# Variant annotation

## VARIANT and HPG-VARIANT

### **University of Cambridge**

Cambridge, UK 10<sup>th</sup> June 2014





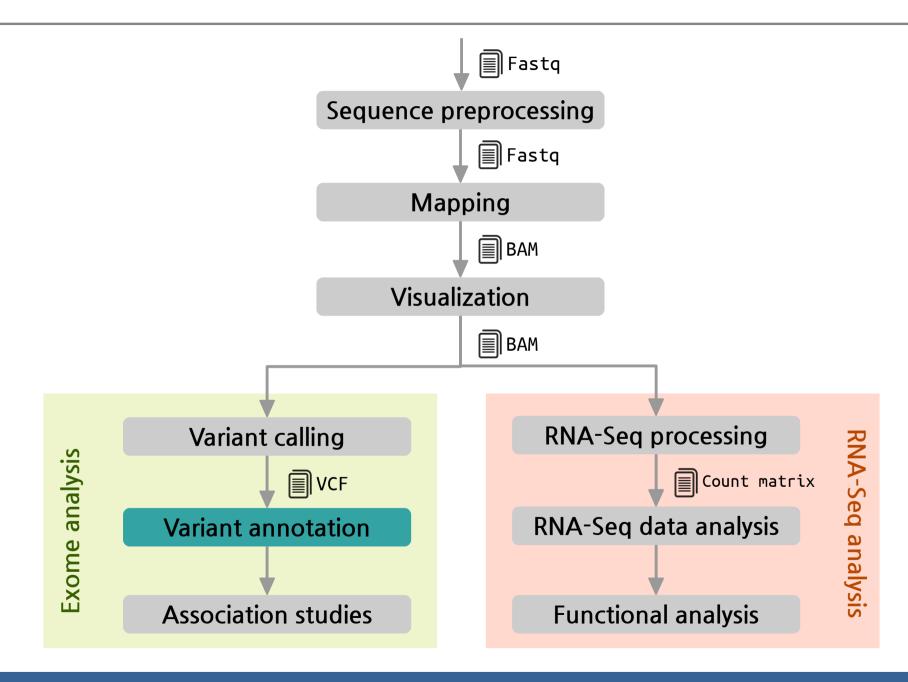


#### Marta Bleda Latorre

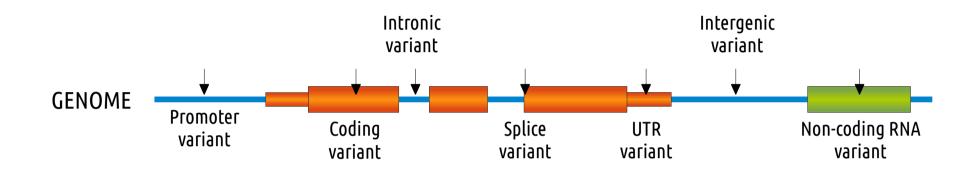
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# The pipeline



## What is functional annotation?



## Why we do that?

- ► Each individual exome carries ~25,000 variants → PRIORITIZATION!
- We want to identify a small subset of functionally important variants to pinpoint the putative disease causal variants
- We need strategies to estimate the deleteriousness of our variants to better identify disease-causal variants

#### **CAUTION!**

On average, each *normal* person is found to carry:

- ~11,000 synonymous variants
- ~11,000 non-synonymous variants

**250 to 300 los-of-function** variants in annotated genes

50 to 100 variants previously implicated in inherited disorders

1000 Genomes Project Consortium. *A map of human genome variation from population-scale sequencing.* **Nature**. 2010 Oct 28;467(7319):1061-73. PubMed PMID: 20981092

## Sources of functional information

Table 1 Publicly available tools and databases for various tasks of genetic variant annotation and prioritization

