DNA and RNA sequencing

2024-04-04





DNA-sequencing





Key steps in sequencing





Main types of DNA sequencing





Deciphering DNA-seq data







Alignment

The first step in data analysis is alignent i.e. we need to

Raw reads are usually found in **FASTQ format**, while the final

The alignment requires a genome reference. The most recent

understand where reads map on the genome.

output of the alignment is a **SAM/BAM** file.

release is GRCh38 (2013).



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The FASTQ format

The FASTQ format keeps both read and read information in a unique file. @A00959:190:HKH3CDRX2:1:2101:1118:1016 1:N:0:AACGCTTA ANTGTGCTGGGCAAGGTTCCTGGCATGAAGCCAGCACTCAATAAATGCAAGTTATT ATGCAGAT @A00959:190:HKH3CDRX2:1:2101:1353:1016 1:N:0:AACGCTTA CNTGCGCTGGATGAGCAGGTAGAACACCACCTTCTGGTGGCCTGCTTCCTGGGCTGGCGCCGCTGGGT -----@A00959:190:HKH3CDRX2:1:2101:1271:1031 1:N:0:AACGCTTA GCCTAGCACATAGTAGGTGCTCAATAAATATGTGTTAAGGCCGGGCGCAGTGGCTCACGCCTATAGTC



The FASTQ format







The FASTQ format







Base quality

The most used quality measure for sequencing data is the **Phred score**.

 $Q_{\rm PHRED} = -10 \times \log_{10}(P_e)$

Phred Quality	Score Probability of incorrec	t base call Base call accuracy
10	1 in 10	90%
20	1 in 100	99%
30	1 in 1,000	99.9%
40	1 in 10,000	99.99%
50	1 in 100,000	99.999%

In **fastq** format base quality is encoded in **ASCII**.



FastQC to do quality control on reads

Report Base quality distribution along the length of the read Summary Mean base quality distribution across reads **Basic Statistics** Per base sequence quality Percentage of each base along the sequence Per tile sequence quality Distribution of the percentage of GC along the sequence er sequence quality scores Per base sequence content Per sequence GC content Distribution of the percentage of N bases (not properly called) along the sequence Per base N content Fragment length distribution Sequence Length Distribution Sequence Duplication Levels **Duplication rate** Overrepresented sequences If there are recurrent identical sequences Adapter Content





Base quality distribution along the read

Mean base quality distribution



Percentage of each base along the sequence



Duplication rate





Come rappresentiamo l'allineamento?



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Come rappresentiamo l'allineamento?



SAM è l'acronimo di Sequence Alignment/Map format. È un formato di testo delimitato da TAB costituito da una sezione di intestazione, che è facoltativa, e una sezione di allineamento.





Come rappresentiamo l'allineamento?





Col	Field	l Me		Op	Descrip	otio	n				
2	FLAG	3		М	alignme	ent	mat	tch (can be a sequence m	nat	ch or mismatch)
3	RNA	ME		I	insertio	n t	o th	le re	ference		,
4	POS			D	deletior	n fr	om	the	reference		
5	MAP	Q		Ν	skipped	l re	gior	n fro	m the reference		
- 6	CIGA	R ——	→	S	soft clip	opii	ng (clip	bed sequences presen	lt i	n SEQ)
(KNE/	К I / Т		Н	hard cli	ipp	ing	(clip	ped sequences NOT	p:	resent in SEQ)
0		1		Р	padding	g (s	ilen	t de	letion from padded r	efe	erence)
10	SEQ	N		=	sequend	ce n	nato	ch			
11	QUA			Х	sequend	ce n	nisn	natc	h		
0HD V 0SQ 5 r001 r002 r003 r004 r003 r001	/N:1.6 N:re 99 0 0 2064 147	SO LN ref ref ref ref ref	 coord 45 7 30 9 30 9 30 16 30 29 17 37 30 	inat 8M21 3S6M 5S6M 6M14 6H5M 9M	24M1D3M 11P1I4M 1 1N5M 1	= * * * =	37 0 0 0 7	39 0 0 0 -39	TTAGATAAAGGATACTG AAAAGATAAGGATA GCCTAAGCTAA ATAGCTTCAGC TAGGC CAGCGGCAT	* * * * *	<pre>SA:Z:ref,29,-,6H5M,17,0; SA:Z:ref,9,+,5S6M,30,1; NM:i:1</pre>



