KPGminer: A tool for retrieving pathway genes from KEGG pathway database

A. K. M. Azad

School of Biotechnology and Biomolecular Sciences, University of NSW, Chancellery Walk, Kensington, 2033, Australia

Abstract

Pathway analysis is a very important aspect in computational systems biology as it serves as a crucial component in many computational pipelines. KEGG is one of the prominent databases that host pathway information associated with various organisms. In any pathway analysis pipelines, it is also important to collect and organize the pathway constituent genes for which a tool to automatically retrieve that would be a useful one to the practitioners. In this article, I present KPGminer, a tool that retrieves the constituent genes in KEGG pathways for various organisms and organizes that information suitable for many downstream pathway analysis pipelines. We exploited several KEGG web services using REST APIs, particularly GET and LIST methods to request for the information retrieval which is available for developers. Moreover, KPGminer can operate both for a particular pathway (single mode) or multiple pathways (batch mode). Next, we designed a crawler to extract necessary information from the response and generated outputs accordingly. KPGminer brings several key features including organism-specific and pathway-specific extraction of pathway genes from KEGG and always up-to-date information. Thus, we hope KPGminer can be a useful and effective tool to make downstream pathway analysis easier and faster. KPGminer is freely available for download from https://sourceforge.net/projects/kpgminer/.

Keywords: GSEA, KEGG pathway, pathway analysis, pathway genes, information retrieval, Web API, REST

1 1. Introduction

Biological pathway is defined as a collection of genes or proteins that are functionally related to each others to perform some biological activities such as signaling or regulatory activities. Some of the on-line pathway databases are KEGG [1], Reactome [2], Wikipathways [3] etc. where pathways related to signaling, metabolomic, cellular processes, diseases, genetic information are stored for various organism.

Pathway analysis is an important downstream component for many bioin-8 formatics pipelines. One of the important aspects of a pathway analysis task 9 set is to conduct enrichment test with already annotated pathways. This 10 enrichment analysis include evaluating the enrichment of *de novo* gene sets 11 (either computationally predicted or experimentally determined) with those 12 already annotated pathways. Azad et al. designed a method called VToD [4] 13 for identifying cancer-related gene modules, which were validated with known 14 pathways from databases including KEGG [1] and GO terms [5] using gene 15 set enrichment test. Another example of gene set enrichment analysis is to 16 check the overlap of a particular set of interest e.g. differentially expressed 17 genes with those annotated pathways. All of these enrichment tests require 18 a set annotated pathways presented in the databases such as KEGG [1]. 19 One of the sources to collect such annotated pathway sets is the Molecular 20 Signatures Database (MSigDB) [6] which stores gene sets from well known 21 pathway databases like KEGG [1] and Reactome [2]. But these gene sets 22 are static and the pathway annotations are always updating. Hence, it is 23 required to have a tool for retrieving up-to-date gene collections for users. 24 Moreover, those collections aren't organism-specific. 25

In this article, I present a standalone tool called *KPGminer* that retrieves the pathway genes from KEGG [1] for all the organisms every time it runs. This provide always up-to-date and organisms specific information which can be stored in the local machine for conducting downstream pathway analysis using some statistical methods such as hyper-geometric tests. I hope, this tool can be very useful for the researchers and contribute to their bioinformatics pipelines.

33 2. Implementation

Figure 1 shows the main KPGminer interface. When user opens KPGminer tool it loads all the available organisms in KEGG database by making

HTTP web request via a web API call using REST protocol. This REST API 36 protocol is available in the KEGG website for the developers' use. Once, all 37 the organisms are loaded successfully, the main interface of KPGminer pops-38 up will a dropdown box populated with all the organism name. Next, user 39 has to select a particular organism for the that list, another HTTP web re-40 quest takes place for retrieving all the pathways currently available in KEGG 41 database for that particular organism. The response of that request is then 42 parsed to get the list of those pathways and a listbox gets populated with 43 them. User can pick one or more pathways from that list which will be shown 44 in another listbox (called selection listbox). 45