Category Database/tool/project		Description	URL		
Genetic variant data	dbSNP <sup>68</sup>	Comprehensive, curated SNP and short indel database	http://www.ncbi.nlm.nih.gov/projects/S		
sources	DbVar <sup>69</sup>	Comprehensive, curated database for structural variants	http://www.ncbi.nlm.nih.gov/dbvar		
	DGV <sup>70</sup>	Human structural variants from samples with no phenotype	http://projects.tcag.ca/variation		
Functional characterization of genomic elements	ENCODE <sup>71</sup>	High-throughput functional characterization of DNA elements, including noncoding regions	http://www.genome.gov/10005107		
	SIFT <sup>72</sup> , PolyPhen <sup>73</sup>	Prioritization of nonsynonymous SNPs	http://sift.jcvi.org, http://genetics.bwh. harvard.edu/pph2		
Public gene–trait associations	dbGaP <sup>34</sup>	Comprehensive listing of genotype-to-phenotype mappings	http://www.ncbi.nlm.nih.gov/gap		
	EGA <sup>74</sup>	Genotype–phenotype experiment archive	http://www.ebi.ac.uk/ega		
Disease-associated	HGMD <sup>35</sup>	Database for human disease mutations	http://www.hgmd.org		
mutations	OMIM <sup>36</sup>	Mendelian disease gene associations	http://www.ncbi.nlm.nih.gov/omim		
	SwissVar <sup>76</sup>	Variant catalog of the UniProt knowledge bases	http://swissvar.expasy.org		
	GAD <sup>77</sup>	NCBI source for genotype – disease associations	http://geneticassociationdb.nih.gov		
	GWAS catalog from NHGRI <sup>78</sup>	SNP-phenotype associations found by GWAS	http://www.genome.gov/gwastudies		
Whole-genome repositories	Complete genomics public genomes <sup>79</sup>	Complete genomics for 69 genomes from multiple ancestries (includes samples from the NHGRI and NIGMS repositories)	http://www.completegenomics.com/ sequence-data/download-data		
	1,000 Genomes <sup>80</sup>	Expanding resource currently housing three low-coverage whole genomes of multiple ancestries	http://www.1000genomes.org		
Ancestry-focused variant data sources	HapMap <sup>26</sup>	Haplo-block mapping for diverse populations	http://www.hapmap.org		
	HGDP <sup>27</sup>	SNP profiles of samples from several endogenous populations	http://hagsc.org/hgdp		
Pharmacogenomic associations and data	PharmGKB <sup>56</sup>	Variant–pharmacokinetic/pharmacodynamic trait http://www.pharmgklassociations and gene–drug interactions		Cord	
sources	DrugBank <sup>81</sup>	Drug-target database with biochemical properties	http://drugbank.ca	Cord in p	

















Cordero P, Ashley EA. *Whole-genome sequencing in personalized therapeutics*. **Clin Pharmacol Ther**. 2012 Jun ;91(6):1001-9. PubMed PMID: 22549284

## Computational method and tools

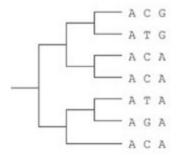
- Annotated information is sometimes limited, particularly for rare and complex traits
- Computational methods can measure deleteriousness by using comparative genomics and knowledge of protein biochemistry and structure

#### **Comparative Genomics**

Focus on sequences that have not been remove by **natural selection**.

Quantify evolutionary changes in genes or genomes and define conserved and neutral regions.

Variants observed in conserved sites are highly likely to be **deleterious**.



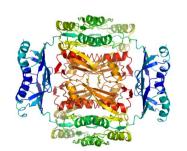
#### Effects in protein-coding variants

Can combine **evolutionary** and **biochemical** information.

Two types of approaches: first **principles** approaches and **trained** approaches.

Use alignments of homologous proteins to estimate mutational deleteriousness.

Use **biochemical data** such as amino acid properties, binding information and structural information to estimate the impact.



#### Effects in non-coding variants

The majority of the human genetic variation is in non-coding regions.

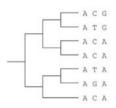
No detectable conservation outside vertebrates.

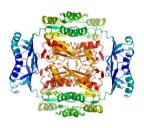
Main strategy for estimation is testing the **mammalian conservation** of the non-coding variants.

