New Advances in Proteomics Informatics for the Trans-Proteomic Pipeline

Luis Mendoza, David Shteynberg, Michael Hoopmann, Eric Deutsch

> ASMS evening Workshop June 4th, 2019 – A304





Introduction to TPP and overview of the latest features in 5.2

- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms
- Open Discussion and Feedback



Group presentations at ASMS

For more info:

- Kojak 2.0 (MP 044)
- PEFF in TPP (MP 417)
- PTMProphet (WP 400)

Booth #118

www.tppms.org/asms/



Trans-Proteomic Pipeline (TPP) Overview Protein msconvert X!Tandem StPeter Prophet Peptide Comet Kojak **XPRESS** Prophet Raw Peptide Peptide Protein Mass Spec Quantitation Identification Validation Assignment Data **PTM SEQUEST*** SpectraST Libra Prophet ASAP **iProphet** Mascot* Ratio protXML **mzML** pepXML

Free and open source suite of software tools and file formats that facilitates and standardizes proteomics analysis



TPP components

- PSM and Peptide validation
- Protein inference
- Quantification
- Spectral Libraries: build and search
- Combine search engines
- Cloud capabilities





• etc...

New features in 5.2.0 (March'19)

- **tpp2mzid**, a new tool for converting *PepXML* and *ProtXML* to *mzIdentML*.
- New ProteoMapper tools: clips and promast, for fast and efficient mapping of peptide sequences to a proteome
 - Supports variants via PEFF format
 - Able to do fuzzy matching of sequences, including isobaric (with and without mass modifications)
- New quantitation tool QUANTIC, which uses matched ion intensities of identified (MS/MS) spectra
- New tool to generate quantitative **volcano plots** on Proteins and Peptides
- Added a simple utility to **compute p-values** for some common distributions using GSL
- Support for *Magnum* and *Morpheus* search engines
- Expanded UI support for up to 12 channels of isobaric labeling, including TMT-11





- Introduction to TPP and overview of the latest features in 5.2
- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms
- Open Discussion and Feedback



What is PEFF?

- PEFF is a "unified format for protein sequence databases to be used by sequence search engines and other associated tools, to enable consistent extraction, display and processing of information such as **post-translational modifications, mutations** and other processing events," among others.
- The format is plain text, largely FASTA-like for backwards compatibility.

psidev.info/peff



PEFF Basics

"\" Keywords

>nxp:NX_Q5EE01-1 \PName=Centromere protein W isoform Iso 1 \GName=CENPW \NcbiTaxId=9606 \TaxName=Homo Sapiens \Length=88 SV=61 EV=265 PE=1 VariantSimple=(4|L)(6|M)(6|V)(8|P)(8|F)(11|R)(19|H)(19|C)(20|D)(24|Q)(28|L)(28|P)(31|R)(32|*)(40|N)(41|F)'(45|V)(47|F)(52|R)(53|*)(53|Q)(57|D)(59|G)(63|F)(64|V)(12|H)(26|C) (62|T)(63|S)(74|R)(78|T)(80|M)(86|I)(86|G) \Processed=(1|88|mature) protein) MALSTIVSQRKQIKRKAPRGFLKRVFKRKKPQLRLEKSGDLLVH Sequence LNCLLFVHRLAEESRTNACASKCRVINKEHVLAAAKVILKKSRG >nxp:NX_Q5EE01-1 \DbUniqueId=NX_Q5EE01-1 ... **PEFF** entry



Single Amino Acid Variants in PEFF

>nxp:NX_Q5EE01-1 \PName=Centromere protein W isoform Iso 1 \GName=CENPW \NcbiTaxId=9606 \TaxName=Homo Sapiens \Length=88 \SV=61 \EV=265 \PE=1 \VariantSimple=(4|L)(6|M)(6|V)(8|P)(8|F) (11|R)(19|H)(19|C)(20|D)(24|Q)(28|L)(28|P)(31|R)(32|*)(40|N)(41|F) (45|V)(47|F)(52|R)(53|*)(53|Q)(57|D)(59|G)(63|F)(64|V)(12|H)(26|C) (62|T)(63|S)(74|R)(78|T)(80|M)(86|I)(86|G) \Processed=(1|88|mature protein) MALSTIVSQRKQIKRKAPRGFLKRVFKRKKPQLRLEKSGDLLVH LNCLLFVHRLAEESRTNACASKCRVINKEHVLAAAKVILKKSRG >nxp:NX_Q5EE01-1 \DbUniqueId=NX_Q5EE01-1 ...



