







THE 3rd VIETNAM SCHOOL OF BIOLOGY (VSOB-3)

# **Gene Quantification**

Bulk RNAseq course 2024

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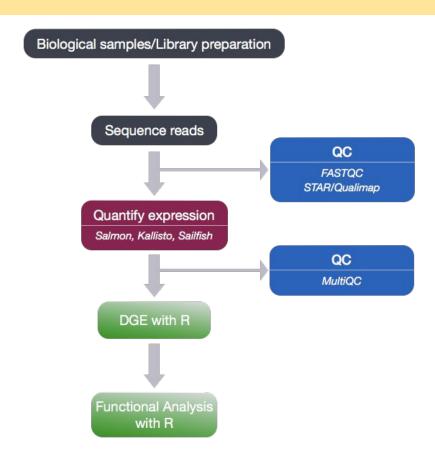
December 06th-08th, 2024, ICISE, Quy Nhon, Vietnam

## RNA-SEQ: STEP IN QUANTIFICATION

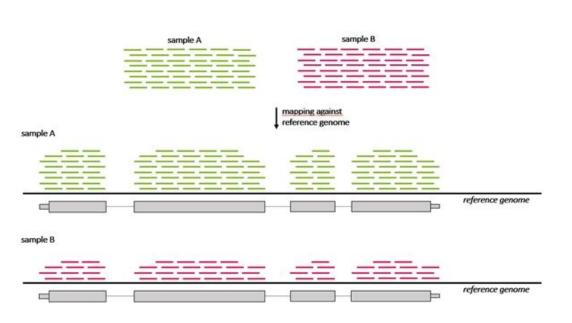
**Definition**: Measuring the abundance of transcripts for each gene in a sample

# **Key Processes:**

- Read Alignment or Alignment-Free Mapping
- Assigning Reads to Genes
- Counting Reads per Gene



#### **Quantification - Read Count**



Count how many reads have mapped to each gene.

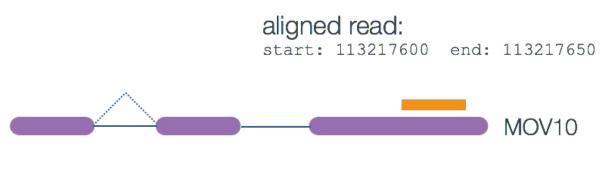
→Using the **featureCounts** tool to get the gene counts

**Input**: BAM + GTF

Output: Number of reads (counts) associated with each feature of interest (genes, exons, transcript, etc.).

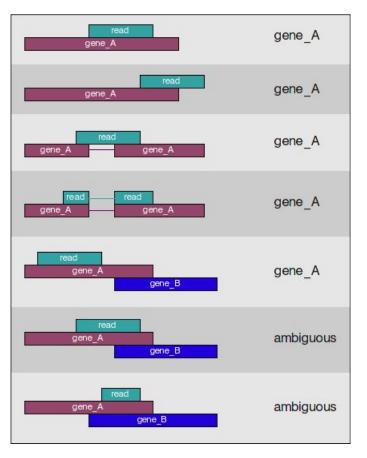
## **Counting reads with featureCounts**

- Accurate, fast and is relatively easy to use
- Counts reads that map to a single location (uniquely mapping) and follows the scheme in the figure below for assigning reads to a gene/exon.



## **GTF**

## Counting reads using featureCounts



- A read is said to overlap a feature if at least one read base is found to overlap the feature.
- For paired-end data, a fragment (or template) is said to overlap a feature if any of the two reads from that fragment is found to overlap the feature.
- If strandedness is specified, then in addition to considering the genomic coordinates it will also take the strand into account for counting.