A

Whole-genome sequencing data





Whole-exome sequencing data







https://www.nature.com/articles/s41576-021-00431-y

How can we see aligned data? Using IGV



According to the site ... "The **Integrative Genomics Viewer (IGV)** is a high-performance, easyto-use, interactive tool for the visual exploration of genomic data. It supports flexible integration of all the common types of genomic data and metadata, investigator-generated or publicly available, loaded from local or cloud sources.

IGV is available in multiple forms, including:

- the original IGV a Java desktop application,
- IGV-Web a web application,
- igv.js a JavaScript component that can be embedded in web pages (for developers)"



The Integrative Genomics Viewer (IGV)





Mutations





Mutations identification

The main goal of variant identification is to evaluate if the alternative alleles supported by sequencing reads are true mutations or artefacts.

Vocabulary:

- Single Nucleotide Polymorphisms (SNPs): is a germline substitution of a single nucleotide at a specific position in the genome
- Single Nucleotide Variants (SNVs): a DNA sequence variation that occurs when a single nucleotide (adenine, thymine, cytosine, or guanine) in the genome sequence is altered. It is usually used for somatic mutations, nevertheless usually we can find the term "variant" for both somatic and germline mutations (Be aware of the context!!)
- Small Insertions or Deletions (InDels) (<50 bp)





Mutations identification



A lot of different tools are available for variant identification:





Error remotion





Mutated genomic positions have to be **annotated** to understand their **biological meaning**.

Can the identified SNP/SNV/InDel cause changes in protein coding and interested amino acids?







Functional

annotation



chrom	position	ref	var	func	exonic.func	gene
chr17	17697102	G	А	exonic	synonymous SNV	RAI1
chr17	21319977	Α	G	UTR3	-	KCNJ18
chr17	26679861	G	А	intronic	-	POLDIP2
chr17	28890301	G	А	exonic	nonsynonymous SNV	TBC1D29
chr17	36716758	G	А	intronic	-	SRCIN1
chr17	40369149	G	А	intronic	-	STAT5B







Value	Rank	Explanation
exonic	1	variant overlaps a coding
splicing	1	variant is within 2-bp of a splicing junction
ncRNA	2	variant overlaps a transcript without coding annotation in the gene definition
UTR5	3	variant overlaps a 5' untranslated region
UTR3	3	variant overlaps a 3' untranslated region
intronic	4	variant overlaps an intron
upstream	5	variant overlaps 1-kb region upstream of transcription start site
downstream	5	variant overlaps 1-kb region downtream of transcription end site
intergenic	6	variant is in intergenic region











The effect of a mutation on protein





Exonic functional annotation

Annotation	Rank	Explanation
frameshift insertion	1	an insertion of one or more nucleotides that cause frameshift changes in protein coding sequence
frameshift deletion	2	a deletion of one or more nucleotides that cause frameshift changes in protein coding sequence
frameshift block substitution	3	a block substitution of one or more nucleotides that cause frameshift changes in protein coding sequence
stopgain	4	a variant lead to the immediate creation of stop codon at the variant site.
stoploss	5	a variant that lead to the immediate elimination of stop codon at the variant site
nonframeshift insertion	6	an insertion of 3 or multiples of 3 nucleotides that do not cause frameshift changes in protein coding sequence
nonframeshift deletion	7	a deletion of 3 or mutliples of 3 nucleotides that do not cause frameshift changes in protein coding sequence
nonframeshift block substitution	8	a block substitution of one or more nucleotides that do not cause frameshift changes in protein coding sequence
nonsynonymous SNV	9	a single nucleotide change that cause an amino acid change
synonymous SNV	10	a single nucleotide change that does not cause an amino acid change
unknown	11	unknown function (due to various errors in the gene structure definition in the database file)

