# **Chapter 1**

### **Protein Bioinformatics Databases and Resources**

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### **Abstract**

Many publicly available data repositories and resources have been developed to support protein-related information management, data-driven hypothesis generation, and biological knowledge discovery. To help researchers quickly find the appropriate protein-related informatics resources, we present a comprehensive review (with categorization and description) of major protein bioinformatics databases in this chapter. We also discuss the challenges and opportunities for developing next-generation protein bioinformatics databases and resources to support data integration and data analytics in the Big Data era.

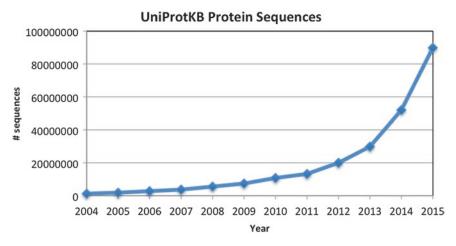
Key words Bioinformatics, Database, Protein sequence, Protein structure, Protein family, Protein function, Protein mutation, Protein interaction, Pathway, Proteomics, PTM, Data integration, Data analytics, Big data

#### 1 Introduction

Use of high-throughput technologies to study molecular biology systems in the past decades has revolutionized biological and biomedical research, allowing researchers to systematically study the genomes of organisms (Genomics) [1], the set of RNA molecules (Transcriptomics) [2], and the set of proteins including their structures and functions (Proteomics) [3]. Since proteins occupy a middle ground molecularly between gene and transcript and many higher levels of molecular and cellular structure and organization, and most physiological and pathological processes are manifested at the protein level, biological and biomedical scientists are increasingly interested in applying high-throughput proteomics techniques to achieve a better understanding of basic molecular biology and disease processes [4, 5].

The richness of proteomics data allows researchers to ask complex biological questions and gain new scientific insights. To support data-driven hypothesis generation and biological knowledge discovery, many protein-related bioinformatics databases, query facilities, and data analysis software tools have been developed

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**Fig. 1** The total number of protein sequences in UniProtKB. The diagram shows that as the result of the rapid development of genome sequencing projects, protein sequences archived in UniProtKB have increased dramatically in recent years

(http://www.oxfordjournals.org/our\_journals/nar/database/cap/) to organize and provide biological annotations for proteins to support sequence, structural, functional, and evolutionary analyses in the context of pathway, network, and systems biology. With the recent extraordinary advances in genome sciences and Next-Generation Sequencing (NGS) technologies [6] that have uncovered rich genomic information in a huge number of organisms, new protein bioinformatics databases are also being introduced and many existing databases have been enhanced. As more and more genomes are sequenced, the protein sequences archived in databases have increased dramatically in recent years (see Fig. 1 for an example). This poses new challenges for computational biologists in building new infrastructure to support protein science research in the age of Big Data.

We present a summary review (with categorization and description) of protein bioinformatics databases and resources in Table 1. The databases and categories presented in Table 1 are selected from the databases listed in the Nucleic Acids Research (NAR) database issues and database collection, as well as the databases cross-referenced in the UniProtKB. The reason we choose them is because they: (1) are protein related and well grouped; (2) are well documented with papers and websites; (3) have been peer reviewed or/and selected by the UniProt consortium for UniProtKB database cross-references; and (4) are supposed to be well maintained.

Protein bioinformatics databases can be primarily classified as sequence databases, 2D gel databases, 3D structure databases, chemistry databases, enzyme and pathway databases, family and domain databases, gene expression databases, genome annotation

Table 1 Overview of protein bioinformatics databases

Category	DB short name	DB name	URLs	Ref.
Sequence databases	CCDS DDBJ HNA	The consensus CDS protein set database  DNA Data Bank of Japan  Furonean nucleotide archive	https://www.ncbi.nlm.nih.gov/CCDS/ CcdsBrowse.cgi http://www.ddbj.nig.ac.jp/ http://www.ehj.ac.ib/ena	[9]
	Gray GenBank RefSeq <sup>a</sup> UniGene	GenBank nucleotide sequence database NCBI reference sequence database arabase of computationally identifies transcripts from the same locate	https://www.ncbi.alm.nih.gov/genbank/ https://www.ncbi.nlm.nih.gov/refseq/ https://www.ncbi.nlm.nih.gov/unigene	
	$UniProtKB^a$	Universal Protein resource (UniProt)	http://www.uniprot.org/	[14]
2D gel databases	COMPLUYEAST-2DPAGE	2-DE database at Universidad Complutense de Madrid Spain	http://compluyeast2dpage.dacya.ucm.es/	[15]
	REPRODUCTION- 2DPAGE	2-Definition of American University, China	http://reprod.njmu.edu.cn/cgi-bin/2d/2d.cgi	[16]
	SWISS-2DPAGE	2-DE database at Swiss Institute of Bioinformatics. Switzerland	http://world-2dpage.expasy.org/swiss-2dpage/	[17]
	World-2DPAGE <sup>a</sup>	The World-2DPAGE database	http://world-2dpage.expasy.org/repository/	[18]
3D structure databases	DisProt MobiDB	Database of protein disorder Database of intrinsically disordered and mobile	http://www.disprot.org/ http://mobidb.bio.unipd.it/	[19] [20]
	ModBase	proteins Database of comparative protein structure	http://modbase.compbio.ucsf.edu/modbase-	[21]
	PDBe4	Protein Data Bank at Europe	cg/, meex.cgt http://www.ebi.ac.uk/pdbe/ 	[22]
	r.D.b.J. PDBsum	Pictorial Data Bank at Japan Pictorial database of 3D structures in the Protein	http://www.ebi.ac.uk/pdbsum/	[24]
	ProteinModelPortal	Data bank Protein model portal of the PSI-Nature errictmal biology browledgebase	http://www.proteinmodelportal.org/	[25]
	RCSB-PDB <sup>a</sup> SMR	Structural Diology Allowacegodase. Protein Data Bank at RCSB Database of annotated 3D protein structure models	http://www.pdb.org/ http://swissmodel.expasy.org/repository/	[26]
Chemistry databases	BindingDB ChEMBL <sup>3</sup> DrugBank	The binding database Database of bioactive drug-like small molecules Drug and drug target database	http://www.bindingdb.org/ https://www.ebi.ac.uk/chembldb http://www.drugbank.ca/	[28] [29] [30]
				(1

(continued)

Table 1 (continued)

Category	DB short name	DB name	URLs	Ref.
Enzyme and pathway	MetaCyc/BioCyc <sup>a</sup>	MetaCyc database of metabolic pathways, BioCyc	http://www.biocyc.org/	[31]
ualaDases	BRENDA <sup>2</sup> ENZYME	BRaunschweig ENzyme DAtabase Enzyme nomenclature database	http://www.brenda-enzymes.org http://enzyme.expasy.org/	[32]
	Reactomea	A knowledgebase of biological pathways and	http://www.reactome.org/	[34]
	SABIO-RK	processes SABIO-RK: biochemical reaction kinetics database	http://sabiork.h-its.org/	[35]
	SignaLink	A signaling pathway resource with multi-layered regulatory networks	http://signalink.org/	[36]
	UniPathway	UniPathway: a resource for the exploration of metabolic pathways	http://www.unipathway.org	[37]
Family and domain	Gene3D	Structural and functional annotation of protein families	http://gene3d.biochem.ucl.ac.uk/Gene3D/	[38]
	HAMAP	High automated and manual annotation of proteins	http://hamap.expasy.org/	[39]
	InterPro	Integrational effects and functional effects	http://www.ebi.ac.uk/interpro/	[40]
	PANTHER Pfam* princps	The PANTHER classification system The Pfam protein families database	http://www.pantherdb.org/ http://pfam.xfam.org/	[41] [42]
	$P1$ KSF $^{a}$	A whole-protein classification database	http://pir.georgetown.edu/pirwww/dbinfo/ pirsf.shtml	[45]
	PRINTS	Protein Motif fingerprint database	http://www.bioinf.manchester.ac.uk/ dbbrowser/PRINTS/	[44]
	ProDom	Protein domain families database	http://prodom.prabi.fr/prodom/current/ html/home.php	[45]
	PROSITE <sup>a</sup>	Database of protein domains, families and functional sites	http://prosite.expasy.org/	[46]
	ProtoNet SMART SUPFAM	Automatic hierarchical classification of proteins Simple modular architecture research tool Superfamily database of structural and functional	http://www.protonet.cs.huji.ac.il/ http://smart.embl.de/ http://supfam.org	[47] [48] [49]
	TIGRFAMs	annotation TIGREAMs protein family database	http://www.jcvi.org/cgi-bin/tigrfams/ index.cgi	[20]

