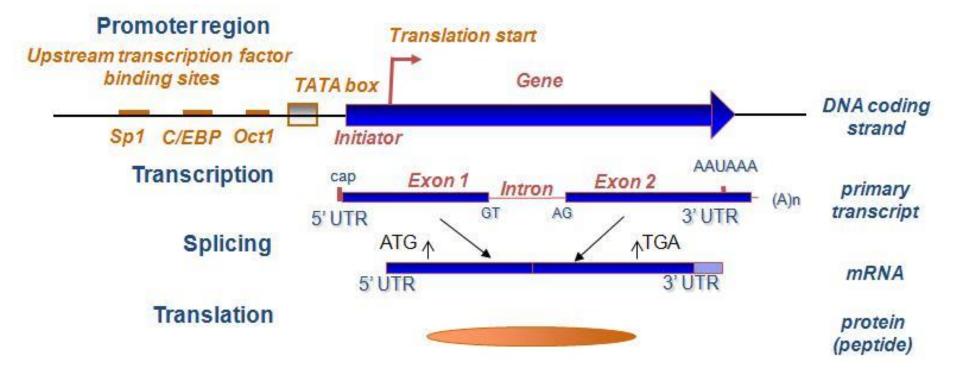
Predicting genes from DNA Sequence

Marylyn D Ritchie, PhD Professor, Biochemistry and Molecular Biology Director, Center for Systems Genomics The Pennsylvania State University







http://www.cpath.pitt.edu/genoAnnot.htm

processing this data. An important aspect of complete genomes is the distinction between coding regions and non-coding regions <u>-'junk' repetitive sequences</u> making up the bulk of base sequences especially in eukaryotes. Within the coding regions, genes are annotated with their translated protein sequence, and often with their cellular function. 2001

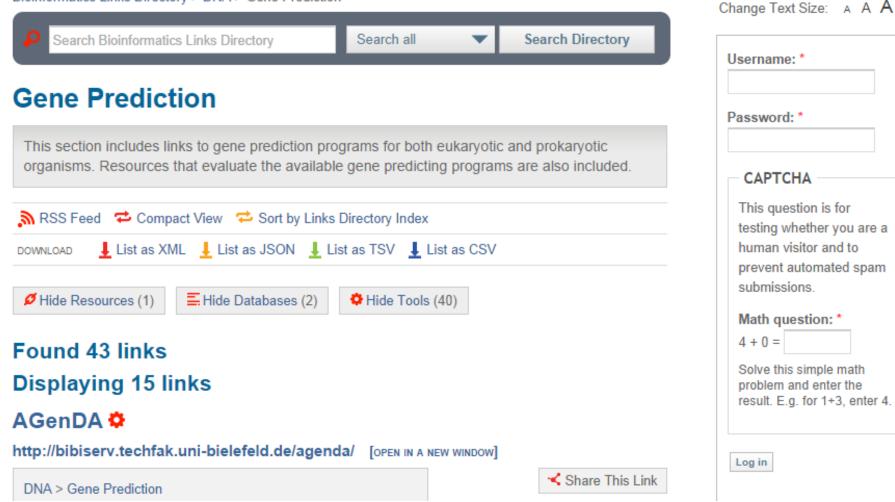
According to ENCODE's analysis, 80 percent of the genome has a "biochemical function". More on exactly what this means later, but the key point is: It's not "junk". Scientists have long recognised that some non-coding DNA has a function, and more and more solid examples have come to light [edited for clarity - Ed]. But, many maintained that much of these sequences were, indeed, junk. ENCODE says otherwise. "Almost every nucleotide is associated with a function of some sort or another, and we now know where they are, what binds to them, what their associations are, and more," says Tom Gingeras, one of the study's many senior scientists.

Gene prediction

- Also called gene finding
- Process of identifying regions of genomic DNA that encode genes
- Includes protein-coding genes and RNA genes
- May also include other functional elements
 - This will be discussed more in the next lecture
 - This area is changing very rapidly



Bioinformatics Links Directory > DNA > Gene Prediction



http://bioinformatics.ca/links_directory/category/dna/gene-prediction

Empirical gene finding systems

- Uses similarity or homology to identify genes
- Target genome is searched for evidence of similar sequence elements
- Local alignment algorithms look for similarity
 - BLAST
 - FASTA
 - Smith-Waterman

BLAST

- Basic Local Alignment Search Tool
- Many different types of BLAST available
- First published in 1990, *Journal of Molecular Biology*
- Fast algorithm
- Cannot guarantee optimal alignments like Smith-Waterman

