

# KEGG: Kyoto Encyclopedia of Genes and Genomes

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# Background

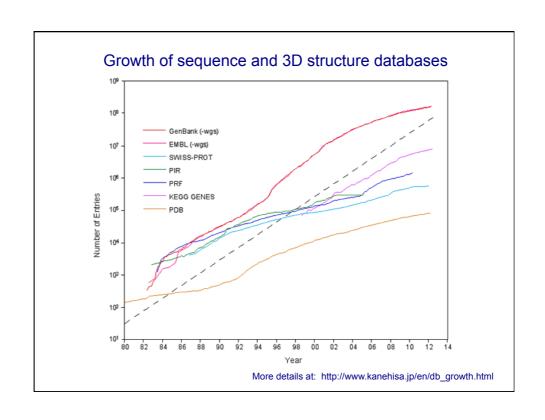
- High-throughput experiments and largescale datasets
- Bioinformatics approaches to integration and interpretation
- Linking genomes to health and society

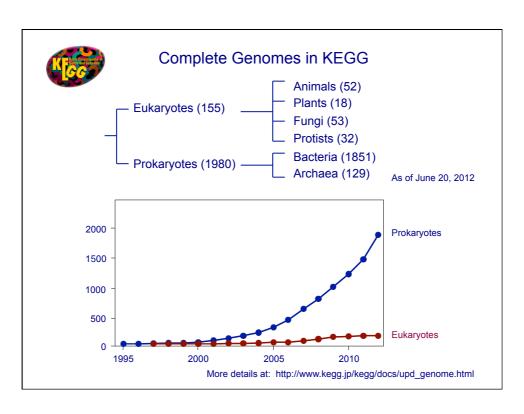
# Seeds and Needs: Changing Roles of Bioinformatics

Period	Seeds	Needs
1990s	Informatics technologies	Large-scale sequence data in the Human Genome Project
2000s	Bioinformatics technologies (bench)	Large-scale molecular data in all areas of biological sciences
2010s	Bioinformatics technologies (bedside)	Scientific data (personal genome data, etc.) in society

# **Translational Bioinformatics**

	Role	Example
Research Community	Helping to bring research results into practical applications	Personalized medicine Drug discovery
Society	Helping to understand scientific basis of diseases and drugs	Participatory medicine Self-medication





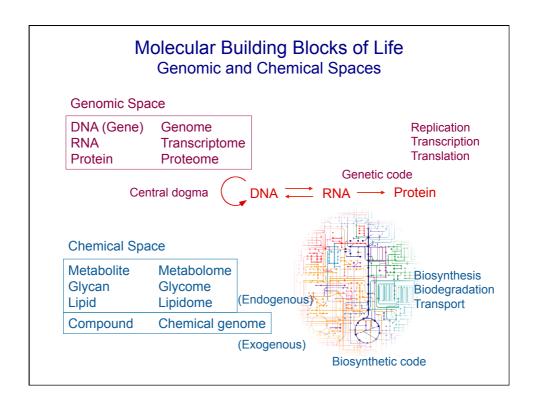
# Genetic and Chemical Blueprints of Life

# Genetic Blueprint of Life (Genome)

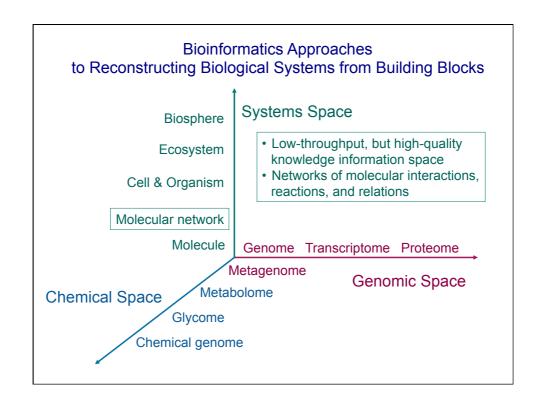
- DNA sequence
- Information about genes, gene regulatory elements, proteins, RNAs, etc.
- Partial information about transcription network

# Chemical Blueprint of Life (Chemical Logic)

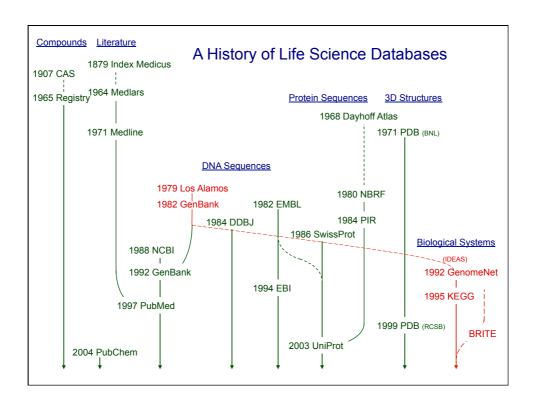
- · Molecular reaction/interaction network
- Information about small molecules, biopolymers, etc. (biosynthetic codes)
- Information about interactions with the environment



# High-throughput Experimental Projects to Uncover Molecular Building Blocks of Life Genomic space Chemical space Genes and proteins Endogenous molecules in individual organisms (metabolomics, glycomics, (genomics, transcriptomics, lipidomics, etc.) proteomics) Exogenous molecules (chemical genomics) Genes and proteins Metabolites in environmental samples in environmental samples (metagenomics, etc.) (meta-metabolomics) Integration of genomic and chemical spaces · Interpretation of higher-level systemic functions



# Molecular network-based analysis of diseases, drugs, and environmental compounds Diseases viewed as perturbed states of the molecular system Drugs and environmental compounds viewed as perturbants to the molecular system Molecular interaction network Molecular reaction network Environmental Perturbants Perturbed system Biodegradation compounds Molecular relation network ATC classification N Nervous system G protein-coupled receptors Class A. Rhodopsin family Biogenic amine N04 Anti-parkinson drugs Dopamine K04144 N04A Dopa and dopa de N04AA Levodopa K05850 D00059



# Overview of KEGG

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



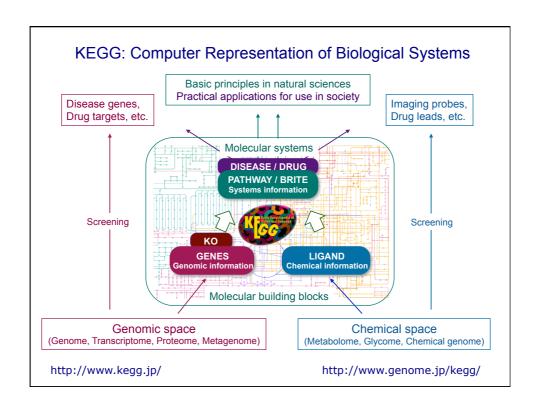
# The KEGG Database

1. Manually created reference knowledge base

Experimental knowledge on systemic functions of the cell, the organism and the ecosystem is represented in terms of molecular networks (KEGG pathway maps, BRITE functional hierarchies and KEGG modules).