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	Bgec CleanEx Genevisible	Database for gene expression evolution Database of gene expression profiles Search portal to normalized and curated expression data from Genevestigator	http://bgee.unil.ch http://cleanex.vital-it.ch/ http://genevisible.com/search	[51] [52] [53]
$ExpressionAtlas^{\mathtt{a}}$	lasª	Database of Differential and Baseline Expression	http://www.ebi.ac.uk/gxa/home	[54]
Ensembla EnsemblBacteria EnsemblFungi	reria 1gi	Ensembl Bukaryotic genome annotation database Ensembl Bacteria genome annotation database Ensembl Fungi genome annotation database	http://www.ensembl.org/ http://bacteria.ensembl.org/ http://fungi.ensembl.org/	[55] [56] [56]
EnsemblMetazoa EnsemblPlants	azoa Its	Ensembl Metazoa genome annotation database Ensembl Plants genome annotation database		[36]
Entrez Gene <sup>a</sup>	a a	Database of Genes of Genomes in the Reference Sequence Collection	https://www.ncbi.nlm.nih.gov/gene	[22]
KEGG PATRIC		Kyoto Encyclopedia of Genes and Genomes Bacterial Bioinformatics Resource Center		[58]
VectorBase		Significant to the promotion of human parknesses of human parknesses	http://www.vectorbase.org/	[61]
WBParaSite		WormBase ParaSite	http://parasite.wormbase.org	[62]
ArachnoServer CGD	ver	ArachnoServer: Spider toxin database Candida Genome Database	http://www.arachnoserver.org http://www.candidagenome.org/	[63] [64]
ConoServer		ConoServer: Cone snail toxin database	http://www.conoserver.org/	[65]
dictyBase		Central resource for Dictyostelid genomics	http://dictybase.org/	[67]
EchoBASE		EchoBASE—an integrated post-genomic database for E. coli.	http://www.york.ac.uk/res/thomas/	[89]
EcoGene		Escherichia coli strain K12 genome database The Euronean Henaritis C Virus database	http://www.ecogene.org/ https://enhcvdh.ihcn-fr/enHCVdb/	[69]
EuPathDB		Eukaryotic Pathogen Database Resources	http://eupathdb.org/eupathdb/	
FlyBase <sup>a</sup> GenAtlas		A Database of Drosophila Genes & Genomes A database on genes, functions and related	http://flybase.org/ http://genatlas.medecine.univ-paris5.fr/	[72] [73]
-		diseases		
Genol ist		The Human Gene Database Integrated environment for the analysis of	http://www.genecards.org/ http://genodh.pasteur.fr/coi-hin /WehOhiects/	[75]
		microbial genomes		5
Gramene		A comparative resource for plants	http://www.gramene.org/	[76]
HGNC		HUGO Gene Nomenclature Committee	http://www.genenames.org/	[78]
HPA		Database The Human Protein Atlas	http://www.proteinatlas.org/	[62]
				1

Table 1 (continued)

Category	DB short name	DB name	URLS	Ref.
	HUGE	A Database of Human Unidentified Gene- Encoded Large Proteins	http://www.kazusa.or.jp/huge/	[80]
	LegioList	Legionella pneumophila genome database	. ` .	[81]
	Leproma MaizeGDB	Mycobacterium reprae genome database Maize Genetics and genomics Database	http://www.maizegdb.org/	[83] [83]
	$\mathrm{MGD}^{a}$	Mouse Genome Database	. ` `	[84]
	Micado	MICrobial Advanced Database Organization	http://genome.jouy.inra.fr/cgi-bin/micado/ index.cgi	[82]
	OMIM	Online Mendelian Inheritance in Man	. `	[98]
	neXtProt <sup>a</sup>	Exploring the universe of human proteins	· ` .	[87]
	Orpnanet	t ne portai for rare diseases and orpnan drugs	<pre>nttp://www.orpna.net/consor/cgl-bm/nome. php?Lng=GB</pre>	[00]
	PharmGKB	The Pharmacogenomics Knowledgebase	. `	[88]
	PomBase	The scientific resource for fission yeast	http://www.pombase.org/	[06]
	PseudoCAP	The Pseudomonas Genome Database		[91]
	RGD	Rat Genome Database	http://rgd.mcw.edu/	[92]
	Rouge	A Database of Rodent Unidentified Gene-	http://www.kazusa.or.jp/rouge/	[80]
		Encoded Large Proteins		
	SGD	Saccharomyces Genome Database	http://www.yeastgenome.org/	[93]
	IAIK	The Arabidopsis Information Resource	http://www.arabidopsis.org/	[46]
	LubercuList	Mycobacterium tuberculosis strain H3/ Kv	http://tuberculist.epfi.ch	[c <sub>6</sub> ]
	WormBase	genome database C. elegans and related nematodes genetics and	http://www.wormbase.org/	[69]
	Total Base	genomics database	11. W.	
	Xenbase	Xenopuslaevis and tropicalis biology and	http://www.xenbase.org/	[96]
	ZFIN	genomics resource The Zebrafish Model Organism Database	http://zfm.org/	[26]
Phylogenomic	eggNOG	Database of orthologous groups and functional	http://eggnog.embl.de/	[86]
databases	HOGENOM	annotation Database of Homologous Genes from Fully	http://pbil.univ-lyon1.fr/databases/hogenom/	[66]
	HOVERGEN	Sequenced Organisms Homologous Vertebrate Genes Database	home.php http://pbil.univ-lyon1.fr/databases/hovergen.	[100]
			html	
	InParanoid KO	Eukaryotic Ortholog Groups with inparalogs Kyoto encyclopedia of genes and genomes	http://inparanoid.sbc.su.se/ http://www.genome.jp/kegg/	[101] [102]
	OMA	orthology The OMA orthology database	http://omahrowser.org/	[103]
	OrthoDB PhylomeDB	Database of Orthologous Groups Database for complete catalogs of gene	http://cegamige.ch/orthodb6	[104]
		phylogenies (phylomes)	/8	
	TreeFam	Database of animal gene trees	http://www.treefam.org	[106]

Polymorphism and	BioMuta	Single-nucleotide variation and disease	https://hive.biochemistry.gwu.edu/tools/	[107]
	dbSNPª DMDM	Database of Short Genetic Variations Domain Mapping of Disease Mutations	https://www.ncbi.nlm.nih.gov/SNP/ http://bioinf.umbc.edu/dmdm/	[12] [108]
Protein-protein interaction databases	BioGRID DIP IntAct* MINT STRING	The Biological General Repository for Interaction Datasets Database of Interacting Proteins IntAct Molecular Interaction Database The Molecular INTeraction database Search Tool for the Retrieval of Interacting Genes/Proteins	http://thebiogrid.org http://dip.doc-mbi.ucla.edu/ http://www.ebi.ac.uk/intact/ http://mint.bio.uniroma2.it/mint/ http://string-db.org	[109] [110] [111] [112] [113]
Proteomic databases	MaxQB PaxDb PeptideAtlas <sup>a</sup> PRIDE <sup>a</sup> ProMEX	The MaxQuant DataBase Protein Abundance Across Organisms PeptideAtlas PRoteomics IDEntifications database Protein Mass spectra EXtraction	http://maxqb.biochem.mpg.de/mxdb/ http://pax-db.org http://www.peptideatlas.org http://www.ebi.ac.uk/pride http://promex.ph.univie.ac.at/promex/	[114] [115] [116] [117] [118]
PTM databases	DEPOD <sup>a</sup> iPTMnet <sup>a</sup> PhosPhAt <sup>a</sup> Phospho.ELM <sup>a</sup> PhosphoGrid <sup>a</sup> PhosphoSitePlus <sup>a</sup> UniCarbKB <sup>a</sup>	The Human DEPhOsphorylation Database Protein post-translational modifications (PTMs) in systems biology context. The Arabidopsis Protein Phosphorylation Site Database Database of S/T/Y phosphorylation sites Database of experimentally verified in vivo protein phosphorylation sites Phosphorylation site database Database of glycomics and glycobiology	http://www.koehnlab.de/depod/index.php http://proteininformationresource.org/ iPTMnet/ http://phosphat.uni-hohenheim.de http://www.phospho.elm.eu.org http://www.phosphogiid.org http://www.phosphosite.org	[119] [120] [121] [122] [123] [124] [125]
Ontology	GO⁴ PRO	Gene Ontology Protein Ontology	http://www.geneontology.org/ http://pir.georgetown.edu/pro/pro.shtml	[126] [127]

