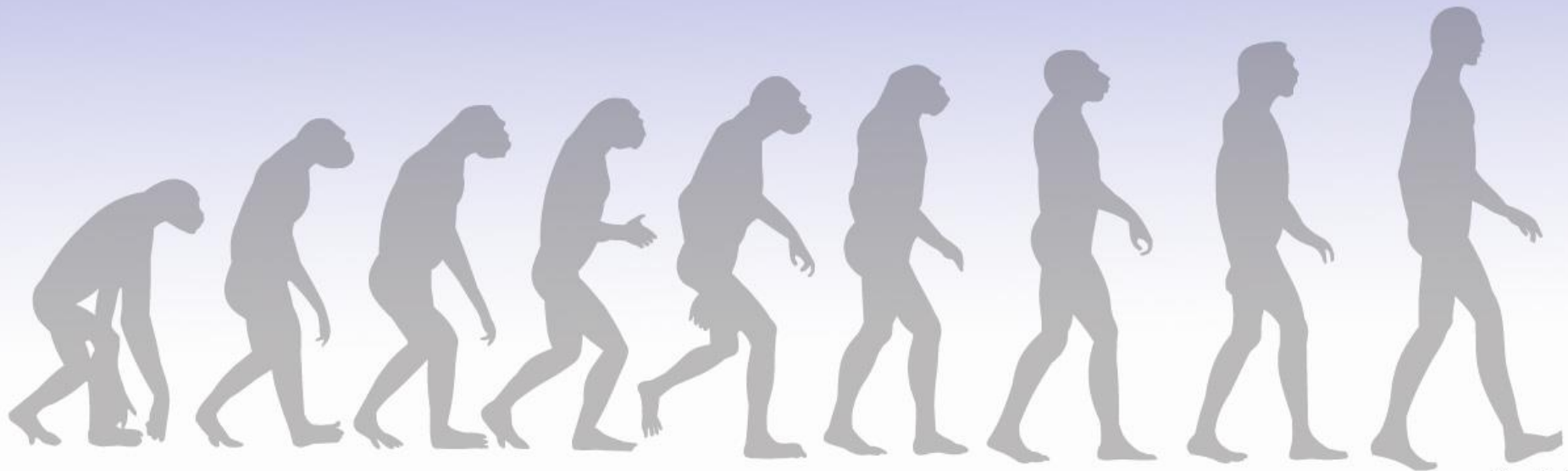


# Gene Expression Level and Single Nucleotide Polymorphism Rates

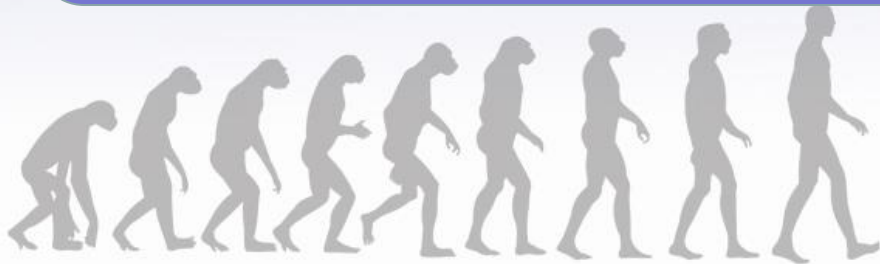


# Protein Evolution in the past

Evolution rates controlled by “function-centered”  
Hypothesis

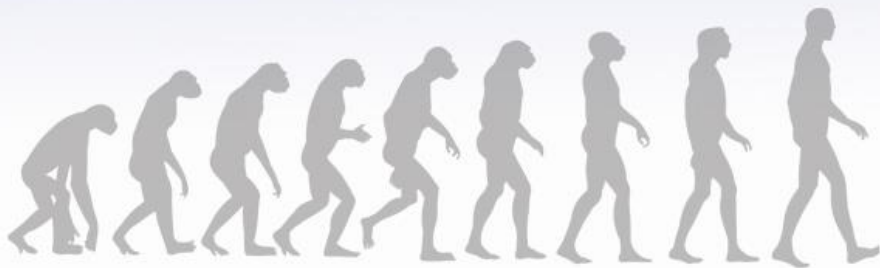


The functional importance of amino acid and their densities  
in a protein.