## **Counting reads using featureCounts**

| jene     |        | Location   | St      | rand   | Length    | 1        |         | C        | Count    |          |         |           |         |                |           |
|----------|--------|------------|---------|--------|-----------|----------|---------|----------|----------|----------|---------|-----------|---------|----------------|-----------|
| # Progr  | am:fea | tureCounts | v2.0.2: | Comman | d:"featur | eCounts' | "-p" ". | a" "/mnt | /d4t/DAT | A/PROJEC | T/RNA < | seg/sacCe | r2/ref/ | annotation/sac | Cer3.ensG |
| Geneid   |        | Start      | End     | Strand |           |          |         |          |          | WT_E_2   |         |           | / /     |                |           |
| YDL248W  |        |            | 2953    | +      | 1152      | 164      | 132     | 148      | 337      | 94       | 378     | 2         |         |                |           |
| YDL247W  |        | chrIV      | 3762    | 3836   | +         | 75       | 0       | 0        | 3        | 0        | 0       | 6         |         |                |           |
| YDL247W  |        |            | 7814    | +      | 1830      | 0        | 0       | 1        | 0        | 0        | 4       |           |         |                |           |
| YDL246C  |        |            | 9756    | 5      | 1074      | 0        | 0       | 2        | 0        | 0        | 6       |           |         |                |           |
| /DL245C  | chrIV  |            | 13360   | -      | 1704      | 14       | 2       | 6        | 38       | 6        | 12      |           |         |                |           |
| /DL244W  |        |            | 17226   | +      | 1023      | 14       | 6       | 6        | 39       | 19       | 27      |           |         |                |           |
| /DL243C  |        |            | 18566   | -      | 990       | 115      | 94      | 100      | 292      | 142      | 215     |           |         |                |           |
| /DL242W  |        |            | 19312   | +      | 354       | 5        | 13      | 9        | 16       | 4        | 26      |           |         |                |           |
| /DL241W  |        |            | 21006   | +      | 372       | 89       | 46      | 60       | 16       | 2        | 13      |           |         |                |           |
| /DL240C  | - A    | chrIV      | 22471   | 22608  | -         | 138      | 5       | 1        | 1        | 1        | 2       | 2         |         |                |           |
| /DL240W  | chrIV  |            | 25876   | +      | 3054      | 191      | 166     | 245      | 112      | 27       | 200     |           |         |                |           |
| DL2390   | chrIV  |            | 28775   | 5      | 2373      | 82       | 146     | 128      | 409      | 136      | 506     |           |         |                |           |
| DL238C   | chrIV  | 28985      | 30454   | -      | 1470      | 101      | 79      | 92       | 555      | 91       | 346     |           |         |                |           |
| /DL237W  | chrIV  | 30657      | 31829   | +      | 1173      | 553      | 381     | 536      | 827      | 322      | 1330    |           |         |                |           |
| /DL236W  |        |            | 33234   | +      | 939       | 1886     | 1855    | 1661     | 3095     | 459      | 1820    |           |         |                |           |
| /DL235C  | chrIV  | 33415      | 33918   | -      | 504       | 1306     | 1405    | 900      | 1364     | 385      | 965     |           |         |                |           |
| /DL234C  |        |            | 36477   | -      | 2241      | 648      | 601     | 881      | 2822     | 1148     | 2386    |           |         |                |           |
| /DL233W  | chrIV  | 36797      | 38173   | +      | 1377      | 132      | 158     | 147      | 391      | 193      | 463     |           |         |                |           |
| /DL232W  | chrIV  | 38487      | 38597   | +      | 111       | 545      | 533     | 443      | 353      | 153      | 429     |           |         |                |           |
| YDL2310  | chrIV  | 38867      | 42244   |        | 3378      | 681      | 565     | 552      | 586      | 139      | 451     |           |         |                |           |
| /DL230W  | chrIV  | 42700      | 43707   | +      | 1008      | 398      | 429     | 411      | 590      | 460      | 1119    |           |         |                |           |
| /DL229W  | chrIV  | 44065      | 45906   | +      | 1842      | 6625     | 4502    | 4656     | 2168     | 124      | 744     |           |         |                |           |
| DL2280   | chrIV  | 45277      | 45918   | -      | 642       | 31       | 28      | 34       | 12       | 1        | 1       |           |         |                |           |
| YDL227C  | chrIV  | 46271      | 48031   | -      | 1761      | 1006     | 837     | 556      | 97       | 8        | 102     |           |         |                |           |
| YDL226C  | chrIV  | 51115      | 52173   | -      | 1059      | 1264     | 1219    | 1326     | 1657     | 603      | 1801    |           |         |                |           |
| YDL225W  | chrIV  | 52445      | 54100   | +      | 1656      | 1116     | 1061    | 1044     | 1430     | 366      | 1444    |           |         |                |           |
| YDL224C  | chrIV  | 54397      | 56346   | -      | 1950      | 310      | 174     | 264      | 272      | 183      | 584     |           |         |                |           |
| YDL223C  | chrIV  | 57265      | 60405   | -      | 3141      | 124      | 104     | 92       | 1487     | 845      | 3016    |           |         |                |           |
| YDL222C  | chrIV  | 60872      | 61801   | -      | 930       | 17       | 15      | 51       | 101      | 303      | 1036    |           |         |                |           |
| YDL221W  | chrIV  | 62011      | 62562   | +      | 552       | 27       | 28      | 13       | 35       | 24       | 39      |           |         |                |           |
| YDL220C  | chrIV  | 62244      | 65018   | -      | 2775      | 63       | 34      | 64       | 110      | 36       | 107     |           |         |                |           |
| YDL219W  | chrIV  | ;chrIV     | 65242;6 | 5378   | 65306;6   | 5765     | +;+     | 453      | 697      | 834      | 610     | 512       | 189     | 509            |           |
| /DL218W  |        |            | 67446   | +      | 954       | 28       | 21      | 16       | 51       | 32       | 84      |           |         |                |           |
| YDL217C  | chrIV  | 67983      | 68606   | -      | 624       | 287      | 247     | 295      | 392      | 91       | 344     |           |         |                |           |
| VDI 2160 | cheTV  | 69007      | 78310   | 42     | 1272      | 170      | 127     | 203      | 215      | 13/      | 100     |           |         |                |           |

