# ERC Drosophila melanogaster 

06/08/2015

## Outline

Introduction
Overview of RNA-seq samples
Wing compartments - resolution of analysis all together
Differential gene expression - EdgeR
Variance decomposition
Space-specific genes - pairwise comparison of wing compartments
Anterior vs posterior
Dorsal vs ventral
Nubbin vs all other wing compartments
Time-specific genes
Space and time
Variance decomposition
Hedgehog signalling
Ibrahim

## Imaginal discs



## Wing imaginal disc



## Wing imaginal disc



## Wing A/P and D/V boundaries



## Considerations

- data highly similar
- all wing compartments together - no resolution
- EdgeR - impossible to identify genes over expressed in a compartment-specific manner
- Decomposing the variation of gene expression across time and space
- anterior / posterior / L3 / WP genes
- EdgeR (A/P matrix vs all wing compartments)
- Decomposing the variation of gene expression across time and space


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Wing compartments - resolution of analysis all together

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Time-specific genes

Space and time

Hedgehog signalling

## Overview of processed RNA-seq samples



## PCA all samples

17092 genes


13854 protein-coding genes


## Clustering by gene expression




## Clustering by gene expression - protein-coding




## PCA wing compartments

17092 genes


13854 protein-coding genes


## PCA wing compartments

13854 protein-coding genes


## clustering by gene expression - wing compartments



## clustering by gene expression - wing compartments -

 protein-coding
pWWP.2;posterior 0.950 .960 .970 .970 .970 .970 .970 .970 .970 .970 .970 .970 .980 .980 .970 .980 .970 .970 .99 pWWP. 1 ;posterior 0.940 .960 .960 .960 .960 .960 .960 .960 .960 .960 .970 .960 .970 .970 .970 .960 .960 .97

WWP.3;nub $0.960 .970 .960 .960 .960 .960 .960 .960 .960 .960 .970 .970 .970 .970 .970 .970 .99 \quad 1$
WWP.2;nub $0.970 .970 .960 .960 .960 .960 .960 .960 .960 .960 .960 .970 .960 .960 .960 .96 \quad 1 \quad 0.990 .9$

cell
anterior
dorsal
nub
posterior ventral

age
$\square$ white pupa

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Wing compartments - resolution of analysis all together Differential gene expression - EdgeR
Variance decomposition

Space-specific genes - pairwise comparison of wing compartments

Nubbin vs all other wing compartments

Time-specific genes

Space and time

## EdgeR allCompartments - general design

4166 differentially expressed genes

factor cell*age as two-way anova 2:10
(Intercept)
cellnub
cellventral
celldorsal:agewhite pupa
cellposterior:agewhite pupa
celldorsal
cellposterior
agewhite pupa
cellnub:agewhite pupa
cellventral:agewhite pupa

## EdgeR allCompartments - general design: age contrast

1264 differentially expressed genes

factor cell*age coefficient for the comparison 6
(Intercept)
cellnub
cellventral
celldorsal:agewhite pupa cellposterior:agewhite pupa
celldorsal
cellposterior
agewhite pupa
cellnub:agewhite pupa cellventral:agewhite pupa

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## Space-specific genes - pairwise comparison of wing compartments