Cooper GM, Shendure J. Needles in stacks of needles: finding disease-causal variants in a wealth of genomic data. Nature Reviews Genetics. 2011 Aug 18;12(9):628-40. Pubmed PMID: 21850043

## Computational methods and tools

# Prediction scores for non-synonymous variants





#### Table 1 | Tools for protein-sequence-based prediction of deleteriousness

Name	Туре	Information	URL	Refs
MAPP	Constraint-based predictor	Evolutionary and biochemical	http://mendel.stanford.edu/SidowLab/downloads/MAPP/index.html	27
SIFT	Constraint-based predictor	Evolutionary and biochemical (indirect)	http://sift.bii.a-star.edu.sg/	39
PANTHER	Constraint-based predictor	Evolutionary and biochemical (indirect)	http://www.pantherdb.org/	41
MutationTaster*	Trained classifier	Evolutionary, biochemical and structural	http://www.mutationtaster.org/	40
nsSNP Analyzer	Trained classifier	Evolutionary, biochemical and structural	http://snpanalyzer.uthsc.edu/	44
PMUT	Trained classifier	Evolutionary, biochemical and structural	http://mmb2.pcb.ub.es:8080/PMut/	38
polyPhen	Trained classifier	Evolutionary, biochemical and structural	http://genetics.bwh.harvard.edu/pph2/	35
SAPRED	Trained classifier	Evolutionary, biochemical and structural	http://sapred.cbi.pku.edu.cn/	42
SNAP	Trained classifier	Evolutionary, biochemical and structural	http://www.rostlab.org/services/SNAP/	36
SNPs3D	Trained classifier	Evolutionary, biochemical and structural	http://www.snps3d.org/	51
PhD-SNP	Trained classifier	Evolutionary and biochemical (indirect)	http://gpcr2.biocomp.unibo.it/~emidio/ PhD-SNP/PhD-SNP_Help.html	37

<sup>\*</sup>Also makes predictions for synonymous and non-coding variant effects: for example, splicing. MAPP, Multivariate Analysis of Protein Polymorphism; polyPhen, polymorphism phenotyping.

Cooper GM, Shendure J. *Needles in stacks of needles: finding disease-causal variants in a wealth of genomic data.* **Nature Reviews Genetics**. 2011 Aug 18;12(9):628-40. Pubmed PMID: 21850043

# Computational methods and tools

## Prediction scores for non-coding variation

Table 2 | Tools for nucleotide-sequence-based prediction of deleteriousness

Name	Туре	Information	URL	Refs
phastCons	Phylogenetic HMM	Evolutionary	http://compgen.bscb.cornell.edu/phast/	60
GERP	Single-site scoring	Evolutionary	http://mendel.stanford.edu/SidowLab/ downloads/gerp/index.html	67
Gumby	Single-site scoring	Evolutionary	http://pga.jgi-psf.org/gumby/	21
phyloP	Single-site scoring	Evolutionary	http://compgen.bscb.cornell.edu/phast/	66
SCONE	Single-site scoring	Evolutionary	http://genetics.bwh.harvard.edu/scone/	68
binCons	Sliding-window scoring	Evolutionary	http://zoo.nhgri.nih.gov/binCons/index.cgi	69
Chai Cons	Sliding-window scoring	Evolutionary and structural	http://research.nhgri.nih.gov/software/chai	71
VISTA	Visualization tool (various scores)	Evolutionary	http://genome.lbl.gov/vista/index.shtml	70

GERP, Genomic Evolutionary Rate Profiling; HMM, hidden Markov model; SCONE, Sequence Conservation Evaluation.

