

KEGG: Kyoto Encyclopedia of Genes and Genomes

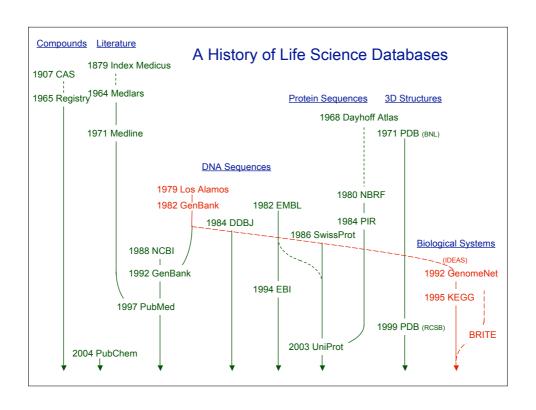
Minoru Kanehisa

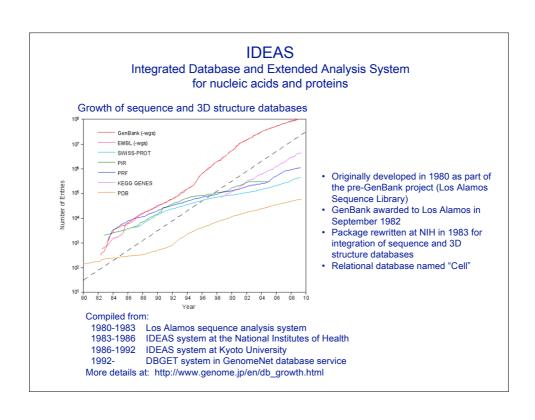
Bioinformatics Center, Institute for Chemical Research,
Kyoto University
Human Genome Center, Institute of Medical Science,
University of Tokyo

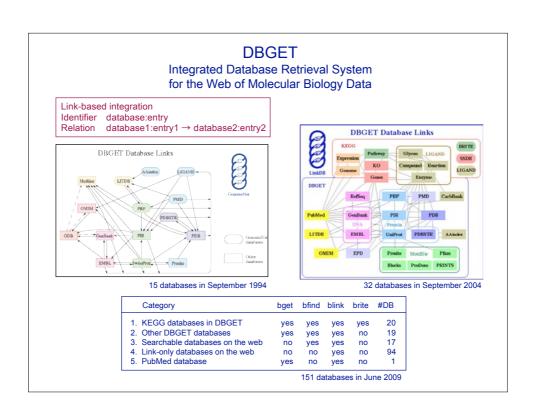
June 2009

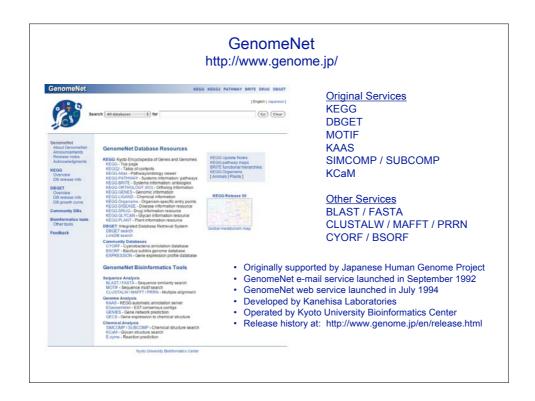
Background

- Integration of life science databases
- Reconstruction of biological systems











	NCBI	KEGG		
Database	Information infrastructure	Computer representation of biological systems		
Content	Comprehensive repositories	Building blocks and wiring-diagrams		
Integration	Linking	Reconstruction		
Implementation	Entrez	KEGG		
Main use	Individual data retrieval	Pathway mapping and Brite mapping		

Overview of KEGG

- From building blocks to biological systems
- Integration of genomics and chemistry

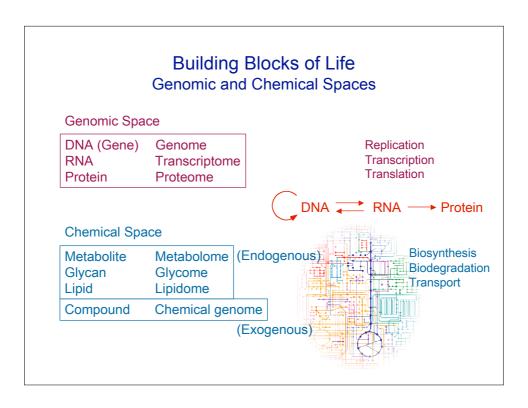
Goal

An ultimate goal of bioinformatics is a complete computer representation of the cell and the organism, which will enable computational prediction of higher-level complexity, such as

- molecular interaction networks involving various cellular processes and
- phenotypes (morphological, physiological, and behavioral aspects) of entire organisms

from genomic information.

Kanehisa, M. and Bork, P.; Bioinformatics in the post-sequence era. Nat. Genet. 33, 305-310 (2003).



Genomic and Chemical Spaces

Genomic Space

- Contains genetic building blocks of life, i.e., DNA, RNA, and proteins
- Represents all possible sequences
- · Uncovered by genomics, transcriptomics, and proteomics

Chemical Space

- Contains chemical building blocks of life, e.g., small molecules, glycans, and lipids
- · Represents all possible chemical structures
- Uncovered by metabolomics, glycomics, lipidomics, etc. for endogenous molecules
- · Uncovered by chemical genomics for exogenous molecules

Integration of Genomic and Chemical Spaces

Genomic space

Chemical space

Repertoire of genes and proteins (genomics, proteomics, etc.)

Repertoire of endogenous molecules (metabolomics, glycomics, etc.)

Glycosyltransferase genes <

Glycan structures

Lipids, secondary metabolites, etc.

Repertoire of genes in the biosphere (metagenomics)

Repertoire of exogenous molecules (chemical genomics)