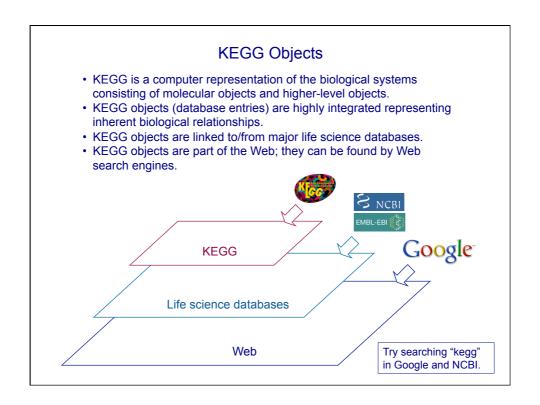
- 2. Enabling interpretation of genomes and high-throughput data
  - A mechanism (KEGG Orthology system) is developed for linking genes in the genome to nodes of the molecular network.
- 3. Supporting translational bioinformatics

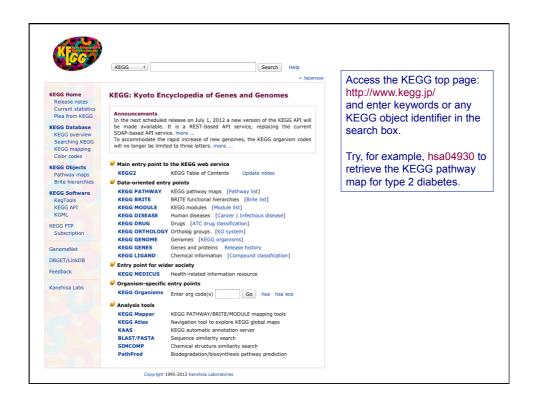
Disease and drug information is integrated in the KEGG molecular networks (diseases as perturbed states and drugs as perturbants).

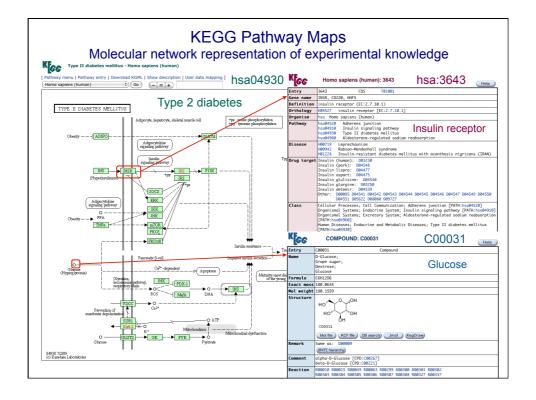


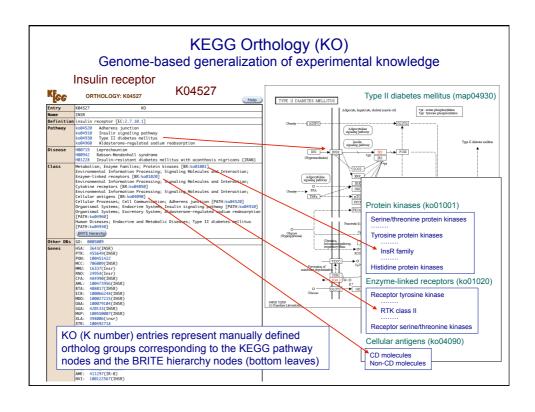
Database	Content	Data size
KEGG PATHWAY	Pathway maps, reference (total)	425 (189,042)
KEGG BRITE	Functional hierarchies, reference (total)	137 (61,818)
KEGG MODULE	KEGG modules, reference (total)	536 (134,097)
KEGG DISEASE	Human diseases	1,221
KEGG DRUG	Drugs	9,779
KEGG EDRUG	Crude drugs and health-related substances	840
KEGG ORTHOLOGY	KEGG Orthology (KO) groups	15,713
KEGG GENOME	KEGG Organisms	2,135
KEGG GENES	Genes in high-quality genomes	8,761,904
	(155 eukaryotes + 1847 bacteria + 129 archaea)	
KEGG SSDB	Best hit relations within GENES	64,225,605,182
	Bi-directional best hit relations within GENES	1,200,860,761
KEGG DGENES	Genes in draft genomes (17 eukaryotes)	359,223
KEGG EGENES	Genes as EST contigs (99 eukaryotes)	3,792,883
KEGG MGENES	Genes in metagenomes (139 samples)	14,822,267
KEGG COMPOUND	Metabolites and other small molecules	16,787
KEGG GLYCAN	Glycans	10,979
KEGG REACTION	Biochemical reactions	9,025
KEGG RPAIR	Reactant pair chemical transformations	13,530
KEGG RCLASS	Reaction class	2,521
KEGG ENZYME	Enzyme nomenclature	5,823

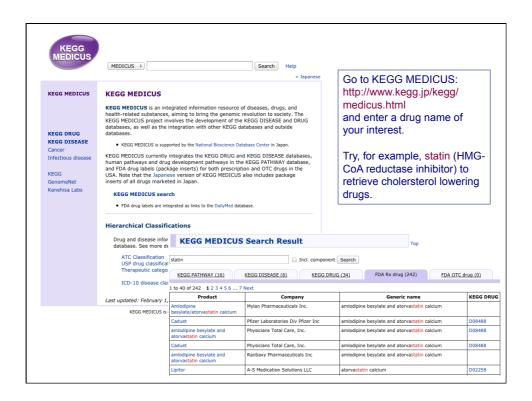
KEGG Object Identifiers			
(Prefix + five-digit number)			
Database	Content	Prefix	Example
KEGG PATHWAY KEGG BRITE KEGG MODULE	Pathway maps Functional hierarchies KEGG modules	map, ko, ec, rn, <i>org</i> br, jp, ko, <i>org</i> M, <i>org</i> _M	hsa04930 ko01003 M00008
KEGG DISEASE KEGG DRUG KEGG ENVIRON	Human diseases Drugs Crude drugs, etc.	H D E	H00004 D01441 E00048
KEGG ORTHOLOGY KEGG GENOME KEGG GENES	KEGG Orthology (KO) groups KEGG Organisms Genes in high-quality genomes	K T	K04527 T01001 (hsa) hsa:3643
KEGG COMPOUND KEGG GLYCAN KEGG REACTION KEGG RPAIR KEGG RCLASS KEGG ENZYME	Metabolites & small molecules Glycans Biochemical reactions Reactant pairs Reaction class Enzyme nomenclature	C G R RP RC	C00031 G00109 R00259 RP04458 RC00046 ec:2.7.10.1
org KEGG Orga		•	entry identifier