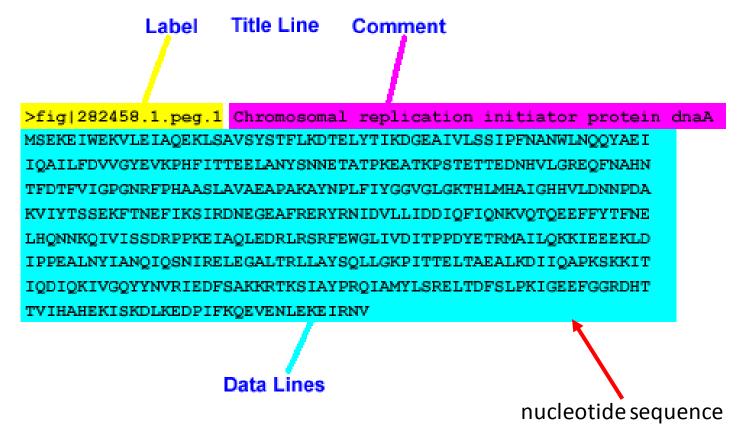
BLAST

- Input = sequences in FASTA or GenBank format
- Output = HTML, text, XML
 - Hits found
 - Table showing sequence identifiers for the hits with scoring related data
- BLAST is available for free through NCBI
- Commercial programs that include BLAST are also available

FASTA

- Originally designed for protein sequence similarity searching
- Added DNA:DNA searches
- Takes a given nucleotide sequence and searches a sequence database to find matches or similar database sequences
- Does a fast search first, followed by Smith-Waterman optimized search

FASTA



or amino acid sequence

Ab initio methods

- Intrinsic method based on gene content and signal detection
- DNA sequence is searched for signals of protein-coding genes
 - Promoter sequences
 - One contiguous open reading frame
 - Stop codon
- Complex in higher organisms due to various complexities
- Typically use probabilistic models such as Hidden Markov Models (HMM)
 - GLIMMER, GENSCAN, GenMark

Combined approaches

- Some combine extrinsic and ab initio approaches
 - Maker

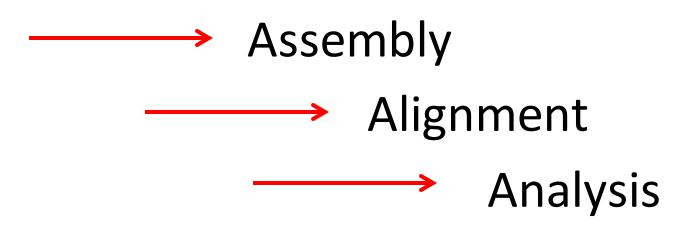
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When you get your sequence data, what do you do with it?

Table 1 Con	nparison of n	ext-genera	tion seq	uencing	platfo	orms				
Platform	Library/ template preparation	NGS chemistry	Read length (bases)	Run time (days)	Gb per run	Machine cost (US\$)	Pros	Cons	Biological applications	Refs
Roche/454's GS FLX Titenium	Frag, MP/ emPCR	PS	330*	0.35	0.45	500,000	Longer reads improve mapping in repetitive regions; fast run times	High reagent cost; high error rates in homo- polymer repeats	Bacterial and insect genome <i>de novo</i> assemblies; medium scale (<3 Mb) exome capture; 16S in metagenomics	D. Muzny, pers. comm.
Illumina/ Solexa's GA _i	Frag, MP/ solid-phase	RTs	75 or 100	4 [‡] ,9 ⁵	18 [‡] , 35 ⁵	540,000	Currently the most widely used platform in the field	Low multiplexing capability of samples	Variant discovery by whole-genome resequencing or whole-exome capture; gene discovery in metagenomics	D. Muzny, pers. comm.
Life/APG's SOLiD 3	Frag, MP/ emPCR	Cleavable probe SBL	50	7*, 14 ⁵	30‡, 50∮	595,000	Two-base encoding provides inherent error correction	Long run times	Variant discovery by whole-genome resequencing or whole-exome capture; gene discovery in metagenomics	D. Muzny, pers. comm.
Polonator G.007	MP only/ emPCR	Non- cleavable probe SBL	26	55	125	170,000	Least expensive platform; open source to adapt alternative NGS chemistries	Users are required to maintain and quality control reagents; shortest NGS read lengths	Bacterial genome resequencing for variant discovery	j. Edwards, pers. comm.
Helicos BioSciences HeliScope	Frag, MP/ single molecule	RTs	32*	8*	37*	999,000	Non-bias representation of templates for genome and seq-based applications	High error rates compared with other reversible terminator chemistries	Seq-based methods	91
Pacific Biosciences (target release: 2010)	Frag only/ single molecule	Real-time	964*	N/A	N/A	N/A	Has the greatest potential for reads exceeding 1 kb	Highest error rates compared with other NGS chemistries	Full-length transcriptome sequencing; complements other resequencing efforts in discovering large structural variants and haplotype blocks	S. Turner, pers. comm.