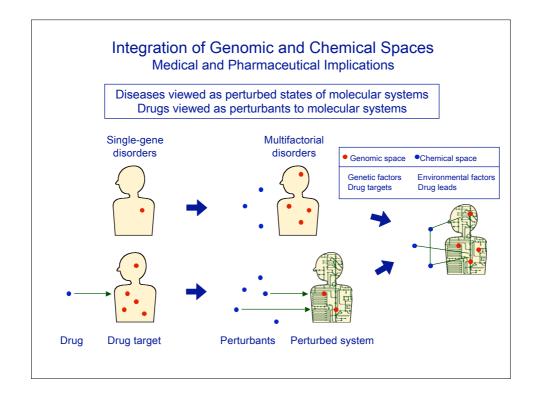
Genetic factors of diseases

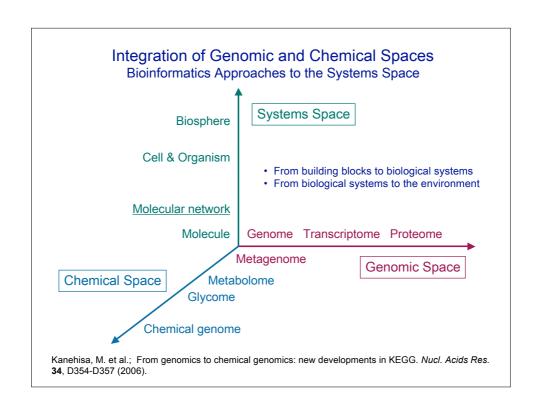
Environmental factors of diseases

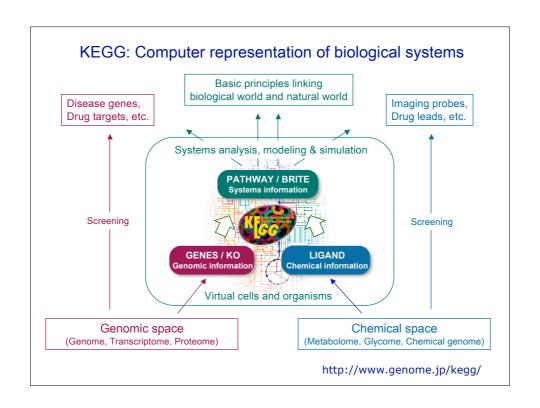
Drug targets 🚐

Drug leads

Human ⟨⇒> Vector ⟨⇒> Pathogen

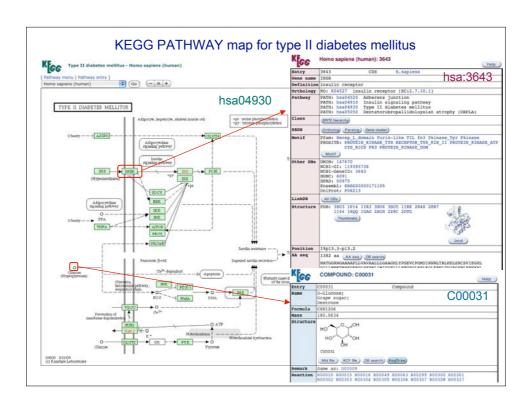


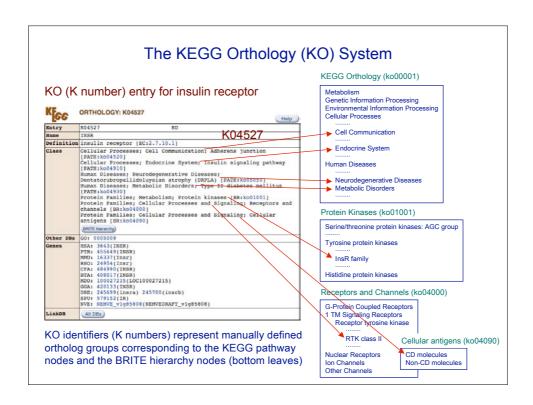


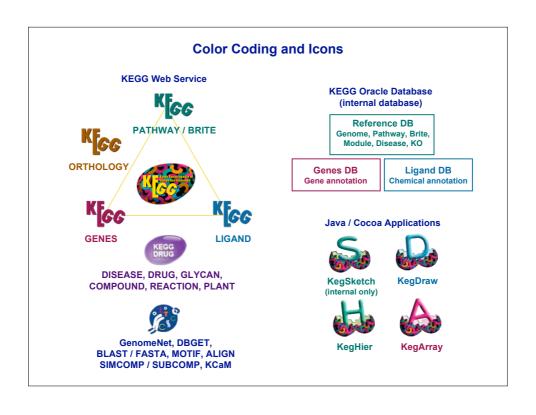


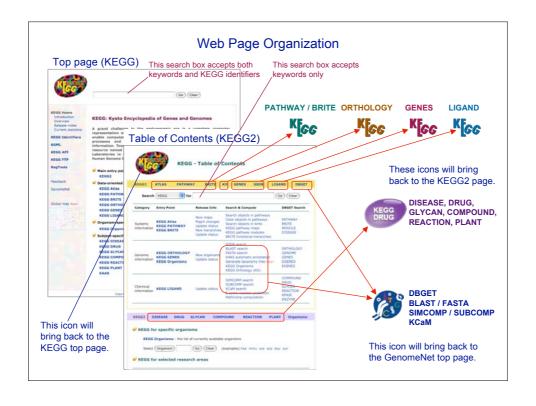
KEGG Databases			
Database	Objects	Data size	
KEGG PATHWAY	Pathway maps	330 (95,271)	
KEGG BRITE	Functional hierarchies and ontologies	61 (21,684)	
KEGG MODULE	Pathway modules and complexes	692	
KEGG DISEASE	Diseases	104	
KEGG ORTHOLOGY	KEGG Orthology (KO) groups	12,178	
KEGG GENES	Genes in high-quality genomes	4,553,978	
KEGG DGENES	Genes in draft genomes	151,662	
KEGG EGENES	Genes as EST contigs	2,919,245	
KEGG GENOME	Organisms	1,008 + 67	
KEGG SSDB	Sequence similarities and best hit relations	_	
KEGG COMPOUND	Metabolites and other small molecules	15,477	
KEGG DRUG	Drugs	8,912	
KEGG GLYCAN	Glycans	10,969	
KEGG ENZYME	Enzyme nomenclature	5,061	
KEGG REACTION	Biochemical reactions	7,915	
KEGG RPAIR	Reactant pair chemical transformations	11,356	
KEGG DPAIR	Drug pair chemical transformations	496	
	4	As of June 12, 2009	