PEFF in TPP

- Search with Comet
- Results in *PepXML*
- Visualize, filter, sort, export... ullet

- Map sequences
- **Protein inference**

In progress:

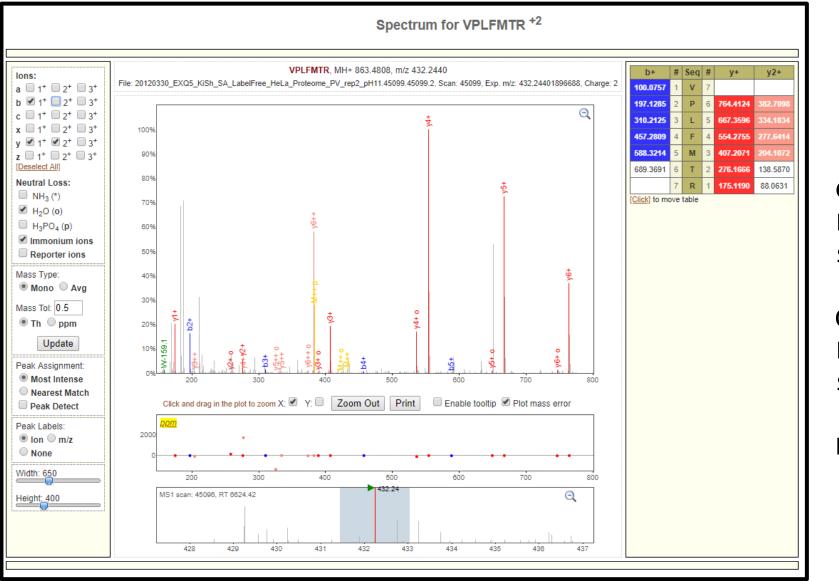
- Results validation (decoys...?)
- In/dels •
- Signal / transit / etc
- Proteogenomics
- Make your own! •
- Other...!?

K. <u>KITEN147.041VITQK</u> .C.		Ì					
K. <u>RTV<mark>5167.00</mark>DNSLSNSR</u> .G ^P							
R. <u>5167.00VAAC160.03T181.01EEPKER</u> .G							
K. <u>LPYGAR</u> .R ^B							
K. <u>IMHDVIKK</u> .V ^R							
K. <u>RHFNAPSHIR</u> .R ^A	TPP :: Pe	eptide Sequence Explor	er			PS	Εx
R. <u>Y243.03VANKTM<mark>5167.00</mark>K</u> .C	Input: <u>single pe</u>	<u>aptide</u> or a <u>peptide list</u> (max.5000 seque Database: All Human Pepti					
K. <u>SVAMC160.03EM147.04EK</u> .K	Fuzz	Peptide Sequence: PSQVSVVIR y mapping settings: known amino acids: 3 •					
R. <u>YGTVEPQDK</u> .C		tch mass tolerance: 0.001 Search!			Clear All		
<u>M147.04ALLHSGR</u> .V ^P	<u>ا</u>) Results :: 468 total re	sults found	I	Download (xls)	
R. <u>GVGFDRMTAISFK</u> .R ^B		[-] Hide redundant mappings Peptide Sequence NPSVSVVLR(+14.0157) NPSVSVVLR(+14.0157)	Protein(s) > <u>NX P20062-1</u> > <u>NX P20062-2</u>	Position 51	Original Sequence n L.NPSLYVGLR.L L.NPSLYVGLR.L	Subs % original seq	
R.DLSAS167.00AGHPR.A		PSQGVKVLR(+0.9840) PSQVGKVLR(+0.9840) PSQVVKGLR(+0.9840)	> <u>NX_P62805-1</u> > <u>NX_P62805-1</u> > <u>NX_P62805-1</u>	4 4 4 4 4	G. RGKGGKGLG. K G. RGKGGKGLG. K G. RGKGGKGLG. K G. RGKGGKGLG. K	6 🗆 6 🗆 6 🗆 7 🗆	
R. TPDGNLDQC160.03K		PSQAAKVLR(+14.0157)(+0.9840) PSQVAKALR(+14.0157)(+0.9840) PSQVLGTLR(+14.0157) PSQVLGTLR(+14.0157)	<u>NX P62805-1</u> <u>NX P62805-1</u> <u>NX Q6P0Q8-1</u> <u>NX Q6P0Q8-2</u>	4 1474 1284	G. RGKGGKGLG. K A. PSRALGTLR. Q A. PSRALGTLR. Q	7 🗆 2 🔜 2 🔤	
K. <u>KM147.04VEDGQS167.00GDL</u> K.K		PSQASLVLR(+14.0157) PSQASLVLR(+14.0157) PSQASLVLR(+14.0157) PSQASLVLR(+14.0157)	NX Q8N1W1-1 NX Q8N1W1-3 NX Q8N1W1-4 NX Q8N1W1-5	1616 1572 1616 1303	D. PSQPSNVSH. K D. PSQPSNVSH. K D. PSQPSNVSH. K D. PSQPSNVSH. K	4 4 4 4	
		PSQASLVLR(+14.0157) PSQVSVVLR * PLNSSVVLR	> <u>NX_Q8N1W1-6</u> > <u>NX_Q8NH41-1</u> > <u>NX_Q96NY8-1</u>	1616 332 107	D. PSQPSNVSH. K K. PSQVSVVLR. N N. PLDGSVLLR. N N. PLDGSVLLR. N	4 0 3 4	
		PVNSSVVLR(+14.0157) TPNVSVVLR TPNVSVVLR TPNVSVVLR TPNVSVVLR	NX Q96NY8-1 NX Q9P2E9-1 NX Q9P2E9-2 NX Q9P2E9-3	107 89 89 89	P. APNVTVLLR. E P. APNVTVLLR. E P. APNVTVLLR. E	4 3 3 3	
		PVNTSVVLR Non-neXtProt mappings PSQVSVVLR *	> <u>NX_Q9UGM1-1</u> > <u>A0A126GWD1</u>	130 308	E. PVNTNVVLR. Y	0	