Nubbin vs all other wing compartments

Time-specific genes

## Variance decomposition



## Variance decomposition

topCellGenes = 511 genes


## Variance decomposition



| Pvalue | BP |
| :--- | :--- |
| $3 \mathrm{e}-15$ | tissue morphogenesis |
| $3 \mathrm{e}-12$ | digestive system development |
| $7 \mathrm{e}-12$ | pattern specification process |
| $7 \mathrm{e}-12$ | regulation of transcription, DNA-templated |
| $7 \mathrm{e}-12$ | regulation of RNA biosynthetic process |
| $2 \mathrm{e}-11$ | epithelial tube morphogenesis |
| $2 \mathrm{e}-11$ | sensory organ development |
| $5 \mathrm{e}-11$ | developmental process |
| $1 \mathrm{e}-10$ | urogenital system development |
| Pvalue | Term |
| Pvalue | Term |
| $3 \mathrm{e}-10$ | sequence-specific DNA binding transcription factor activity |
| $3 \mathrm{e}-10$ | sequence-specific DNA binding |
| $9 \mathrm{e}-07$ | RNA polymerase II distal enhancer sequence- |
|  | specific DNA binding transcription factor activity |
| $6 \mathrm{e}-06$ | sequence-specific DNA binding RNA polymerase II |
| $4 \mathrm{e}-05$ | transcription factor activity |
| $5 \mathrm{e}-05$ | metal ion binding |
| fibroblast growth factor receptor binding |  |
| $5 \mathrm{e}-05$ | enhancer sequence-specific DNA binding |
| $6 \mathrm{e}-05$ | ion binding |
| $1 \mathrm{e}-04$ | transcription regulatory region DNA binding |

## Variance decomposition



| Pvalue | BP |
| :--- | :--- |
| $5 \mathrm{e}-04$ | synaptic vesicle docking |
| $5 \mathrm{e}-04$ | exocytosis |
| $8 \mathrm{e}-04$ | vesicle docking |
| $1 \mathrm{e}-03$ | synaptic vesicle transport |
| Pvalue | CC |
| Pvalue | MF |
| 0.001 | SNARE binding |
| 0.001 | SNAP receptor activity |


| KEGGID | Pvalue | Term |
| :--- | :--- | :--- |
| - | - | - |

## Variance decomposition



## Variance decomposition



| Pvalue | BP |
| :--- | :--- |
| $8 \mathrm{e}-14$ | cell cycle |
| $8 \mathrm{e}-13$ | organelle fission |
| $2 \mathrm{e}-11$ | DNA conformation change |
| $2 \mathrm{e}-11$ | microtubule cytoskeleton organization |
| $4 \mathrm{e}-11$ | DNA-dependent DNA replication |
| $3 \mathrm{e}-10$ | DNA replication initiation |
| $5 \mathrm{e}-10$ | DNA repair |
| $1 \mathrm{e}-09$ | cellular component organization |
| $6 \mathrm{e}-09$ | pre-replicative complex assembly involved in |
| Pvalue | nuclear cell cycle DNA replication |
| $4 \mathrm{e}-14$ | MCM complex |
| $5 \mathrm{e}-11$ | intracellular non-membrane-bounded organelle |
| $3 \mathrm{e}-10$ | nuclear pre-replicative complex |
| $6 \mathrm{e}-10$ | nucleus |
| $7 \mathrm{e}-08$ | microtubule |
| $8 \mathrm{e}-08$ | replication fork |
| $1 \mathrm{e}-07$ | intracellular part |
| $2 \mathrm{e}-07$ | organelle lumen |
| $6 \mathrm{e}-07$ | nuclear chromosome |
| Pvalue | MF |
| $6 \mathrm{e}-10$ | $3 '-5 '$ DNA helicase activity |
| $1 \mathrm{e}-09$ | microtubule binding |
| $2 \mathrm{e}-09$ | pyrophosphatase activity |
| $2 \mathrm{e}-09$ | hydrolase activity, acting on acid anhydrides |
| $5 \mathrm{e}-09$ | chromatin binding |
| $5 \mathrm{e}-09$ | macromolecular complex binding |
| $1 \mathrm{e}-08$ | adenyl nucleotide binding |
| $4 \mathrm{e}-08$ | helicase activity |
| $4 \mathrm{e}-08$ | nucleotide binding |