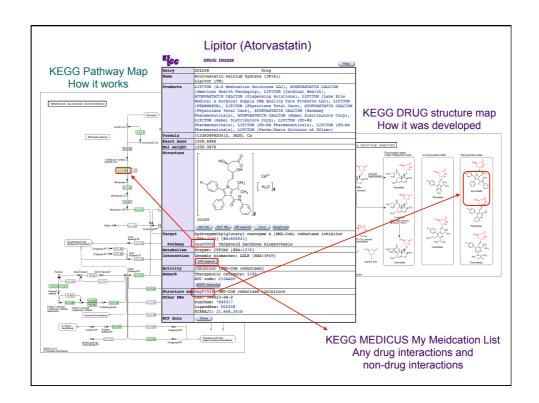














# My Medication List (Japanese version only)

# 1. 'Okusuri-techo' in Japan

Keeps track of prescribed drugs Used for checking drug allergies and past adverse events Used for checking drug interactions and overdose of similar drugs

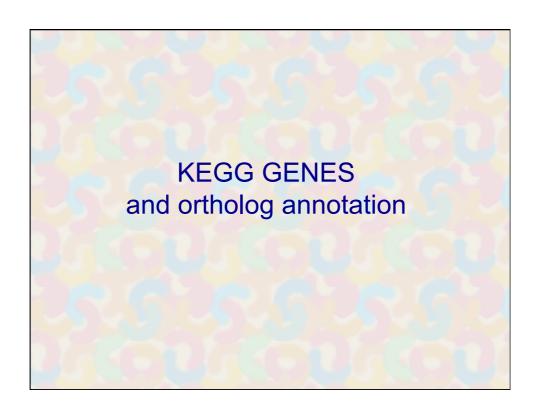
# 2. Drug interaction database

Molecular to higher-level drug interactions including:

- Known drug-drug interactions (contraindications, warnings, etc.)
- Interactions with OTC drugs, food supplements, etc.
- · Personal health status
- Personal genomes

# 3. User interface

Automatic checking against drug interaction database Links to KEGG and other web resources Personal data managed by individuals (no data stored on the server)

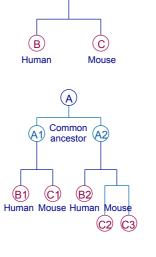


# Orthologs and Paralogs

- 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



Common ancestor

# Computational Identification of Orthologs

# Between two organisms

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



# Genome 1 Genome 2

# Among multiple organisms

### 1. COG

Triangle of BBH relationships among three organisms



Superposition of

ABC and ABD

# 2. KEGG OC

p-Quasi clique among multiple organisms

ue among multiple organisms



(completely connected subgraph)

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

# Genome annotation in KEGG

# Separate function database

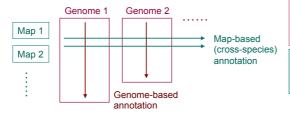
- Experimental evidence is stored in the KEGG ORTHOLOGY (KO) database
- KO entries identified by K numbers are manually defined in the context of molecular networks; i.e., as KEGG pathway nodes and BRITE hierarchy nodes

# **Ortholog annotation**

- KO (K number) assignment; i.e., it establishes links from the KO database
- Gene definitions in the original database (mostly RefSeq) are not rewritten
- But the definitions of KO entries are frequently updated to follow guidelines

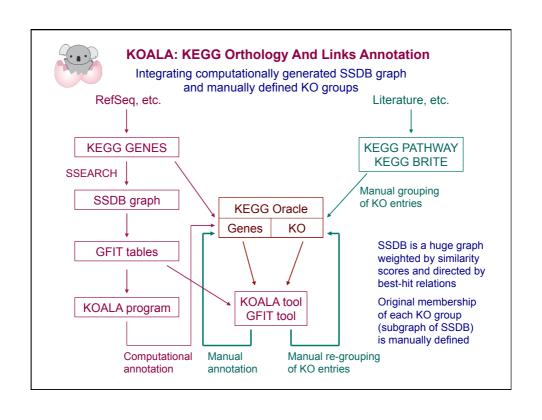
# **Cross-species annotation**

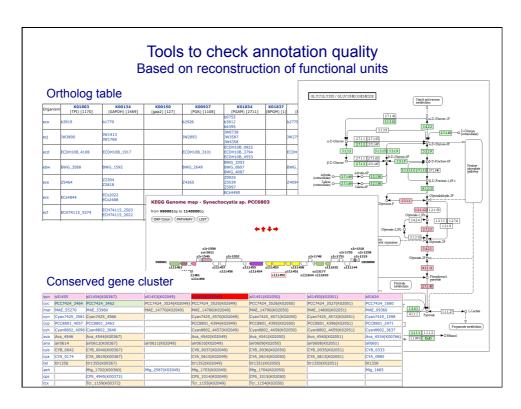
- Molecular network-based annotation; i.e., starting from a pathway map, etc. orthologs are searched in all available genomes
- · Genome-based annotation is also done