# Factors affect the proteins evolution

- The genomic position of the encoding genes
- Gene expression patterns
- Position in biological networks and possibly their robustness to mistranslation.



# Expression-based evolutionary analysis

Multicellular organisms

**Using**

Expression breadth

Unicellular organisms

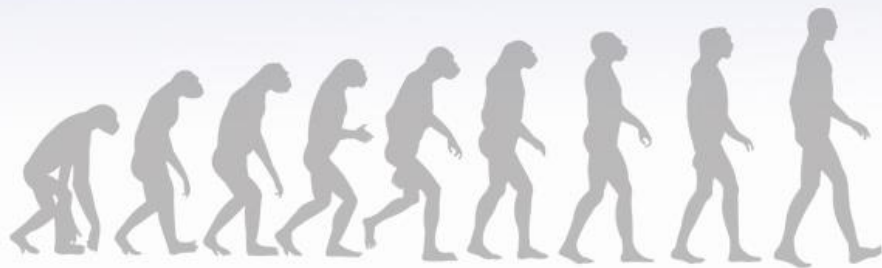
**Using**

Gene expression



# Why “**Expression breadth**” used mainly in Multicellular organisms

- As Genes express at different levels in different tissue types in multicellular organisms.
- Therefore the **Expression breadth** is the number of different tissues where a gene is significantly expressed.

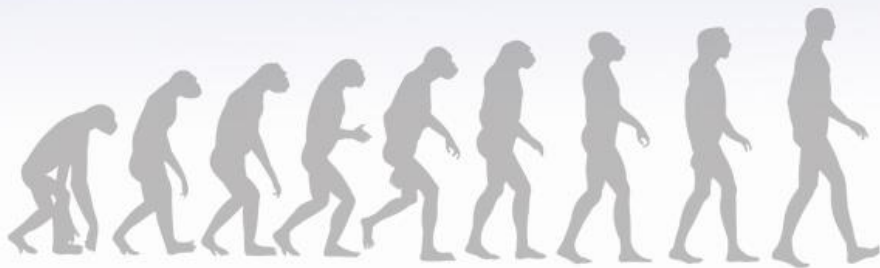
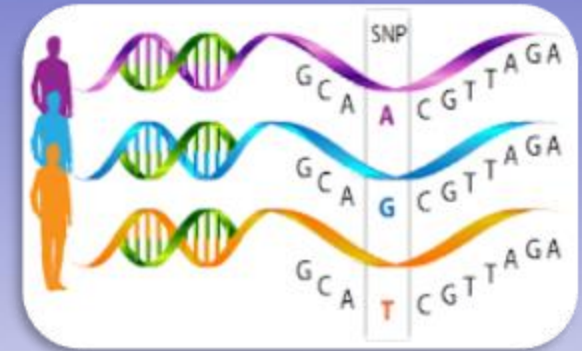


# High Vs. Low

| High expressed genes   | Low expressed genes  |
|--|--|
| Involved in house-keeping processes  | Weakly expressed   |
| Higher and broader expressed, to have more interaction partners                | Fewer interaction partners                                   |
| Evolve slower, and are less prone to gene loss across various taxonomic groups | Genes evolve faster and are more often lost during evolution |
| Any mutation could be lethal   |  |

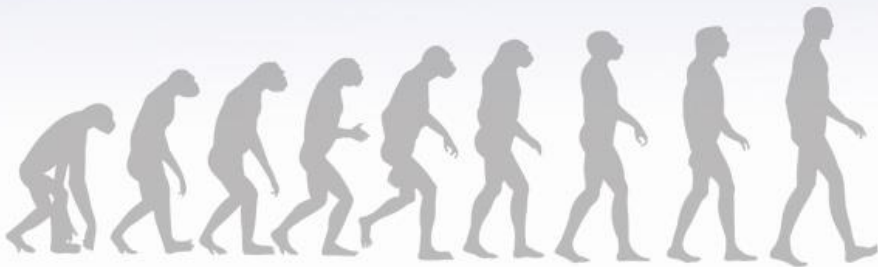
# Single-nucleotide polymorphisms (SNPs)

- DNA base variants present in the human population at a frequency  $>1\%$ .
- The non-synonymous coding SNPs & SNPs in regulatory regions have an effect on phenotype.