Cooper GM, Shendure J. *Needles in stacks of needles:* finding disease-causal variants in a wealth of genomic data. **Nature Reviews Genetics**. 2011 Aug 18;12(9):628-40. Pubmed PMID: 21850043

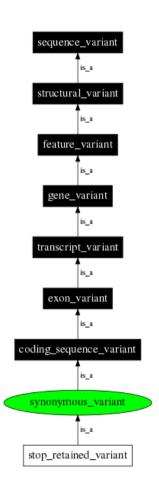
## Consequence types

The standard:



## Common vocabulary

Label	SO accession	Description
Coding sequence	SO:0001580	In coding sequence with in determinate effect
Synonymous codon	SO:0001588	In coding sequence, not resulting in an amino acid change (silent mutation)
Non-synonymous codon	SO:0001583	In coding sequence and results in an amino acid change in the encoded peptide sequence
Stop gained	SO:0001587	In coding sequence, resulting in the gain of a stop codon
Stop lost	SO:0001587	In coding sequence, resulting in the gain of a stop codon
Splice site	SO:0001630	1-3bps in to an exon or 3-8bps into an intron
Splice acceptor	SO:0001574	A splice variant that changes the 2 base region at the 3' end of an intron
Splice donor	SO:0001575	A splice variant that changes the 2 base region at the 5' end of an intron
5' UTR	SO:0001623	In 5 prime untranslated region
3' UTR	SO:0001624	In 3 prime untranslated region
Upstream	SO:0001635	Within 5kb upstream of the 5 prime end of a transcript
Downstream	SO:0001633	Within 5kb downstream of the 3 prime end of a transcript
TFBS	SO:0001782	A sequence variant located with in a transcription factor binding site
miRNA target	SO:0000934	A binding site where the molecule is a microRNA
Intergenic	SO:0001628	More than 5 kb either upstream or downstream of a transcript



More information: http://www.ensembl.org/info/docs/variation/predicted\_data.html

## Tools for functional annotation

- We need to measure the impact of each variant in the genome
- We cannot annotate 25,000 variants manually checking more than 20 databases

**SNPnexus SNPeffect HSF** SCONE **PHAST PupaSNP CUPSAT** 4.0 **SNP Function FANS SNPper** SNPdbe Finder F-SNP CHASM and Portal **ABSOLUTE** SIFT **SNVBox** SCAN Auto-mute nsSNPAnalyzer MutationTaster PolyPhen-2 PhD-SNP AnnTools **FastSNP** pfSNP FOLD-X MAPP **SNAP** GERP++ **HOPE PESX SAPRED** ResqueESE **VEP** SeaAnt **FFSD** QuikSNP SNPs3D **PolyDoms** MutaGeneSys MutPred NGS-SNP **ANNOVAR** 

ANNOVAR

MutaGeneSys

MutPred

SVA

SiPhy

FolyDoms

PolyDoms

SiPhy

SiPhy

PolyMAPr

ESEfinder

MuD

SeqProfCod

MutSig

Mutsing

Stephan Pabinger et al. A survey of tool

SNP@Domain
I-Mutant2.0

Align GVD

Stephan Pabinger et al. A survey of tools for variant analysis of next-generation genome sequencing data. Briefings in Bioinformatics. 2013 Jan. Pubmed PMID: 23341494

## **AnnoVar**

#### ANNOVAR web site: http://www.openbioinformatics.org/annovar/



- Free and open source
- Can annotate SNV, insertions and deletions
- Regulatory information: Conserved genomic regions, TFBSs, miRNA targets and predicted miRNA secondary structures. ENCODE DNAse I hypersensitive sites, Histone methylations, ChIP and RNA-Seq peaks
- DbSNP, 1000 genomes SIFT and GERP filtering
- Predictions: Polyphen, LRT, MutationTaster, PhyloP
- Can handle custom annotations in GFF3
- Can handle 1 o 0-based coordinates
- 5 Species (human, mouse, worm, fly, yeast)



Accepts VCF4, GFF3-SOLiD and CSV BUT after conversion to their particular input file:

Chr	Start	End	Ref	0bs	Comments
1	161003	161003	С	Т	comments: rs1000050

- Perl written program
- Installation required
- Users need to download every annotation database and save them locally (~35GB per assembly)
- Need to be run several times
- Output: several files depending on the query
- Does not use Sequence Ontology terms

Wang K, Li M, Hakonarson H. *ANNOVAR: Functional annotation of genetic variants from next-generation sequencing data.* **Nucleic Acids Research**. Sep;38(16):e164 Pubmed PMID: 20601685