Sequence data



Sequence Data Analysis

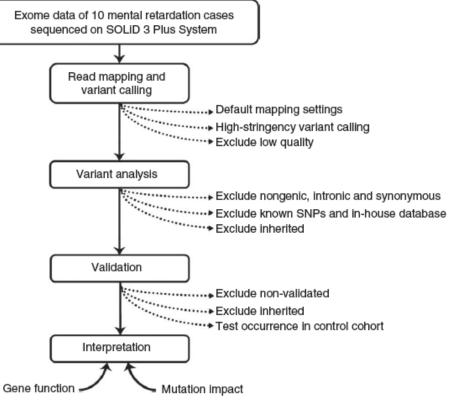
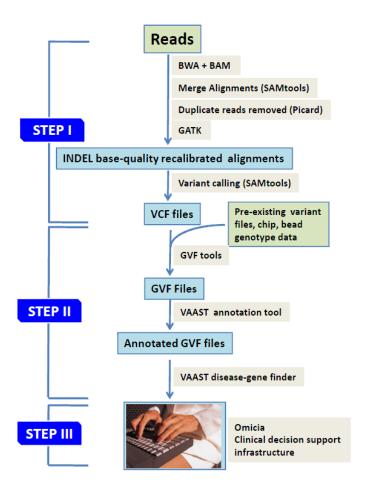


Figure 1 Experimental work flow for detecting and prioritizing sequence variants. For all ten mental retardation trios, prioritization of variants observed in the probands was based on selection for non-synonymous changes of high quality only and exclusion of all variants previously observed in healthy individuals, together with those variants that were inherited from an unaffected parent. Interpretation of *de novo* variants was based on gene function and the impact of the mutation.



Aligning Sequence & Detecting a Sequence Variant

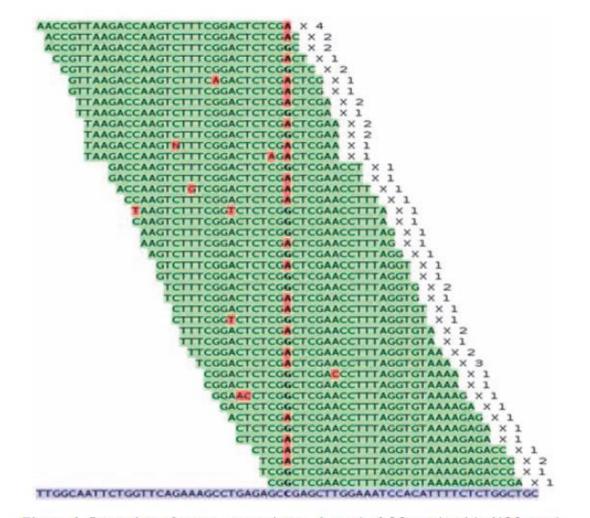
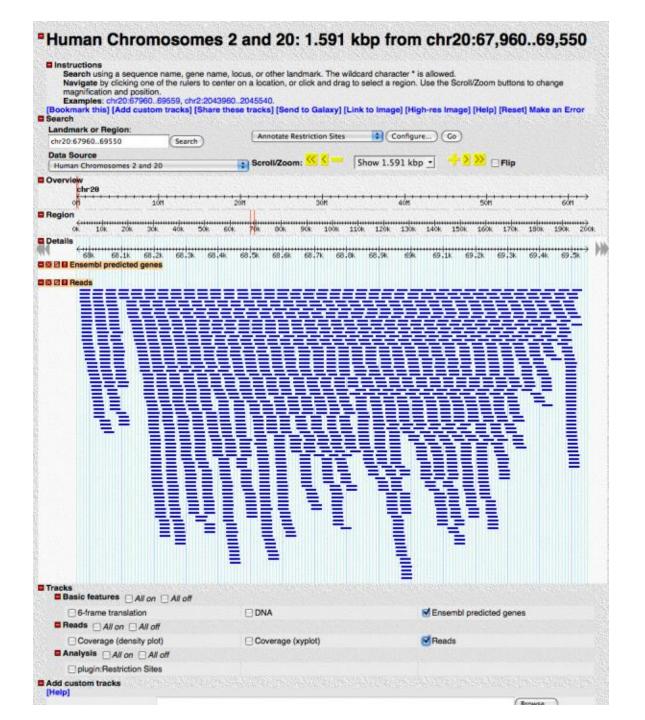
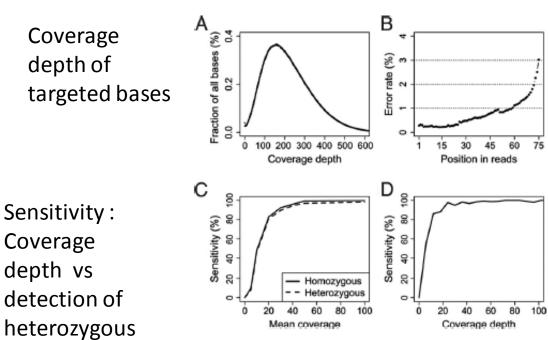