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Exonic functional annotation (nonsilent mutations)

Annotation	Rank	Explanation
frameshift insertion	1	an insertion of one or more nucleotides that cause frameshift changes in protein coding sequence
frameshift deletion	2	a deletion of one or more nucleotides that cause frameshift changes in protein coding sequence
frameshift block substitution	3	a block substitution of one or more nucleotides that cause frameshift changes in protein coding sequence
stopgain	4	a variant lead to the immediate creation of stop codon at the variant site.
stoploss	5	a variant that lead to the immediate elimination of stop codon at the variant site
nonframeshift insertion	6	an insertion of 3 or multiples of 3 nucleotides that do not cause frameshift changes in protein coding sequence
nonframeshift deletion	7	a deletion of 3 or mutliples of 3 nucleotides that do not cause frameshift changes in protein coding sequence
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unknown	11	unknown function (due to various errors in the gene structure definition in the database file)

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Clinical interpretation of variants



InterVar e **CancerVar** are curated databases for clinical interpretation. They contain catalogues of mutations previously pointed out to be pathogenetic or probably related to a disease.





Clinical interpretation of germline mutations

In 2015, the 'American College of Medical Genetics and Genomics (ACMG) e l'Association for Molecular Pathology (AMP) published standard criterions and updated guidelines for the clinical interpretation of sequence variants (relations between variants and human diseases).

InterVar generates an automatic interpretation based on 28 criterions, classifying mutations as 'Benign', 'Likely benign', 'Uncertain significance', 'Likely pathogenic' and 'Pathogenic'





InterVar:Guideline



The American College of Medical Genetics and Genomics (ACMG)and the Association for Molecular Pathology(AMP) published in 2015 the updated standards and guidelines for the clinical interpretation of sequence variants,based on 28 criteria. However, variability between individual interpreters may be extensive due to lack of standard algorithms that implement these guidelines. This ACMG/AMP2015 guideline is at here

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Clinical Interpretation of genetic variants by ACMG/AMP 2015 guideline

InterVar is a bioinformatics software tool for clinical interpretation of genetic variants by the ACMG/AMP 2015 guideline. The input to InterVar is an annotated file generated from ANNOVAR, while the output of InterVar is the classification of variants into 'Benign', 'Likely benign', 'Uncertain significance', 'Likely pathogenic' and 'Pathogenic', together with detailed evidence code.

Search your exonic variants from pre-built wIntervar databases(updated 2022-June-13 17:57:28 with 100M sites):

If you already know the criteria of your variant, you can clik here to interpret your variant directly.

This server is for exon variants interpretation only, if you have indels, you need to download the intervar tool from github, then interpret your variant on local. if you have cancer/somatic variant or CNV, you can click CancerVar to interpret your cancer variant directly. if you have germline CNV, you can click CNVinter to interpret your copy number variation directly.

Please select the genomic version:	hg19_updated.v.202107
------------------------------------	-----------------------

0	Query	by	genomic	coordinate	

Chr	1	~	POS:	115828756	Ref:	G	Alt:	А
-----	---	---	------	-----------	------	---	------	---

○ Query	by	dbSNP	ID
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O Query by HGNC gene symbol and cDNA

Gene: IL2RA

cDNA change: c. C246A

Query by HGNC gene symbol and Protein Change



Gene: KRAS Protein change: p. G12C

Clinical Interpretation of genetic variants by ACMG/AMP 2015 guideline

InterVar is a bioinformatics software tool for clinical interpretation of genetic variants by the ACMG/AMP 2015 guideline. The input to InterVar is an annotated file generated from ANNOVAR, while the output of InterVar is the classification of variants into 'Benign', 'Likely benign', 'Uncertain significance', 'Likely pathogenic' and 'Pathogenic', together with detailed evidence code.

Warning: All listed results were from the automated interpretation on default parameters! Users are advised to examine detailed evidence and use prior knowledge on ethnicity/disease to perform manual adjustments.