## **AnnoVar**

#### **EXAMPLE** of ANNOVAR usage

```
DOWNLOADING BIOLOGICAL DATA:
 user@computer:~$ annotate variation.pl -buildver hg19 -downdb refgene humandb/
 user@computer:~$ annotate variation.pl -buildver hg19 -downdb snp135 -webfrom annovar humandb/
 user@computer:~$ annotate variation.pl -buildver hg19 -downdb phastConsElements46way humandb/
 user@computer:~$ annotate variation.pl -buildver hg19 -downdb 1000g2012apr -webfrom annovar
humandb/
 user@computer:~$ annotate variation.pl -buildver hg19 -downdb cytoBand humandb/
EXTRACTING THE EFFECT:
 user@computer:~$ annotate variation.pl -geneanno example/ex1.human humandb/
 user@computer:~$ annotate variation.pl -regionanno -dbtype band example/ex1.human humandb/
 user@computer:~$ annotate variation.pl -filter -dbtype 1000g2012apr eur example/ex1.human humandb/
```

# Variant Effect Predictor (VEP)

VEP documentation site: http://www.ensembl.org/info/docs/variation/vep/index.html



- Backed by Ensembl
- Free and open source
- 3 ways of functionality: web interface, standalone Perl script and Ensembl's Perl API
- Input formats: CSV, VCF, Pileup and HGVS
- Regulatory information: TFBSs
- Filtering by coding regions and MAF
- Predictions: SIPF, PolyPhen
- 1000 genomes and dbSNP information
- Uses Sequence Ontology
- Many species

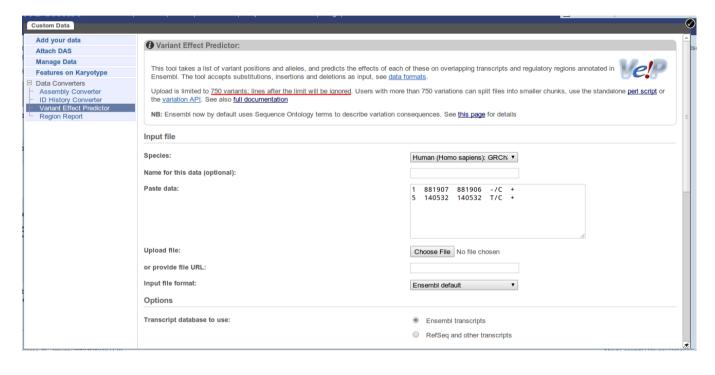


- Regulatory information does not include miRNA targets
- Web interface limit: 750 variants
- The standalone Perl script needs:
  - Perl and MySQL support (more than 100GB of data)
  - Download, install and update every ~ 2 months
- Perl API requires:
  - Installation (Really, really hard!)
  - Downloads and update
  - API documentation → Hard to understand

McLaren W, Pritchard B, Rios D, Chen Y, Flicek P, Cunningham F. *Deriving the consequences of genomic variants with the Ensembl API and SNP Effect Predictor.* **BMC Bioinformatics** 26(16):2069-70(2010) Pubmed PMID: 20562413

## Variant Effect Predictor (VEP)

VEP web interface: http://www.ensembl.org/tools.html



The web interface to the VEP has a hard limit of 750 variants in your uploaded file. However, it is possible that the tool will not work with fewer variants than this, depending on the content of your data and the features you switch on. For example, a relatively small file (e.g. 100 variants) may fail to return results if every variant in the file falls in a different gene and those genes are spread across many chromosomes. Contrastingly, a file containing 500 variants may return results quickly if those variants all fall in just a few genes.