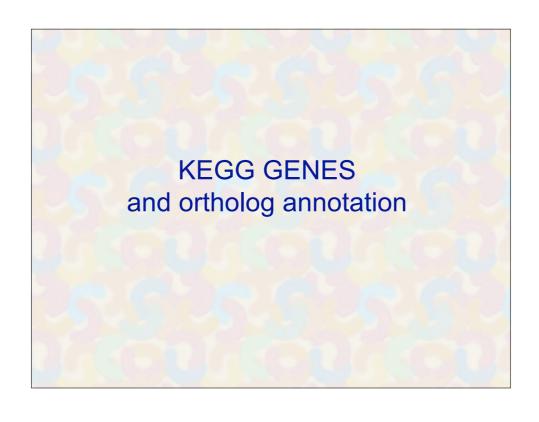
		G Object Identi			
git numl	ber				
	Content	Database	Example		
	Ortholog group	KEGG ORTHOLOGY	K04527 for insulin receptor		
	Chemical compound	KEGG COMPOUND	C00031 for D-glucose		
	Drug	KEGG DRUG	D01441 for Gleevec		
	Glycan	KEGG GLYCAN	G00109 for GM2		
		KEGG REACTION	R00259 for EC 2.3.1.1		
	· ·		RP04458 for C00025_C00624		
٠ ٠,			hsa04930 for type II diabetes		
org)	•		ko01003 for glycosyltransferases		
	•		M00008 for Entner-Doudoroff pathway		
	Human disease	KEGG DISEASE	H00004 for Chronic myeloid leukemia		
iers					
Conte	ent	Database	Example		
org KEGG organism code		KEGG GENOME	hsa for Homo sapiens		
		KEOO OENEO	1 0040 (1) 1		
	•		hsa:3643 for human insulin receptor		
Datat	base entry	Any database	gn:hsa for Homo sapiens up:P06213 for UniProt insulin receptor		
	iers Conte KEGO The	Ortholog group Chemical compound Drug Glycan Reaction Reactant pair n/(org) Pathway map org) Brite hierarchy Pathway module Human disease Content KEGG organism code Three letter code	Ortholog group Chemical compound Drug Glycan Reaction Reactant pair Mr(org) Brite hierarchy Pathway module Human disease Content KEGG organism code Three letter code Perfix d for draft genome Prefix d for draft genome Prefix e for EST contig Gene entry KEGG ORTHOLOGY KEGG ORTHOLOGY KEGG DRUG KEGG REACTION KEGG REACTION KEGG REACTION KEGG REACTION KEGG PATHWAY KEGG BRITE KEGG MODULE KEGG MODULE KEGG DISEASE KEGG Organism code KEGG organism code KEGG organism code Frefix d for draft genome Frefix e for EST contig Gene entry KEGG GENES		

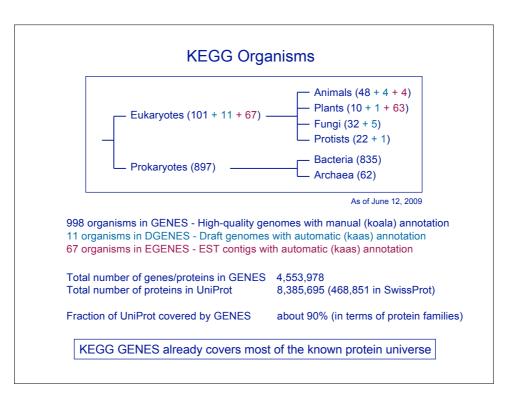












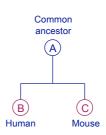
Orthologs and Paralogs

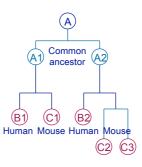
- Sequence similarity between two genes (or proteins) may imply ortholog or paralog relationship.
- Orthologs are genes in different species evolved from a common ancestral gene by speciation and tend to have the same function.
- Paralogs are generated by gene duplication within a species and often represent diversified functions in a broader functional category.
- Identification of ortholog relationships is the basis for genome annotation (assigning gene functions), and it requires distinction from paralog relationships.

Orthologs: B-C, B1-C1 Co-orthologs: B2-(C2,C3)

Inparalogs: C2–C3

Outparalogs: B1-B2, B1-(C2,C3), B2-C1



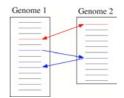


Computational Identification of Orthologs

Between two species

Bi-directional best hit (BBH) (Reciprocal best hit)





Among multiple species

1. COG

Triangle of BBH relationships among three species



Superposition of ABC and ABD

2. KEGG OC

p-Quasi clique among multiple species



Clique (completely connected subgraph)

p-Quasi clique is an almost complete subgraph, where the degree of completeness is represented by p.

Genome annotation in KEGG: KO (K number) assignment

KEGG GENES

- Gene information for completely sequenced genomes
- Computationally generated from RefSeq and other public resources
- Manual annotation with KOALA and GFIT tools
- · Automatic annotation by KAAS for draft genomes

KEGG ORTHOLOGY (KO)

- Manually defined ortholog groups that correspond to KEGG pathway nodes and BRITE hierarchy nodes
- · Identified by K numbers

KEGG SSDB

- · Sequence similarity scores and best hit relations
- Computationally generated from GENES by pairwise genome comparisons using SSEARCH

KEGG OC

- Ortholog clusters
- · Computationally generated from SSDB by a quasi-clique finding algorithm

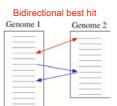
Genes with KO 1,504,505 KO assignment 33% As of June 12, 2009