Database	version:hg19	_update										
You searc	hed by HGN	C gene syn	nbol with	name as KRAS,	and Protein chan	ge: p.G12C						
Show/hic	de columns	Restore co	olumns	Copy to clipboar	d Download res	sult as CSV			Search:			
Chr 🔺	Position	Ref	Alt	Gene (refGene) [♦]	Intervar 🗍	ExonicFunc (refGene)	SNP 🍦	Transcripts (Ref)	MAF in gnomAD_ALL(genome	Diseas	e ∳ (Net	
12	25398285	С	A	KRAS	Pathogenic (Details&Adjust)	nonsynonymous SNV	rs121913530(details of MAF)	NM_004985 p.G12C NM_033360 p.G12C	. (show in 7 POPs)	1340 268114 (519 1333 2612 26 227535	548 3 1§ 106	
Showing 1	l to 1 of 1 en	tries							Pre	vious 1	Next	



Clinical interpretation of somatic mutations

CancerVar is a bioinformatic tool for the clinical interpretation of somatic variants based on guidelines of the AMP/ASCO/CAP/ CGC 2017-2019

CancerVar classifies somatic variants as:

- Tier I/Pathogenic
- Tier II/Likely pathogenic
- Tier III/Variants of Unknown Clinical Significance (VUS)
- Tier IV/Benign or Likely Benign Variants



Clinical interpretation of somatic mutations

Tier I: Variants of Strong Clinical Significance

Therapeutic, prognostic & diagnostic

Level A Evidence

FDA-approved therapy Included in professional guidelines

Level B Evidence

Well-powered studies with consensus from experts in the field

Tier II: Variants of Potential Clinical Significance

Therapeutic, prognostic & diagnostic

Level C Evidence

FDA-approved therapies for different tumor types or investigational therapies

Multiple small published studies with some consensus

Level D Evidence

Preclinical trials or a few case reports without consensus

Tier III: Variants of Unknown Clinical Significance

Not observed at a significant allele frequency in the general or specific subpopulation databases, or pan-cancer or tumor-specific variant databases

No convincing published evidence of cancer association

Tier IV: Benign or Likely Benign Variants

Observed at significant allele frequency in the general or specific subpopulation databases

No existing published evidence of cancer association



Clinical interpretation of somatic mutations



C.G.B.



CancerVar:a web server for improved AI and evidence-based clinical interpretation for cancer somatic mutations

CancerVar is a bioinformatics software tool for clinical interpretation of somatic variants.

Search your exonic variants from pre-built CancerVar databases(updated: with 13 Million mutations in 1911 cancer census gene):

This server is for exon variants, CNVs and some known indels interpretation only, if you have novel indels, you need to download the CancerVar tool from github, then interpret your variant on local.

Please select the genomic version:	hg19/GRC	h37 ~	and	cancer type:	All types	~
O Query by genomic coordinate						
Chr 1 v POS: 115256529	Ref: T	Alt:	С			
O Query by dbSNP ID						
rs. : rs121434568						
O Query by HGNC gene symbol and	CDNA					
Gene: BRAF cDNA change	:: с. Т1799	A				
Query by HGNC gene symbol and	l Protein Ch	ange				
Gene: KRAS Protein chang	je: p. G12C					
○ Query by HGNC gene symbol or A	Alternations					
Gene: ERBB2 Copy Num	per v					
Submit Reset						

CancerVar Results

You searched by HGNC gene symbol with name as KRAS, cancer types: All_types and Protein change: P.G12C

GENOMIC VERSION hg19		CANCER TYPE All_types	<u>.</u>	ALTERNATIONS Mutation	
-------------------------	--	--------------------------	----------	--------------------------	--

INTERPRETATION SUMMARY

Based on Evidence(CBPs), CancerVar assign the clinical significance of your somatic mutation in KRAS as:

Tier_I_strong and Score: 11(with sub-scores) Deep learning Score from OPAI: 0.99(Oncogenic)

