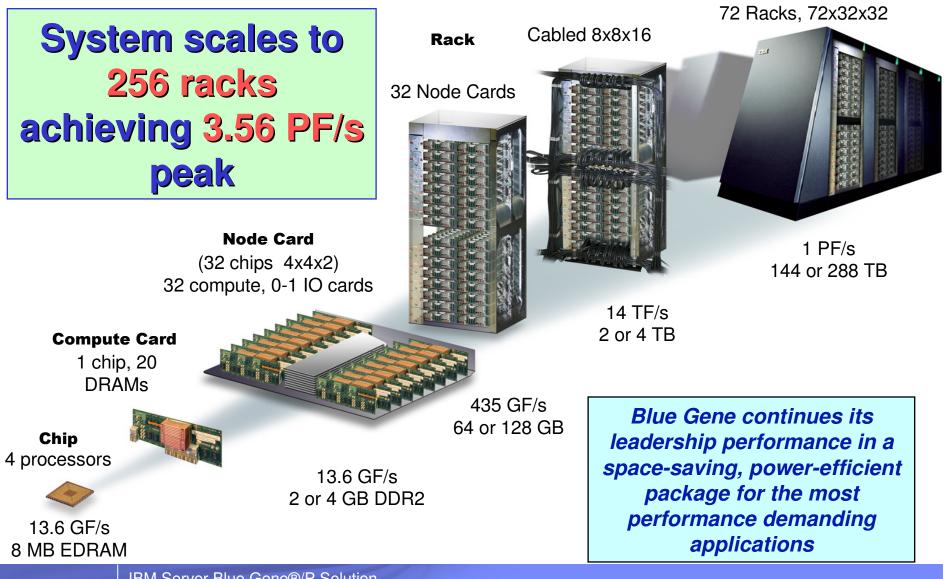


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- *in silico* Drug Discovery



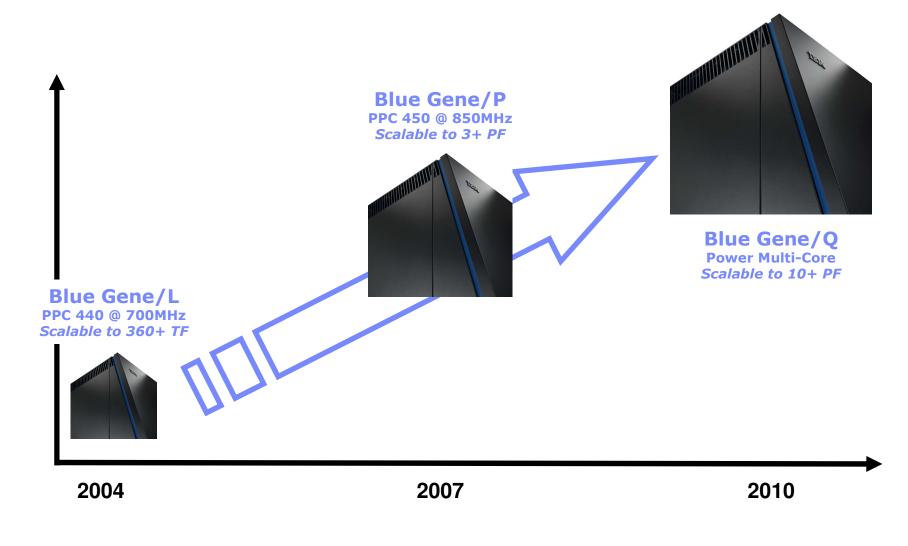
### **Blue Gene – Ultrascalable multi-PetaFlop Performance** System



