



A transcriptomic analysis of photomorphogenesis in *Arabidopsis thaliana*

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Outline

- Photomorphogenesis in *A. thaliana*
- Strategy of analysis :- Systems Biology (well, a qualitative picture) from one set of microarrays
- A time-line of photomorphogenesis
 - Regulation phase
 - Cell cycle phase
 - Growth and photosynthesis
- Lessons for other species

Photomorphogenesis in *Arabidopsis thaliana*

- Before exposure to light, seedling grows via skotomorphogenesis after germination - slow root growth, no growth in shoot apical meristem or cotyledon.
- When exposed to light, cotyledon grows through reproduction.
- Shoot apex meristem (stem cells) grow by differentiation.
- Shoot apex meristem source of true leaves.
- Little understood process.



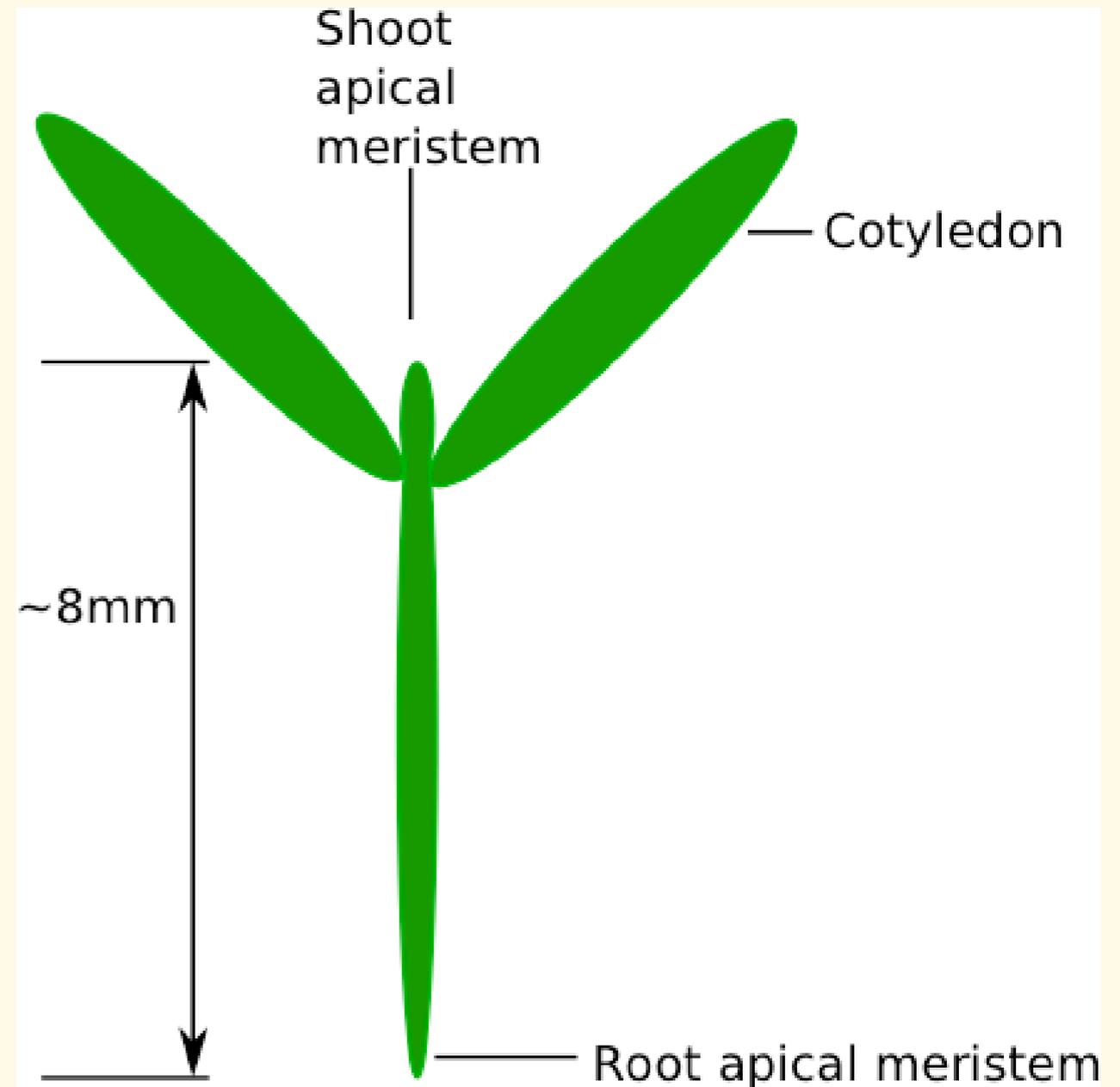
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The data