# Hypothesis

- Genes that are expressed at higher levels and in a greater number of tissues have lower single nucleotide polymorphism (SNP) rates than genes that are lowly/narrowly expressed.





# Tools and Methods



- Mygene



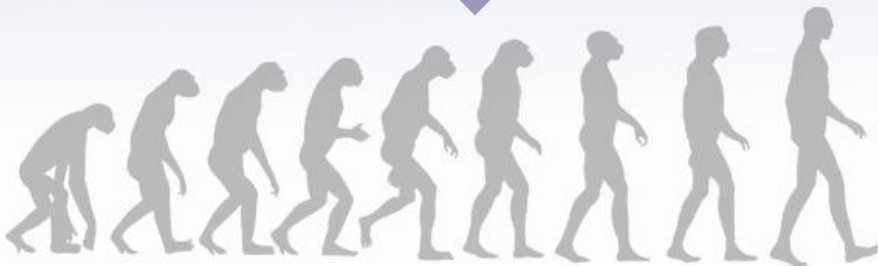
- pybedtools



- Pandas



- Linux command line



# Raw Data

|   | 00Annotation    | tpm.293SLAM%20rinderpest%20infection<br>%2c%20000hr<br>%2c%20biol_rep1.CNhs14406.13541-145H4 | tpm.293SLAM%20rinderpest%20infection<br>%2c%20000hr<br>%2c%20biol_rep2.CNhs14407.13542-145H5 | tpm.293SLAM%20rinderpest%20infection<br>%2c%20000hr<br>%2c%20biol_rep3.CNhs14408.13543-145H6 |
|---|-----------------|--|--|--|
| 0 | C9orf152        | 0.000000   | 0.000000   | 0.000000   |
| 1 | ENST00000457273 | 0.000000   | 0.000000   | 0.000000   |
| 2 | ELMO2           | 3.871942   | 6.530896   | 4.745576   |
| 3 | RPS11           | 496.664564   | 504.874536   | 518.284684   |
| 4 | CREB3L1         | 0.527992   | 0.907069   | 0.000000   |
| 5 | PNMA1           | 78.846819  | 77.826510  | 72.370033  |
| 6 | MMP2            | 0.000000   | 0.725655   | 0.677939   |
| 7 | TMEM216         | 36.079460  | 35.738514  | 35.083365  |
| 8 | TRAF3IP2-AS1    | 4.575931   | 5.623827   | 5.931970   |
| 9 | C10orf90        | 0.000000   | 0.000000   | 0.000000   |

```

1 df['max_expr'] = df.iloc[:, 1:1829].max(axis=1)
2 df['median_expr'] = df.iloc[:, 1:1829].median(axis=1)
3 df['expr_breadth'] = df.iloc[:, 1:1829].ge(5, axis=0).sum(axis=1)

```



# Max-Median-Breadth Calculations

|    | Annotation      | max_expr    | median_expr | expr_breadth |
|----|-----------------|-------------|-------------|--------------|
| 0  | C9orf152        | 90.000000   | 90.0        | 3            |
| 1  | ENST00000457273 | 2.349140    | 0.0         | 0            |
| 2  | ELMO2           | 1695.000000 | 1695.0      | 3            |
| 3  | RPS11           | 3314.932418 | 1826.0      | 3            |
| 4  | CREB3L1         | 1021.000000 | 1021.0      | 3            |
| 5  | PNMA1           | 1780.000000 | 1780.0      | 3            |
| 6  | MMP2            | 8337.690244 | 1224.0      | 3            |
| 7  | TMEM216         | 1553.000000 | 1553.0      | 3            |
| 8  | TRAF3IP2-AS1    | 483.000000  | 483.0       | 3            |
| 9  | C10orf90        | 1212.386209 | 121.0       | 3            |
| 10 | ENST00000435872 | 7.363069    | 3.0         | 1            |