This variant is nonsynonymous SNV in gene KRAS, located in chromosome 12:25398285. There are some clinical and/or experimental evidence showed strong/potential clinical significance in Therapeutic,Diagnosis,Prognosis, From the population databases(gnomAD,1000 genome etc), this variant is absent or extremely low minor allele frequency(MAF<0.1%). In Germline database of Clinvar/HGMD, this variant's clinical significane is <u>Pathogenic</u>. In most of the pathogenic or deleterious prediction softwares/algorithms, this variant was predicted as <u>Pathogenic</u>. When check the occurrence of somatic database in COSMIC or ICGC, this variant shows in <u>both</u> of them. From the KEGG pathway database, the gene of this variant **does** involve in disease-associated pathways or pathogenic pathways. Currently, searching the pubmed website, there are **some** publications from functional study, population study or other study as supporting evidence for clinical/biological significance.

Please review the cards below to get the detail of the interpretation.



Evidence Overview

CBP1:Therapeutic: FDA approved or investigational with strong evidence.In total of 78 records (you specified cancer types as: <u>All_types</u>),most of the cancers are located in:Lung 35%,Colorectal 33%,Cancer 8%,and they have been mostly treated with:Melphalan 5%,Cetuximab 4%,EGFR mAb inhibitor 4%,the treatment of the drugs are:Responsive 35%,Sensitivity/Response

28%,Resistance 21%,if you need more information, please click Detail...

CBP2:Diagnostic: In Professional guideline or reported evidence with consensus.In total of 1 records (you specified cancer types as: <u>All_types</u>),most of the cancers are located in:Lung 100%, the diagnostic are:Positive 100%,if you need more information, please click Detail...

CBP3:Prognostic: In Professional guideline or reported evidence with consensus.In total of 4 records (you specified cancer types as: <u>All_types</u>),most of the cancers are located in:Lung 75%,Other 25%, the prognostic are:Poor Outcome 100%,if you need more information, please click Detail...

CBP4:Mutation type: Activating, LOF (missense, nonsense, indel, splicing), CNAs, fusions. CBP5:Variant frequencies:Mostly mosaic. Need user's knowledge.

CBP6:Potential germline: Mostly nonmosaic. Need user's knowledge.

CBP7:Population databases: Absent or extremely low MAF. MAF In GnomAD_genome . (show in 7 POPs) CBP8:Germline databases: may be present in HGMD/ClinVar <u>Pathogenic</u>. CBP9:Somatic databases: Most present in COSMIC, ICGC, My Cancer Genome, TCGA. CBP10:Predictive from: SIFT, PolyPhen2,MutationAssessor,MetaSVM,MetaLR,FATHM M,GERP++_RS, and mostly as <u>Pathogenic</u>. CBP11:Pathway: involve in Disease-associated pathways or pathogenic pathways. KEGG Pathway CBP12:Publications: Convincing evidence from

CBP12:Publications: Convincing evidence from Functional study, population study, other.

Mutation Information

Chromosome: 12 Position: 25398285 Reference Allele: C Alternative Allele: A Function in refGene: nonsynonymous SNV Minor allele frequency in(. means absent): ESP6500:. 1000 genome:. gnomAD genome_ALL:. More ExAC:1.976E-5 Transcript in refGene: NM_033360 Exon location:exon2 Nucleotide change:c.34G>T Residue change :p.G12C Clinvar:Pathogenic/Likely_pathogenic While the KRAS G12 region is a widely studied recurrent region in cancer, its impact on clinical action is still debated. Often associated with tumors that are wildtype for other drivers (EGFR and ALK specifically), the prognosis for patients with this mutation seems to be worse than the KRAS wild-type cohort in patients with colorectal and pancreatic cancer, however this hypothesis is in need of further validation. This mutation, along with the mutations affecting the neighboring G13 position, may result in a less responsive tumor when treated with first-generation TKI's like gefitinib. However, cetuximab treatment was shown to extend survival in a cohort of colorectal patients.

Deep learning Score: 0.99(OPAI,Oncogenic)

CancerVar: Tier_I_strong with score: 11

Need to review scores or adjust and manually reinterpret? Please Click Adjust!