## Variance decomposition



| Pvalue | BP |
| :--- | :--- |
| $3 \mathrm{e}-06$ | instar larval or pupal development |
| $3 \mathrm{e}-06$ | imaginal disc morphogenesis |
| $4 \mathrm{e}-06$ | post-embryonic organ development |
| $4 \mathrm{e}-06$ | post-embryonic morphogenesis |
| $1 \mathrm{e}-05$ | tube morphogenesis |
| $2 \mathrm{e}-05$ | single-organism process |
| $4 \mathrm{e}-05$ | ecdysteroid metabolic process |
| $6 \mathrm{e}-05$ | wing disc development |
| $8 \mathrm{e}-05$ | imaginal disc-derived wing morphogenesis |
| Pvalue | CC |
| $4 \mathrm{e}-08$ | endoplasmic reticulum |
| $1 \mathrm{e}-05$ | rough endoplasmic reticulum membrane |
| $2 \mathrm{e}-05$ | plasma membrane |
| $6 \mathrm{e}-05$ | membrane region |
| $1 \mathrm{e}-04$ | Sec61 translocon complex |
| $2 \mathrm{e}-04$ | cytoplasm |
| $2 \mathrm{e}-04$ | lipid particle |
| Pvalue | MF |
| $6 e-05$ | choline dehydrogenase activity |

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## Overview of RNA-seq samples

## Wing compartments - resolution of analysis all together

Space-specific genes - pairwise comparison of wing compartments Anterior vs posterior

Dorsal vs ventral

Nubbin vs all other wing compartments

Time-specific genes

## EdgeR - design matrix

| allCompartments | A/P |
| :--- | :--- |
| anterior.L3 | anterior.L3 |
| anterior.white pupa | anterior.white pupa |
| dorsal.L3 | posterior.L3 |
| dorsal.white pupa | posterior.white pupa |
| nub.L3 |  |
| nub.white pupa |  |
| posterior.L3 |  |
| posterior.white pupa |  |
| ventral.L3 |  |
| ventral.white pupa |  |


| Contrasts |  |  | space |
| :--- | :--- | :--- | :--- |
| anterior.L3 | vs | posterior.L3 | 1 |
| anterior.white pupa | vs | posterior.white pupa | 1 |
| anterior.L3 | vs | anterior.white pupa | 0 |
| posterior.L3 | vs | posterior.white pupa | 0 |
| anterior.L3 | vs | posterior.white pupa | $?$ |
| anterior.white pupa | vs | posterior.L3 | $?$ |


| Contrasts |  |  | space |
| :--- | :--- | :--- | :--- |
| anterior.L3 | vs | posterior.L3 | 1 |
| anterior.white pupa | vs | posterior.white pupa | 1 |
| anterior.L3 | vs | anterior.white pupa | 0 |
| posterior.L3 | vs | posterior.white pupa | 0 |
| anterior.L3 | vs | posterior.white pupa | $?$ |
| anterior.white pupa | vs | posterior.L3 | $?$ |


| Contrasts |  |  | space |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| anterior.L3 | vs | posterior.L3 | 1 | 1 | 1 | 1 |
| anterior.WP | vs | posterior.WP | 1 | 1 | 1 | 1 |
| anterior.L3 | vs | anterior.WP | 0 | 0 | 0 | 0 |
| posterior.L3 | vs | posterior.WP | 0 | 0 | 0 | 0 |
| anterior.L3 | vs | posterior.WP | 0 | 1 | 0 | 1 |
| anterior.WP | vs | posterior.L3 | 0 | 0 | 1 | 1 |
| number of genes |  | 0 | 2 | 6 | 36 |  |

## anterior vs posterior - space-specific genes $=44$



| Pvalue | Term-Cluster1 |
| :--- | :--- |
| $1 \mathrm{e}-06$ | sensory organ development |
| $1 \mathrm{e}-06$ | digestive tract development |
| $2 \mathrm{e}-06$ | cell morphogenesis involved in differentia- |
| $5 \mathrm{e}-06$ | tion |
| $6 \mathrm{e}-06$ | neuron differentiation |
| $9 \mathrm{e}-06$ | developection morphogenesis |
| $1 \mathrm{e}-05$ | single-multicellular organism process |


| Pvalue | Term - cluster2 |
| :--- | :--- |
| $1 \mathrm{e}-08$ | regulation of transcription, DNA-templated |
| $1 \mathrm{e}-08$ | regulation of RNA biosynthetic process |
| $3 \mathrm{e}-08$ | tissue development |
| $5 \mathrm{e}-08$ | regulation of nucleobase-containing com- |
| $7 \mathrm{e}-08$ | pound metabolic process |
| $3 \mathrm{e}-06$ | regulation of biosynthetic process |
| $3 \mathrm{e}-05$ | imaginal disce-derivent appendage develop- |
| $7 \mathrm{e}-05$ | ment |
| $1 \mathrm{e}-04$ | posinal disc morphogenesis |
| $2 \mathrm{e}-04$ | wing disc anterior/posterior pattern forma- |
| $2 \mathrm{e}-04$ | tion |
| $4 \mathrm{e}-04$ | post-embryonic morphogenesis |
| $2 \mathrm{e}-03$ | instar larval or pupal development |
| $2 \mathrm{e}-03$ | posterior compartment specification |
| determination of wing disc primordium |  |