PSOVSVVI R



PEFF in PeptideAtlas



Canonical Protein sequence: K.VPLFMSR.A Observed Peptide sequence: K.VPLFMTR.A Known variant dbSNP:rs1147990

USI:

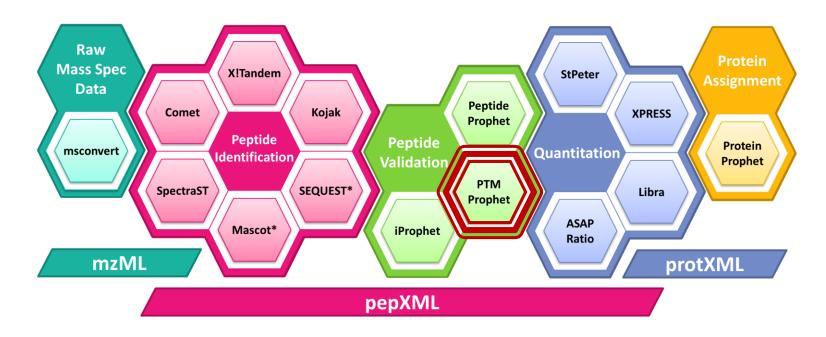




- Introduction to TPP and overview of the latest features in 5.2
- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms
- Open Discussion and Feedback



PTMProphet: Localizing PTMs



GOALS:

1. For each Modified PSM, Compute Accurate Probabilities of each potential modification site being modified

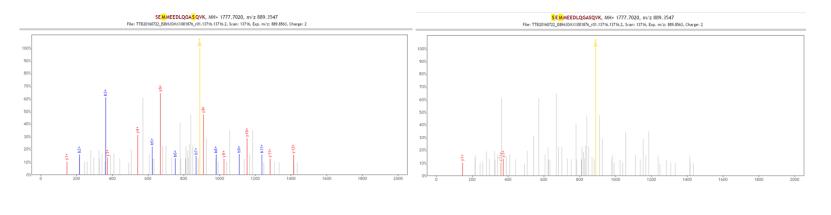
Systems Biology

Revolutionizing Science. Enhancing Life

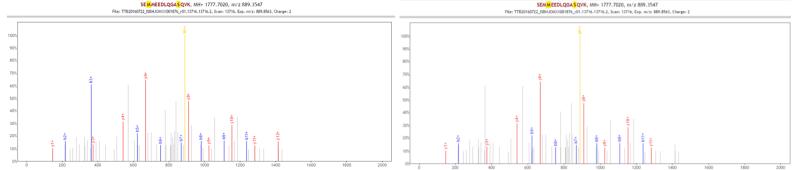
2. Compute Information Content thereby allowing comparing PSMs having different numbers of potential modification sites and number of modifications