# High/Low genes selection

- Sorting genes according to these values:
  - Max Expression.
  - Median Expression.
  - Expression Breadth.
- Selecting top 5% and low 5% of genes according to the calculated values.

|   | Annotation | max_expr     |
|---|------------|--------------|
| 0 | HBB        | 1.400648e+06 |
| 1 | SMR3B      | 9.885506e+05 |
| 2 | STATH      | 8.895355e+05 |
| 3 | uc004cox.3 | 5.185081e+05 |

|   | Annotation | median_expr  |
|---|------------|--------------|
| 0 | uc004cos.3 | 11389.754997 |
| 1 | MALAT1     | 4958.169276  |
| 2 | ACTG1      | 4714.807306  |
| 3 | ACTB       | 4614.233458  |
| 4 | TPT1       | 2923.555044  |

|   | Annotation      | expr_breadth |
|---|-----------------|--------------|
| 0 | C9orf152        | 3            |
| 1 | ANXA8L2         | 3            |
| 2 | ENST00000450990 | 3            |
| 3 | ENST00000522897 | 3            |
| 4 | NTAN1           | 3            |
| 5 | C12orf4         | 3            |

```

1 high_genes = set(df2['Annotation'][:1403])
2 low_genes = set(df2['Annotation'][-1403:])

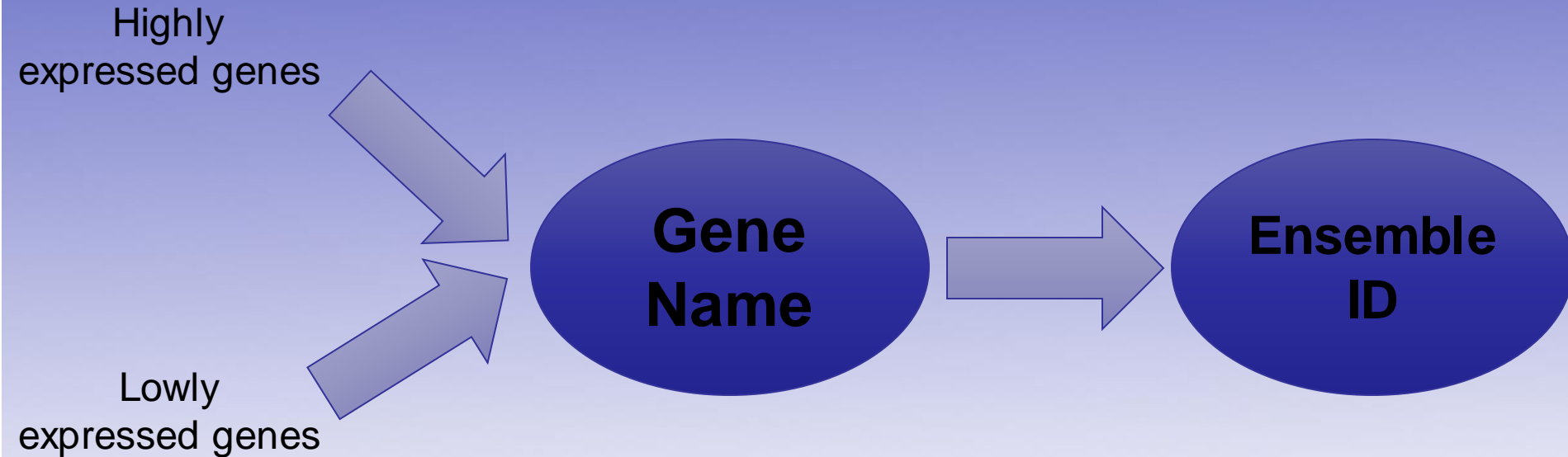
```