4,553,977

KEGG GENES in Oracle

Genomes

Genes

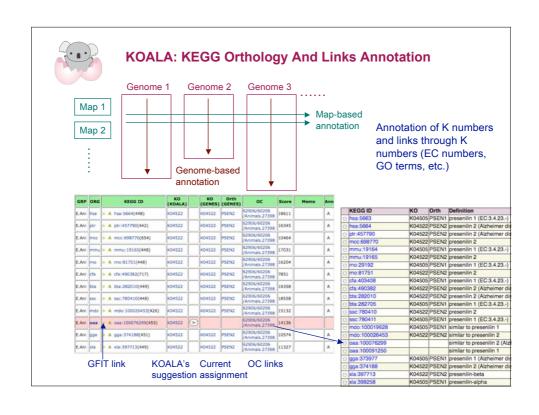


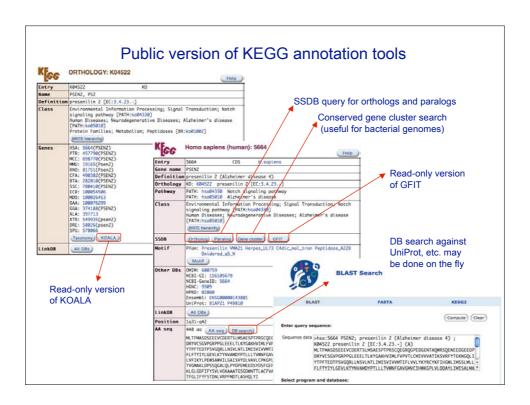
GFIT: Gene Function Identification Tool [SP.SHI, MOUSE] Shih; sonic heagehog , managharia ; Sp.SHI, CHICK] Shih; sonic hedgehog homolog (Orosophia); sc.SHI, sonic hedgehog homolog (Orosophia); sc.SHI, sonic hedgehog of BBH: red for hedgehog A mmu:20423(437) 434 66.8 1892 (244) 7 462 65.6 1890 (259) 7 462 64.7 1880 (252) 5 К06224 НН К06224 НН A mo:29499(437) Color coding of BBH: red for Coccasion and C A mcc:716553(462) more overlap; yellow otherwise K06224 HH A hsa:6469(462) isonic hedgehog hedgehog homolog (prosphila) kedgehog homolog (prosphila) kedgehog homolog (prosphila) kedgela hedgehog homolog (prosphila) kedgela hedgehog homolog (prosphila) kedgela hedgehog homolog (prosphila) kedgela hedgehog (prosphila) kedgela hedgehog homolog (prosphila) kedgehog homolog (prosphila) kedgehog homolog (prosphila) kedgehog homolog (prosphila) kedgehog homolog kedgehog homolog (prosphila) kedgehog homolog ked 461 64.4 1878 (721) 6 A cfa:608860(461) A mdo:100016531(477) 477 62.7 1870 (194) 7 A xiii;398047(446) 438 63.5 1824 (178) 7 A pdr:743371(383) 418 64.4 1671 (46) 8 A ptr:743371(383) 418 64.4 1671 (46) 8 > A xtr:100036603(396) 399 54.9 1433 (1330) 3 > A spu:373331(411) 418 48.3 1224 (1108) 17 edgehog SP:A4V396_DROME] hh; hedgehog (EC:3.4.22.-); A dme:Dmel_CG4637(471) 412 46.4 1182 (1079) 2 K06224 HH x06224 hedgehog [SS-Q23MA_D805075] GALB321 gene product from transcript GALB321-AA, x060224 hedgehog SHH; sonic hedgehog homolog (Drospohla) x06024 hedgehog [SS-A7874, AENVIZ 1 NEMVEDAAFT_vig241466; predicted protein; x06224 hedgehog [SS-Q31535_CAEE] qua-1; QUAhog (hedgehog eleited) 408 46.6 1167 (1056) K06224 HH NEMVE_v1g241466(401) 360 45.3 1047 (287) 13 193 30.6 279 (21) 14

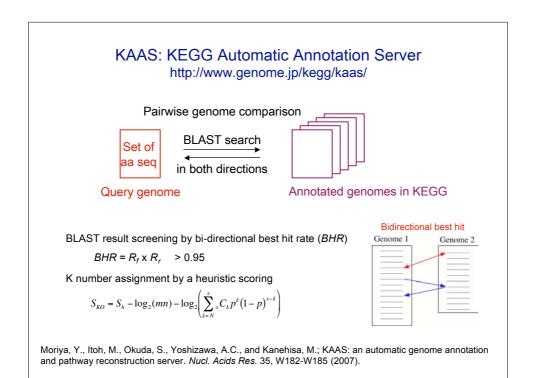
KOALA processes this table and automatically assigns K numbers when considered safe to do so.

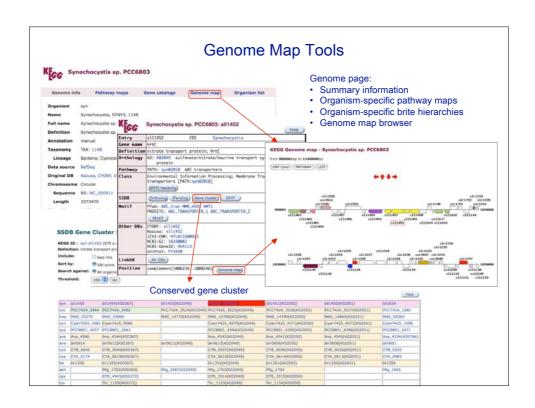
 GFIT table is a summary of best hit relations for individual genes in a genome generated from the KEGG SSDB database. It has been used to manually assign K numbers (KO identifiers).

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KEGG PATHWAY and BRITE: Reference knowledge base

Data objects for computer representation of molecular systems

Element

gene, protein, small molecule, etc.

Pair (binary relation)

protein-protein interaction, drug-target relationship, etc.

Graph (wiring diagram)

pathway, complex, etc.

Simple list (membership)

pathway, complex, etc.

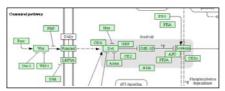
Hierarchical list

hierarchical classification, ontology, etc.

Knowledge Representation of Systemic Functions

Graph (pathway map)

KEGG PATHWAY



Simple list (membership)

KEGG MODULE

KEGG DISEASE

List of molecules that constitute a pathway, a complex, etc.

List of disease genes, environmental factors, markers, drugs, etc.

Hierarchical list (ontology) **KEGG BRITE**

- ► Rhodopsin family: other receptors
- ► Secretin family

Data source: textbooks, review articles, other publications, specialists' websites

KEGG PATHWAY Database

Collection of KEGG pathway maps

Global Map

Metabolism Map (1)

Metabolism

Carbohydrate Metabolism (16)

Energy Metabolism (8)

Lipid Metabolism (16) Nucleotide Metabolism (2)

Amino Acid Metabolism (16)

Metabolism of Other Amino Acids (9)

Glycan Biosynthesis and Metabolism (15)

Biosynthesis of Polyketides and Nonribosomal Peptides (9)

Metabolism of Cofactors and Vitamins (12)

Biosynthesis of Secondary Metabolites (27) Xenobiotics Biodegradation and Metabolism (26)

Overview (9)

Genetic Information Processing

Transcription (2)

Translation (2)

Folding, Sorting and Degradation (8)

Replication and Repair (6)

Environmental Information Processing

Membrane Transport (2)

Signal Transduction (14)

Signaling Molecules and Interaction (4)

Cellular Processes

Cell Motility (3)
Cell Growth and Death (4)

Cell Communication (5)

Circulatory System (2)

Endocrine System (7)

Immune System (9) Nervous System (2)

Sensory System (2)

Development (2)

Behavior (3)

Human Diseases

Cancers (15)

Immune Disorders (6)

Neurodegenerative Diseases (4)

Metabolic Disorders (3)

Infectious Diseases (4)

Drug Development

Chronology: Antibiotics (8)

Chronology: Antineoplastics (5) Chronology: Nervous System Agents (9)

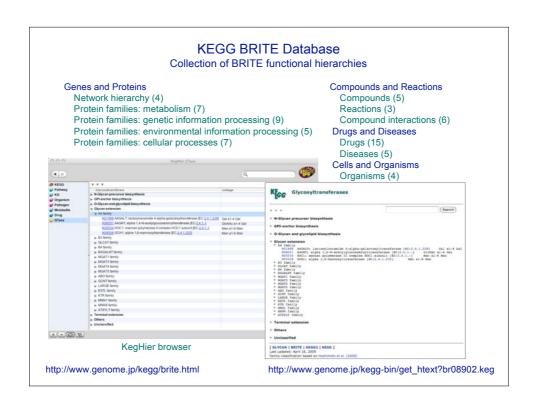
Chronology: Other Drugs (12)