Clinical significance Unknown Benign

Gene Information

KRAS

Name: Kirsten rat sarcoma viral oncogene homolog Location: chr12:25357723-25403870(Grch37) Cytoband: 12p12.1

GeneCards Summary:

KRAS (KRAS Proto-Oncogene, GTPase) is a Protein Coding gene. Diseases associated with KRAS include Oculoectodermal Syndrome and Noonan Syndrome 3. Among its related pathways are Oocyte meiosis and Oxytocin signaling pathway. Gene Ontology (GO) annotations related to this gene include GTP binding. An important paralog of this gene is NRAS. More on GeneCards

CIViC Summary:

Mutations in the RAS family of proteins are frequently observed across cancer types. The amino acid positions that account for the overwhelming majority of these mutations are G12, G13 and Q61. The different protein isoforms, despite their raw similarity, also behave very differently when expressed in non-native tissue types, likely due to differences in the C-terminal hyper-variable regions. Mis-regulation of isoform expression has been shown to be a driving event in cancer, as well as missense mutations at the three hotspots previously mentioned. While highly recurrent in cancer, attempts to target these RAS mutants with inhibitors have not been successful, and has not yet become common practice in the clinic. The prognostic implications for KRAS mutations vary between cancer types, but have been shown to be associated with poor outcome in colorectal cancer, non-small cell lung cancer, and others.

Evidence

DC

Gene

Clinical publications	~
Pathway	~
Domain	÷
P-loop containing nucleoside triphosphate hydrolase;Small G	TP-binding protein domain
More resources	~
Gene on Oncokb Variant on Oncokb Clinvar	

Deleterious Predictions from other softwares(. means no prediction)

SIFT (Sorting Intolerant From Tolerant)	0.02
GERP++RS(Genomic Evolutionary Rate Profiling , Rejected Substitutions)	5.68
MetaSVM	0.548
Polyphen2 HDIV(Polymorphism Phenotyping2)	1
MetaLR	0.701
FATHMM(Functional Analysis through Hidden Markov Models)	-1.24
MutationAssessor	3.135
Deleterious/Damage Ounknown Benign/Neutral	

Cosmic



Candidate cancer driver





Copy Number Alterations





Allelic copies variation





Allelic copies variation







Genome CNV profile





RNA-sequencing





Sequencing transcriptome



- Evaluate **expression** of genes/transcripts for:
 - All species of RNA
 - mRNA
 - small RNAs
- Evaluate expression levels of exons
 - Patterns of alternative splicing
- Evaluate transcriptional **alterations**
- Annotate regions and functional elements





RNA Transcription	RNA-Protein Interactions	RNA Modifications	RNA Structure	Low-Level RNA Detection
RNA-Seq	Ribo-Seq	MeRIP-Seq	SHAPE-Seq	scRNA-Seq
CaptureSeq	RIP-Seq	miCLIP-m6A	icSHAPE	SUPeR-Seq
RASL-Seq	CLIP-Seq	PSI-Seq	CIRS-Seq	UMI
ClickSeq	Pol II CLIP	Pseudo-Seq	SHAPE-MaP	Digital RNA Sequencing
3Seq	miR-CLIP	ICE	DMS-Seq	MARS-Seq
cP-RNA-Seq	eCLIP		SPARE	Quartz-Seq
3P-Seq	irCLIP		PARS-Seq	DP-Seq
2P-Seq	PAR-CLIP		Cap-Seq	Smart-Seq
3'-Seq	iCLIP		CIP-TAP	FRISCR
TIF-Seq	BrdU-CLIP			CEL-Seq
PEAT	AGO-CLIP			STRT-Seq
SMORE-Seq	PIP-Seq			TCR Chain Pairing
TL-Seq	hiCLIP			TCR-LA-MC PCR
TATL-Seq	RBNS			CirSeq
RARseq	TRIBE			TIVA
TAIL-Seq	HiTS-RAP			PAIR
PAL-Seq	TRAP-Seq			CLaP
FRT-S wcell	DLAF			CytoSeq
ChIRP	miTRAP			Drop-Seq:
CHART	CLASH			Hi-SCL
RAP				InDrop
GRO-seq				snRNA-Seq
Bru-Seq				Nuc-Seq
BruChase-Seq				Div-Seq
5'-GRO-Seq				SCRB-Seq
BruDRB-Seq				G&T-Seq
4sUDRB-Seq				scM&T-Seq
PRO-Seq				scTrio-seq
PRO-Cap				
CAGE				
3'NT Method				
NET-Seq				