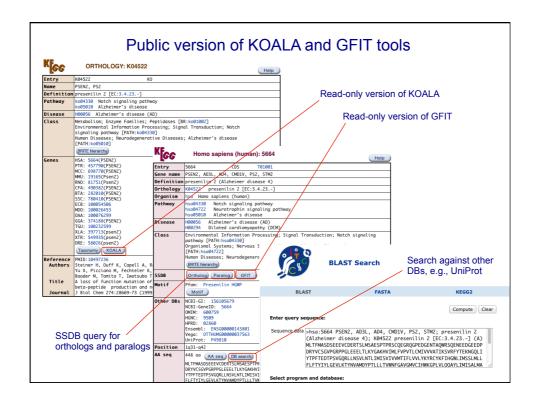


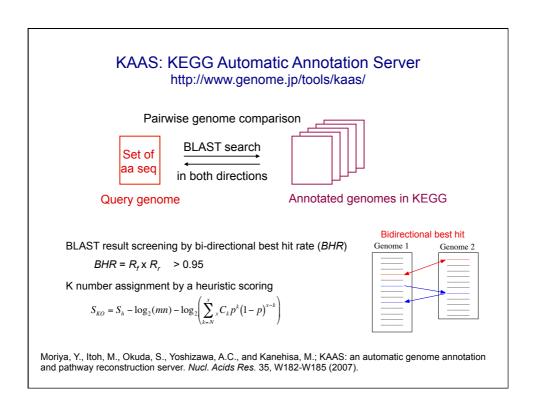
Genomes	2,134
Genes	8,775,231
Genes with KO	3,532,258
KO assignment	40%
KO	15,713
Safe KO	9,157
KOALA automation	1 58%

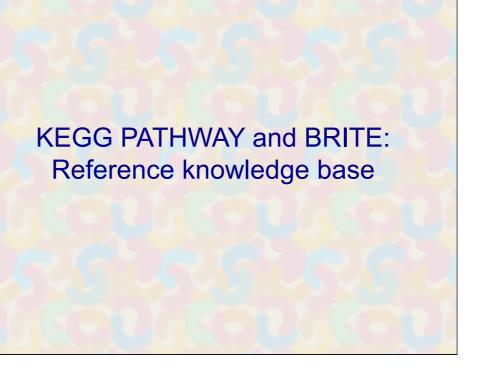
As of June 20, 2012











# Data objects for computer representation of molecular systems

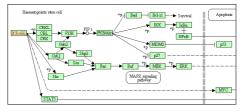
Data object	Database
Element	KEGG GENES
gene, protein, small molecule, etc.	KEGG COMPOUND
gene, protein, amail molecule, etc.	KEGG GLYCAN
Pair (binary relation)	KEGG DRUG
reactant pair, drug-target relationship, etc.	KEGG RPAIR
	KEGG BRITE
Graph (wiring diagram)	
pathway, complex, etc.	KEGG PATHWAY
	KEGG SSDB
Hierarchical list (tree)	
hierarchical classification, ontology, etc.	KEGG BRITE
Olerada Pat (caracaba antica)	KEGG MODULE
Simple list (membership)	KEGG DISEASE
disease gene list, etc.	KEGG ORTHOLOGY

# Set operations for biological interpretation of large-scale datasets

Large scale data + Reference knowledge	Tool
KEGG pathway mapping (pathway enrichment) elements + KEGG pathway map	KEGG Mapper
KEGG pathway mapping (network extension) binary relations + KEGG pathway map	
BRITE mapping (ontology enrichment) elements + BRITE functional hierarchy	KEGG Mapper
BRITE mapping (tree manipulation) binary relations + BRITE functional hierarchy	KEGG Mapper
KEGG annotation SSDB graph + KO group	KOALA

# Knowledge Representation of Systemic Functions (Molecular interaction, reaction and relation networks)

# Pathway map **KEGG PATHWAY**



# Membership list KEGG DISEASE KEGG MODULE

Gene	BCR-ABL (translocation) [MSA:613 25] EVII (overeyresion) [MSA:2122] AWL1 (translocation) [MSA:861] pl67/MN4A (mutation) [MSA:1027] p53 (mutation) [MSA:71577] R81 (mutation) [MSA:5925]
Carcinogen	1,3-Butadiene [CPD:C16450] Rubber industry
Marker	BCR-ABL (translocation) [HSA:613 25] WT1 [HSA:7490]
Drug	Imatinib mesylate (Gleevec) [DR:D01441] Hydroxyurea [DR:D00341] Interferon-alpha [DR:D00745 D02745 D03305 D04552 D04553]