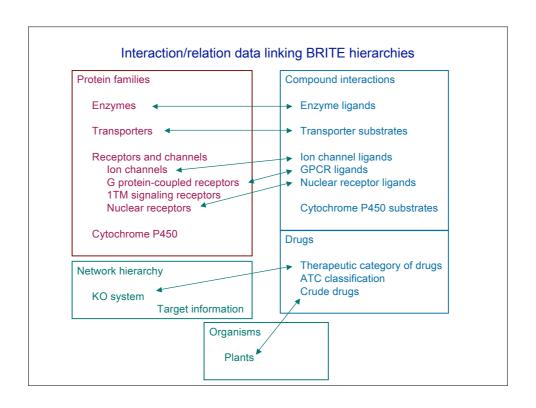
Target Based Structure Classification (12)

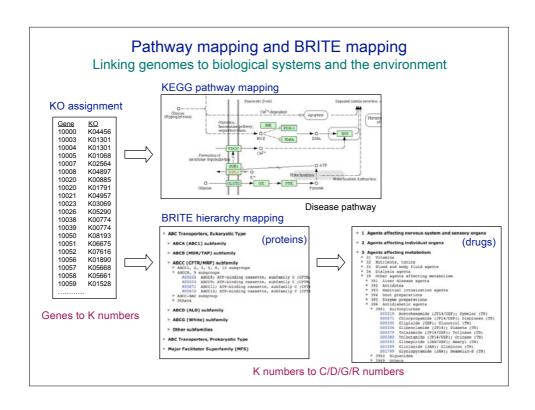
Skeleton Based Structure Classification (8)

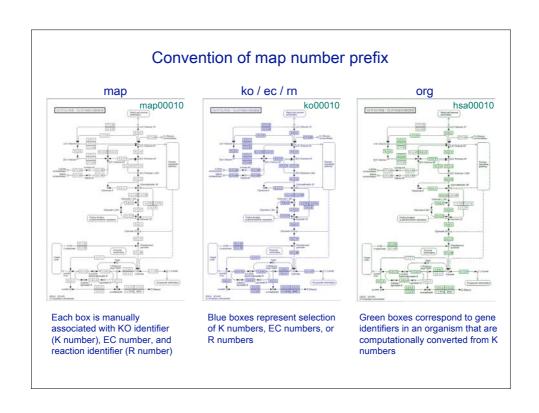
http://www.genome.jp/kegg/pathway.html

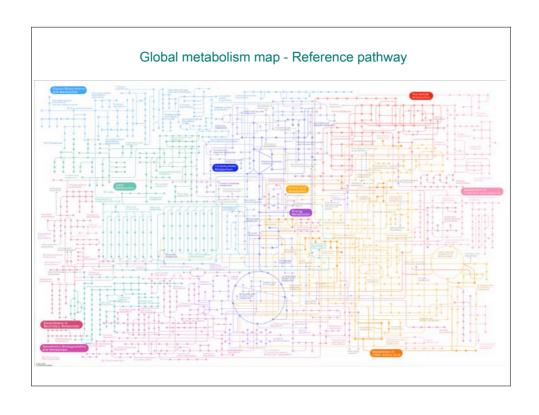
http://www.genome.jp/kegg-bin/get htext?br08901.keg

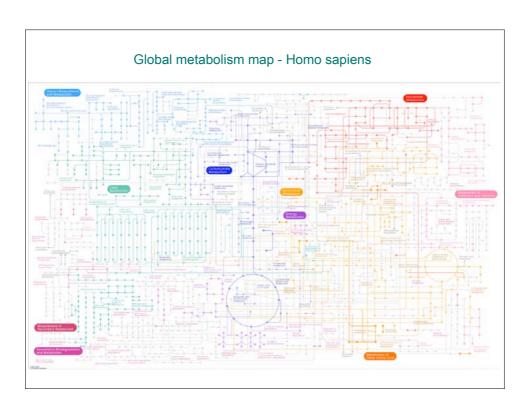


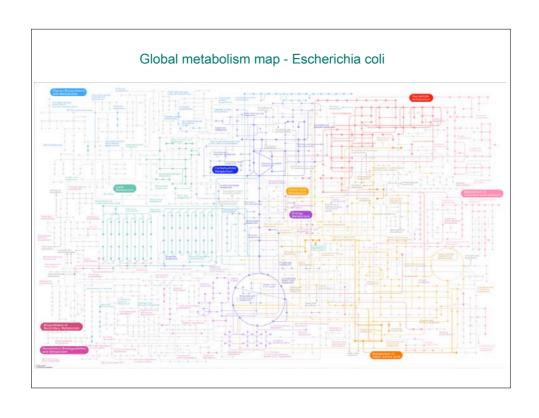


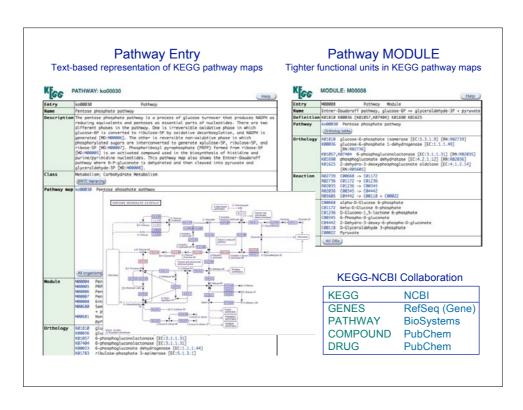








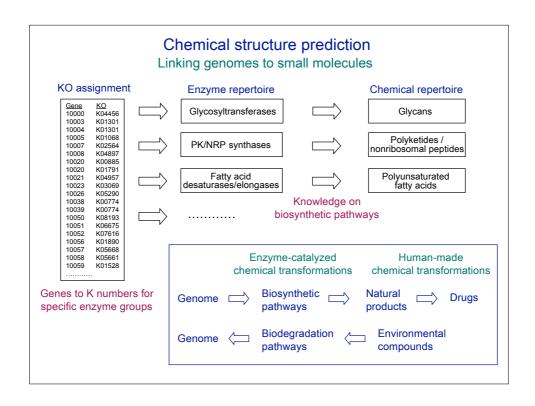




KEGG LIGAND and chemical bioinformatics

Bioinformatics for Small Molecules

- 1. Chemical structure similarity
 - · Comparison of bit-represented vectors (fingerprints)
 - · Comparison of graph objects
- 2. Chemical building blocks
 - · Conserved substructures as building blocks of compounds/drugs
 - · Variable substructures as building blocks of reactivity/efficacy
- 3. Network modules
 - Genomic module, e.g. operon
 - · Chemical module, e.g. overall reaction
- 4. Predictive methods
 - · Interaction prediction, e.g. toxicity
 - · Reaction prediction, e.g. metabolic fate
- 5. Examples
 - Plant/fungi/bacterial genomes and secondary metabolites via biosynthetic pathways
 - Bacterial genomes and environmental compounds via biodegradation pathways



Linking genomes to chemical structures

Glycans

- Hashimoto, K., Goto, S., Kawano, S., Aoki-Kinoshita, K.F., Ueda, N., Hamajima, M., Kawasaki, T., and Kanehisa, M.; KEGG as a glycome informatics resource. *Glycobiology* 16, 63R-70R (2006).
- Kawano, S., Hashimoto, K., Miyama, T., Goto, S., and Kanehisa, M.; Prediction of glycan structures from gene expression data based on glycosyltransferase reactions. *Bioinformatics* 21, 3976-3982 (2005)
- Hashimoto, K., Tokimatsu, T., Kawano, S., Yoshizawa, A.C., Okuda, S., Goto, S., and Kanehisa, M.;
 Comprehensive analysis of glycosyltransferases in eukaryotic genomes for structural and functional characterization of glycans. *Carbohydrate Res.* 344, 881-887 (2009).