(continued)

Table 1 (continued)

Category	DB short name	DB name	URLs	Ref.
Specialized protein databases	Allergome CAZy ESTHER	Allergome: platform for allergen knowledge Carbohydrate-Active enZYmes Database ESTerases and alpha/beta-Hydrolase Enzymes	http://www.allergome.org/ http://www.cazy.org/ http://bioweb.ensam.inra.fr/ESTHER/	[128] [129] [130]
	GPCRDB	Information system for G protein-coupled receptors (GPCRs)	butp://www.gpcr.org/7tm/	[131]
	IMGT	The International ImMunoGeneTics information system	http://www.imgt.org/	[132]
	MEROPS <sup>a</sup> MoonProt	MEROPS protease database Moonlighting protein database	http://merops.sanger.ac.uk/ http://www.moonlightingproteins.org/	[133] [134]
	mycoCLAP	Characterized Lignocellulose-Active Proteins of Fungal Origin	https://mycoclap.fungalgenomics.ca/ mycoCLAP/	[135]
	PeroxiBase REBASE TCDB	The peroxidases database The Restriction Enzyme Database Transporter Classification Database	http://peroxibase.toulouse.inra.fr/ http://rebase.neb.com/rebase/rebase.html http://www.tcdb.org/	[136] [137] [138]
Other (Miscellaneous) databases	ChiTaRS EvolutionaryTrace	Database of chimeric transcripts and rna-seq data Database of relative evolutionary importance of	http://chitars.bioinfo.cnio.es/ http://mammoth.bcm.tmc.edu/ETserver.html	[139] [140]
	$GeneWiki^a$	annio actas within a protein sequence Wiki portal for the annotation of gene and protein function	http://en.wikipedia.org/wiki/Portal:Gene_Wiki	[141]
	GenomeRNAi	Database of phenotypes from RNA interference screens in Drosophila and Homo sariens	http://genomernai.dkfz.de/GenomeRNAi/	[142]
	PMAP-CutDB SOURCE	Proteolytic event database The Stanford Online Universal Resource for Clones and ESTs	http://www.proteolysis.org/ http://smd.princeton.edu/cgi-bin/source/ sourceSearch	[143]

<sup>&</sup>lt;sup>a</sup>Databases covered in the Subheading 3 of the chapter

databases, organism-specific databases, phylogenomic databases, polymorphism and mutation databases, protein-protein interaction databases, proteomic databases, PTM databases, ontologies, specialized protein databases, and other (miscellaneous) databases. Please visit http://proteininformationresource.org/staff/chenc/MiMB/dbSummary2015.html to access the databases reviewed in this chapter through their corresponding web addresses (URLs). For many of these databases, their identifiers can be mapped to UniProtKB protein AC/IDs [7]. Our coverage of protein bioinformatics databases in this chapter is by no means exhaustive. Our intention is to cover databases that are recent, high quality, publicly available, and are expected to be of interest to more users in the community. It is worth noting that certain databases can be classified into more than one category.

As an update to our previously contributed MiMB series chapter [8], we now focus on databases that are aligned with the content of this book and emphasize the types of data stored and related data access and data analysis supports. For each category of databases listed in Table 1, we select some representatives and describe them briefly in Subheading 2. In Subheading 3, we discuss the challenges and opportunities for developing next-generation protein bioinformatics databases and resources to support data integration and data analytics in Big Data era. We conclude the chapter in Subheading 4.

### 2 Databases and Resources Highlights

# 2.1 Sequence Databases

2.1.1 RefSeq

The National Center for Biotechnology Information Reference Sequence (NCBI RefSeq) database [13] provides curated nonredundant sequences of genomic regions, transcripts, and proteins for taxonomically diverse organisms including Archaea, Bacteria, Eukaryotes, and Viruses. RefSeq database is derived from the sequence data available in the redundant archival database GenBank [12]. RefSeq sequences include coding regions, conserved domains, variations etc. and enhanced annotations such as publications, names, symbols, aliases, Gene IDs, and database cross-references. The sequences and annotations are generated using a combined approach of collaboration, automated prediction, and manual curation [13]. The RefSeq release 73 on November 6, 2015 includes 54,766,170 proteins, 12,998,293 transcripts, and 55,966 organisms. The RefSeq records can be directly accessed from NCBI web sites by search of the Nucleotide or Protein databases, BLAST searches against selected databases, and FTP downloads. RefSeq records are also available through indirect links from other NCBI resources such as Gene, Genome, BioProject, dbSNP, ClinVar, Map Viewer, etc. In addition, RefSeq supports programmatic access through Entrez Programming Utilities [145].

2.1.2 UniProt

The UniProt Consortium consists of research teams from the European Bioinformatics Institute (EBI), the Swiss Institute of Bioinformatics (SIB), and the Protein Information Resource (PIR). The UniProt Consortium provides a central resource for protein sequences and functional annotations with four core database components to support protein bioinformatics research.

- 1. The UniProt Knowledgebase (UniProtKB) is the predominant data store for functional information on protein sequences with rich and accurate annotations (protein name or description, taxonomic information, classification, crossreference and literature citation) [14]. The UniProtKB consists of two parts: UniProtKB/Swiss-Prot, which contains manually annotated records with information extracted from the literature and curator-evaluated computational analysis, and UniProtKB/TrEMBL, which contains computationally analyzed records with automatic annotation and classification. Comparative analysis and query for proteins are supported by UniProtKB extensive cross-references, functional and feature annotations, classification, and literature-based evidence attribution. The 2015\_12 release on December 09, 2015 of UniProtKB/Swiss-Prot contains 550,116 sequence entries, comprising 196,219,159 amino acids, and 55,270,679 UniProtKB/TrEMBL sequence entries comprising 18,388,518,872 amino acids.
- 2. The UniProt Archive (UniParc) [146] is a comprehensive and non-redundant archival protein sequence database from all major publicly accessible resources. UniParc contains protein sequences and cross-references to their source databases. UniParc stores each unique protein sequence with a stable and unique identifier and tracks sequence changes in its source databases.
- 3. The UniProt Reference Clusters (UniRef) [147] are clustered sets of sequences from the UniProt Knowledgebase (including isoforms) and selected UniParc records. UniRef merges sequences and sub-fragments with 100 % (UniRef100), ≥90 % (UniRef90), or ≥50 % (UniRef50) identity and 80 % overlap with the longest sequences in the cluster (seed) into a single UniRef entry and select the highest ranked protein sequences as the cluster representatives.
- 4. The UniProt Proteomes [14] provides sets of proteins that are considered to be expressed by organisms whose genomes have been completely sequenced. A UniProt proteome consists of all UniProtKB/Swiss-Prot entries plus those UniProtKB/TrEMBL entries mapped to Ensembl Genomes for that proteome. Some well-studied model organisms and other organisms of interest to biomedical research and phylogeny have been manually and computationally [148] selected as reference proteomes.