Figure 1 Detection of sequence variants. A total of 32 nucleotide NGS reads (top, sequence mismatches in red) aligned with the genomic reference sequence (bottom). The center of the alignment shows a variant present in the heterozygous state. ' $\times n$ ' behind the read indicates how many identical reads were obtained.



Technical Considerations for NGS



variants

Fig. 1. Coverage of targeted bases, error rate, and sensitivity to detect variants in whole-exome capture data. (A) Distribution of per-base read coverage among 5 capture experiments. A small fraction of targeted bases are poorly captured across all experiments. (B) The per-base error rate in this data set is shown as a function of read position. (C) Subject GIT 264–1 was sequenced to a mean depth of 99×. The sensitivity to detect homozygous (solid line) or heterozygous (dashed line) variants as mean depth of whole-exome sequence coverage increases from 0 to 100× is shown. Sensitivity to detect heterozygous variants increases from 81% to 90% to 95% as mean coverage is increased from 20× to 30× and 40×, and plateaus at 98%. (D) Sensitivity of detection of heterozygous variants at exact per-base coverage. Sensitivity is approximately 80% at 10× coverage, and approaches 100% at or greater than 20× per-base coverage.

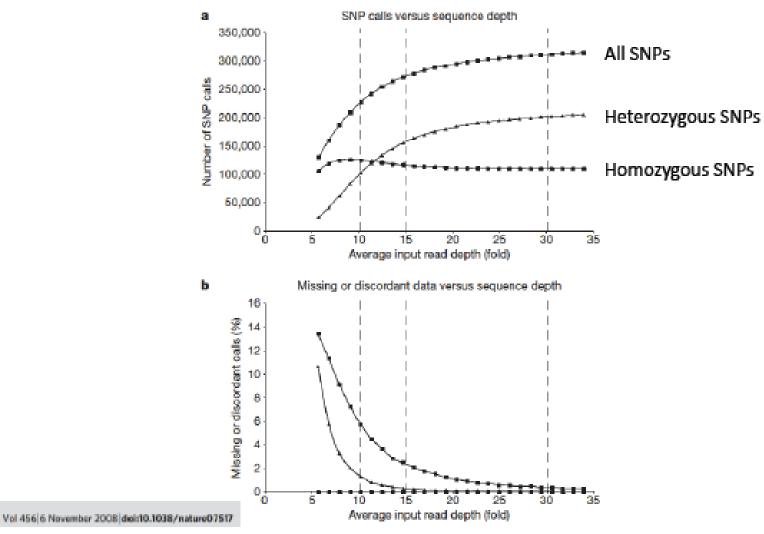
Per base error rate related to read position