Polyketides & nonribosomal peptides

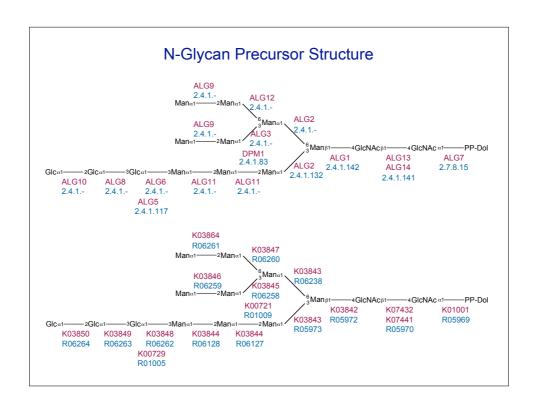
 Minowa, Y., Araki, M., and Kanehisa, M.; Comprehensive analysis of distinctive polyketide and nonribosomal peptide structural motifs encoded in microbial genomes. *J. Mol. Biol.* 368, 1500-1517 (2007).

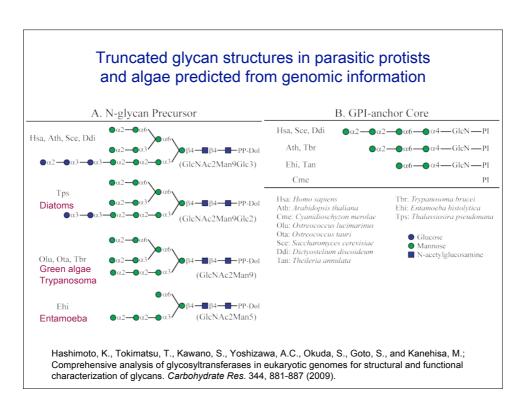
Polyunsaturated fatty acids

Hashimoto, K., Yoshizawa, A.C., Okuda, S., Kuma, K., Goto, S., and Kanehisa, M.; The repertoire
of desaturases and elongases reveals fatty acid variations in 56 eukaryotic genomes. *J. Lipid Res.*49, 183-191 (2008).

Environmental compounds

 Oh, M., Yamada, T., Hattori, M., Goto, S., and Kanehisa, M.; Systematic analysis of enzymecatalyzed reaction patterns and prediction of microbial biodegradation pathways. *J. Chem. Info. Model.* 47, 1702-1712 (2007).

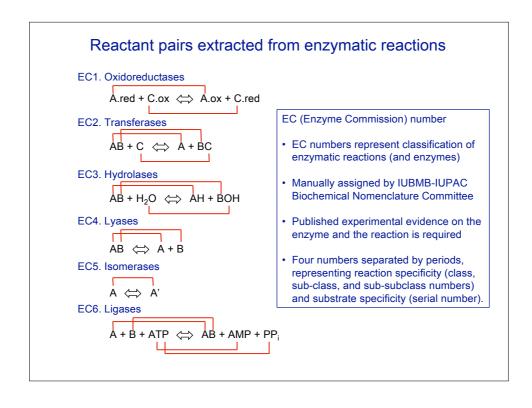


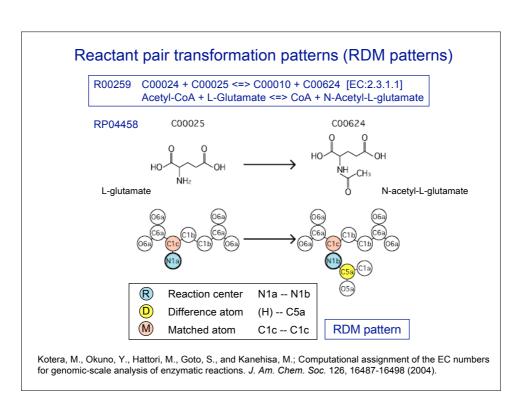


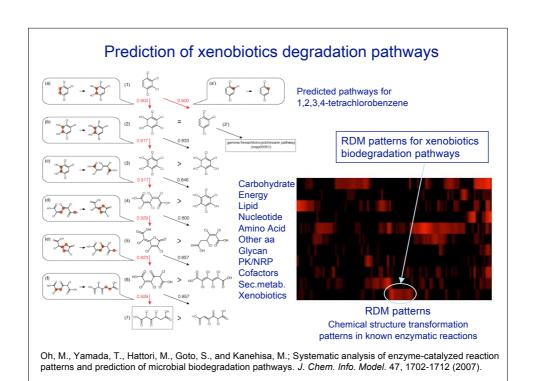
3-Hydroxypropanoate 3-Oxopropanoate 3-Oxopropanoate Common (i) Common (ii)

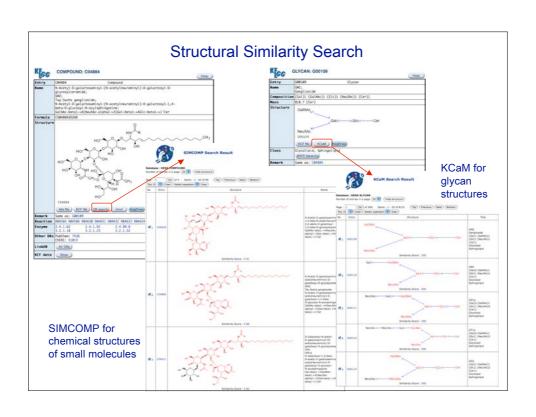
Hattori, M., Okuno, Y., Goto, S., and Kanehisa, M.; Development of a chemical structure comparison method for integrated analysis of chemical and genomic information in the metabolic pathways. *J. Am. Chem. Soc.* 125, 11853-11865 (2003).