The UniProt web site (http://www.uniprot.org) is the primary access point to its data and documentation. The site provides batch retrieval using UniProt identifiers; BLAST-based sequence similarity search; Clustal Omega-based sequence alignment; and Database identifier mapping [7]. The UniProt FTP download site provides batch download of protein sequence data in various formats, including flat file TEXT, XML, RDF and FASTA. Programmatic access to data and search result is supported via RESTful web services. For more details about UniProt databases, we refer the readers to Chapter 2 of this book.

2.2 2D Gel Databases: World-2DPAGE The World-2DPAGE Constellation [18] is an effort of the Swiss Institute of Bioinformatics to promote and publish two-dimensional gel electrophoresis proteomics data online through the ExPASy proteomics server. The World-2DPAGE Constellation consists of three components:

- 1. World-2DPAGE List (http://world-2dpage.expasy.org/list/) contains references to known federated 2-D PAGE databases, as well as to 2-D PAGE-related servers and services.
- 2. World-2DPAGE Portal (http://world-2dpage.expasy.org/portal/) is a dynamic portal that serves as a single interface to query simultaneously worldwide gel-based proteomics databases that are built using the Make2D-DB package [149].
- 3. World-2DPAGE Repository (http://world-2dpage.expasy.org/repository/) is a public repository for gel-based proteomics data with protein identifications published in the literature. Mass-spectrometry-based proteomics data from related studies can also be submitted to the PRIDE database [117] so that interested readers can explore the data in the views of 2D-gel and/or MS.

The World-2DPAGE Constellation also provides a set of tools:

- 1. **Make2D-DB package** (ver. 3.10.2) is open source packages that can be used to build a user's own 2-DPAGE web site, access and integrate federated 2D-PAGE databases, portals, or data repositories.
- 2. **Melanie Viewer** (ver. 7.0) is a free viewer that can be used to visualize gels and related data obtained through the use of the full version of Melanie 2D electrophoresis gel analysis software.
- 3. **MIAPEGeIDB** can be used to produce MIAPE-compliant gel experiments documents.

2.3 3D Structure
Databases: wwPDB

The worldwide PDB (wwPDB, http://www.wwpdb.org) [150] was established in 2003 as an international collaboration to maintain a single and publicly available Protein Data Bank Archive

(PDB Archive) of macro-molecular structural data. The wwPDB member includes Protein Data Bank in Europe (PDBe) [22], Protein Data Bank Japan (PDBj) [23], Research Collaboratory for Structural Bioinformatics Protein Data Bank (RCSB PDB) [26], and Biological Magnetic Resonance Bank (BMRB) [151]. The "PDB Archive" is a collection of flat files in three different formats: the legacy PDB format; the PDBx/mmCIF (http://deposit.pdb. org/mmcif/) format; and the Protein Data Bank Markup Language (PDBML) [152] format. Each member site serves as a deposition, data processing, and distribution site for the PDB Archive, and each provides its own view of the primary data and a variety of tools and resources. As of December 1, 2015, there are 113,971 biological macromolecular structures in the wwPDB database including 37,049 distinct protein sequences, 30,099 structures of human sequences, 8,096 Nucleic Acid containing structures.

## 2.4 Chemistry Databases: ChEMBL

ChEMBL [29] is a large-scale bioactivity database containing binding, functional, in vivo absorption, distribution, metabolism, excretion, and toxicity (ADMET) information about drug-like bioactive compounds. ChEMBL data are manually curated from the published literature together with data drawn from other databases. ChEMBL data are standardized for using in many types of chemical biology and drug-discovery research problems. ChEMBL database can be accessed from a web-based interface where a variety of search and browsing functionality are provided. ChEMBL data are freely available from their FTP site in the formats of Oracle, MySQL, PostgreSQL, structure-data file (SDF), FASTA, and RDF. Programmatic access is also supported by a set of RESTful web services. The ChEMBL release 20 (prepared on Jan 14, 2015) contains 1,715,135 compound records, 1,463,270 compounds (of which 1,456,020 have mol files), 13,520,737 activities, 1,148,942 assays, 10,774 targets, and 59,610 documents.

# 2.5 Enzyme and Pathway Databases

2.5.1 MetaCyc and BioCyc

MetaCyc is a reference database of nonredundant, experimentally elucidated metabolic pathways and enzymes curated from the scientific literature [31]. MetaCyc stores pathways, compounds, proteins, protein complexes, and genes associated with these pathways with extensive links to protein sequence databases, nucleic acid sequence databases, protein structure databases, and literature. MetaCyc can also be used as a reference database to predict the metabolic network in sequenced genomes using Pathway Tools software [153] and machine-learning methods [154]. The 2015 release of MetaCyc includes 2,411 metabolic pathways, 13,074 reactions, 10,789 enzymes, 10,928 genes, 12,792 chemical compounds, 2,740 organisms, and 47,838 citations.

BioCyc is a collection of Pathway/Genome Databases (PGDBs) [31]. Each BioCyc PGDB contains the metabolic network of one organism predicted by the Pathway Tool software

using MetaCyc as a reference database. The BioCyc databases are organized into three tiers: Tier 1 databases are those that have received at least one person-year of literature-based curation. Tier 2 and Tier 3 databases are computationally predicted metabolic pathways. Web-based query, browsing, visualization, and comparative analysis tools are also provided from MetaCyc and BioCyc web sites. A collection of data files in different formats is provided for download. BioCyc also provides RESTful web services, MySQL server and Perl, Java, and Lisp APIs access to its data. The 2015 release of BioCyc includes 7,667 Pathway/Genome Databases.

2.5.2 BRENDA

BRENDA (BRaunschweig ENzyme DAtabase) [32] is an information system for functional and molecular properties of enzymes and enzyme-ligands obtained by manual extraction from literature, text and data mining, data integration, and computational predictions. BRENDA stores enzyme data in textual, single numeric, numeric range, and graphic formats. The content of BRENDA is based on the IUBMB (International Union of Biochemistry and Molecular Biology) enzyme classification system. BRENDA includes the following databases generated by a text mining approach:

- 1. **KENDA** contains kinetic values and kinetic expressions mined from PubMed abstracts.
- 2. **DRENDA** contains disease-related enzyme information (causal interaction, therapeutic application, diagnostic usage, and ongoing research) mined from PubMed abstracts using MeSH terms.
- 3. **FRENDA** contains references found in PubMed abstracts that have the enzyme name and organism combination.
- 4. **AMENDA** is a subset of FRENDA providing organism-specific information on the enzyme sources and the subcellular localization.

The user can access the data and information in BRENDA by searching (Quick Search, Advanced Search, Full text Search, Substructure Search, and Sequence Search) and browsing (TaxTree Explorer, EC Explorer, Ontology Explorer, and Genome Explorer). The search results can be downloaded as CSV file. The BRENDA release 2015.2 in July 2015 contains 6,759 enzymes.

2.5.3 Reactome

Reactome [34] is an open source, expert-curated, and peer-reviewed database of biological reactions and pathways with cross-references to major molecular databases. Reactome provides the visual representation of classical intermediary metabolism, signaling, innate and acquired immune function, transcriptional regulation, apoptosis and disease process, etc. The Reactome website supports the navigation of pathway knowledge and pathway-based

analysis and visualization of experimental or computational data. Interaction, reaction, and pathway data are downloadable as flat file, MySQL, BioPAX, SBML, and PSI-MITAB files. They are also accessible through RESTful web services. Software tools such as Pathway Browser, Analyze Data, Species Comparison, and Reactome FI Network are provided to support data mining and analysis of large-scale data sets. The Reactome release 54 in September 2015 contains 101,670 proteins, 74,357 complexes, 68,659 reactions, and 20,261 pathways.