# Gene Transfer Format of the hg19/GRCh37 genome

|    | 0 | 1                                  | 2          | 3     | 4     | 5 | 6 | 7 | 8  |
|----|---|------------------------------------|------------|-------|-------|---|---|---|--|
| 0  | 1 | pseudogene                         | gene       | 11869 | 14412 | . | + | . | gene_id "ENSG00000223972"; gene_name "DDX11L1"...  |
| 1  | 1 | processed_transcript               | transcript | 11869 | 14409 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 2  | 1 | processed_transcript               | exon       | 11869 | 12227 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 3  | 1 | processed_transcript               | exon       | 12613 | 12721 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 4  | 1 | processed_transcript               | exon       | 13221 | 14409 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 5  | 1 | transcribed_unprocessed_pseudogene | transcript | 11872 | 14412 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 6  | 1 | transcribed_unprocessed_pseudogene | exon       | 11872 | 12227 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 7  | 1 | transcribed_unprocessed_pseudogene | exon       | 12613 | 12721 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 8  | 1 | transcribed_unprocessed_pseudogene | exon       | 13225 | 14412 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 9  | 1 | transcribed_unprocessed_pseudogene | transcript | 11874 | 14409 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |
| 10 | 1 | transcribed_unprocessed_pseudogene | exon       | 11874 | 12227 | . | + | . | gene_id "ENSG00000223972"; transcript_id "ENST..." |



# Gene Names to Ensemble Gene IDs Conversion



```

1 def gene_to_ens(genes):
2     mg = mygene.MyGeneInfo()
3     ENS_IDs = []
4     for gene in genes:
5         result = mg.query(gene, scopes="symbol", fields=["ensembl"], species="human", verbose=False)
6         hgnc_name = gene
7         for hit in result["hits"]:
8             if "ensembl" in hit and "gene" in hit["ensembl"]:
9                 ENS_IDs.append(hit["ensembl"]["gene"])
10    return(ENS_IDs)

```

# Gtf file for selected genes



```
1 def get_gtf(df_gtf, ens_ids):  
2     df_ = pd.DataFrame()  
3     for value in ens_ids:  
4         df_ = df_.append(df_gtf[df_gtf[8].str.contains(value)==True], ignore_index=True)  
5     return(df_)
```



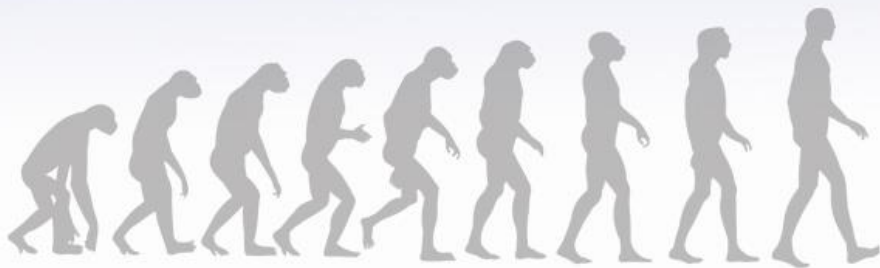


# Where is the coding regions????

Complete gtf for  
selected genes



Gtf selected  
genes( exons  
only)





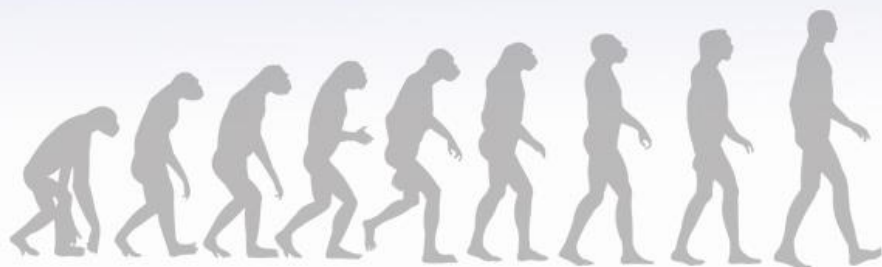
# SNPs file (VCF file)

```
##fileformat=VCFv4.1
##fileDate=07/30/15
##source=SeqPilotV4.1.2
##INFO=<ID=TI,Number=.,Type=String,Description="Transcript ID">
##INFO=<ID=GI,Number=.,Type=String,Description="Gene ID">
##INFO=<ID=DB,Number=0,Type=Flag,Description="dbSNP membership: SNP137 - hg19 - 2012-12-18">
##FILTER=<ID=q15,Description="Quality below or equal15">
##FORMAT=<ID=GT,Number=1,Type=String,Description="Genotype">
##FORMAT=<ID=DP,Number=1,Type=Integer,Description="Read depth at this position for this sample">
##FORMAT=<ID=AF,Number=A,Type=Float,Description="Allele frequency for each ALT allele in the same order as listed">
```