> Sensitivity of detection of the variants at exact per base coverage

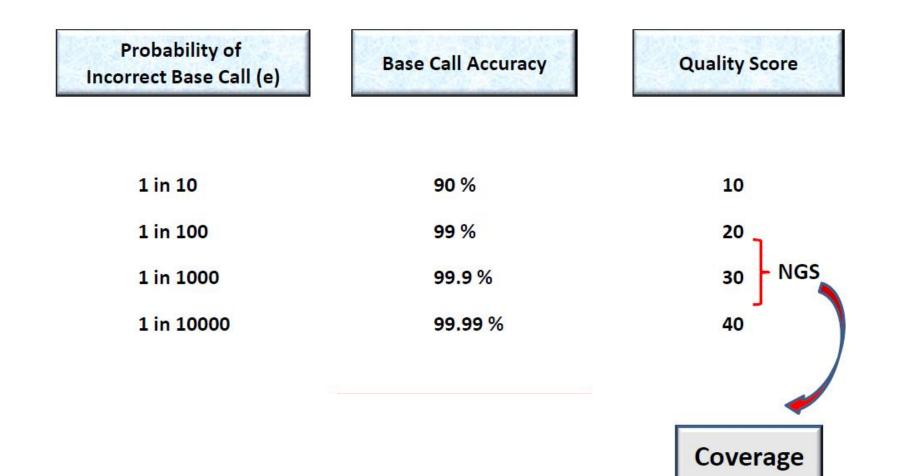
• Different technologies have different limitations.

Why 30X Coverage?

Why 30X?



NGS Quality Score



Galaxy

http://main.g2.bx.psu.edu/

💳 Galaxy

Data intensive biology for everyone.

<u>Galaxy</u> is an open, web-based platform for data intensive biomedical research. Whether on the <u>free public server</u> or <u>your own instance</u>, you can perform, reproduce, and share complete analyses.



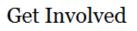
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Install <u>locally</u> or in the cloud Learn Galaxy



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Mailing lists, Tool Shed, wiki

The <u>Galaxy Team</u> is a part of <u>BX</u> at <u>Penn State</u>, and the <u>Biology</u> and <u>Mathematics and Computer</u> <u>Science</u> departments at <u>Emory University</u>. The Galaxy Project is supported in part by <u>NSF</u>, NHGRI, The Huck Institutes of the Life Sciences, The Institute for CyberScience at Penn State,

Name	URL	Description
Ensembl	http://www.ensembl.org/	Major species with completed genome sequences providing lineage-specific web portals for vertebrates, metazoa, plants, fungi, protists and bacteria.
UCSC	http://genome.ucsc.edu/cgi-bin/hgGateway	Major species with completed genome sequences including vertebrates, deuteros- tomes, insects and nematodes. No plant species.
Map Viewer	http://www.ncbi.nlm.nih.gov/mapview/	Major species with completed genome sequences including vertebrates, inverte- brates, protozoa, plants and fungi, as well as dozens of uncompleted plant genomes.
Phytozome	http://www.phytozome.net/cgi-bin/gbrowse/	Major plant species with completed and ongoing genome sequences including monocots, dicots, fern, moss and green algae, with VISTA alignments.
Gramene	http://www.gramene.org/genome.browser/	Major plant species with completed genome sequences including monocots, dicots, fern, moss and green algae, and the short arm of chromosome 3 of several wild rice species.
VISTA	http://pipeline.lbl.gov/cgi-bin/gateway2/	Whole genome alignment presentation, including vertebrates, insects, nematodes, deuterostomes, plants, fungi, alga, annelids, stramenopiles and metazoa.
Genome Projector	http://www.g-language.org/g3/	Several hundreds of bacteria genomes with circular or linear maps.
Annmap	http://annmap.picr.man.ac.uk/	A genome browser that includes mappings between genomic features and Affymetrix microarrays for human, mouse, rat and yeast.