Simple Peptide: One +16, One +80

SEMMEEDLQGASQVK vs SEMMEEDLQGASQVK



SEMMEEDLQGASQVK vs SEMMEEDLQGASQVK





PTMProphet Algorithm

- 1. For each PSM, evaluate all possibilities of peptide modification
- 2. Sum matched peak intensities: $\Psi(P)$ for peptide P
- 3. Compute Ψ for each peptide possibility
- 4. For each potential PTM site **s** on the peptide, compute:

```
\begin{array}{ll} \mathbf{P}^{mod} &= \operatorname{argmax}( \forall \mathbf{P} \text{ with site } \mathbf{s} \text{ modified } | \Psi(\mathbf{P}) ) \\ \mathbf{P}^{unmod} &= \operatorname{argmax}( \forall \mathbf{P} \text{ with site } \mathbf{s} \text{ unmodified } | \Psi(\mathbf{P}) ) \end{array}
```

- 5. Compute "common" matched peak intensity: **C**(**P**^{mod}, **P**^{unmod})
- 6. Compute discretized observed maximum noncommon intensities:

$$O^m = \frac{\Psi(P^{mod}) - C(P^{mod}, P^{unmod})}{i}$$
 and $O^u = \frac{\Psi(P^{unmod}) - C(P^{mod}, P^{unmod})}{i}$

7. Compute observed maximum noncommon matched peaks:

 M^m and M^u

- 8. Compute probability for each potential PTM site
- 9. EM > 0 apply expectation / maximization algorithm until probabilities remain constant
- 10. Normalize all probabilities by the number of modifications in the peptide
- 11. Record the output in pepXML

```
S(0.000)EM(1.000)M(0.000)EEDLQGAS(1.000)QVK
```

PROBLEM: Site Probabilities May Not Be Comparable

• Different numbers of potentially modified sites in different peptides

SEMMEEDLQGASQVK (2 phospho sites) **SESSEEDLQGASQVK** (4 phospho sites)

 Different numbers of modifications in different peptides

PSESPSEEDLQGAPSQVK (3 phospho mods)
PSESSEEDLQGASQVK (1 phospho mod)

PTMProphet Information Content Stats:

H_t^{norm} : Multiple Modification & Site Normalized Shannon's Entropy

Quantifies the amount of information stored in the PTM site assignment for a peptide with s modification sites and m modifications, range: [0, 1]

M_t: Localized Modifications Estimate

Estimates the number of modifications confidently localized that can be used to directly compare PSMs containing m modification, range: [0, m]

I_t: Normalized Per-Modification Information Content

Estimates the per-modification localization certainty that can be used to directly compare PSMs with different number of modifications, range: *[0, 1]*





- For example, site probability 0.75 implies different conclusions in different PSMs
 - If s=4 and m=3 and
 S(0,750) S(0,750) S(0,750)

S(0.750)ES(0.750)S(0.750)EEDLQGAS(0.750)QVK

then,	H_t^{norm}	$=$ 1.0 (H_t = 3.0)	
	I _t	= 0.0	
	M_t	= 0.0	

Maximum Uncertainty

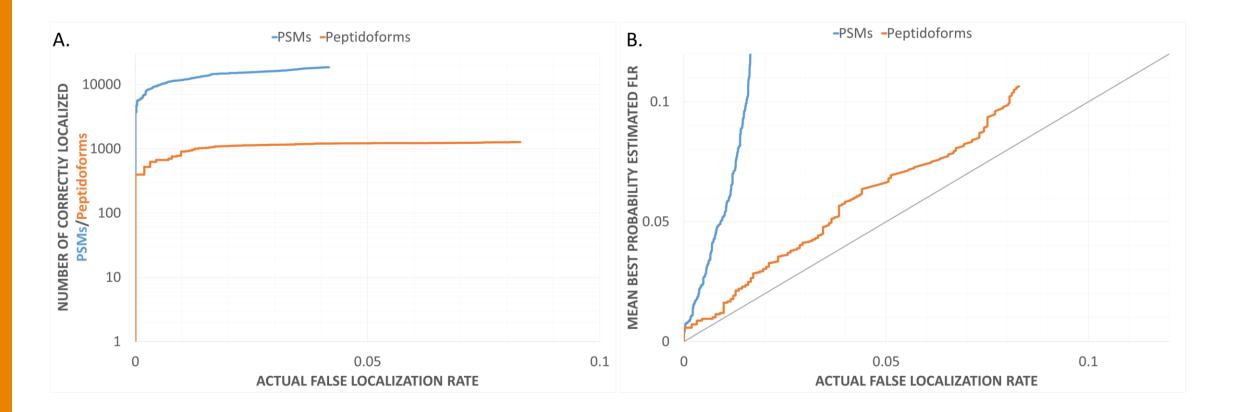
If s=4 and m=1 and

S(0.000)ES(0.750)S(0.250)EEDLQGAS(0.000)QVK

then, $H_t^{norm} = 0.41 (H_t = 0.41)$ $I_t = 0.59$ Mid-range Uncertainty $M_t = 0.59$