			Pathway	Description	Genes
Chose Organism Homo sapiens (human)			Glycolysis / Gluconeogenesis	dummytext	HK3, HK1, HK2, HKDC1, GCK, GPI, PF
nomo sapiens (numan)			Citrate cyde (TCA cyde)	dummytext	CS, ACLY, ACO2, ACO1, IDH1, IDH2
hoose from 307 pathway(s)	Selected Dathway(c)	Selected Pathway(s): 23	Pentose phosphate pathway	dummytext	GPI, G6PD, PGLS, H6PD, PGD, RPE, R
FoxO signaling pathway Phosphatidylinositol signaling syste	Givcolvsis / Gluconeogenesis		Pentose and glucuronate interconversions	dummytext	GUSB, KL, UGT2A1, UGT2A3, UGT2B
	Citrate cycle (TCA cycle)	Fructose and manpose metabolism	dummytext	MPI, PMM2, PMM1, GMPPB, GMPPA,	
phingolipid signaling pathway hospholipase D signaling pathwa		Pentose phosphate pathway Pentose and glucuronate interconvers	Galactose metabolism	Concession in the second	GALM, GALK1, GALT, GALE, UGP2, PO
euroactive ligand cell cycle		Fructose and mannose metabolism Galactose metabolism	Ascorbate and aldarate metabolism		UGDH, UGT2A1, UGT2A3, UGT2B17,
ocyte meiosis 53 signaling pathway		Ascorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid elongation			
Ibiquitin mediated proteolysis			Fatty acid biosynthesis	dummytext	ACACA, ACACB, MCAT, FASN, OXSN
ulfur relay system NARE interactions in vesicular tra	>	Fatty acid degradation Synthesis and degradation of ketone I	Fatty acid elongation	dummytext	ACAA2, HADHB, HADH, HADHA, ECH
utophagy Noohagy	_	Steroid biosynthesis Primary bile acid biosynthesis	Fatty acid degradation	dummytext	ACAT2, ACAT1, ACAA1, ACAA2, HA
utophagy	>>	Ubiquinone and other terpenoid	Synthesis and degradation of ketone bodies	dummytext	HMGCS1, HMGCS2, HMGCL, HMGCLL
Protein processing in endoplasmic Lysosome		Steroid hormone biosynthesis Oxidative phosphorylation Arginine biosynthesis Purine metabolism Caffeine metabolism			
ndocytosis hagosome	<		Steroid biosynthesis		FDFT1, SQLE, LSS, CYP51A1, TM7SF
Peroxisome			Primary bile acid biosynthesis	dummytext	CYP46A1, CYP39A1, HSD3B7, CH25
nTOR signaling pathway		Pyrimidine metabolism Alanine, aspartate and glutamate meta	Ubiquinone and other terpenoid	dummytext	TAT, COQ2, COQ3, COQ6, COQ5, C
AIDA signaling pathway Apoptosis Longevity regulating pathway Longevity regulating pathway Apoptosis Perroptosis Cellular senescence ¥	<<	Glycine, serine and threonine metabol Cysteine and methionine metabolism	Steroid hormone biosynthesis	dummytext	CYP11A1, CYP17A1, STS, SULT2B1,
		Cysteine and metrionine metabolism	Oxidative phosphorylation	dummytext	ND1, ND2, ND3, ND4, ND4L, ND5, N
	1		Arginine biosynthesis		OTC, ASS1, ASL, ARG2, ARG1, NOS
			Purine metabolism		NUDT9, ADPRM, NUDT5, PGM1, PGM
			Caffeine metabolism	dummytext	CYP1A2, NAT2, NAT1, CYP2A6, XDH
			Pyrimidine metabolism	dummytext	CAD, DHODH, UMPS, CMPK1, CMPK2
			Alanine, aspartate and glutamate metabolism	dummytext	GOT1, GOT2, IL4I1, DDO, ASNS, NIT
Get Pathway Genes		Browse output directory	Glycine, serine and threonine metabolism	dummytext	SHMT2, SHMT1, AGXT, GRHPR, GLYC

Figure 1: Main interface of KPGminer tool

To get all the pathway genes for those selected pathways, user press a button which makes another HTTP web request. KPGminer reports pathway
genes in single or batch mode depending on the number of selected pathways.
Once loaded all the pathway genes the results are shown in the right panel
on the main KPGminer interface. Finally, to all of these pathway genes are

can be saved in a file by clicking a button which asks a place to save that file
in the local directory. The file is saved with a .gmt extension just as similar
to the MSigDB for the convenience of users. A tooltip label keeps providing
messages for every stages of KPGminer in retrieving pathway genes for selected pathway(s) for a particular organism. Table 1 shows the KPGminer
metadata.