# 2.6 Family and Domain Databases

2.6.1 InterPro

InterPro [40] is an integrated resource of predictive models or "signatures" representing protein domains, families, regions, repeats, and sites from major protein signature databases including CATH-Gene3D [38], HAMAP [37], PANTHER [41], Pfam[42], PIRSF [43], PRINTS [44], ProDom [45], PROSITE [46], SMART [48], SUPERFAMILY [49], and TIGRFAMs [50]. Each entry in the InterPro database is annotated with a descriptive abstract name and cross-references to the original data sources, as well as to specialized functional databases. The search by sequence or domain architecture is provided by the InterPro web site. The InterPro signatures in XML format are available via anonymous FTP download. InterPro also provides a software package InterProScan [155] that can be used locally to scan protein sequences against InterPro's signatures. Programmatic access to InterProScan is possible via RESTful and SOAP web service APIs. The InterPro BioMart [156] allows users to retrieve InterPro data from a query-optimized data warehouse that is synchronized with the main InterPro database, and to build simple or complex queries and control the query results through a unified interface. The InterPro release 54.0 on October 15, 2015 includes 28,462 entries containing signatures of 19,110 families, 8,191 domains, 284 repeats, 115 active sites, 74 binding sites, 672 conserved sites, and 16 PTMs.

2.6.2 Pfam

Pfam is a database of protein families represented as multiple sequence alignments and Hidden Markov Models (HMMs) [42]. Pfam entries can be classified as Family (related protein regions), Domain (protein structural unit), Repeat (multiple short protein structural units), or Motifs (short protein structural unit outside global domains). Related Pfam entries are grouped into clans based on sequence, structure, or profile-HMM similarity. The Pfam database web site provides a search interface for querying by sequence, keyword, domain architecture, or taxonomy, and browse interfaces for analyzing protein sequences for Pfam matches and viewing Pfam annotations in domain architectures, sequence alignments, interactions, species, and protein structures in PDB[26]. The Pfam data can be downloaded from its FTP site or programmatically accessed through RESTful web service APIs. The Pfam release 28.0 in May 2015 contains 16,230 families.

2.6.3 PIRSF

The PIRSF classification system [43] provides comprehensive and non-overlapping clustering of UniProtKB [14] sequences into a hierarchical order to reflect their evolutionary relationships based on whole proteins rather than on the component domains. The PIRSF system classifies the protein sequences into families, whose members are both homologous (evolved from a common ancestor) and homeomorphic (sharing full-length sequence similarity and a common domain architecture) [43]. The PIRSF family classification results are expert-curated based on literature review and integrative sequence and functional analysis. The classification report shows the information on PIRSF members and general statistics, family and function/structure relationships, database crossreferences, and graphical display of domain and motif architecture of seed members or all members. The web-based PIRSF system has been demonstrated as a useful tool for studying the function and evolution of protein families [43]. It provides batch retrieval of entries from the PIRSF database. The PIRSF scan allows searching a query sequence against the set of fully curated PIRSF families with benchmarked Hidden Markov models. The PIRSF membership hierarchy data is also available for FTP download. The current release of PIRSF contains 11,800 families, which cover 5,407,000 UniProtKB protein sequences.

2.6.4 PROSITE

PROSITE [46] is a database of documentation entries describing protein domains, families, and functional sites as well as associated patterns and profiles to identify them. The entries are derived from multiple alignments of homologous sequences and have the advantage of identifying distant relationships between sequences. PROSITE includes a collection of ProRules based on profiles and patterns of functionally and/or structurally critical amino acids that can be used to increase PROSITE's discriminatory power [46]. The PROSITE web site provides keyword-based search and allows browsing by documentation entry, ProRule description, taxonomic scope, and number of positive hits. The software tool ScanProsite [157] supports three options for users to scan proteins for matches to PROSITE motifs or their own sequence patterns: (1) scan protein sequence against the PROSITE motifs; (2) scan motifs against a protein sequence database; (3) submit protein sequences and motifs and scan them against each other. The PROSITE documentation entries and related tools can be downloaded from its FTP site. The PROSITE release 20.120 on November 4, 2015 contains 1,742 documentation entries, 1,309 patterns, 1,139 profiles, and 1,138 ProRules.

2.7 Gene Expression Databases: Expression Atlas The Expression Atlas database [54] provides gene, protein, and splice variant expression patterns in different cell types, organism parts, biological and experimental conditions. The high quality Microarray and RNA-Seq data imported from ArrayExpress[158]

and Gene Expression Omnibus [12] were manually curated, annotated, and processed using standardized analysis methods to detect the expression patterns under the original experimental conditions. Expression Atlas consists of two components: Baseline Atlas and Differential Atlas. The Baseline Atlas is about genes and their expression pattern under "normal" conditions using only RNA-Seq data. The Differential Atlas is about genes that are up- or down-regulated in differential biological or experimental conditions using both Microarray and RNA-Seq data. Expression Atlas web interface supports queries of both the Baseline Atlas and Differential Atlas by gene, protein, and splice variant. Searches for sample attributes and experimental conditions are also supported. All Expression Atlas analysis results can be downloaded from their FTP site. The differential expression data and meta-data can be used in the R Bioconductor (https://www.bioconductor.org/) package. The APIs to programmatically access Expression Atlas are under development. The October 29, 2015 release of Expression Atlas contains 2,373 datasets (93,057 assays).

## 2.8 Genome Annotation Databases

2.8.1 Ensembl

Ensembl is a genome annotation database that provides up-to-date annotations for chordates and model organism genomes [55]. Additional metazoan genomes are available from EnsemblMetazoa [56], plant and fungal genomes are available from EnsemblPlants [56] and EnsemblFungi [56], unicellular eukaryotic and prokaryotic genomes are available from EnsemblProtists [56] and EnsemblBacteria [56]. Ensembl supports a variety of access routes to their data. Small data sets can be exported from online search results. Large datasets or complex analyses can be accessed from MySQL server, Perl, and RESTful APIs. Complex cross databases queries are supported by the BioMart data mining tool [156]. The whole database can be downloaded from an FTP site in FASTA, EMBL, GenBank, GVF, VCF, VEP, GFF formats or through MySQL dumps. In addition, Ensembl also provides a set of data processing software tools, for example, Variant Effect Predictor, BLAST/BLAT, Assembly converter, ID History converter, etc. The Ensembl release v83 in September 2015 contains 69 species with annotations for gene and transcript, gene sequence evolution, genome evolution, sequence and structural variants, and regulatory elements.

2.8.2 Entrez Gene

Entrez Gene [57] is a NCBI gene-specific database that provides GeneIDs (unique integer identifiers) for genomes that have been completely sequenced. The data in Entrez Gene database (nomenclature, map location, gene products and attributes, markers, phenotypes, citations, sequences, variations, maps, expression, homologs, protein domains, etc.) are results of manual curation and automated computational analysis of data from RefSeq [13]

and many other NCBI databases [12]. The data in Entrez Gene database can be accessed in several ways: (1) query Entrez from the NCBI home page and display the results in Gene, (2) enter a query in any Entrez query bar and restrict the database search to Gene, (3) cross links from other NCBI resources such as GenBank, BLAST, RefSeq, or Map Viewer. Entrez Gene data can be downloaded from the NCBI FTP site and accessed by Entrez Programming Utilities [145]. The Entrez Gene release on December 4, 2015 includes 13,778 taxa and 12,841,400 genes.

2.8.3 UCSC

UCSC Genome Browser database [60] contains large collections of genome assemblies and annotations for vertebrate and selected model organisms. The major sources of genome annotations include RefSeq, GENCODE, Ensembl, GenBank, ENCODE, RepeatMasker, dbSNP, the 1000 Genome project and other resources. In addition to Genome Browser, the UCSC bioinformatics group also provides web-based and command-line-based tools to facilitate the use of genome annotation data. For example, BLAT can be used to quickly find sequences of 95 % and greater similarity and 25 bases or more in length. The Table Browser can retrieve the data associated with a track in Genome Browser and calculate intersections between tracks. The Variant Annotation Integrator can associate UCSC Genome Browser annotations with the user-uploaded variants. The Gene Sorter can be used to show expression, homology, and other information on groups of genes. User data can be viewed together with UCSC annotations via "custom track," "track data hubs," "assembly hub," and "Genome Browser in a Box (GBiB)" [159]. Genome data and source codes are downloadable. UCSC Genome Bioinformatics group also provides public MySQL server access. Currently (December 11, 2015), there are 95 genomes in the UCSC Genome Browser database.