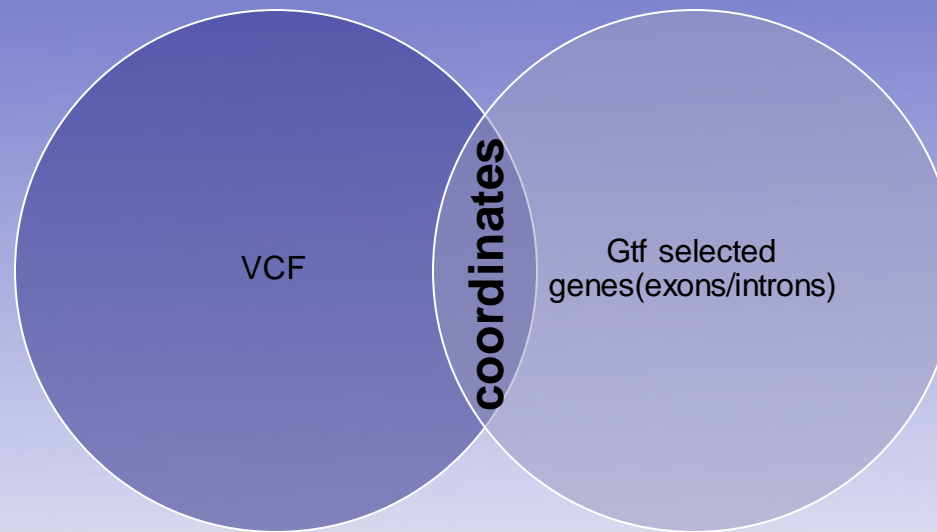
| #CHROM | POS      | ID        | REF   | ALT   | QUAL | FILTER | INFO                         | FORMAT   | S1           |
|--------|----------|-----------|-------|-------|------|--------|------------------------------|----------|--------------|
| 1      | 45794806 | .         | C     | CT    | .    | PASS   | TI=NM_001048171;GI=MUTYH     | GT:DP:AF | 0/1:265:0.51 |
| 1      | 45796269 | rs3219493 | G     | C     | .    | PASS   | TI=NM_001048171;GI=MUTYH;DB  | GT:DP:AF | 0/1:303:0.43 |
| 1      | 45798555 | rs3219487 | T     | C     | .    | PASS   | TI=NM_001048171;GI=MUTYH;DB  | GT:DP:AF | 0/1:241:0.55 |
| 1      | 45798699 | .         | AC    | A     | .    | PASS   | TI=NM_001048171;GI=MUTYH     | GT:DP:AF | 0/1:416:0.30 |
| 1      | 45798726 | .         | TG    | T     | .    | PASS   | TI=NM_001048171;GI=MUTYH     | GT:DP:AF | 0/1:346:0.23 |
| 10     | 88515072 | rs3905377 | T     | C     | .    | PASS   | TI=NR_031657_2;GI=MIR1256;DB | GT:DP:AF | 1/1:544:1.00 |
| 10     | 88515190 | .         | G     | GT    | .    | PASS   | TI=NR_031657_2;GI=MIR1256    | GT:DP:AF | 0/1:745:0.14 |
| 10     | 88515790 | .         | T     | TC    | .    | PASS   | TI=NR_031657_2;GI=MIR1256    | GT:DP:AF | 0/1:352:0.11 |
| 10     | 88515966 | rs7070369 | G     | A     | .    | PASS   | TI=NR_031657_2;GI=MIR1256;DB | GT:DP:AF | 1/1:206:1.00 |
| 10     | 88635779 | rs3182217 | C     | A     | .    | PASS   | TI=NM_004329;GI=BMPR1A;DB    | GT:DP:AF | 0/1:766:0.49 |
| 10     | 88649763 | rs7087358 | C     | T     | .    | PASS   | TI=NM_004329;GI=BMPR1A;DB    | GT:DP:AF | 1/1:982:1.00 |
| 10     | 88683122 | rs7074064 | T     | C     | .    | PASS   | TI=NM_004329;GI=BMPR1A;DB    | GT:DP:AF | 0/1:554:0.54 |
| 10     | 88683724 | .         | G     | A     | .    | PASS   | TI=NM_004329;GI=BMPR1A       | GT:DP:AF | 0/1:410:0.25 |
| 10     | 88683733 | .         | T     | TT    | .    | PASS   | TI=NM_004329;GI=BMPR1A       | GT:DP:AF | 0/1:422:0.40 |
| 10     | 88683808 | .         | AA    | A     | .    | PASS   | TI=NM_004329;GI=BMPR1A       | GT:DP:AF | 0/1:423:0.13 |
| 10     | 88683847 | .         | C     | T     | .    | PASS   | TI=NM_004329;GI=BMPR1A       | GT:DP:AF | 0/1:417:0.28 |
| 10     | 88683890 | rs7078571 | T     | A     | .    | PASS   | TI=NM_004329;GI=BMPR1A;DB    | GT:DP:AF | 1/1:402:0.99 |
| 10     | 89623897 | .         | CCGTG | TCGTC | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:224:0.25 |
| 10     | 89623901 | rs2943772 | G     | C     | .    | PASS   | TI=NM_000314;GI=PTEN;DB      | GT:DP:AF | 0/1:218:0.73 |
| 10     | 89623944 | .         | CGGC  | TGGA  | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:231:0.26 |
| 10     | 89624039 | .         | C     | A     | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:215:0.27 |
| 10     | 89624045 | .         | A     | C     | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:213:0.26 |
| 10     | 89685280 | .         | T     | TA    | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:655:0.30 |
| 10     | 89685327 | .         | T     | TT    | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:716:0.19 |
| 10     | 89690626 | .         | GG    | G     | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:144:0.11 |
| 10     | 89690750 | .         | TT    | T     | .    | PASS   | TI=NM_000314;GI=PTEN         | GT:DP:AF | 0/1:137:0.14 |