	Technology used
Version	v1.0.0
Language	C#.Net
Platform	Microsoft .Net platform
Operative systems	Windows
HTTP web request	REST API
Information retrieval technique	In-house built crawler

Table 1: KPGminer Metadata

57 3. Discussion

KPGminer has several useful features. First, even though KEGG pro-58 vided necessary APIs for retrieving those information, a single platform to 59 facilitate organism-specific and pathway-specific (single or batch mode) infor-60 mation retrieval may be advantageous for practitioners by abstracting their 61 corresponding lower-level implementations. Second, while loading, KPG-62 miner starts requesting KEGG databases for pathway information, which 63 indicates that it always brings the up-to-date information. Third, KPG-64 miner is a open source and free software that can help scientific communities 65 to conduct pathway analysis required with KEGG pathway databases. 66

In this version of KGPminer, there is one limitation which is in batch-67 mode (for multiple pathways) operation, it creates HTTP web request for 68 each pathways separately, which is a time consuming. But this limitation 60 can be overcome by exploiting multi-threading approach by making each 70 HTTP web request running in a single thread, which can be implemented 71 in future versions of KPGminer. In future I also hope to extend this tool 72 for retrieving information from other pathway databases including Reactome 73 [2], Wikipathways [3] or GO [5] database. I hope KPGminer can be a very 74 useful tool for the researchers in their pathway analysis. 75

76 4. References

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•	KPGminer
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Chose Organism

Homo sapiens (human)

File About

Pathway	Description	Genes		
Glycolysis / Gluconeogenesis	dummytext	HK3, HK1, HK2, HKDC1, GCK, GPI, PF		
Citrate cyde (TCA cyde)	dummytext	CS, ACLY, ACO2, ACO1, IDH1, IDH2,		
Pentose phosphate pathway	dummytext	GPI, G6PD, PGLS, H6PD, PGD, RPE, R		
Pentose and glucuronate interconversions	dummytext	GUSB, KL, UGT2A1, UGT2A3, UGT2B1		
Fructose and mannose metabolism	dummytext	MPI, PMM2, PMM1, GMPPB, GMPPA, G		
Galactose metabolism	dummytext	GALM, GALK1, GALT, GALE, UGP2, PO		
Ascorbate and aldarate metabolism	dummytext	UGDH, UGT2A1, UGT2A3, UGT2B17,		
Fatty acid biosynthesis	dummytext	ACACA, ACACB, MCAT, FASN, OXSM		
Fatty acid elongation	dummytext	ACAA2, HADHB, HADH, HADHA, ECH		
Fatty acid degradation	dummytext	ACAT2, ACAT1, ACAA1, ACAA2, HAE		