# Hierarchical list (ontology) KEGG BRITE

```
V V V

V Cancers

Cancers of the nervous system

Cancers of the dispstive system

Cancers of head dispstive system

Cancers of head dispstive system

W Cancers of head dispstive system

H00003 Acute myeloid leukemia (ALL) (Precursor B

H00002 Acute lymphoblastic leukemia (ALL) (Precursor B

H00005 Acute lymphoblastic leukemia (ALL) (Precursor B

H00006 Acute lymphoblastic leukemia (ALL) (Precursor B

H00006 Acute lymphocytic leukemia (CLL)

H00007 Hodgkin lymphoma

H00008 Burkit lymphoma

H00008 Burkit lymphoma

H00012 Folymphophasmacytic lymphoma

H00012 Folymphophasmacytic lymphoma

H00012 Folymphomia vera

Cancers of the breast and female genital organs

Cancers of soft tissues and bone

Cancers of soft tissues and bone

Cancers of the urinary system and male genital organs

Cancers of the urinary system and male genital organs

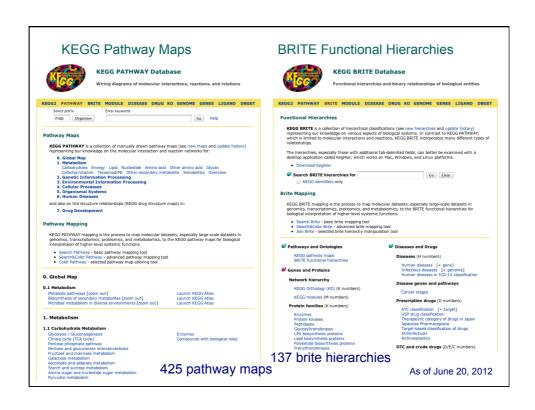
Model Cancers of the lung and pleura

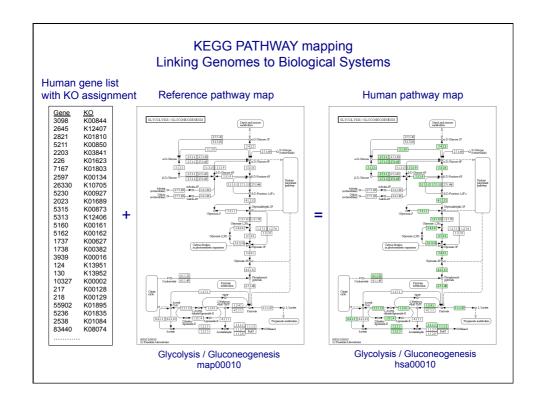
Immune System Diseases

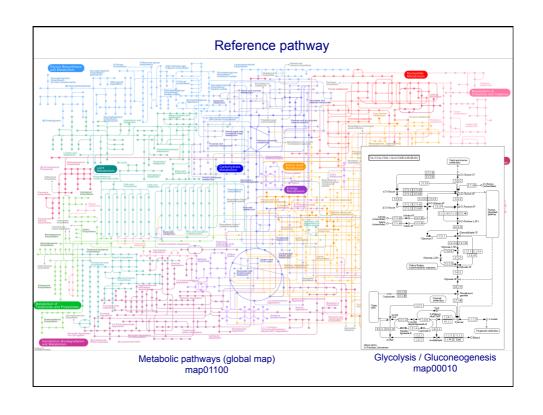
Nervous System Diseases

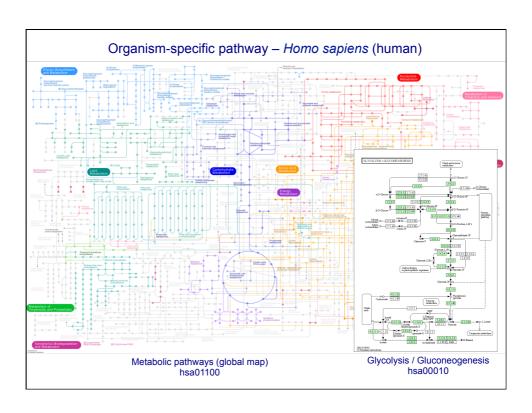
Metabolic Diseases
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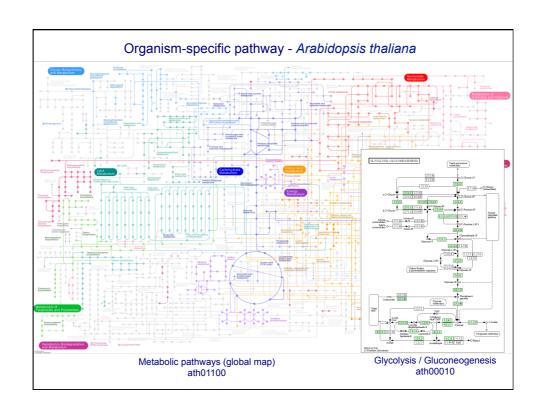
Data source: review articles, other publications, specialists' websites, etc.

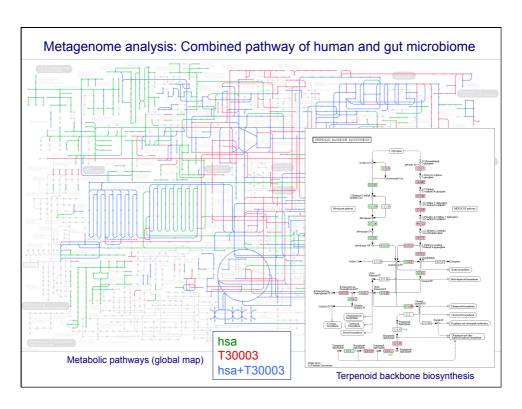


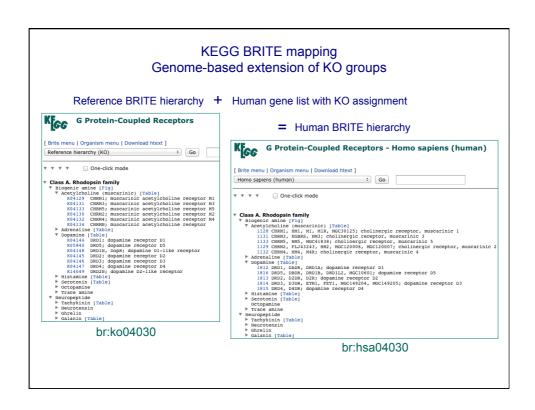


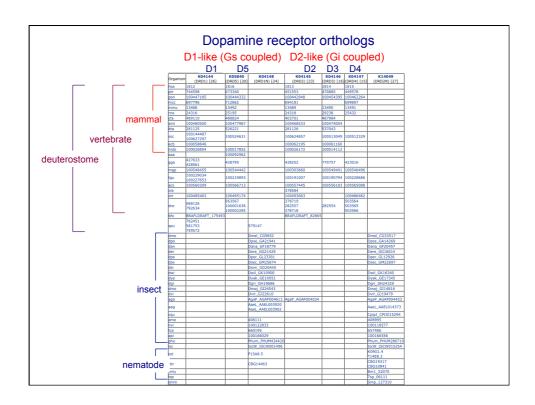


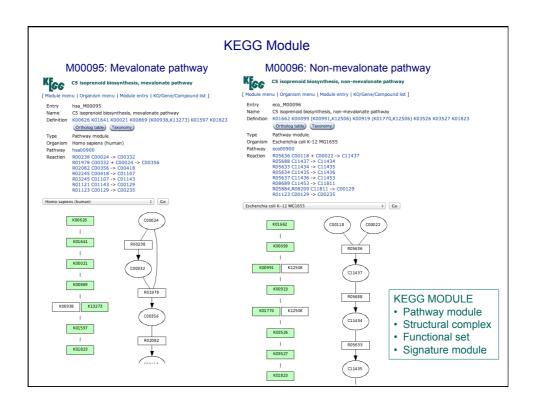