To mitigate this issue, users should consider splitting up their input by chromosome and uploading each chromosome's variants as a separate file. The problem can also be solved by using the VEP script - it is a command line tool, but not as hard to use as you might think! It also offers many more features than the web interface and is a generally much more powerful tool.

http://www.ensembl.org/info/docs/variation/vep/index.html

McLaren W, Pritchard B, Rios D, Chen Y, Flicek P, Cunningham F. *Deriving the consequences of genomic variants with the Ensembl API and SNP Effect Predictor.* **BMC Bioinformatics** 26(16):2069-70(2010) Pubmed PMID: 20562413

## Variant Effect Predictor (VEP)

```
1 use strict:
2 use warnings:
                                                                 EXAMPLE of API usage: Getting all variations in a particular human
3 use Bio::EnsEMBL::Registry;
                                                               transcript and see what is the effect of that variation in the transcript
5 my $registry = 'Bio::EnsEMBL::Registry';
7 $registry->load registry from db(
      -host => 'ensembldb.ensembl.org'.
      -user => 'anonymous'
10):
11
12 my $stable id = 'ENST00000393489'; #this is the stable id of a human transcript
13 my $transcript_adaptor = $registry->get adaptor('homo sapiens', 'core', 'transcript'); #get the adaptor to get the Transcript from the database
14 my $transcript = $transcript_adaptor->fetch_by_stable_id($stable_id); #get the Transcript object
16 my $trv_adaptor = $registry->get_adaptor('homo_sapiens', 'variation', 'transcriptvariation'); #get the adaptor to get TranscriptVariation objects
17 my $trvs = $trv_adaptor->fetch all by Transcripts([$transcript]); #get ALL effects of Variations in the Transcript
19 foreach my $tv (@{$trvs}) {
20
          my $tvas = $tv->get all alternate TranscriptVariationAlleles():
21
22
          foreach my $tva(@{$tvas}) {
23
                 my @ensembl_consequences;
24
                 my @so_consequences;
25
                 my $ocs = $tva->get_all_OverlapConsequences();
26
27
                 foreach my $oc(@{$ocs}) {
28
                        push @ensembl_consequences, $oc->display_term;
29
30
                        push @so_consequences, $oc->SO_term;
31
32
33
                 my $sift = $tva->sift_prediction;
                 my $polyphen = $tva->polyphen_prediction;
35
36
37
                        "Variation ", $tv->variation_feature->variation_name,
38
                         " allele ", $tva->variation feature seg,
                         " has consequence ", join(",", @ensembl_consequences),
39
                         " (SO ", join(",", @so_consequences), ").";
                 if(defined($sift)) {
                        print " SIFT=$sift":
                 if(defined($polyphen)) {
                        print " PolyPhen=$polyphen";
                 print "\n":
```

McLaren W, Pritchard B, Rios D, Chen Y, Flicek P, Cunningham F. *Deriving the consequences of genomic variants with the Ensembl API and SNP Effect Predictor.* **BMC Bioinformatics** 26(16):2069-70(2010) Pubmed PMID: 20562413

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# **HPG-VARIANT** (aka VARIANT)

HPG-VARIANT web site: http://www.opencb.org/projects/hpg/doku.php?id=variant:overview



- Free and open source.
- 3 ways of functionality: C CLI program, Web application and Java RESTful WS API
- Cloud variant annotator. Requires no installation or updates
- Regulatory information: Conserved genomic regions, TFBSs and miRNA targets. ENCODE DNAse I hypersensitive sites and Histone methylations
- dbSNP and 1000genomes information
- Phenotypic information: HGMD, COSMIC and OMIM
- Cross-link with many other DDBB (Ensembl, UniProt, PDB, etc)
- Polyphen and SIFT
- Input: VCF, GFF and BED. Accepts compressed files in tar.gz
- 11 species (human, mouse, rat, zebra fish, worm, fly, yeast, dog, pig, mosquito and plasmodium)
- HPG-VARIANT-GWAS to test for association



- Young program, many new features coming
  - PhastCons, GERP
  - Many more species (~25 new species)
  - Large structural variants annotation

Medina I, De Maria A, Bleda M, Salavert F, Alonso R, Gonzalez CY, Dopazo J. *VARIANT: Command Line, Web service and Web interface for fast and accurate functional characterization of variants found by Next-Generation Sequencing*. **Nucleic Acids Research**. 2012 Jul;40(Web Server issue):W54-8 Pubmed PMID: 22693211

# **HPG-VARIANT (CLI Program)**

- Download the program and save it into your course/variant\_annotation folder:
  - http://wiki.opencb.org/projects/hpg/doku.php?id=variant:downloads
- Extract the contents