# 2.9 Organism Specific Databases

2.9.1 FlyBase

FlyBase [72] is a database of *Drosophila melanogaster* related genetic and genomic information. The sequence and annotation data for *Drosophila melanogaster* genome assembly can be downloaded from the FlyBase FTP site in multiple formats (GFF3, FASTA, GTF, Chado XML, and Chado PostgreSQL dump). FlyBase uses generic genome browser 2 (GBrowse 2) to display the genome annotations and genome-aligned evidence on the reference genome assembly. FlyBase database can be searched for genes, alleles, aberrations, and other genetic objects, phenotypes, sequences, stocks, images and movies, and controlled terms. FlyBase provides a standalone BLAST server for 50 different arthropod genomes and supports query results analysis such as hit list refinement and batch download. The latest FlyBase is FB2015\_05 released on November 20, 2015 that consists of 212,991 references, 141,104 stocks, and 1,258 images.

2.9.2 MGD

The Mouse Genome Database (MGD) [84] is a database of integrated genomic, genetic, and biological data on the laboratory mouse that is a model for translational research. MGD integrates mouse genome annotations from NCBI, Ensembl, and Havana into a single non-redundant resource. MGD is the authoritative source for the unified catalog of mouse genome features, Gene Ontology (GO) annotations (functional associations) of mouse protein-coding genes, and mouse phenotype annotations. The Human-Mouse: Disease Connection (http://www.diseasemodel. org) is a translational research tool that provides simultaneous access to human-mouse genomic, phenotypic, and genetic disease information. MGD uses a powerful new genome browser called JBrowse [160] to integrate mouse gene and protein annotations with large-scale sequence data. In addition to online search tools for genes, genome features and maps, phenotypes, alleles and disease models, gene expression, GO functional annotations, strains, SNPs and polymorphisms, sequences, references, and vocabularies, MGD also provides bulk data download as FTP reports and batch query tool and programmatic access by Web services and BioMart [156]. MGD is updated on a weekly basis.

2.9.3 neXtProt

neXtProt [87] is a new protein-centric knowledge platform and serves as a central hub for all knowledge about human proteins. neXtProt integrates high-quality and manually curated UniProt/ Swiss-Prot entries with large amount of additional human proteinrelated information from other resources such as Human Protein Atlas [79], ArrayExpress [158], UniGene [12], PeptideAtlas [116], Gene Ontology Annotation [126], Ensembl [55], dbSNP [12], etc. Ontologies and controlled vocabularies (CVs) are extensively used in neXtProt to support consistent annotation and data retrieval. neXtProt's Google-like search interface supports free text search and complex queries with results displayed as lists or short summaries. neXtProt provides export functionality for protein entries in TEXT, Excel, FASTA, and XML formats and bulk download from the FTP site. neXtProt release on September 1, 2015 contains 20,066 protein entries, 153,556 controlled vocabularies, and 465,706 publications.

2.10 Phylogenomic Databases: OMA

The Orthologous Matrix (OMA) [103] is a method and associated database that infers evolutionary relationships among complete proteomes. OMA's inference algorithm includes three steps: (1) infer homologous sequences (sequences of common ancestry); (2) infer orthologous pairs (subsets of homologs related by speciation events); (3) cluster orthologs into: (a) OMA groups (cliques of orthologous pairs) and (b) HOGs (groups of genes descended from a common ancestral gene in a given taxonomic range). OMA can be accessed through the OMA browser and programmatic interfaces. OMA genomes including all-against-all computations

can be downloaded with an OMA stand-alone program to do orthology prediction using the user's custom data. The OMA release in September 2015 contains 1,970 species, 1,001,242 OMA groups, and 10,129,468 proteins.

# 2.11 Polymorphism and Mutation Databases: dbSNP

The NCBI dbSNP database [12] is a database for short genetic variations from a variety of organisms. dbSNP catalogs single nucleotide variations, short nucleotide insertions and deletions, short tandem repeats, and microsatellites. The dbSNP homepage provides a search interface for querying variations by simple term or complex queries. The details of matched variation records are displayed as the Reference SNP Cluster Report that contains a summary of the allele, mapping information in Human Genome Variation Society (HGVS) nomenclature, gene-centric view, map table with chromosomal coordinates, variation view, and link to the 1000 Genomes Browser. dbSNP integrates disease-related variations collected by OMIM [86]. dbSNP variation data are accessible through links from other NCBI databases. dbSNP data can also be downloaded from a FTP site and accessed by EUtils API (https:// www.ncbi.nlm.nih.gov/books/NBK25500/). dbSNP build 146 on November 24, 2015 for Homo sapiens contains 150,482,731 RefSNP Clusters; among them 100,135,281 are validated.

### 2.12 Protein-Protein Interaction Databases: IntAct

IntAct [111] is an open source database and toolkit for the storage, presentation, and analysis of rich curated molecular interaction data in community accepted standard formats. IntAct provides relevant experimental details of protein interactions curated from literature or directly deposited. All the entries in the database are fully compliant with the IMEx [162] guidelines and MIMIx [163] standard. The IntAct web site provides multiple search functionalities: (1) search by anything that might be related to interactions, for example, gene name, identifiers, GO term, publication, and experimental method etc.; (2) search on four ontologies: Gene Ontology [126], InterPro [40], PSI-MI [164], ChEBI [165]; (3) draw all or part of a chemical structure and search for chemical compounds. IntAct data is released monthly and available as FTP download. IntAct release 194 on December 2, 2015 consists of 577,297 binary interactions from 13,952 curated publications and 1,378 biological complexes.

# 2.13 Proteomics Databases

2.13.1 PeptideAtlas

PeptideAtlas [116] provides an approach and framework to archive proteomic data that enables the data exchange and integration with genomic data. PeptideAtlas statistically validates peptides identified by high-throughput tandem mass spectrometry (MS/MS) experiments and maps peptide sequences to eukaryotic genomes. PeptideAtlas uses a uniform statistical validation process to ensure consistent and high-quality peptide and protein identifications. The raw data used to build PeptideAtlas includes raw

MS/MS files, MS/MS files in mzXML[166] format, and SEQUEST [167] search results. The user can also download PeptideProphet [168] results and ProteinProphet [169] outputs. The PeptideAtlas builds are available for download or browsing via the PeptideAtlas web interface. As of December 7, 2015, there are in total 72 builds covering 19 organisms.

2.13.2 PRIDE

The PRoteomics IDEntifications database (PRIDE) [117] is a repository for mass-spectrometry based proteomics data including identifications of proteins, peptides, and post-translational modifications that have been described in the scientific literature, together with supporting mass spectra and related technical and biological metadata. PRIDE supports tandem MS (MS/MS) and Peptide Fingerprinting datasets with search/analysis workflows originally analyzed by the submitters. PIRDE provides several services such as the Protein Identifier Cross-Reference (PICR) [170], the Ontology Lookup Service (OLS) [171], and Database on Demand [172]. The data in PRIDE database can be accessed in different ways: (1) The PRIDE web interface can be used to explore all public datasets currently available in the repository; (2) Batch data retrieval and integration with other databases can be achieved by PRIDE BioMart [156]; (3) PRIDE public experiments data in mzData (http://www.psidev.info/mzdata) and PRIDE XML formats can be downloaded via FTP, Aspera, and HTTP; (4) A set of RESTful web services can be used to get programmatic access to data in the PRIDE repository. PRIDE supports submissions of protein and peptide identification/quantification data with the accompanying mass spectral evidence by following ProteomeXchange (PX) consortium [173] guidelines. PRIDE also provides a set of software tools: PRIDE Converter 2 for converting common mass spectrometry data formats into PRIDE XML for data submission, and PRIDE Inspector for visualizing and analyzing MS dataset, such as mzML [174], mzIdentML (http://www. psidev.info/mzidentml), and PRIDE XML. As of December 8, 2015, PRIDE repository includes 3,774 projects and 55,873 assays.