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Space-specific genes - pairwise comparison of wing compartments Anterior vs posterior
Dorsal vs ventral

Nubbin vs all other wing compartments

Time-specific genes

## EdgeR - design matrix

| allCompartments | D/V |
| :--- | :--- |
| anterior.L3 | dorsal.L3 |
| anterior.white pupa | dorsal.white pupa |
| dorsal.L3 | ventral.L3 |
| dorsal.white pupa | ventral.white pupa |
| nub.L3 |  |
| nub.white pupa |  |
| posterior.L3 |  |
| posterior.white pupa |  |
| ventral.L3 |  |
| ventral.white pupa |  |


| Contrasts |  |  | space |
| :--- | :--- | :--- | :--- |
| dorsal.L3 | vs | ventral.L3 | 1 |
| dorsal.white pupa | vs | ventral.white pupa | 1 |
| dorsal.L3 | vs | dorsal.white pupa | 0 |
| ventral.L3 | vs | ventral.white pupa | 0 |
| dorsal.L3 | vs | ventral.white pupa | $?$ |
| dorsal.white pupa | vs | ventral.L3 | $?$ |


| Contrasts |  |  | space |
| :--- | :--- | :--- | :--- |
| dorsal.L3 | vs | ventral.L3 | 1 |
| dorsal.white pupa | vs | ventral.white pupa | 1 |
| dorsal.L3 | vs | dorsal.white pupa | 0 |
| ventral.L3 | vs | ventral.white pupa | 0 |
| dorsal.L3 | vs | ventral.white pupa | $?$ |
| dorsal.white pupa | vs | ventral.L3 | $?$ |


| Contrasts |  |  | space |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| dorsal.L3 | vs | ventral.L3 | 1 | 1 | 1 | 1 |
| dorsal.WP | vs | ventral.WP | 1 | 1 | 1 | 1 |
| dorsal.L3 | vs | dorsal.WP | 0 | 0 | 0 | 0 |
| ventral.L3 | vs | ventral.WP | 0 | 0 | 0 | 0 |
| dorsal.L3 | vs | ventral.WP | 0 | 1 | 0 | 1 |
| dorsal.WP | vs | ventral.L3 | 0 | 0 | 1 | 1 |
| number of genes |  | 0 | 3 | 6 | 48 |  |

## dorsal vs ventral - space-specific genes $=57$



| Pvalue | Term - Cluster1 |
| :--- | :--- |
| $1 \mathrm{e}-06$ | eye-antennal disc development |
| $2 \mathrm{e}-06$ | tube morphogenesis |
| $9 \mathrm{e}-06$ | myoblast migration |
| $1 \mathrm{e}-05$ | tissue development |
| $2 \mathrm{e}-05$ | organ morphogenesis |
| $2 \mathrm{e}-05$ | fibroblast growth factor receptor signaling pathway |
| $2 \mathrm{e}-05$ | response to fibroblast growth factor |
| $4 \mathrm{e}-05$ | post-embryonic organ development |
| $6 \mathrm{e}-05$ | learning or memory |
| Pvalue | Term |
| Pvalue | Term |
| $3 \mathrm{e}-08$ | fibroblast growth factor receptor binding |
| $3 \mathrm{e}-05$ | receptor binding |
| $3 \mathrm{e}-04$ | sequence-specific DNA binding transcription factor activ- |
| ity |  |
| Pvalue | Term Cluster2 |
| $8 \mathrm{e}-06$ | digestive system development |
| $9 \mathrm{e}-06$ | midgut development |
| $1 \mathrm{e}-04$ | maintenance of epithelial integrity, open tracheal system |
| $5 \mathrm{e}-04$ | tube morphogenesis |
| $9 \mathrm{e}-04$ | morphogenesis of an epithelium |
| $1 \mathrm{e}-03$ | instar larval or pupal development |
| $1 \mathrm{e}-03$ | tissue homeostasis |
| $1 \mathrm{e}-03$ | epithelial cell migration, open tracheal system |
| $1 \mathrm{e}-03$ | muscle attachment |
| Pvalue | Term |
| $9 \mathrm{e}-04$ | basolateral plasma membrane |
| $3 \mathrm{e}-03$ | sarcolemma |
| Pvalue | Term |