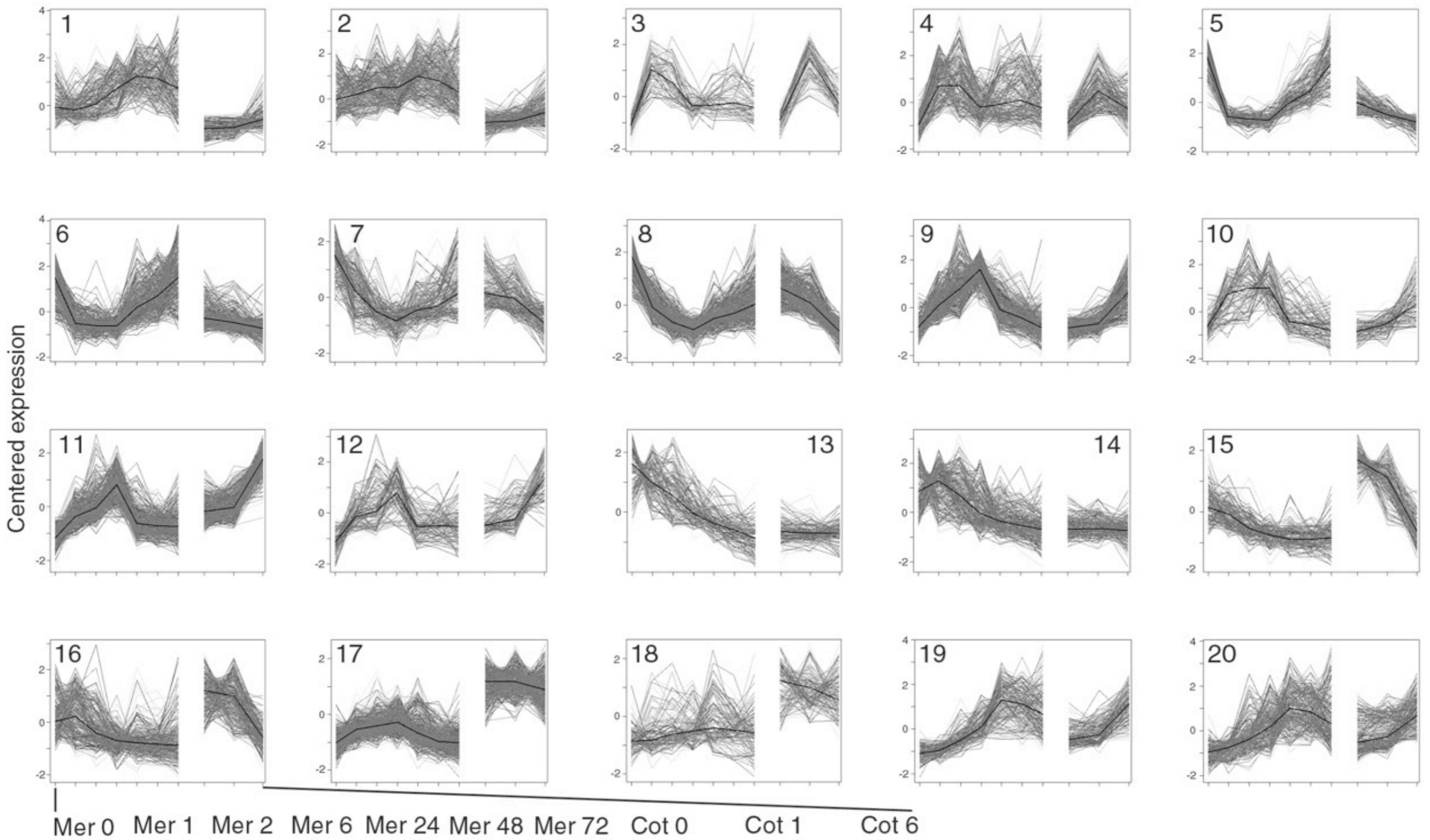
- RNA material was gathered from the shoot apical meristem and cotyledon of Arabidopsis seedlings at
 - 0 hour (in darkness)
 - 1 and 6 hours (Cot and Mer with replicates)
 - 2, 24, 48 and 72 hours (Mer only)
- Samples hybridised with Affymetrix ATH1 GeneChip array.
- No amplification of RNA material !