### 2.14 PTM Databases

2.14.1 DEPOD

The human DEPhOsphorylation Database (DEPOD) [119] is a comprehensive, high-quality, manually curated database for human phosphatases, their experimentally verified protein and non-protein substrates, dephosphorylation sites, involved pathways with cross-references to kinases, and small molecule modulators. The human phosphatase substrate information is integrated from a variety of sources including "dephosphorylation" post-translational modification data in Human Protein Reference Database [175], "dephosphorylation" interaction data from PSICQUIC service [176], substrate information from UniProt annotation [14], and scientific literature from PubMed and Google. DEPOD database can be browsed by human phosphatases, protein substrates, non-protein

substrates, pathways, and phosphatase-substrate networks. DEPOD also allows direct deposit of substrate candidates for human active phosphatases. The human active phosphatase data can be downloaded in XSLX format. The human phosphatase-substrate interaction and dephosphorylation sites data are available for download in PSI-MI Tab 2.5 format. In addition, phosphatases and substrates mapped onto KEGG [58], NCI Nature PID and Reactome [34] pathways are available in TXT format. The latest release of DEPOD on August 15, 2015 contains 228 human active and 11 inactive phosphatases (194 phosphatases have substrate), 298 protein substrates, 89 nonprotein substrates, 1,096 dephosphorylation interactions, 213 KEGG pathways, 206 NCI Nature PID pathways, and 560 Reactome pathways.

2.14.2 iPTMnet

iPTMnet [120] is an integrated resource for protein posttranslational modification network discovery that combines text mining, data mining, and ontological representation to capture rich PTM information, including PTM enzyme-substrate relationships, PTM-specific protein-protein interactions (PPIs), and PTM conservation across species to support PTM analysis in the context of systems biology. It employs the RLIMS-P [177] and eFIP [178] text mining tools developed by the PIR group for fullscale mining of PubMed abstracts to identify PTM information (kinase, substrate, and site) and phosphorylation-dependent PPIs. Experimentally observed PTMs, including high-throughput proteomic data from curated PTM databases, are incorporated. Proteins and PTM protein forms (proteoforms) are organized using the Protein Ontology (PRO) [127], enabling representation and annotation of forms modified on combinations of PTM sites and orthologous relationships between forms. iPTMnet thus serves as an integrated resource that connects knowledge about biologically relevant modified proteins from disparate sources. Covering seven major PTM types (phosphorylation, acetylation, ubiquitination, methylation, glycosylation, sumoylation, and myristoylation), the current iPTMnet database contains more than 250,000 PTM sites in more than 45,000 modified proteins, along with more than 1,000 PTM enzymes for human, mouse, rat, yeast, Arabidopsis, and several other organisms. The web portal supports online search and visual analysis for scientific queries. For more details about iPTMnet database, we refer the readers to Chapter 16 of this book.

2.14.3 PhosPhAt

The Arabidopsis Protein Phosphorylation Site Database (PhosPhAt) [121] catalogs published information on large-scale mass spectrometry experiments that have identified phosphorylation sites in Arabidopsis. It contains information about the peptides, their annotated biological functions, and experimental and analytical contexts as well as information about kinase-substrate relationships manually

curated from the literature. In addition, PhosPhAt provides a plant-specific phosphorylation site predictor trained using serine, threo-nine, and tyrosine phosphorylation (pSer, pThr, pTyr) experimental data. The user can access the precomputed prediction using Arabidopsis gene identifiers or do "on-the-fly" prediction of phosphorylation of user-submitted protein sequences. Both the experimentally determined phosphorylation sites and high confidence predicted sites are available for download. As of December 8, 2015, PhosPhAt includes 9,159 experimental phosphoproteins with 19,100 unique tryptic phosphopeptides, and 31,916 predicted proteins with 2,176,360 predicted phosphosites.

2.14.4 Phospho.ELM

Phospho.ELM [122] is a manually curated database of experimentally verified eukaryotic phosphorylation sites. Each entry in the Phospho.ELM database is manually annotated with information about the phosphorylated proteins, the positions of known phosphorylations, the kinases responsible for phosphorylation, and literature citations. Additional information such as structure, interaction partners, subcellular compartment, and tissue specificities is also provided whenever they are available. Phospho. ELM data can be searched from its web interface. The data sets are also available for download upon request. PhosphoBlast server can be used to search proteins (UniProt ID/AC or amino acid sequence) against the curated dataset of phosphorylated peptides. Phospho.ELM (v9.0, September 2010) contains 8,718 substrate proteins covering 3,370 tyrosine, 31,754 serine, and 7,449 threonine instances.

2.14.5 PhosphoGrid

PhosphoGrid [123] is a database of experimentally verified in vivo protein phosphorylation sites of Saccharomyces cerevisiae curated from the literature. Both high-throughput MS phospho-proteomics studies and focused low-throughput analyses of individual proteins or complexes are integrated into PhosphoGrid. Each in vivo phosphorylation site is annotated by a hierarchy of experimental evidence codes, experimentally defined protein kinases and/or phosphatases, specific condition(s) under which the phosphorylation event occurs and the effect(s) of phosphorylation on protein function. The user can search PhosphoGrid web-based interface for any substrate, protein kinase, or phosphatase. Each record is cross-referenced with BioGRID [109], Saccharomyces Genome Database (SGD) [93], NCBI protein database [12], and its original PubMed articles. The latest release of PhosphoGrid contains 20,177 phosphorylation sites, 3,011 kinases, 266 phosphatases, and 563 publications.

2.14.6 PhosphoSitePlus

PhosphoSitePlus (PSP) [124] is a curated and highly interactive systems biology knowledgebase for studying experimentally observed mammalian post-translational modifications (PTMs) and

their roles in the regulation of biological process. PSP provides a comprehensive coverage of protein phosphorylation, acetylation, methylation, ubiquitination, and O-glycosylation. PSP includes structural and functional information about the topology, biological function, and regulatory significance of modification sites integrated from both low- and high-throughput (LTP and HTP) data. The homepage of PSP includes "Simple Search" that allows query of all known phosphorylation sites in a specific protein and "Advanced Search" that allows search by protein, sequence, or reference. PSP also supports retrieval of a list of modified sites that possess certain specified attributes and browsing curated MS/MS records by disease type, cell line, and tissue. Multiple types of datasets and tools are available for download such as PTMVar datasets, modification site datasets, regulatory sites, disease-associated sites, kinase-substrate datasets, Cytoscape plugin, etc. The latest release of PSP (accessed on December 9, 2015) contains 52,872 proteins, 21,619 low-throughput (LTP) sites, 456,434 high-throughput (HTP) MS sites, 2,130,888 MS peptides, and 19,704 curatorreviewed papers.

2.14.7 UniCarbKB

UniCarbKB [125] is a curated knowledgebase for glycomics and glycobiology research. UniCarbKB provides comprehensive information about the structures, pathways, and networks involved in glycosylation and glycol-mediated processes. UniCarbKB integrates GlycoSuiteDB [179] and EUROCarbDB [180] to provide a unified portal to support glycol-bioinformatics research and knowledge dissemination. The content of UniCarbKB is mainly eukaryotic glycoproteins curated from GlycoSuiteDB and a selected few datasets from EUROCarbDB. The data in GlycosuiteDB, EUROCarbDB, and GlycoBase [181] can be queried by taxonomy, tissue, protein name, protein accession, and composition. Glycan structures can be searched using carbohydrate sequences in GlycoCT format. The user can browse the curated collection of proteins or search them by name. Glycan Builder provides a GUI interface for building and displaying glycan structures. GlycoDigest is a tool that simulates exoglycosidase digestion, based on controlled rules acquired from expert knowledge and experimental evidence available in GlycoBase. The latest release of UniCarbKB (accessed on December 9, 2015) contains 899 Glycoproteins, 3,238 GlycoSuite structures, 520 UniCarb-DB MS/MS datasets, and 909 publications.