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```

Nubbin vs all other wing compartments

Time-specific genes

Space and time

Hedgehog signalling

## EdgeR - design matrix and contrasts

| allCompartments |
| :--- |
| anterior.L3 |
| anterior.white pupa |
| dorsal.L3 |
| dorsal.white pupa |
| nub.L3 |
| nub.white pupa |
| posterior.L3 |
| posterior.white pupa |
| ventral.L3 |
| ventral.white pupa |


| Contrasts |  |  | space |
| :--- | :--- | :--- | :--- |
| nub.L3 | vs | anterior.L3 | 1 |
| nub.L3 | vs | dorsal.L3 | 1 |
| nub.L3 | vs | posterior.L3 | 1 |
| nub.L3 | vs | ventral.L3 | 1 |
| nub.WP | vs | anterior.WP | 1 |
| nub.WP | vs | dorsal.WP | 1 |
| nub.WP | vs | posterior.WP | 1 |
| nub.WP | vs | ventral.WP | 1 |
| nub.L3 | vs | nub.WP | 0 |
| anterior.L3 | vs | anterior.WP | 0 |
| dorsal.L3 | vs | dorsal.WP | 0 |
| posterior.L3 | vs | posterior.WP | 0 |
| ventral.L3 | vs | ventral.WP | 0 |
| number of genes |  | 28 |  |

## dorsal vs ventral - space-specific genes $=28$



| Pvalue | Term - cluster1 |
| :--- | :--- |
| $3 \mathrm{e}-07$ | aromatic compound biosynthetic process |
| $3 \mathrm{e}-07$ | heterocycle biosynthetic process |
| $3 \mathrm{e}-07$ | cellular nitrogen compound biosynthetic process |
| $4 \mathrm{e}-07$ | organic cyclic compound biosynthetic process |
| $1 \mathrm{e}-06$ | system development |
| $1 \mathrm{e}-06$ | sensory organ development |
| $2 \mathrm{e}-06$ | negative regulation of transcription |
| $4 \mathrm{e}-06$ | compound eye development |
| $6 \mathrm{e}-06$ | Malpighian tubule stellate cell differentiation |
| Pvalue | Term |
| $8 \mathrm{e}-05$ | nucleus |
| Pvalue | Term |
| $2 \mathrm{e}-04$ | sequence-specific DNA binding transcription factor activity |
| $1 \mathrm{e}-03$ | protein tyrosine phosphatase activity, metal-dependent |
| $2 \mathrm{e}-03$ | sequence-specific DNA binding RNA polymerase II |
| Pvalue | Term - cluster2 |
| $2 \mathrm{e}-05$ | ganglion mother cell fate determination |
| $2 \mathrm{e}-04$ | cell fate determination |
| $3 \mathrm{e}-04$ | regulation of nucleic acid-templated transcription |
| $3 \mathrm{e}-04$ | regulation of transcription from RNA polymerase II promoter |
| $4 \mathrm{e}-04$ | transcription, DNA-templated |
| $4 \mathrm{e}-04$ | RNA biosynthetic process |
| $4 \mathrm{e}-04$ | ventral cord development |
| $4 \mathrm{e}-04$ | regulation of RNA metabolic process |
| $5 \mathrm{e}-04$ | regulation of cellular macromolecule biosynthetic process |
| Pvalue | Term |
| Pvalue | Term |
| $6 e-06$ | sequence-specific DNA binding transcription factor activity |
| $5 \mathrm{e}-04$ | positive regulation of transcription |
| $7 \mathrm{e}-04$ | sequence-specific DNA binding |
| $8 \mathrm{e}-04$ | inositol-3-phosphate synthase activity |
| $3 \mathrm{e}-03$ | nucleic acid binding |