#### **Output: Raw counts**

These are the "raw" counts will be used in statistical programs downstream for differential gene expression.

## **Counting reads using featureCounts**

|         | gene      |        |        | Co     | unt    |        |        |
|---------|-----------|--------|--------|--------|--------|--------|--------|
| Geneid  | gene_name | WT_C_2 | WT_C_1 | WT_E_1 | WT_C_3 | WT_E_2 | WT_E_3 |
| YDL246C | SOR2      | 0      | 0      | 0      | 2      | 0      | 6      |
| YDL243C | AAD4      | 104    | 109    | 275    | 109    | 328    | 206    |
| YDR387C | CIN10     | 263    | 274    | 747    | 492    | 695    | 810    |
| YDL094C | NA        | 7      | 4      | 8      | 1      | 8      | 3      |
| YDR438W | THI74     | 72     | 102    | 140    | 126    | 144    | 161    |
| YDR523C | SPS1      | 39     | 30     | 27     | 61     | 31     | 12     |
| YDR542W | PAU10     | 0      | 1      | 0      | 1      | 0      | 0      |
| YDR492W | IZH1      | 420    | 619    | 2850   | 338    | 1651   | 749    |
| YDR018C | NA        | 21     | 19     | 160    | 50     | 359    | 455    |
| YDL189W | RBS1      | 380    | 405    | 376    | 518    | 408    | 515    |
| YDR508C | GNP1      | 1661   | 2365   | 767    | 2126   | 972    | 1417   |
| YDR462W | MRPL28    | 307    | 304    | 850    | 360    | 1081   | 700    |
| YDR175C | RSM24     | 528    | 577    | 1456   | 617    | 1304   | 903    |
| YDR186C | SND1      | 730    | 868    | 2061   | 681    | 1658   | 1643   |
| YDR150W | NUM1      | 474    | 420    | 772    | 535    | 831    | 724    |
| YDR243C | PRP28     | 189    | 176    | 282    | 192    | 147    | 232    |
| YDL182W | LYS20     | 2163   | 2953   | 500    | 3361   | 318    | 710    |
| YDR362C | TFC6      | 323    | 360    | 558    | 350    | 536    | 461    |
| YDR232W | HEM1      | 616    | 579    | 845    | 642    | 542    | 452    |
| YDR158W | HOM2      | 12602  | 14504  | 4521   | 14868  | 4053   | 5727   |
| YDR439W | LRS4      | 93     | 136    | 163    | 113    | 197    | 202    |
| YDL206W | NA        | 177    | 215    | 369    | 315    | 633    | 653    |
| YDR125C | ECM18     | 82     | 87     | 111    | 93     | 145    | 228    |
| YDR338C | NA        | 204    | 245    | 226    | 259    | 289    | 265    |
| YDR526C | NA        | 0      | 2      | 0      | 4      | 1      | 0      |
| YDR533C | HSP31     | 3469   | 3665   | 24999  | 1677   | 30821  | 22425  |
| YDR272W | GL02      | 1591   | 1329   | 5826   | 1413   | 6536   | 7377   |
| YDR197W | CBS2      | 329    | 393    | 573    | 380    | 732    | 648    |
| YDR512C | EMI1      | 783    | 588    | 2009   | 670    | 2625   | 2619   |