Conservative FLR Estimates



B_t: Mean Best Probability Statistic

Easy to compute and works well in practice, should be considered in the context of Information Content, range: [0, 1]



PTMProphet: Wednesday Poster 400 O^m Mscore = Oscore = $M^m + M^u$ $O^m + O^u$ -STY:+80 -MW:+16 •n+42 -OC:-17 -NO:+1 -E:-18 PTMPROPHET MSCORE PTMPROPHET OSCORE 32768 1.0 1.0 1.0 16384 Pos/Total Pos/Total 8192 4096 2048 0.8 0.8 0.8 CORRECT 512 256 0.6 0.6 0.6 OTAL 128 0.4 0.4 0.4 0.2 0.2 0.2

0.04

0 0

1.0

0.0

0.0

0.2

0.4

0.6

0.8

0.0

Pr(Mscore, Oscore|Modified)Pr(Modified)Pr(Mscore, Oscore)

0.2

0.4

0.6

0.8

0.06

0.08

0.12

0.1

ESTIMATED UNCERTAINTY

 $H_t^{norm} = -\frac{1}{m} \sum p_i \log_{s/m} p_i$



0.18

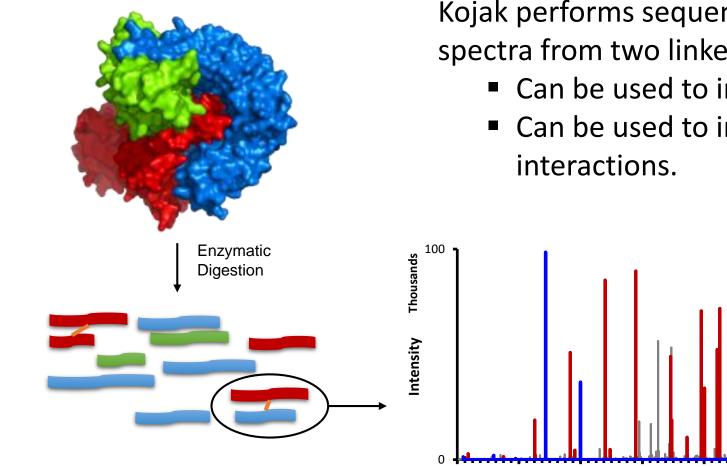




- Introduction to TPP and overview of the latest features in 5.2
- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms
- Open Discussion and Feedback



Kojak: Identifying protein interactions through errors of the cross-linking



m/z

Kojak performs sequence identification of MS/MS spectra from two linked peptides.

- Can be used to infer protein structure.
- Can be used to infer protein-protein interactions.

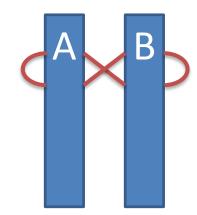


XL Fragmentation Properties Ν Η Ρ K R 0 F R S Κ Ε Ε 861 Da **20 FRAGMENT IONS** Ν Н Ρ R Κ \mathbf{O} 1365 Da **12 FRAGMENT IONS** R S E

- Consider a cross-linked peptide to be two peptides with modification masses.
- Match peptide fragment ions separately, starting with the largest (by mass) peptide.
- Largest peptide likely has highest potential score.



Dealing With Homodimers



Intra-protein links: ¹⁴N-¹⁴N (**A1-A2**) ¹⁴N-¹⁴N (**B1-B2**)

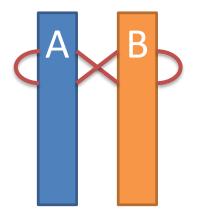
Inter-protein links: ¹⁴N-¹⁴N (A1-B2) ¹⁴N-¹⁴N (B1-A2) New Kojak Parameter: 15N_filter = 15n

>ProteinX

MAAAAVVAATYPAQSMGADGASSVHWFRKGL RSAVVKVKGSRSGQRLFKEWGVTRDAAIMKM AKHLLPSLEELGFPTEGLGPAVWQGGE

Total Mass: 729.47 Da

b⁺		AA		У+		
88.039	1	S				
159.076	2	А	6	643.450		
258.144	3	V	5	572.413		
357.213	4	V	4	473.344		
485.308	5	К	3	374.276		
584.376	6	V	2	246.181		
		K	1	147.112		