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Space and time
Variance decomposition

## Variance decomposition


Sets
Others
Top age genes
Top cell genes

## Average

contribution:
Cell 16\%
Age 45\%
Residuals 39\%

## Variance decomposition

topCellGenes $=280$ genes

topAgeGenes $=2346$ genes


## Variance decomposition


topCellGenes = 280 genes, cluster 2
$=151$ genes


| Cluster1 Pvalue | Term BP |
| :---: | :---: |
| $4 \mathrm{e}-05$ | compartment pattern specification |
| $6 \mathrm{e}-05$ | wing disc development |
| 1e-04 | anterior commissure morphogenesis |
| 1e-04 | positive regulation of gene expression |
| 1e-04 | imaginal disc lineage restriction |
| 1e-04 | imaginal disc-derived wing vein specification |
| $2 \mathrm{e}-04$ | wing disc anterior/posterior pattern formation |
| $2 \mathrm{e}-04$ | positive regulation of RNA metabolic process |
| $2 \mathrm{e}-04$ | appendage morphogenesis |
| $2 \mathrm{e}-04$ | post-embryonic organ morphogenesis |
| 2e-04 | instar larval or pupal development |
| Pvalue | Term |
| Pvalue | Term |
| $1 e-04$ $3 e-04$ $4 e-04$ | sequence-specific DNA binding RNA polymerase II transcription factor activity sequence-specific DNA binding transcription factor activity sequence-specific DNA binding |
| Cluster2 Pvalue | Term |
| 1e-06 | post-embryonic organ development |
| 5e-06 | imaginal disc-derived appendage development |
| 1e-05 | post-embryonic development |
| $5 \mathrm{e}-05$ | tissue development |
| $6 \mathrm{e}-05$ | post-embryonic appendage morphogenesis |
| 6e-05 | cell part morphogenesis |
| $9 \mathrm{e}-05$ | imaginal disc morphogenesis |
| 1e-04 | cell surface receptor signaling pathway |
| 3e-04 | organ morphogenesis |
| 3e-04 | cell morphogenesis |
| Pvalue | Term |
| Pvalue | Term |
| $2 \mathrm{e}-07$ | sequence-specific DNA binding transcription factor activity |
| $6 \mathrm{e}-05$ | transmembrane receptor protein tyrosine kinase activity |
| $2 \mathrm{e}-04$ | transcription regulatory region sequence-specific DNA binding |

## Variance decomposition VS EdgeR



## Variance decomposition




## Variance decomposition

topCellGenes $=280$ vs 261 genes

topAgeGenes $=2346$ vs 2369 genes


## Variance decomposition

topCellAgeGenes $=71$ genes


## Variance decomposition



| cluster1 - Pvalue | Term BP |
| :--- | :--- |
| Pvalue | Term CC |
| Pvalue | Term MF |
| KEGG Pvalue | Term |
| Cluster2 - Pvalue | Term BP |
| $7 e-04$ | response to silver ion |
| $1 \mathrm{e}-03$ | detoxification of cadmium ion |
| $2 \mathrm{e}-03$ | response to zinc ion |
| $2 \mathrm{e}-03$ | response to mercury ion |
| $2 \mathrm{e}-03$ | stress response to metal ion |
| $3 \mathrm{e}-03$ | response to copper ion |
| Pvalue | Term CC |
| 0.005 | ciliary basal body |
| Pvalue | Term MF |
| 0.005 | RNA 7-methylguanosine cap binding |
| KEGG Pvalue | Term |

## Variance decomposition

topCellAgeGenes vs space.time EdgeR
topCellAgeGenes vs all differentially expressed genes EdgeR


## Hedgehog signalling KEGG



## Ibrahim



## Ibrahim