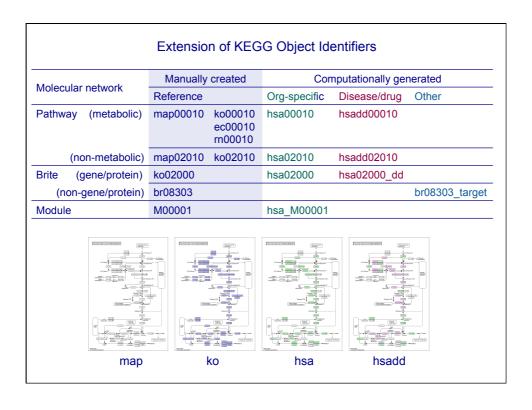




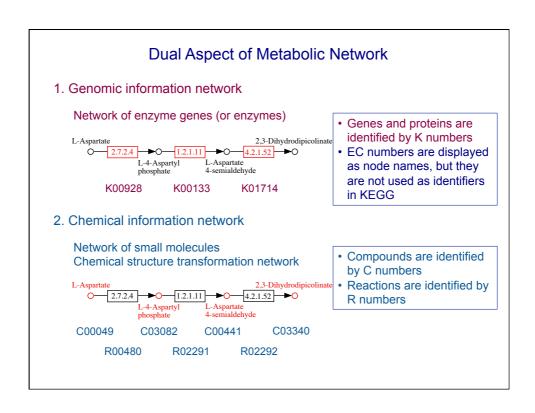


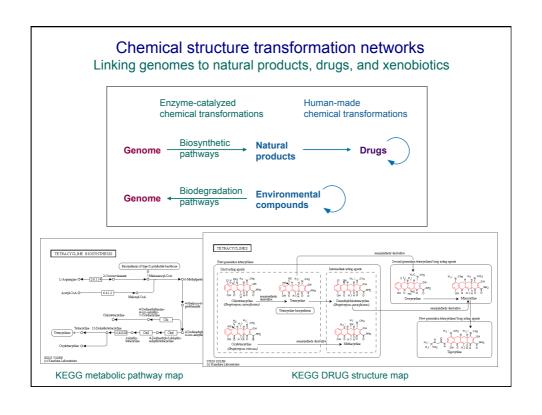


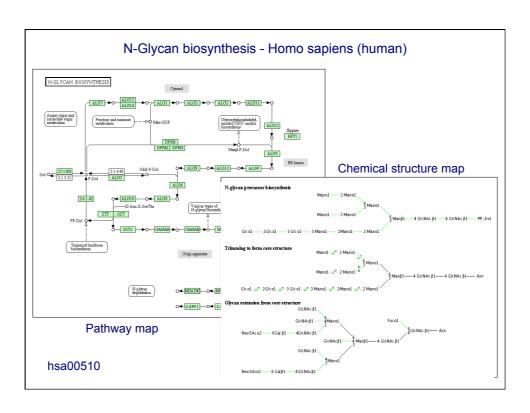


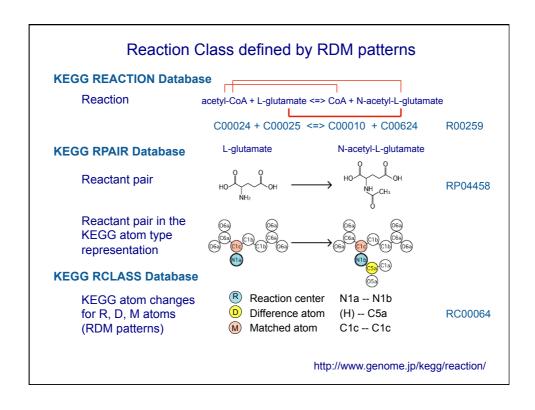


# KEGG LIGAND: Integration of genomics and chemistry

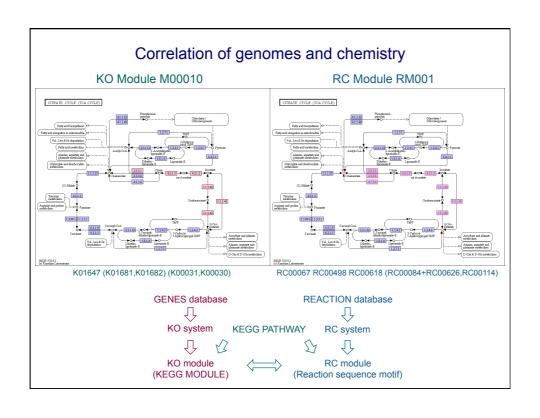


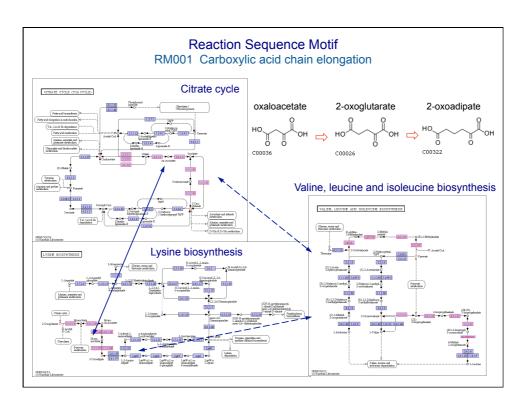


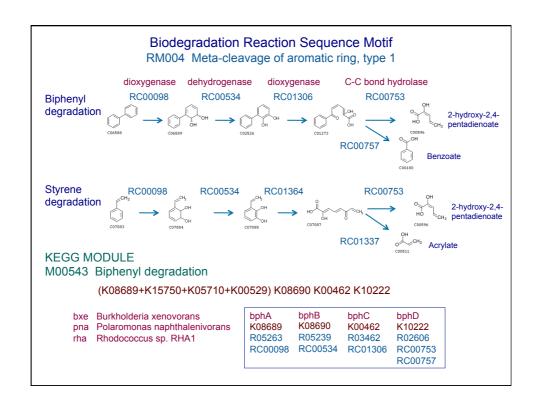


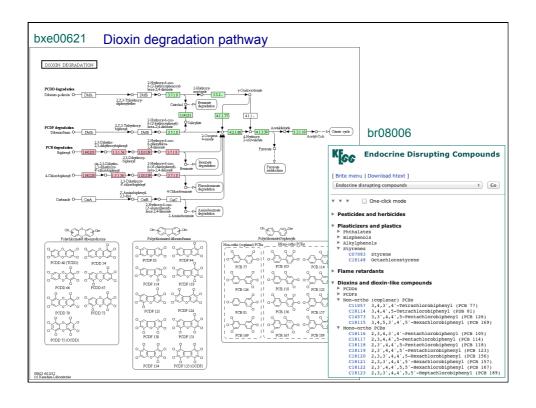


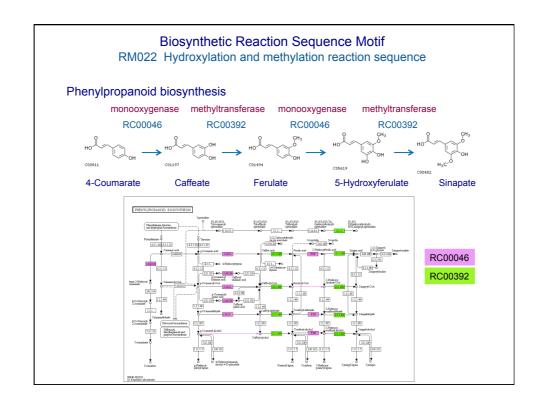
### **KEGG** atom types Carbon 23 types Nitrogen 16 types Oxygen 18 types C1a R-CH3 C1b R-CH2-R N1a R-NH2 N1b R-NH-R O1a R-OH O1b N-OH Alkane Amine Hydroxy C1c R-CH(-R)-R N1c R-N(-R)2 O1c P-OH O1d S-OH C1d R-C(-R)2-R N1d R-N(-R)3+ Cyclic alkane C1x ring-CH2-ring Cyclic amine N1x ring-NH-ring Ether O2a R-O-R C1y ring-CH(-R)-ring C1z ring-CH(-R)2-ring C2a R=CH2 C2b R=CH-R N1y ring-N(-R)-ring N2a R=N-H O2b P-O-R O2c P-O-P Imine O2x ring-O-ring O3a N=O Alkene N2b R=N-R Cyclic imine N2x ring-N=ring Охо C2c R=C(-R)2 N2y ring-N(-R)+=ring O3b P=O Cyclic alkene O3c S=O C2x ring-CH=ring C2y ring-C(-R)=ring Cvan N3a R≡N O4a R-CH=O O5a R-C(=O)-R Aromatic ring N4x ring-NH-ring Aldehyde ring-C(=R)-ring C3a R=CH N4y ring-N(-R)-ring N5x ring-N=ring Ketone O5x ring-C(=O)-ring O6a R-C(=O)-OH O7a R-C(=O)-O-R Alkyne C3b R≡C-R C4a R-CH=O N5y ring-N(-R)+=ring N0 Carboxylic acid Aldehyde Undefined N C5a R-C(=O)-R C5x ring-C(=O)-ring C6a R-C(=O)-OH Ketone Cyclic ketone O7x ring-C(=O)-O-ring Undefined O Sulfur 7 types Carboxylic acid Thiol S1a R-SH Carboxylic