\* Only for Debian 6 / Ubuntu 10.04 or greater

Add the folder to your PATH

```
echo "export PATH=$PATH:/home/Desktop/hpg-variant-1.0" >> ~/.bashrc
source ~/.bashrc
```

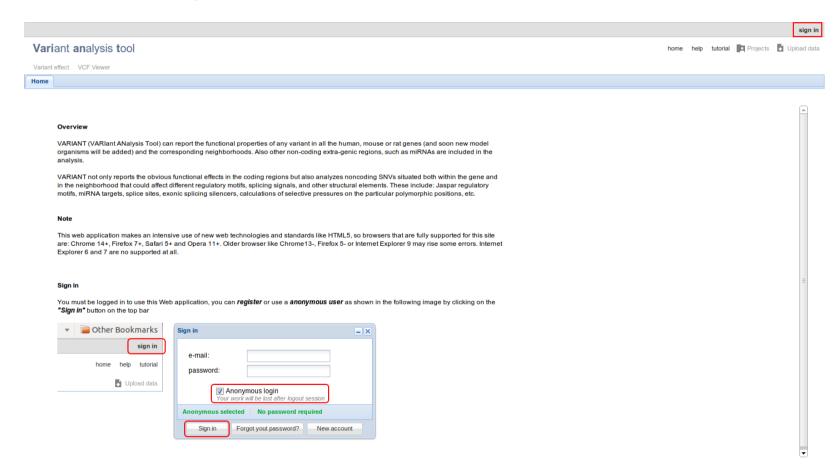
Usage:

```
hpg-var-effect -v CHB.exon.2010_03.sites.vcf --outdir effect_output/
```

# HPG-VARIANT Web application

Web application

http://variant.bioinfo.cipf.es/



# **HPG VARIANT - CLI program**

- Open the effect\_output directory and let's see what is in!
- Is there any variant affecting a splice donor site?

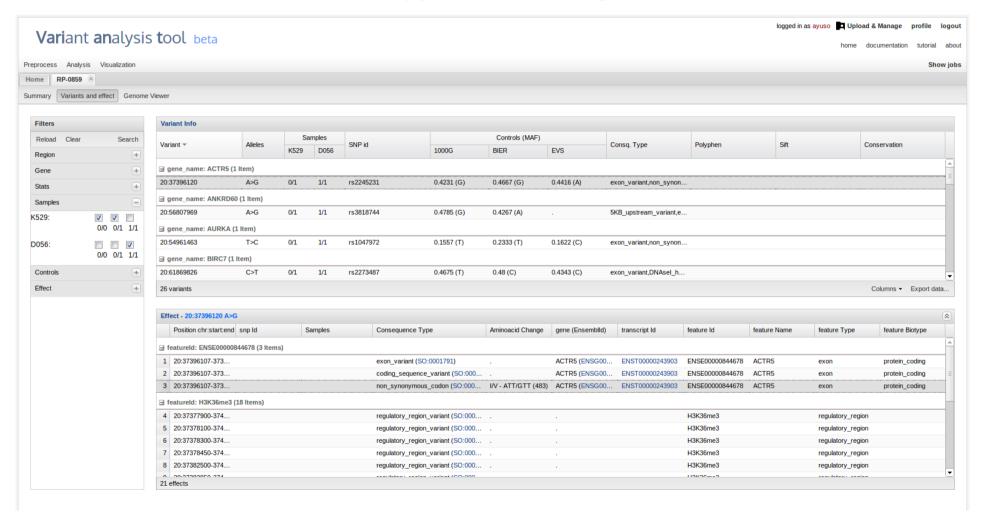
Yes! There are 4 variants in a splice donor site affecting 5 genes: CEP104, HSE4, C1orf159, CALML6 and C1ORF222.

Is there any SNP with known phenotype?

Yes! There are 39 SNPs with known phenotype. They have been associated with Migraine, Alzheimer's disease, Ulcerative colitis, Rheumatoid arthritis, etc.

## **BierApp**

### Bierapp.babelomics.org





# The objective