Table I: List of main web-based general genome browsers with multiple species

Wang et al. 2013 Briefings in Bioinformatics

Name	URL	Species
Animals		
MGI	http://gbrowse.informatics.jax.org/cgi-bin/gbrowse/	Mus musculus (Mouse)
RGD	http://rgd.mcw.edu/fgb2/gbrowse/	Rattus norvegicus (Rat)
Xenbase	http://www.xenbase.org/fgb2/gbrowse/	Xenopus tropicalis (Frog)
ZFIN	http://zfin.org/cgi-perl/gbrowse/	Danio rareo (Zebrafish)
Flybase	http://flybase.org/cgi-bin/gbrowse/	Drosophila (Fruit fly)
BeetleBase	http://beetlebase.org/cgi-bin/gbrowse/	Tribolium Castaneum (Beetle)
AphidBase	http://isyip.genouest.org/cgi-bin/gb2/gbrowse/	Acyrthosiphon pisum (Aphid)
wFleaBase	http://wfleabase.org/gbrowse/	Daphnia (Water flea)
Wormbase	http://www.wormbase.org/db/gb2/gbrowse/	Caenorhaditus elegans (Worm)
Plants		
TAIR	http://www.arabidopsis.org/browse/	Arabidopsis thaliana (Wall cress)
BRAD	http://brassicadb.org/cgi-bin/gbrowse/	Brassica rapa (Brassica)
SGN	http://solgenomics.net/gbrowse/bin/gbrowse/	Solanum pimpinellifolium (Tomato)
Popgenie	http://www.popgenie.org/tool/gbrowse/	Populus trichocarpa (Populus)
Rice Genome	http://rice.plantbiology.msu.edu/cgi-bin/gbrowse/	Oryza sativa japonica (Rice)
Rice-Map	http://www.ricemap.org/	Oryza sativa japonica/indica (Rice)
MaizeDB	http://gbrowse.maizegdb.org/	Zea mays (Maize)
Microbes		
dictyBase	http://dictybase.org/db/cgi-bin/ggb/gbrowse/	Dictyostelium discoideum (Dictyostelid
SGD	http://browse.yeastgenome.org/	Saccharomyces cerevisiae (Yeast)
Paramecium DB	http://paramecium.cgm.cnrs-gif.fr/cgi-bin/gbrowse2/	Paramecium tetraurelia

Table 2: List of some web-based species-specific genome browsers

Wang et al. 2013 Briefings in Bioinformatics

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Abaca bunchy top virus	Viruses		ssDNA viruses	Nanoviridae		0.006422	6	-	-	1
Abalone herpesvirus Victoria/AUS/2009	Viruses		dsDNA viruses, no RNA stage	unclassified		0.211518	1	-	-	1
Abalone shriveling syndrome-associated virus	Viruses		dsDNA viruses, no RNA stage	unclassified		0.034952	1	-	-	1
Abelson murine leukemia virus	Viruses		Retro-transcribing viruses	Retroviridae		0.005894	1	-	-	1

Geminiviridae

Geminiviridae

Geminiviridae

Geminiviridae

Other Protists

Mimiviridae

Birds

Phycodnaviridae

Abutilon Brazil virus

Abutilon mosaic Bolivia virus

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Acanthamoeba castellanii

Acanthamoeba polyphaga mimivirus

Acanthisitta chloris

Acanthocystis turfacea Chlorella virus 1

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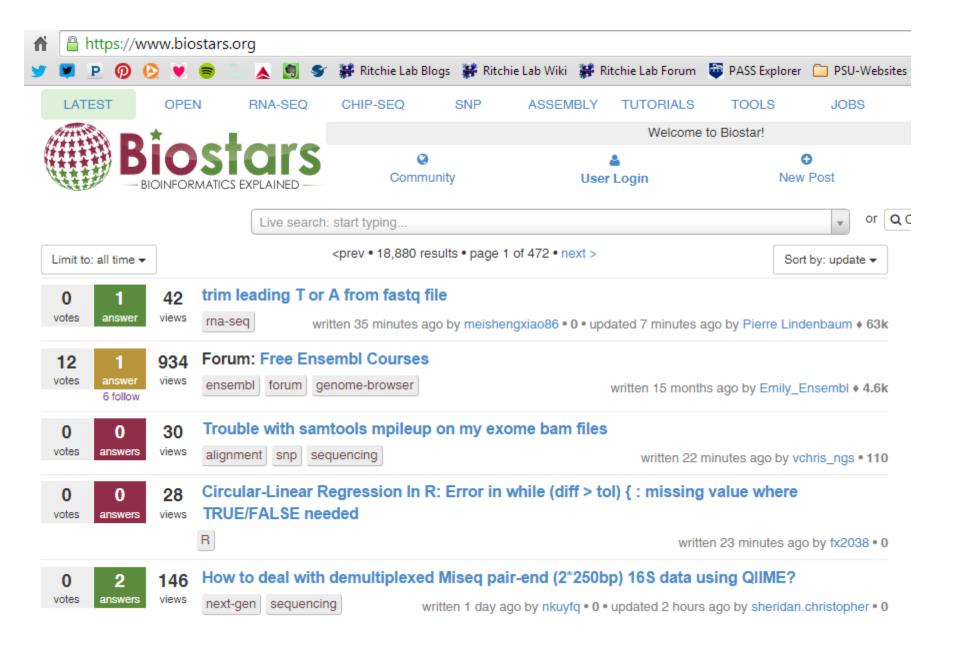
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Multiple Alignments			
Metagenomic analyses Genome Diversity			

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Questions???