ester C7a R-C(=O)-O-R C7x ring-C(=O)-O-ring Phosphorus 2 types S2a R-S-R S2x ring-S-ring Thioether C8x ring-CH=ring C8y ring-C(-R)=ring Attatched to other elements P1a Aromatic ring Disulfide S3a R-Š-S-R Attatched to oxygen S3x ring-S-S-ring S4a R-SO3 Undefined C Other elements 2 types Undefined S S0 Halogens F, CI, Br, I Others

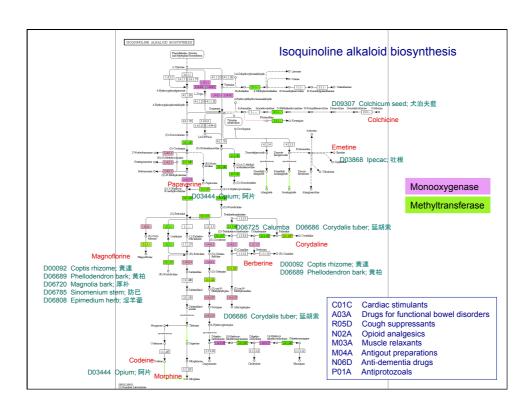




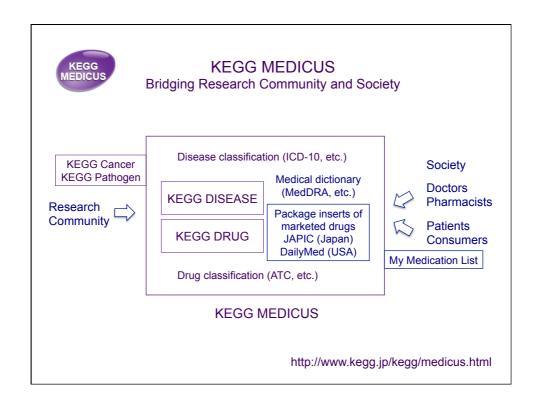








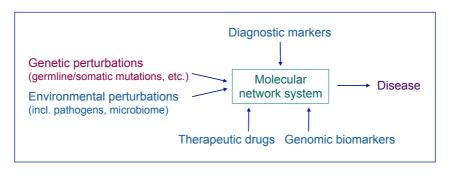
# KEGG MEDICUS: Bringing genomic revolution to society

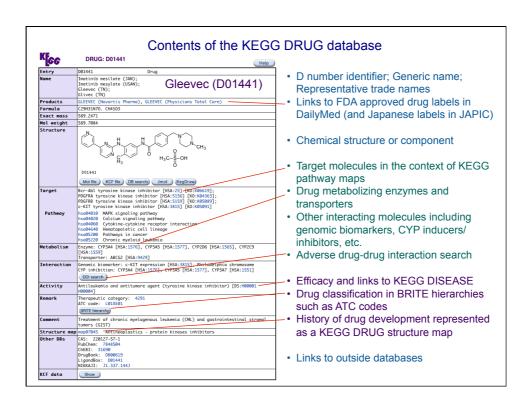


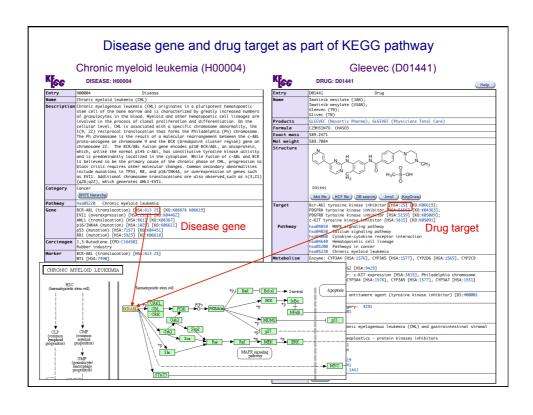
# Diseases and Drugs Viewed As Molecular Network Information

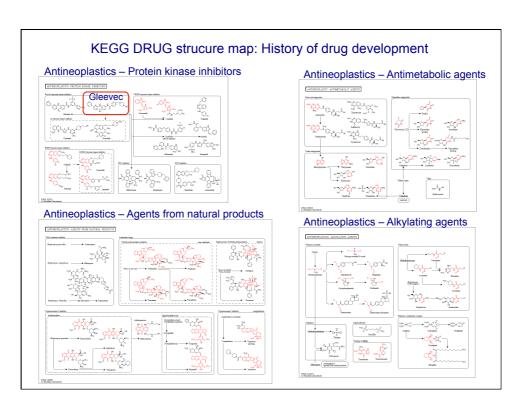
- Diseases are viewed as perturbed states of the molecular network.
- Genetic factors, environmental factors, and other causative agents are perturbants to the molecular network.
- Drugs are different types of perturbants to the molecular network.

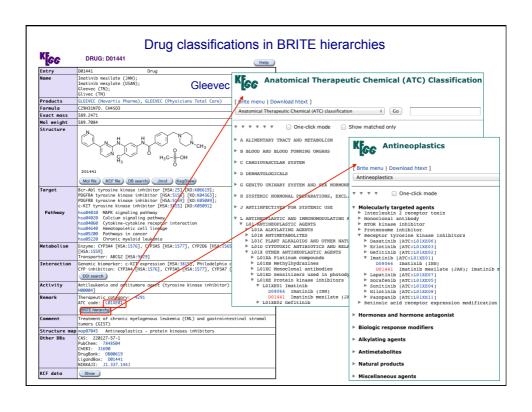
## **Network-Disease Associations**

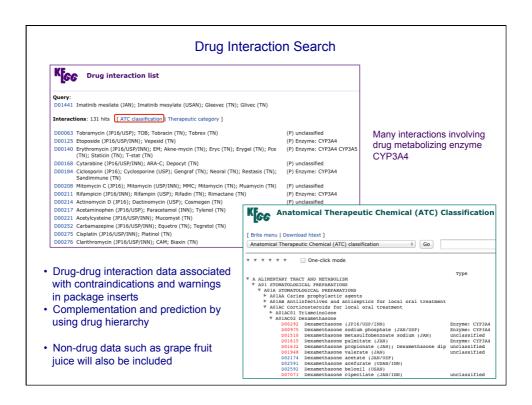


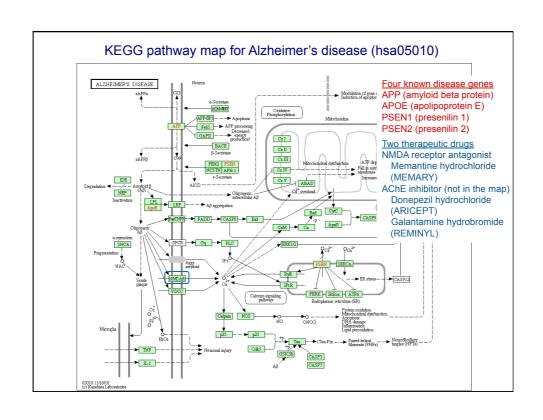


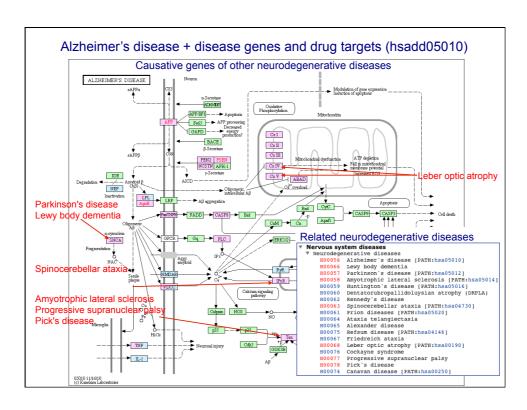


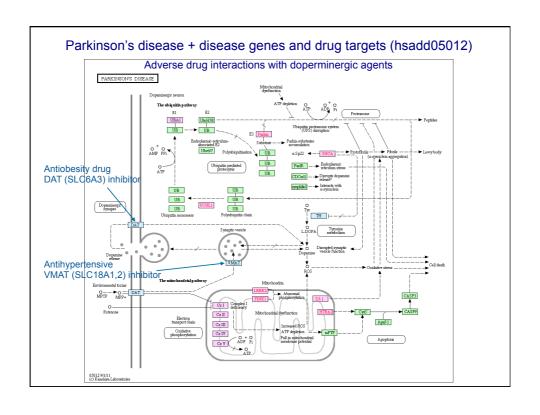


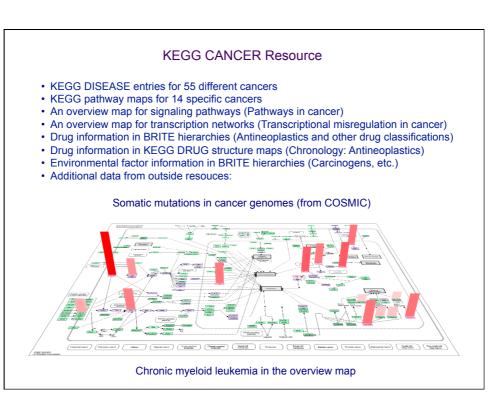














# KEGG: Reference knowledge base for use in practice and in society

- Capturing experimental knowledge on molecular systems in both normal and perturbed (disease) states
- Capturing knowledge on genetic and environmental factors of diseases, as well as drugs and health-related KEGG DRUG substances as perturbants to molecular systems