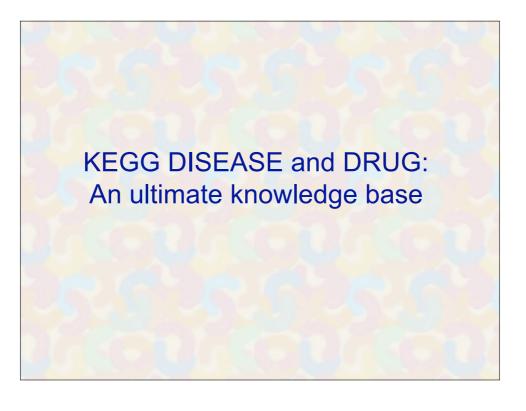
			KEGG	ator	n types			
Carbon 23 ty	/pes		Nitrogen 16	types	8	Oxygen 18 t	ypes	
Alkane	C1a C1b C1c	R-CH3 R-CH2-R R-CH(-R)-R R-C(-R)2-R	Amine	N1a N1b N1c N1d	R-NH2 R-NH-R R-N(-R)2 R-N(-R)3+	Hydroxy	01a 01b 01c	R-OH N-OH P-OH S-OH
Cyclic alkane	C1x C1y C1z	ring-CH2-ring ring-CH(-R)-ring ring-CH(-R)2-ring	Cyclic amine Imine	N1x N1y N2a	ring-NH-ring ring-N(-R)-ring R=N-H	Ether	O2a O2b O2c	R-O-R P-O-R P-O-P
Alkene	C2a C2b C2c	R=CH2 R=CH-R R=C(-R)2	Cyclic imine	N2b N2x N2y	R=N-R ring-N=ring ring-N(-R)+=ring	Охо	O2x O3a O3b	ring-O-ring N=O P=O
Cyclic alkene	C2x C2y	ring-CH=ring ring-C(-R)=ring ring-C(=R)-ring	Cyan Aromatic ring	N3a N4x N4y	R = N ring-NH-ring ring-N(-R)-ring	Aldehyde Ketone	O3c O4a O5a	S=O R-CH=O R-C(=O)-R
Alkyne	C3a C3b	R=CH R=C-R		N5x N5y	ring-N=ring ring-N(-R)+=ring	Carboxylic acid	O5x O6a	ring-C(=O)-ring R-C(=0)-OH
Aldehyde	C4a	R-CH=O	Undefined N	N0		Ester	O7a	R-C(=O)-O-R
Ketone Cyclic ketone Carboxylic acid	C5a C5x C6a	R-C(=O)-R ring-C(=O)-ring R-C(=O)-OH				Undefined O	O7x O0	ring-C(=O)-O-rii
Carboxylic ester	_	R-C(=O)-O-R ring-C(=O)-O-ring	Sulfur 7 types Phosphorus 2 types			es		
Aromatic ring	C8x C8y	ring-CH=ring ring-C(-R)=ring	Thiol Thioether	S1a S2a	R-SH R-S-R	Attatched to other elements P1a P-R Attatched to oxygen P1b P-O		
Undefined C	C0		Disulfide	S2x S3a S3x	ring-S-ring R-S-S-R ring-S-S-ring	Other eleme	nts 2	types
			Sulfate Undefined S	S4a S0	R-SO3	Halogens Others	X	F, Cl, Br, I



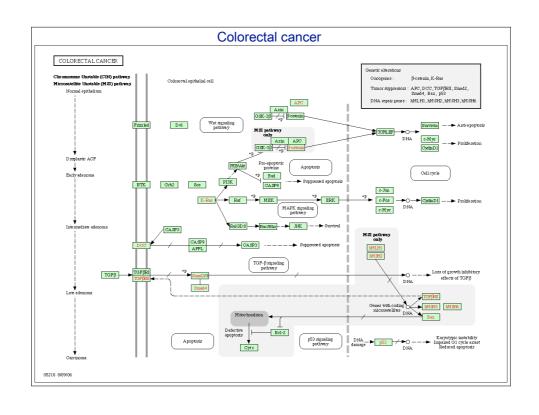


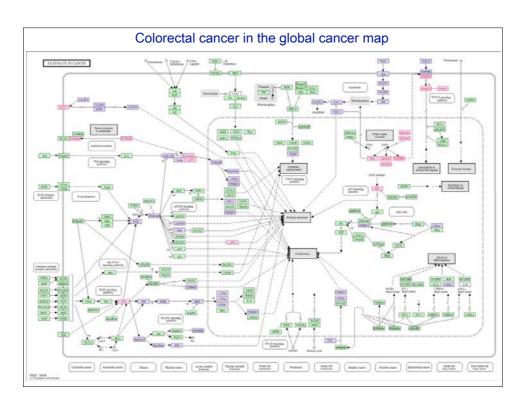


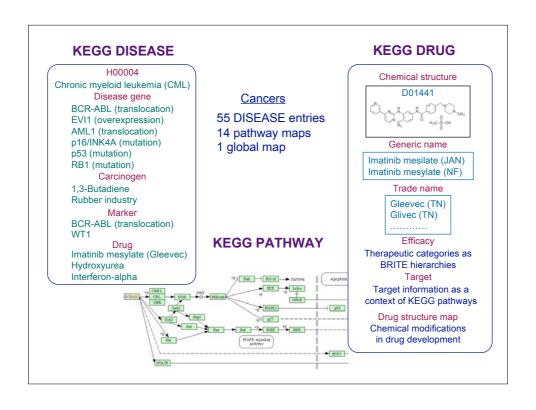


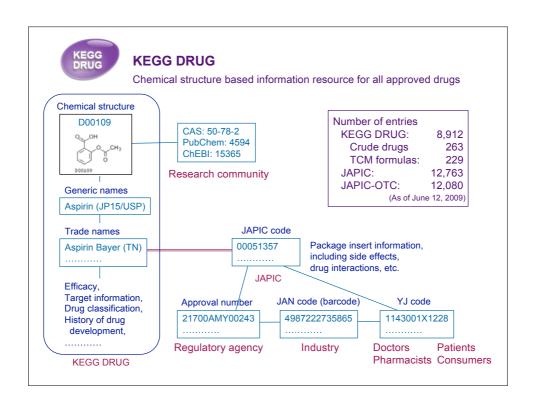


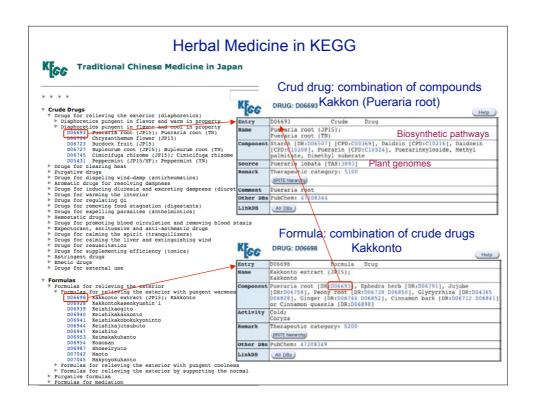
	Disease and Drug Infor	mation in REGG
	KEGG DISEASE	KEGG DRUG
URL	http://www.genome.jp/kegg/disease/	http://www.genome.jp/kegg/drug/
Content	Lists of disease genes and molecular factors	Chemical structure based collection of all approved drugs in Japan, USA, and Europe
Pathway	KEGG pathway maps for human diseases: cancers, immune disorders, neurodegenerative diseases, metabolic disorders, and infectious diseases	KEGG DRUG structure maps for drug development
BRITE hierarchy	Disease classifications including: Pathogens and infectious diseases Human diseases ICD-10 disease classification	Drug classifications including: Therapeutic category of drugs (Japan) USP drug classification (USA) ATC classification (WHO) TCM (Traditional Chinese Medicine) drugs in Japan Crude drugs