IBM Server Blue Gene®/P Solution

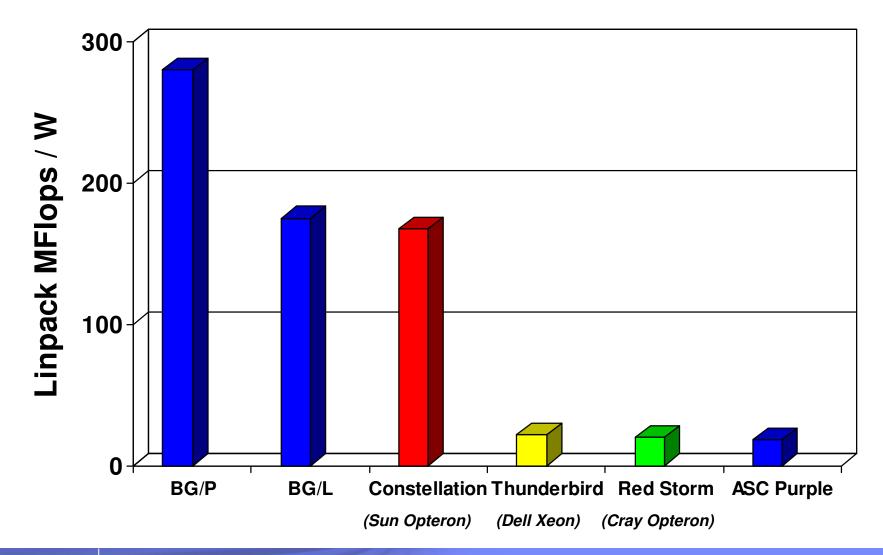
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## **Blue Gene technology roadmap**



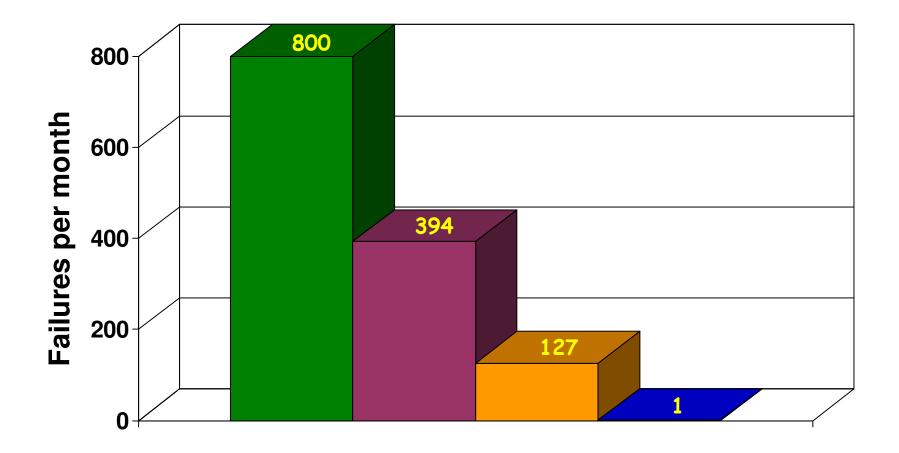


## Blue Gene/P's power efficiency is even better





## **Relative reliability @ 100 TFlops**



### 🗖 Itanium2 🔳 x86 📃 Power5 🗖 BG/L

Results of survey conducted by Argonne National Lab on 10 clusters ranging from 1.2 to 365 TFlops (peak); excluding storage subsystem, management nodes, SAN network equipment, software outages

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## **BG/L** @ LLNL



- 4 in TOP20
- 22 in TOP100
- 34 in TOP400

www.top500.org (6/07)