mNET-Seq PARE-Seq

illumina®

Protocolli di sequenziamento



Low-level RNA detection



illumina®

Illumina Stranded mRNA Prep







Key steps in sequencing





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Deciphering gene expression

RNA-seq data analysis workflow:





Deciphering gene expression





Gene expression level distribution



https://academic.oup.com/nar/article/48/4/1730/5691219





Gene expression level distribution



QCs Reproducibility

Principal Component Analysis (PCA)

PCA is a statistical technique for dimensionality reduction. We use PCA when a dataset presents a high number of features (genes in this case). It is like compressing information about ~20,000 in two dimensions or some more if we need it.



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Differential expression



Two are the main goals of a differential expression (DE) analysis:

1. Estimate the **entity of variation** between the two conditions, i.e. calculate Fold Change (FC)

2. Estimate the **significance of the difference**, i.e. p-value, and correct it for multiple testing (p-adjusted).





DESeq2





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Normalization

Normalising data is fundamental. If we skip this step we introduce biases in our analysis.

https://docs.gdc.cancer.gov/Data/Bioinformatics_Pipelines/Expression_mRNA_Pipeline/ #mrna-expression-transformation

https://hbctraining.github.io/DGE_workshop/lessons/02_DGE_count_normalization.html





Once identified differentially expressed genes, we can ask if they belong to some particular groups of genes, i.e. if they have common functionalities.

We can perform a gene ontology/over-representation analysis/gene set enrichment analysis



Molecular Function	Molecular-level activities performed by gene products. Molecular function terms describe activities that occur at the molecular level, such as "catalysis" or "transport". GO molecular function terms represent activities rather than the entities (molecules or complexes) that perform the actions, and do not specify where, when, or in what context the action takes place. Molecular functions generally correspond to activities that can be performed by individual gene products (<i>i.e.</i> a protein or RNA), but some activities are performed by molecular complexes composed of multiple gene products. Examples of broad functional terms are <i>catalytic activity</i> and <i>transporter activity</i> ; examples of narrower functional terms are <i>adenylate cyclase activity</i> or <i>Toll-like receptor binding</i> . To avoid confusion between gene product names and their molecular functions, GO molecular functions are often appended with the word "activity" (a <i>protein kinase</i> would have the GO molecular function <i>protein kinase activity</i>).
Cellular Component	The locations relative to cellular structures in which a gene product performs a function, either cellular compartments (<i>e.g.</i> , <i>mitochondrion</i>), or stable macromolecular complexes of which they are parts (<i>e.g.</i> , the <i>ribosome</i>). Unlike the other aspects of GO, cellular component classes refer not to processes but rather a cellular anatomy.
Biological Process	The larger processes, or 'biological programs' accomplished by multiple molecular activities. Examples of broad biological process terms are <i>DNA repair</i> or <i>signal transduction</i> . Examples of more specific terms are <i>pyrimidine nucleobase biosynthetic process</i> or <i>glucose transmembrane transport</i> . Note that a biological process is not equivalent to a pathway. At present, the GO does not try to represent the dynamics or dependencies that would be required to fully describe a pathway.

http://geneontology.org/docs/ontology-documentation/



Once identified differentially expressed genes, we can ask if they belong to some particular groups of genes, i.e. if they have common functionalities.

We can perform a gene ontology/over-representation analysis/gene set enrichment analysis

Molecular Signatures Database



https://www.gsea-msigdb.org/gsea/msigdb/