#### A table of counts

Don't need information about the genomic coordinates, length

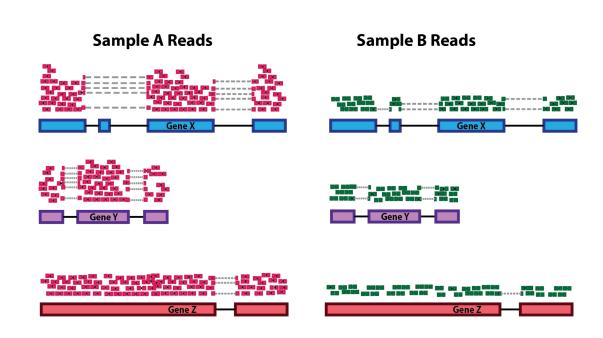
→ Cleaning up the featureCounts matrix

## **Final output:**

A count matrix, with genes as rows and samples are columns

## **Normalization**

Sequencing depth: Accounting for sequencing depth is necessary for comparison of gene expression between samples.

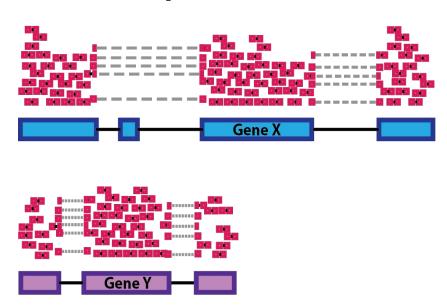


In the example below, each gene appears to have doubled in expression in Sample A relative to Sample B, however this is a consequence of Sample A having double the sequencing depth.

## **Normalization**

Gene length: Accounting for gene length is necessary for comparing expression between different genes within the same sample.

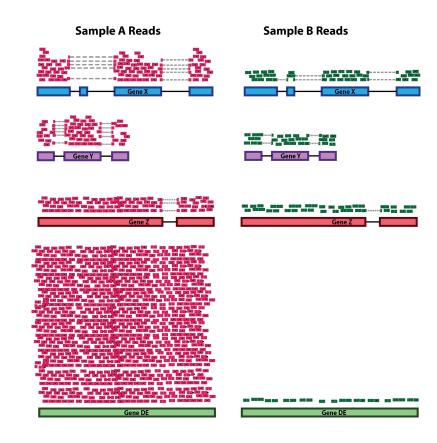
# **Sample A Reads**



In the example, Gene X and Gene Y have similar levels of expression, but the number of reads mapped to Gene X would be many more than the number mapped to Gene Y because Gene X is longer.

## **Normalization**

**RNA composition:** A few highly differentially expressed genes between samples, differences in the number of genes expressed between samples, or presence of contamination can skew some types of normalization methods.





We are happy to help you!