- Generalizing knowledge on genes and proteins by **KEGG Orthology**
- Generalizing knowledge on biochemical reactions by reaction class

**KEGG PATHWAY KEGG BRITE KEGG MODULE** 

**KEGG DISEASE KEGG ENVIRON** 

**KEGG ORTHOLOGY KEGG GENES KEGG COMPOUND** 

**KEGG REACTION KEGG RCLASS** 

# For research community

Helping to bring research results into practical applications, such as personalized medicine and drug discovery

Helping to understand scientific basis of diseases and drugs with practical tools, such as My Medication List





### KAAS

Moriya, Y., Itoh, M., Okuda, S., Yoshizawa, A.C., and Kanehisa, M.; KAAS: an automatic genome annotation and pathway reconstruction server. *Nucl. Acids Res.* 35, W182-W185 (2007).

### **GENIES**

Kotera, M., Yamanishi, Y., Moriya, Y., Kanehisa, M., and Goto, S.; GENIES: gene network inference engine based on supervised analysis. *Nucleic Acids Res.* Epub 2012 Jun 14.

### SIMCOMP/SUBCOMP

Hattori, M., Tanaka, N., Kanehisa, M., and Goto, S.; SIMCOMP/ SUBCOMP: chemical structure search servers for network analyses. *Nucleic Acids Res.* 38, W652-W656 (2010).

### **KCaM**

Aoki, K.F., Yamaguchi, A., Ueda, N., Akutsu, T., Mamitsuka, H., Goto, S., and Kanehisa, M.; KCaM (KEGG Carbohydrate Matcher): a software tool for analyzing the structures of carbohydrate sugar chains. *Nucleic Acids Res.* 32, W267-W272 (2004).

### PathPred

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