# Get Exons/ Introns

```
1 !grep -P "\texon\t" GRCh37_filtered_high_med.gtf | bedtools sort > exons_high_med.gtf
2 !bedtools sort -i exons_high_med.gtf > sorted_exons_high_med.gtf
3 !bedtools merge -s -i sorted_exons_high_med.gtf -c 6,7 -o distinct,distinct > exons_high_med.bed
4
5 !grep -P "\ttranscript\t" GRCh37_filtered_high.gtf | bedtools sort > transcripts_high_med.gtf
6 !bedtools sort -i transcripts_high_med.gtf > sorted_transcripts_high_med.gtf
7 !bedtools merge -s -i sorted_transcripts_high_med.gtf -c 6,7 -o distinct,distinct > transcripts_high_med.bed
8
9 !bedtools subtract -a transcripts_high_med.bed -b exons_high_med.bed > introns_high_med.bed
```



# Intersection

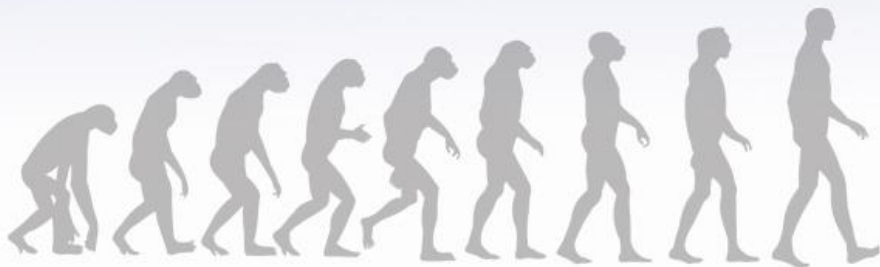


```

1 def get_SNPs(genes_bed_file):
2     snps = BedTool('ALL.wgs.phase3_shapeit2_mvncall_integrated_v5b.20130502.sites.vcf.gz')
3     expressed_genes = BedTool(genes_bed_file)
4     expressed_genes.sort()
5     SNPs = snps.intersect(expressed_genes)
6     return(SNPs.count())
  