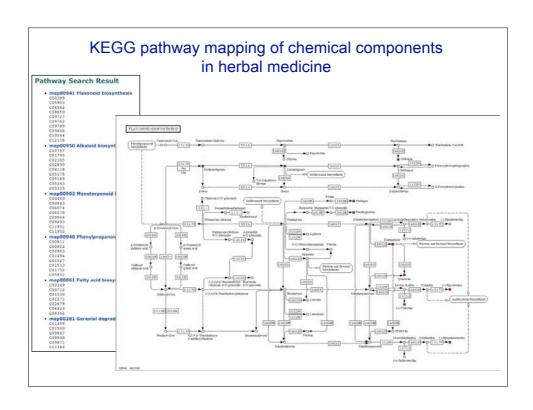


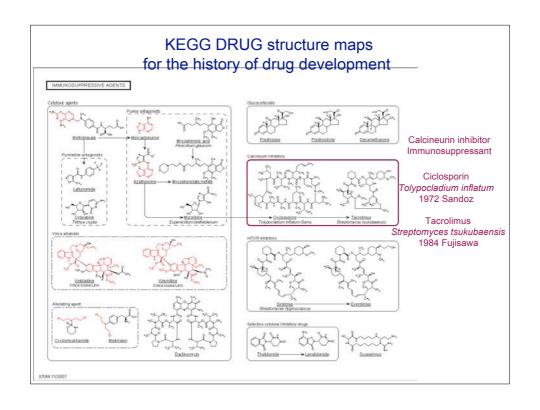


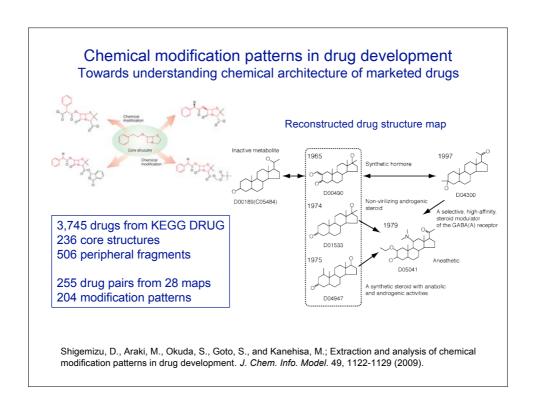




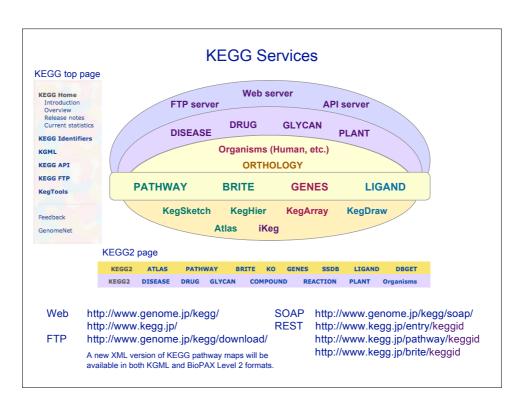


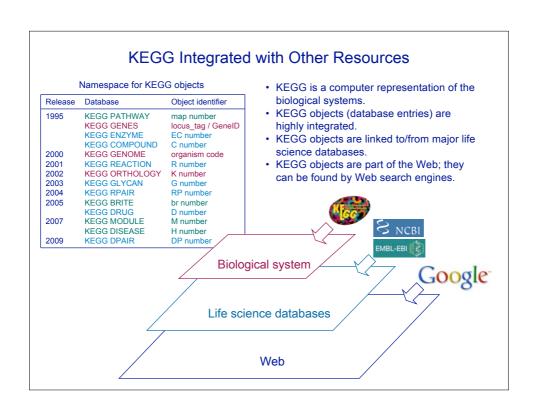


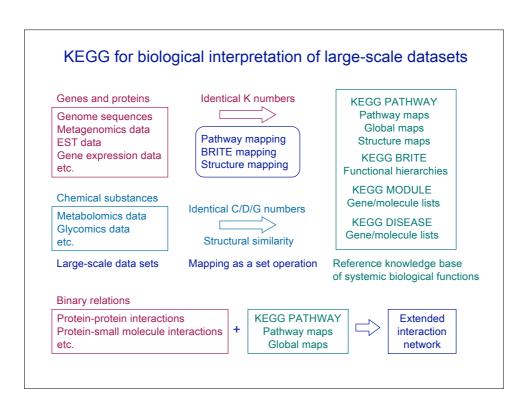












Changing roles of bioinformatics: molecules to molecular systems

More divergent datasets

- Biopolymers: DNA, RNA, protein, glycan, lipid, polyketide, nonribosomal peptide, etc.
- · Small molecules: metabolite, environmental compound, drug, etc.
- Molecular systems: pathway, complex, ontology, etc.

More complex data types

- Biopolymers: linear sequence, circular sequence, tree structure,
 3D structure
- Small molecules: chemical structure, 3D structure
- Molecular systems: graph, tree, list, etc.

Hierarchy of data

- · atom molecule molecular system
- · monomer biopolymer
- molecule molecular interaction molecular system
- · cell cellular interaction cellular system

Changing roles of bioinformatics: basic research to practical values Diseases viewed as perturbed states of molecular systems

- Capturing knowledge on molecular systems both in normal and perturbed states
- KEGG PATHWAY KEGG DISEASE
- Capturing knowledge on drugs as perturbants to molecular systems
- KEGG DRUG
- Capturing knowledge on natural product biosynthetic pathways and human-made chemical structure transformations
- KEGG RPAIR KEGG DPAIR
- Generating knowledge from genome sequencing and other high-throughput data
- KEGG ORTHOLOGY
- · Knowledge based analysis of human diseases
- · Drug discovery from the genomes of plants and microorganisms