Strategy

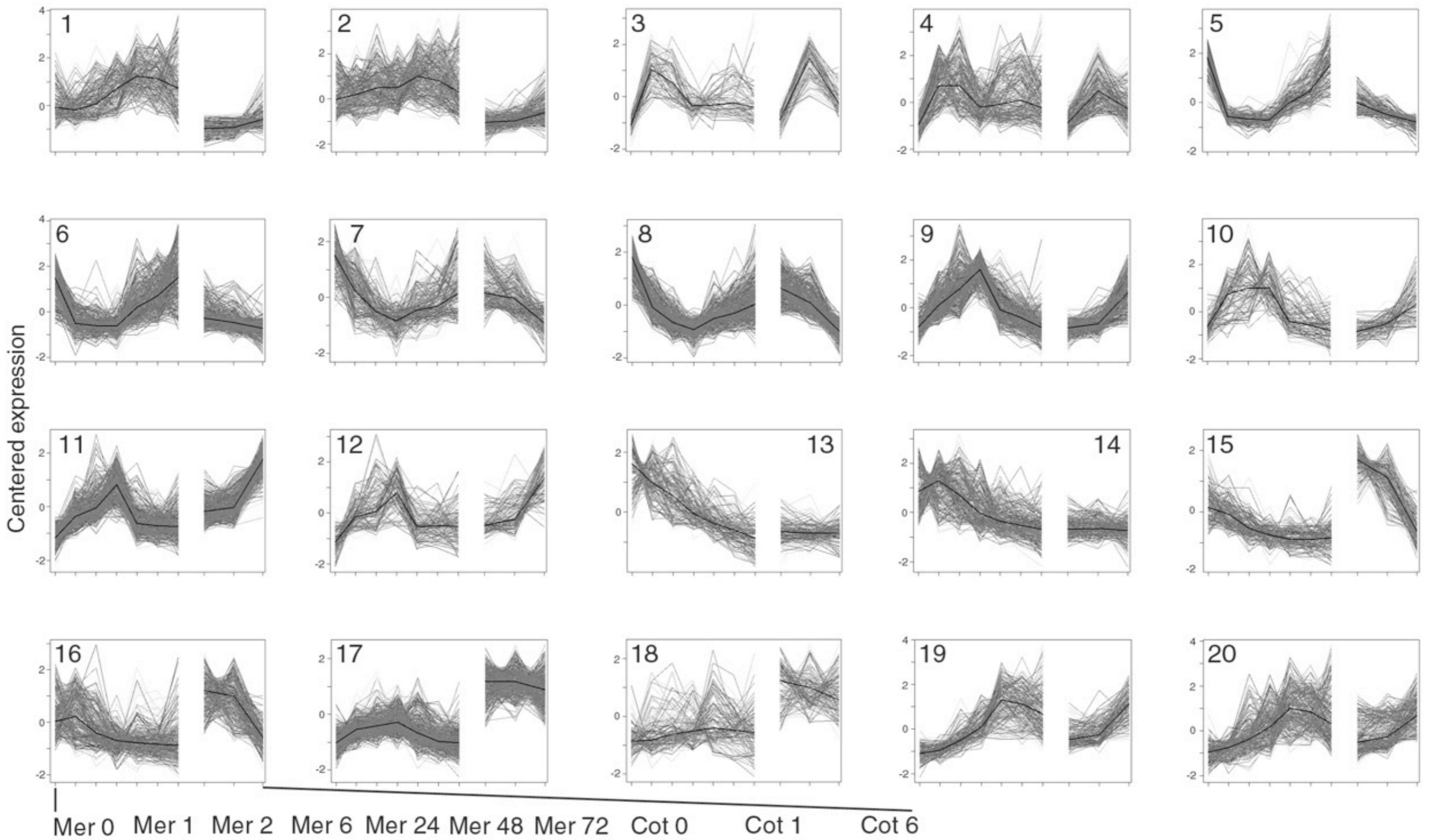
- Construct stringent test to determine genes which are clearly differentially expressed.
- Identify kinetic behaviour of different classes of differentially expressed genes (i.e. cluster genes according to their time behaviour).
- On the basis of the clusters, identify relevant functional groupings of genes and then examine how all the genes in that functional grouping behave (i.e. including those that are not differentially expressed according to our strict criteria) as a function of time.

Initial Results

- Selected 5,620 genes (out of 22,810).
 - (Very conservatively) 1/4 of the transcriptome is differentially expressed during photomorphogenesis.
- Majority selected through time variation (2/3 time, 1/3 tissue).
- Very small number selected using time-tissue variation (10).



K-means clusters (reordered)



Yes, but what does it mean ?

K-means clusters (reordered)

Functional Classification :- not as straightforward as one thinks....