```

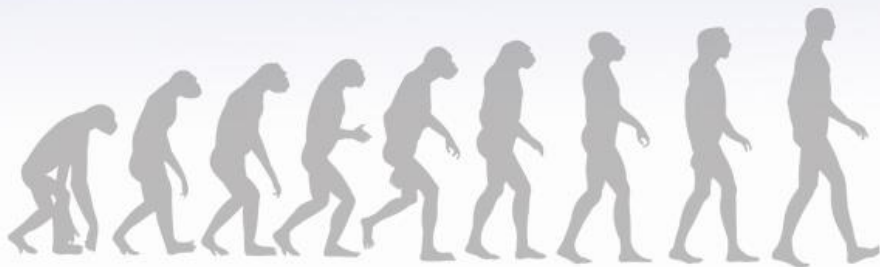
# Results (exons)

|                        | Max Expression            | Median Expression         | Breadth Expression       |
|------------------------|---------------------------|---------------------------|--------------------------|
| Highly Expressed Genes | 0.00348998373379<br>15773 | 0.0031972270987<br>368073 | 0.003228856553583<br>139 |
| Lowly Expressed genes  | 0.00050077923754<br>17857 | 0.0014232640755<br>09528  | 0.028695393161306<br>672 |



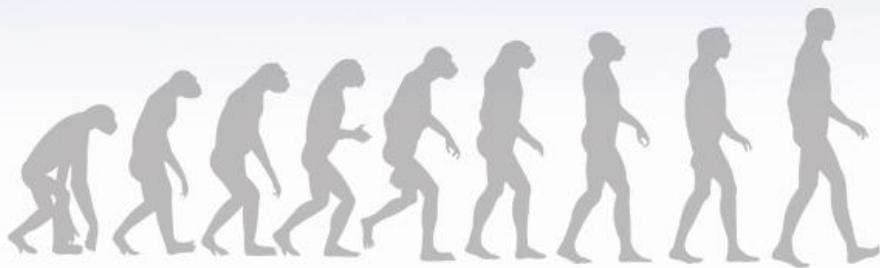
# Results (introns)

|                        | Max Expression       | Median Expression    | Breadth Expression    |
|------------------------|----------------------|----------------------|-----------------------|
| Highly Expressed Genes | 0.03314763184341043  | 0.02827210363243538  | 0.0005027683569847616 |
| Lowly Expressed genes  | 0.009858628492566827 | 0.023731668376511285 | 0.009577278598021467  |



# Conclusion

- According to exons: SNPs frequency inversely proportional gene expression mainly according to **breadth**
- While according to introns: SNPs frequency inversely proportional gene expression mainly according to **breadth**




# What else ....?

- We can conclude a **new hypothesis** that the SNPs in noncoding regions can be associated with number of diseases, this improves our understanding of noncoding of genomes and their roles in disease.

## Identifying noncoding risk variants using disease-relevant gene regulatory networks

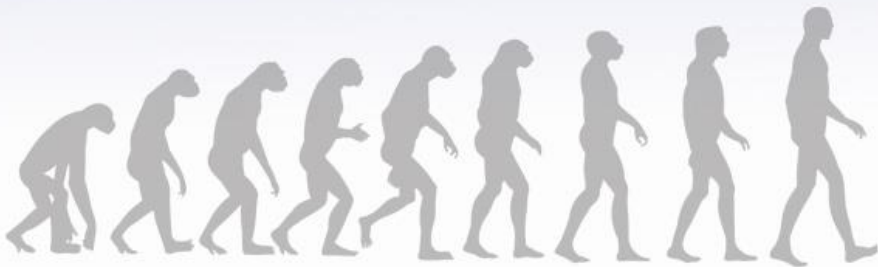
Long Gao, Yasin Uzun, Peng Gao, Bing He, Xiaoke Ma, Jiahui Wang, Shizhong Han & Kai Tan 

*Nature Communications* **9**, Article number: 702 (2018) | [Download Citation](#) 



# Recommendation

- This all steps can be done using :





# THANK YOU