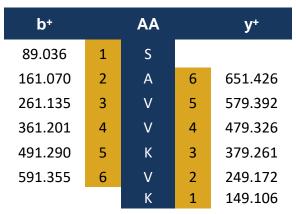
Intra-protein links: ¹⁴N-¹⁴N (A1-A2) ¹⁵N-¹⁵N (B1-B2)

Inter-protein links: ¹⁴N-¹⁵N (A1-B2) ¹⁵N-¹⁴N (B1-A2)

>15n-ProteinX

MAAAAVVAATVPAQSMGADGASSVHWFRKGL RSAVVKVKGSRSGQRLFKEWGVTRDAAIMKM AKHLLPSLEELGFPTEGLGPAVWOGGE

Total Mass: 738.45 Da

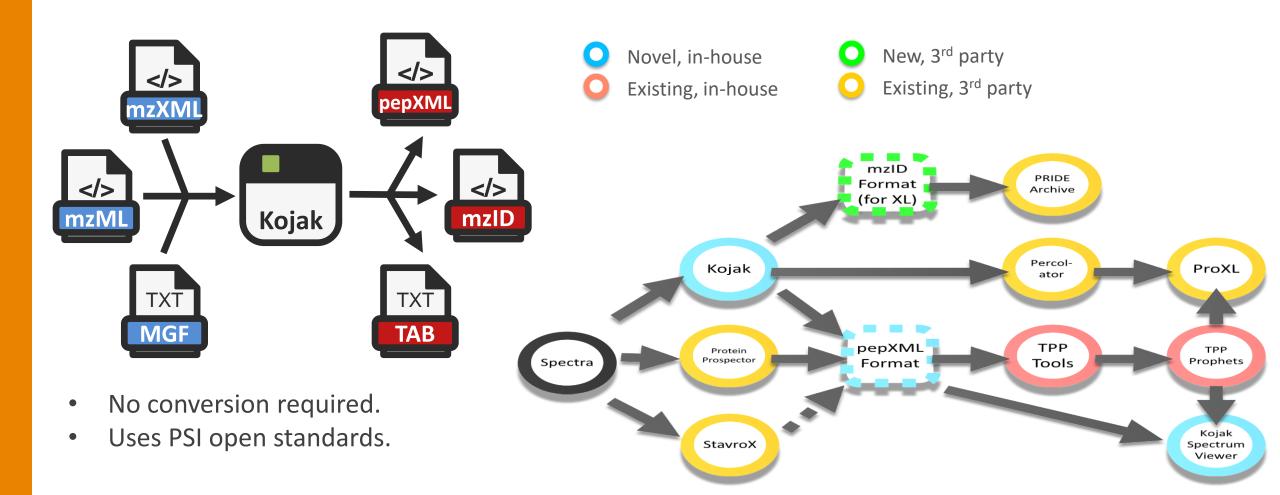


 \bigcirc

Natural isotope abundance

Heavy isotope labeled

More Supported File Formats & The Extended Kojak 2.0 Pipeline





- Introduction to TPP and overview of the latest features in 5.2
- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms
- Open Discussion and Feedback



Docker Container Platform





BioContainers

7.6Ktools,17.6Kversions,54.8Kcontainers and packages

Quick Start) (Registry

toppred/1.10-4-deb	Add debian package toppred/1.10-4-deb/Dockerfile	a year ago
tpmcalculator/0.0.1	remove CMD	11 days ago
in tpp	Updated for TPP 5.2 release version (#321)	a month ago
transdecoder/3.0.1dfsg-1-deb	Add debian package transdecoder/3.0.1dfsg-1-deb/Dockerfile	a year ago
transrate-tools/1.0.0-1b1-deb	Add debian package transrate-tools/1.0.0-1b1-deb/Dockerfile	a year ago
transtermhp/2.09-3b1-deb	Add debian package transtermhp/2.09-3b1-deb/Dockerfile	a year ago
tree-ppuzzle/5.2-8b2-deb	Add debian nackage tree-npuzzle/5 2-8h2-deb/Dockerfile	2 //27 200