- Gene Ontology is useful but far too specific at its lowest nodes - False Discovery Rate calculation.
- Initially interested in general picture, what is the highest level annotation ?
- GO slim should cover more general cases, however annotations of genes can have multiple parents, e.g. a gene with kinase function and binds to DNA will sit in both classes.
- Ultimately, we developed our own general functional annotation using GO and MapMan.
- Lesson :- GO has a huge amount of information, but when looking at the big picture, you need to make the decisions !

Gene Model: AT5G60890.1 [Help]**Update History** AT5G60890.1 replaces AT5G60890.1 on 2004-02-23**Date last modified** 2007-04-17**Name** AT5G60890.1**Name Type** orf**Gene Model Type** protein_coding**TAIR Accession** Gene:3441888**Description** Myb-like transcription factor that modulates expression of ASA1, a key point of control in the tryptophan pathway; mutant has deregulated expression of ASA1 in dominant allele. Loss of function allele suggests ATR1 also functions at a control point for regulating indole glucosinolate homeostasis.**Chromosome** 5**Locus** AT5G60890 (Note: use this locus link to see associated gene models, markers and ESTs).

Gene Alias	name	type
	MSL3_10	orf
	MSL3.10	orf
	ATMYB34	symbol
	ATR1	symbol
	MYB DOMAIN PROTEIN 34	full_name

Annotations	Category	Relationship Type	Keyword
	GO Biological Process	involved in	response to salt stress, response to abscisic acid stimulus, response to gibberellin stimulus, response to jasmonic acid stimulus, response to salicylic acid stimulus
	GO Cellular Component	located in	nucleus
	GO Molecular Function	functions in	DNA binding
		has	kinase activity, transcription factor activity