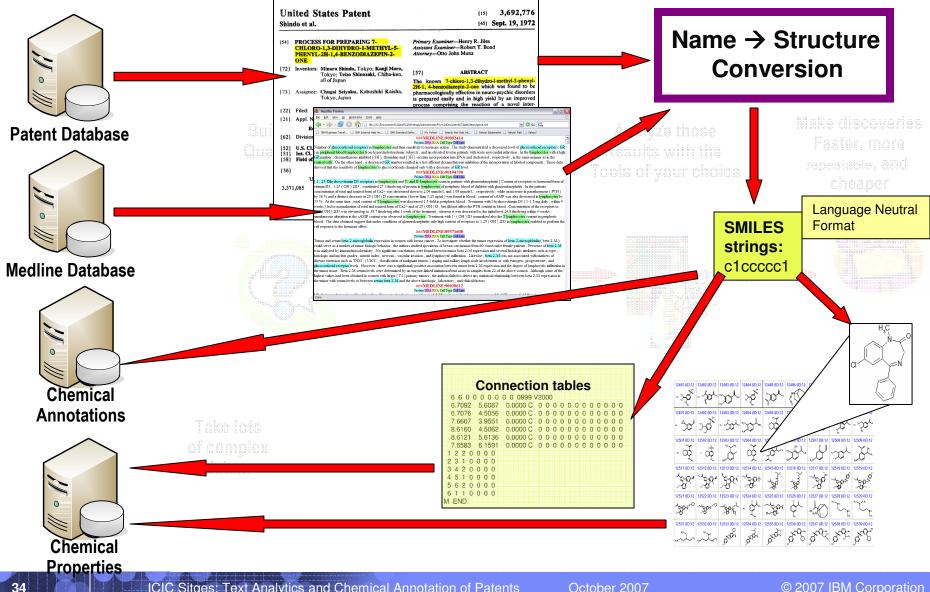
### **Blue Gene's Award-Winning Performance**

June 6, 2006 WASHINGTON, D.C. — The Department of Energy's National Nuclear Security Administration (NNSA) and IBM teamed up to announce that a new mark was achieved on the world's fastest supercomputer named Blue Gene/L (BG/L). This world record for a scientific application was set by achieving a sustained performance of **207.3 trillion floating-point operations per second (teraFLOPS) on the "Qbox" computer code** for conducting materials science simulations critical to national security.

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Blue Gene Development

# The reference implementation... (annotation process)

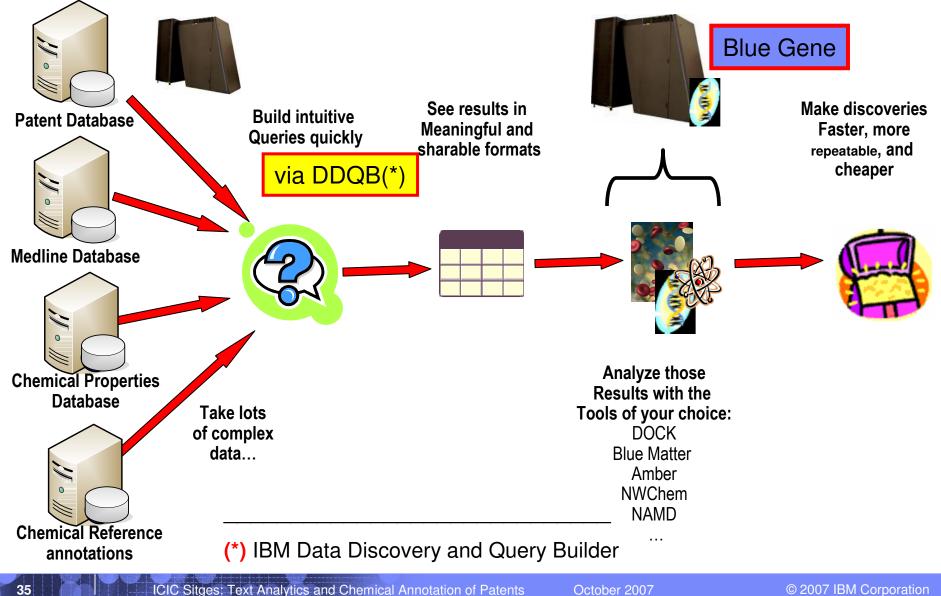


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#### Blue Gene Development

& Literature

# Towards in silico Drug Discovery... (UIM + Simulation)





## **Acknowledgments (IBM)**

• Steve Boyer, Almaden, CA

- James Rhodes, Almaden, CA
- David Martin, Almaden, CA
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- Brad Wade, Almaden, CA
- David Zirl, Almaden, CA
- Jim Cooper, Yorktown, NY
- Anni Coden, Yorktown, NY
- Richard Dettinger, Rochester, MN
- Amanda Peters, Rochester, MN
- Carl Obert, Rochester, MN

## Note:

INFOCHEM is providing similar capabilities based on both Public Domain and Infochem CONTENT!