Running TPP on Docker

Running the TPP docker image Contents [hide] 1 Overview 2 Installing Docker 3 Downloading spctools/tpp docker image Find tutorials at: http://tppms.org/tutorial 4 Verifying that the image has been downloaded 5 Running a specific TPP program from the docker image 6 Obtaining a copy of the default parameter files 7 Running the TPP GUI via Docker 8 Checking to make sure the docker is running 9 Stopping the GUI when you're done 10 Troubleshooting Notes 11 Testing the container and GUI with a sample dataset (optional) [edit] Overview The docker system allows the distribution of pre-built computational units called images, which can be run on any system with the docker software installed. The spctools/tpp image is built on the BioContainers d ubuntu image, and uses many of the BioContainers conventions. On some systems you may have to run these commands using sudo, a mechanism for elevating user privileges for specific tasks. The initial download described below will be relatively slow the first time it is run, since most if not all the 'layers' will have to be downloaded. Subsequent invocations will generally be much faster [edit] Installing Docker Detailed installation guidance on how to install Docker on your computer is beyond the scope of this document, but if you're using Ubuntu 18.04 LTS, it should be as easy as: sudo apt --yes install docker.io % apt --yes install docker.io [edit] Downloading spctools/tpp docker image As mentioned above, this may be slow the first time it is run. Subsequent runs should be considerably faster. The example below shows a pull of the latest (default) version, you can also specific version if desired docker pull spctools/tpp % docker pull spctools/tpp Using default tag: latest Trying to pull repository docker.io/spctools/tpp ... latest: Pulling from docker.io/spctools/tpp Digest: sha256:37220874949d6f710eec6661ef57ec2b3cc42f9066d1496a283c4eb32387e4da Status: Image is up to date for spctools/tpp:latest

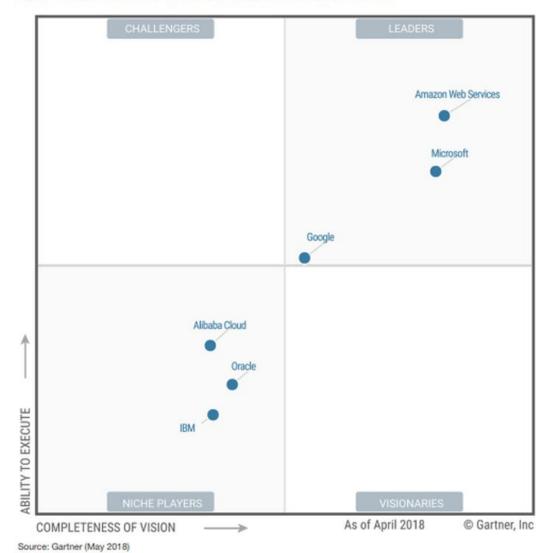
% docker run -v /tmp/tppdata:/data spctools/tpp comet -p

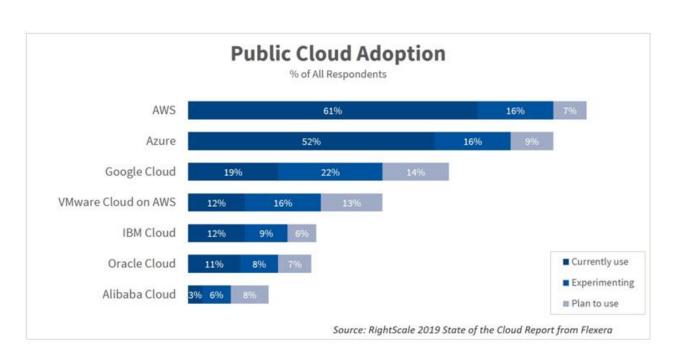
% docker run -dit --user=root -p 10401:10401 -v /tmp/tppdata:/data spctools/tpp apache2ctl -DFOREGROUND