2.15 Ontology Databases: Gene Ontology (GO) The Gene Ontology (GO) [126] is a bioinformatics effort to create the consistent computational representation of gene functions at the molecular, cellular, and tissue system levels across all organisms. GO provides a controlled vocabulary of terms (ontologies) to describe gene products in terms of their biological processes, cel-

lular components, and associated molecular functions. The use of GO terms enables uniform queries and association across many biological databases. From the GO web site, the user can search for GO terms, annotations to gene products, and metadata across multiple species and perform GO enrichment analysis. The GO web site supports the download of the gene association files (Annotation), Gene Ontology (Ontology), and mappings of GO terms to those in a number of external vocabularies (Mapping). The Gene Ontology as of December 8, 2015 consists of 29,033 biological process terms, 4,039 cellular component terms, and 10,920 molecular function terms.

2.16 Specialized Protein Databases: MEROPS MEROPS [133] is an integrated database of information about peptidases (also termed proteases, proteinases, and proteolytic enzymes) and the proteins that inhibit them. A homologous set of peptidases and protein inhibitors are grouped into peptidase and inhibitor species. Species are grouped into families that contain statistically significant similarities in amino acid sequence. Families are grouped into clans that contain related structures. Both family (subfamily) and clan can be browsed by index page with links to their summary page. Each peptidase has a summary page that can be browsed by name, identifier, gene name, organism, and substrates. The peptidase summary page includes information on gene structure, alignment, tree, sequences and their features, distribution, structure, literature, human EST, mouse EST, substrates, inhibitors, and pharmacological modulators. The MEROPS database can be searched for peptidases or inhibitors, peptidases or inhibitor genes, or structures of peptidases or inhibitors. Users can also search via specificity, organism, and citation. MEROPS supports searching peptidase and protein inhibitor sequences with a protein or nucleotide query sequence by WU-BLAST. MEROPS also provides batch substrate cleavage analysis. MEROPS allows online submission of protein cleavage sites; however login is required for data download.

2.17 Other (Miscellaneous) Databases: Gene Wiki Gene Wiki [141] is a collection of community-written Wikipedia articles about human genes in the NCBI Gene database [57]. Gene Wiki starts with a set of seed stub Wikipedia articles, populated and expanded by community contributors with focus on the functions and disease relevance of the gene and corresponding protein. Gene Wiki has an automated system to keep the article structures in sync with the data from trusted primary databases and uses the WikiTrust [161] reputation system to assess and display the trustworthiness of authors and their contributions. Gene Wiki has over 10,000 distinct gene pages, spanning 2.07 million words and 82 megabytes of data.

### 3 Challenges and Opportunities

Although a large number of protein bioinformatics databases and resources have been developed to catalog and store different information about proteins, there are challenges and opportunities in developing next-generation databases and resources to facilitate data integration, data-driven hypothesis generation, and biological knowledge discovery. Recent rapid developments in high-throughput sequencing technologies bring molecular biology researchers to the age of Big Data, where the research paradigm has shifted from hypothesis-driven to data-driven. Big Data opens new avenues to study molecular biology as well as brings new challenges for computational biologists to explore ways to efficiently manage and analyze data, and eventually turn data into usable and actionable knowledge. Next, we will review and discuss some recent technology developments that can help in addressing some of the challenges.

# 3.1 Characteristics of Big Data

Big data is a broad term for data sets so large or complex that traditional data processing applications are inadequate (Wikipedia, https://www.wikipedia.org/). More specifically, Big Data has the following characteristics:

- 1. **Volume** The size of data is definitely an important aspect of Big Data. Large volumes of data demand scalable storage solutions and distributed information processing and retrieval.
- 2. Variety The types of data determine how the data will be analyzed. The heterogeneity of data requires non-trivial analysis methods.
- 3. **Velocity** The speed with which the data are generated and processed challenges novel real-time data analytics.
- 4. **Variability** The inconsistency of data calls for effective data management and handling.
- 5. **Veracity** The accuracy of data analysis depends on high-quality data and data capture methodology.

# 3.2 Data Storage and Management

The first challenge computational biologists have to face is the efficient storage and management of large volumes of data. In addition to better hardware support, massive parallel storage systems (distributed file systems, cluster file systems, and parallel file systems) have been explored. Examples include the Lustre [182] and Hadoop Distributed File System (HDFS) [183]. On top of that we need frameworks for user-specific solutions where several tools have been developed. Apache Hive [184] is a distributed data warehouse framework for analyzing data stored in HDFS and compatible systems using a SQL-like language called HiveQL. Apache Pig [185] further simplifies complex data analysis using simpler

scripting language targeting domain experts. Traditional relational database management systems often have difficulty handling Big Data because they lack horizontal scalability, require hard consistency, and become very complex when dealing with large volume of heterogeneous data. Non-relational databases (NoSQL) are alternative to Big Data storage and management because they focus on scalability and flexibility. The popular NoSQL database management systems include key-value stores, columnar databases, graph databases, and document-oriented databases.

#### 3.3 Data Analytics

Data storage and management is only one side of the coin. In the field of biomedical research and healthcare systems, the purpose of high-throughput omics studies is to turn biomedical data into knowledge. In order to accomplish the goal of personalized medicine and better treatments, we need scalable computational facilities and efficient data analytics frameworks. Compared to traditional HPC cluster computing, cloud computing emerges as an economical solution to large-scale data analysis. Hosting large-volume high-throughput data in the cloud is changing the way the analysis is done. Instead of moving data to the analysis code, code is now moving to the data. In addition, novel and efficient machine learning and data mining algorithms and computational frameworks are also essential to the success of turning data into knowledge. Apache Spark [186] is a recently developed fast and general computing engine for large-scale lightning-fast in-memory clustering computing. It supports a rich set of higher-level tools including Spark SQL for SQL and structured data processing, MLlib for machine learning, GraphX for graph processing, and Spark Streaming for scalable streaming applications.

### 3.4 Data Integration

The most challenging task in Big Data research is to deal with the heterogeneity, diversity, and complexity of the data and to find better ways to integrate them. In addition to exploring the flexibility of NoSQL technology, another promising area is to apply ontologies and Semantic Web technology. As a formal, explicit specification of a shared conceptualization of a domain of interest, ontologies play an important role in addressing the issues of heterogeneity in data sources. Rapid development and adoption of ontologies have enabled the research community to annotate and integrate biological and biomedical data using standardized ontologies, and automate the discovery and composing of bioinformatics web services and workflows. Linked Data technology provides a method for publishing structured data on the web and making them interconnected. The successful Linked data projects in the field of bioinformatics include the Bio2RDF [187] and EBI RDF platforms [188]. They use Semantic Web technologies to build and provide the largest network of Linked data for the Life Sciences by defining a set of simple conventions to create RDF(s) compatible Linked Data from a diverse set of heterogeneously formatted sources obtained from multiple data providers. The challenge for data integration using Linked Data is to develop applications that can consume such data, extract meaningful biological knowledge, and present it in a user-friendly fashion.

#### 3.5 User Interfaces

With the pervasiveness of mobile devices (tablets and phones), responsive web design that makes the web page look good on all devices becomes more and more important. Next-generation protein bioinformatics databases should provide users with an optimal viewing and interaction experience across a wide range of devices using technology such as Bootstrap [189], JQuery [190], Dojo Toolkit [191], etc. The need for speed, particularly for web-based applications, has also driven the development of NoSQL technology and high-performance index and search platforms such as Lucene/Solr [192] for fast information retrieval.

### 4 Conclusions

In this chapter, we presented a comprehensive review (with categorization and description) of major protein bioinformatics databases. We also reviewed and discussed the recent technology improvements that can help addressing some of the challenges in building next-generation protein bioinformatics databases and resources in the Big Data era.

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