		Concernence and the second s	Contraction of the second second	
	Selected Pathway(s): 23	Pentose phosphate pathway	dummytext	GPI, G6PD, PGLS, H6PD, PGD, RPE, F
	Glycolysis / Gluconeogenesis	Pentose and glucuronate interconversions	dummytext	GUSB, KL, UGT2A1, UGT2A3, UGT2B
	Citrate cycle (TCA cycle) Pentose phosphate pathway Pentose and glucuronate interconvers Fructose and mannose metabolism Galactose metabolism Ascorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid elongation Fatty acid degradation of ketone I Steroid biosynthesis Primary bile acid biosynthesis Ubiquinone and other terpenoid Steroid hormone biosynthesis Oxidative phosphorylation Arginine biosynthesis Purine metabolism Caffeine metabolism Pyrimidine metabolism	Fructose and mannose metabolism	dummytext	MPI, PMM2, PMM1, GMPPB, GMPPA,
		Galactose metabolism	dummytext	GALM, GALK1, GALT, GALE, UGP2, P
		Ascorbate and aldarate metabolism	dummytext	UGDH, UGT2A1, UGT2A3, UGT2B17,
		Fatty acid biosynthesis	dummytext	ACACA, ACACB, MCAT, FASN, OXSN
>		Fatty acid elongation	dummytext	ACAA2, HADHB, HADH, HADHA, ECH
		Fatty acid degradation	dummytext	ACAT2, ACAT1, ACAA1, ACAA2, HA
>>		Synthesis and degradation of ketone bodies	dummytext	HMGCS1, HMGCS2, HMGCL, HMGCL
-		Steroid biosynthesis	dummytext	FDFT1, SQLE, LSS, CYP51A1, TM7S
		Primary bile acid biosynthesis	dummytext	CYP46A1, CYP39A1, HSD3B7, CH25
		Ubiquinone and other terpenoid	dummytext	TAT, COQ2, COQ3, COQ6, COQ5, C
<<		Steroid hormone biosynthesis	dummytext	CYP11A1, CYP17A1, STS, SULT2B1,
		Oxidative phosphorylation	dummytext	ND1, ND2, ND3, ND4, ND4L, ND5, N
		Arginine biosynthesis	dummytext	OTC, ASS1, ASL, ARG2, ARG1, NOS
		Purine metabolism	dummytext	NUDT9, ADPRM, NUDT5, PGM1, PGM
		Caffeine metabolism	dummytext	CYP1A2, NAT2, NAT1, CYP2A6, XDH
		Pyrimidine metabolism	dummytext	CAD, DHODH, UMPS, CMPK1, CMPK
		Alanine, aspartate and glutamate metabolism	dummytext	GOT1, GOT2, IL4I1, DDO, ASNS, ND
	Browse output directory	Glycine, serine and threonine metabolism	dummytext	SHMT2, SHMT1, AGXT, GRHPR, GLYC
		<		>
	> <	 Citrate cycle (TCA cycle) Pentose phosphate pathway Pentose and glucuronate interconvers Fructose and mannose metabolism Galactose metabolism Ascorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid degradation Synthesis and degradation of ketone I Steroid biosynthesis Primary bile acid biosynthesis Oxidative phosphorylation Arginine biosynthesis Purine metabolism Caffeine metabolism Caffeine metabolism Alanine, aspartate and glutamate meta Glycine, serine and threonine metabolism 	Steletied Pathway (S), 23 Pentose and glucuronate interconversions Citrate cycle (TCA cycle) Pentose and glucuronate interconversions Fructose and glucuronate interconversions Galactose metabolism Galactose metabolism Galactose metabolism Galactose metabolism Galactose metabolism Sacorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid degradation Synthesis and degradation of ketonel Steroid biosynthesis Primary bile acid biosynthesis Dibiquinone and other terpenoid Steroid hormone biosynthesis Purine metabolism Caffeine metabolism Alanine, aspartate and glutamate metabolism Cysteine and methionine metabolism Cysteine and methionine metabolism Caffeine metabolism Pyrimidine metabolism Caffeine metabolism Pyrimidine metabolism Alanine, aspartate and glutamate metabolism Cysteine and methionine metabolism Cysteine and methionine metabolism Purine metabolism Purine metabolism Purine metabolism </td <td>Selected Pailway(s): 23 Glycolysis / Gluconscopenesis Citrate cycle (TCA cycle) Pentose and glucuronate interconversions Pentose and glucuronate interconversions Futzose and glucuronate interconversions Galactose metabolism Galactose metabolism Ascorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid biosynthesis Synthesis and degradation of ketonel Steroid biosynthesis Primary bile acid biosynthesis Oxidative phosphorylation Arginine biosynthesis Purime metabolism Cafferine metabolism Cafferine metabolism Cyteine and methionine metabolism Pyrimidine metabolism Cyteine and methionine metabolism</td>	Selected Pailway(s): 23 Glycolysis / Gluconscopenesis Citrate cycle (TCA cycle) Pentose and glucuronate interconversions Pentose and glucuronate interconversions Futzose and glucuronate interconversions Galactose metabolism Galactose metabolism Ascorbate and aldarate metabolism Fatty acid biosynthesis Fatty acid biosynthesis Synthesis and degradation of ketonel Steroid biosynthesis Primary bile acid biosynthesis Oxidative phosphorylation Arginine biosynthesis Purime metabolism Cafferine metabolism Cafferine metabolism Cyteine and methionine metabolism Pyrimidine metabolism Cyteine and methionine metabolism

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