Cloud Computing Platforms

Figure 1. Magic Quadrant for Cloud Infrastructure as a Service, Worldwide







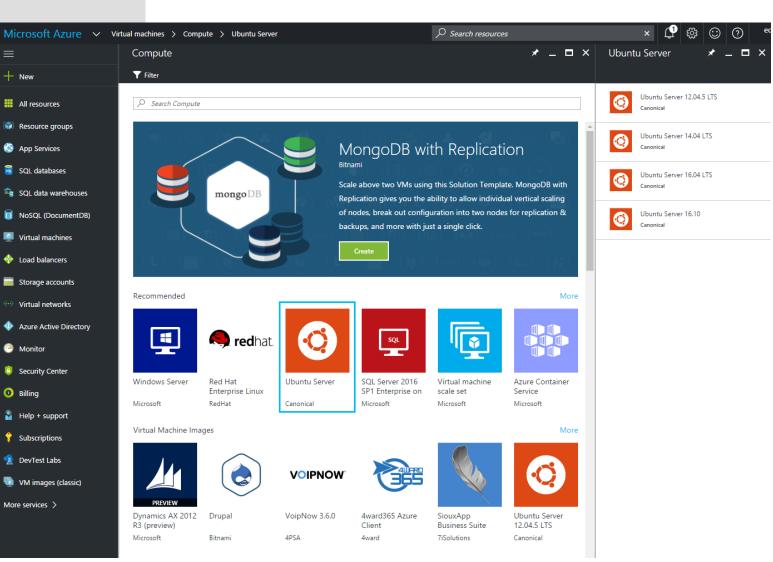
Microsoft Azure

Microso	oft Azur	٩							SALES 1-800-867-1389 🐨	MY ACCOUNT	PORTAL	Search	P
												FREE ACCOUNT	>
Why Azure	Solutions	Products	Documentation	Pricing	Partners	Blog	Resources	Support					1

Azure regions

Azure is generally available in 30 regions around the world, and has announced plans for 8 additional regions. Geographic expansion is a priority for Azure because it enables our customers to achieve higher performance and it support their requirements and preferences regarding data location.





TPP on the Cloud

Find tutorials at: http://tppms.org/tutorials

TPP 5.2.0: Installing on Ubuntu 18.04 LTS

Note that this recipe will likely not be exactly applicable to different versions of TPP or different distributions of Linux, but perhaps can be a useful head start. For other versions of TPP, please see the README \wedge and INSTALL LINUX files found in source code distribution for instructions on how to build TPP for the Linux platform.

Contents [hide]

discussion edit history

1 Before we begin

article

- 2 Installation
- 2.1 Installing prerequisite packages
- 2.2 Creating a suitable place to compile and install 2.3 Pulling the TPP 5.2.0 source code from SourceForge
- 2.4 Compiling the source code
- 2.5 Configuring the Apache web server
- 3 Testing the installation with a sample dataset (optional)

Before we begin

This recipe describes installing TPP release 5.2.0.

First some general notes

- We assume a fresh installation of Ubuntu 18.04 LTS as a starting point (LTS stands for
- This recipe was tested on a fresh Azure cloud computing platform instance running Ub
- . We assume that there is an ordinary user account named 'tpp' that will be used as the
- This installation assumes you are installing to /usr/local/tpp. If you want to install
- This installation assumes you will make your data directory /data. If you want to make
- This installation assumes you are using Apache 2.4 as your web server
- The gray blocks are commands to be typed in at the shell directly. You should be able

Installation

Installing prerequisite packages

Use the ubuntu package manager to upgrade any outdated packages and then install all

sudo apt update

- sudo apt --yes upgrade
- sudo apt --yes install subversion sudo apt --yes install build-essential
- sudo ant -- ves install nerl

ISB/SPC Trans Proteomic Pipeline ::	Petunia
PLEASE LOG IN TO USE TPP AND RELATE	D TOOLS
User Name: guest	
Password:	
Login	

TPP v5.2.0 Flammagenitus, Build 201903272055-7901 (Linux-x86 64)



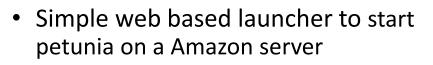




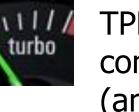
TPP on Amazon Web Services



TPP Web Application (TWA)



- Starts up an pre-configured TPP instance
- Doesn't require any software installation and is inexpensive to run
- Great tool for just trying out TPP
- Can be used when memory and better CPU is needed for an analysis



TPP Amazon command line tools (amztpp)

- Advanced command line toolset
- Launches parallel searches of files across multiple nodes
- Currently supports X!Tandem, OMSSA, MyriMatch, InsPect
- Manage all aspects of cloud computing including data transfer, scheduling, and instances
- Great for quickly and inexpensively processing large amounts of data



Direct Cloud support in TPP's User Interface, Petunia

Discussion

- Are you currently using Docker to run proteomics tools?
- Are you currently using cloud computing?
- Using the TPP on the cloud?
- Experiences?
- Is there an aspect that we should add?
- Are you writing cloud computing funds into your grant budgets?





- Introduction to TPP and overview of the latest features in 5.2
- Proteogenomics & PEFF applications
- Analyzing PTMs with PTMProphet
- Cross-linking analysis with Kojak 2.0
- Deploying the TPP using Docker containers and cloud computing platforms

• Open Discussion and Feedback





Group presentations at ASMS

For more info:

- Kojak 2.0 (MP 044)
- PEFF in TPP (MP 417)
- PTMProphet (WP 400)

Booth #118

http://www.tppms.org/asms/