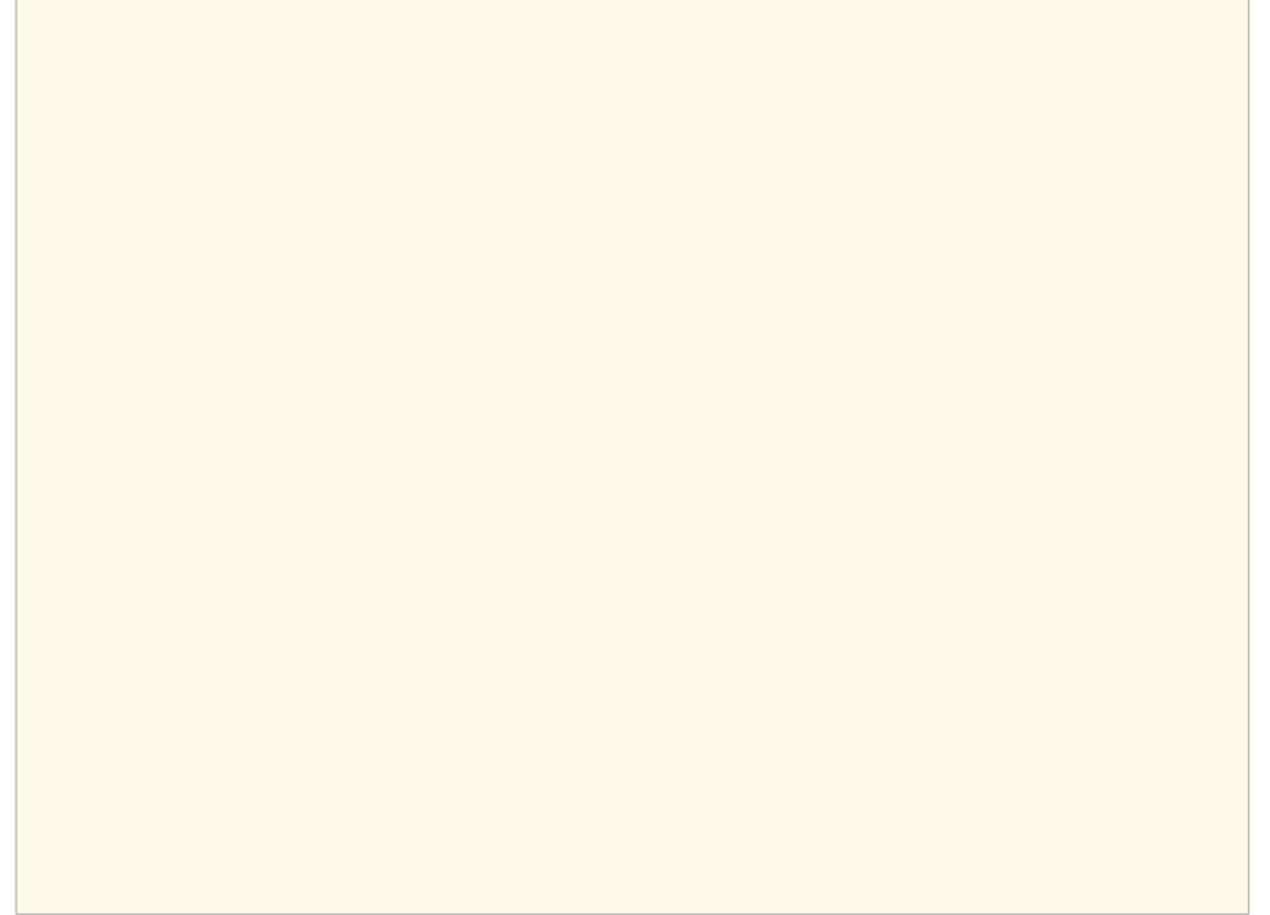
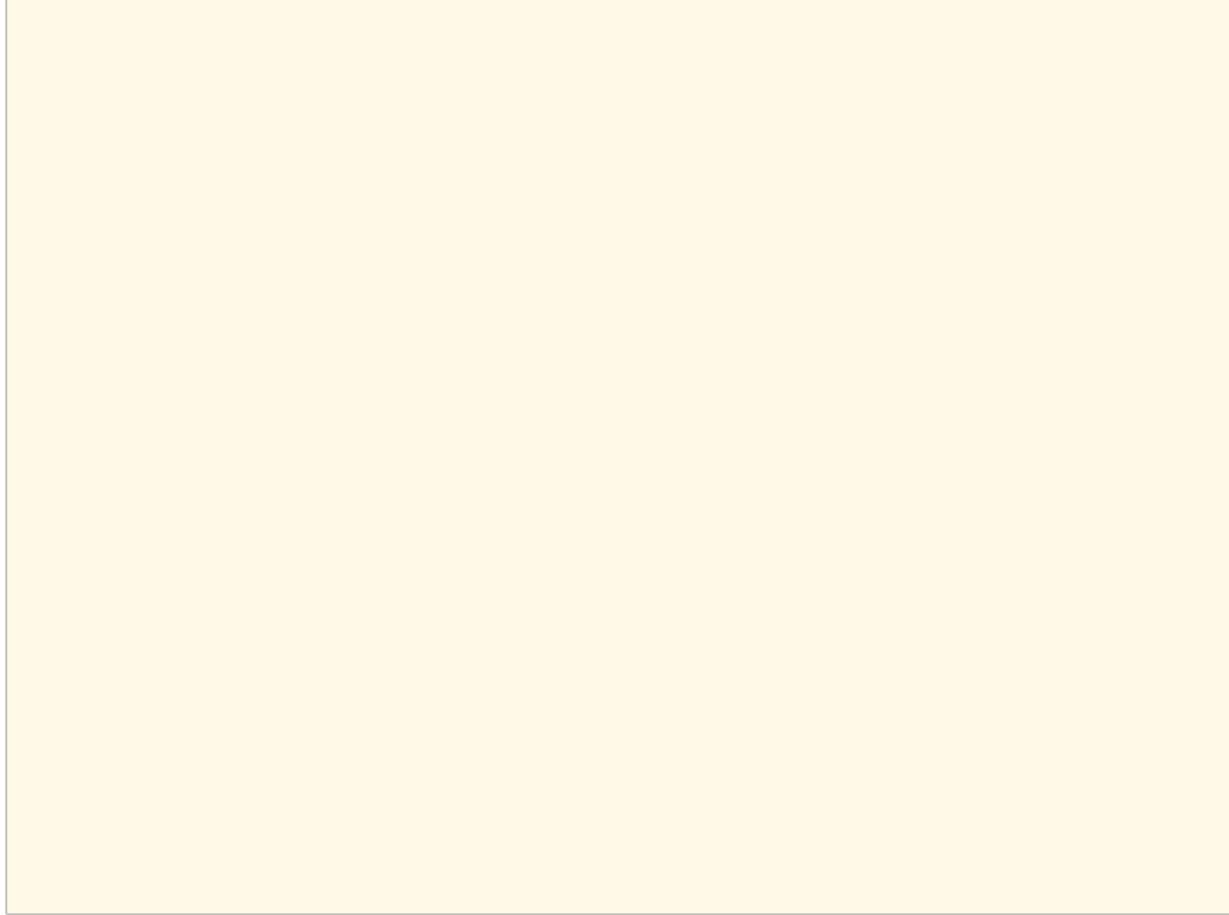
Annotation Detail

Protein Data	name	Length(aa)	molecular weight	isoelectric point	domains(# of domains)
	AT5G60890.1	295	32743.0	4.9866	Myb, DNA-binding;Molecular Function: DNA binding (:IPR001005(7))

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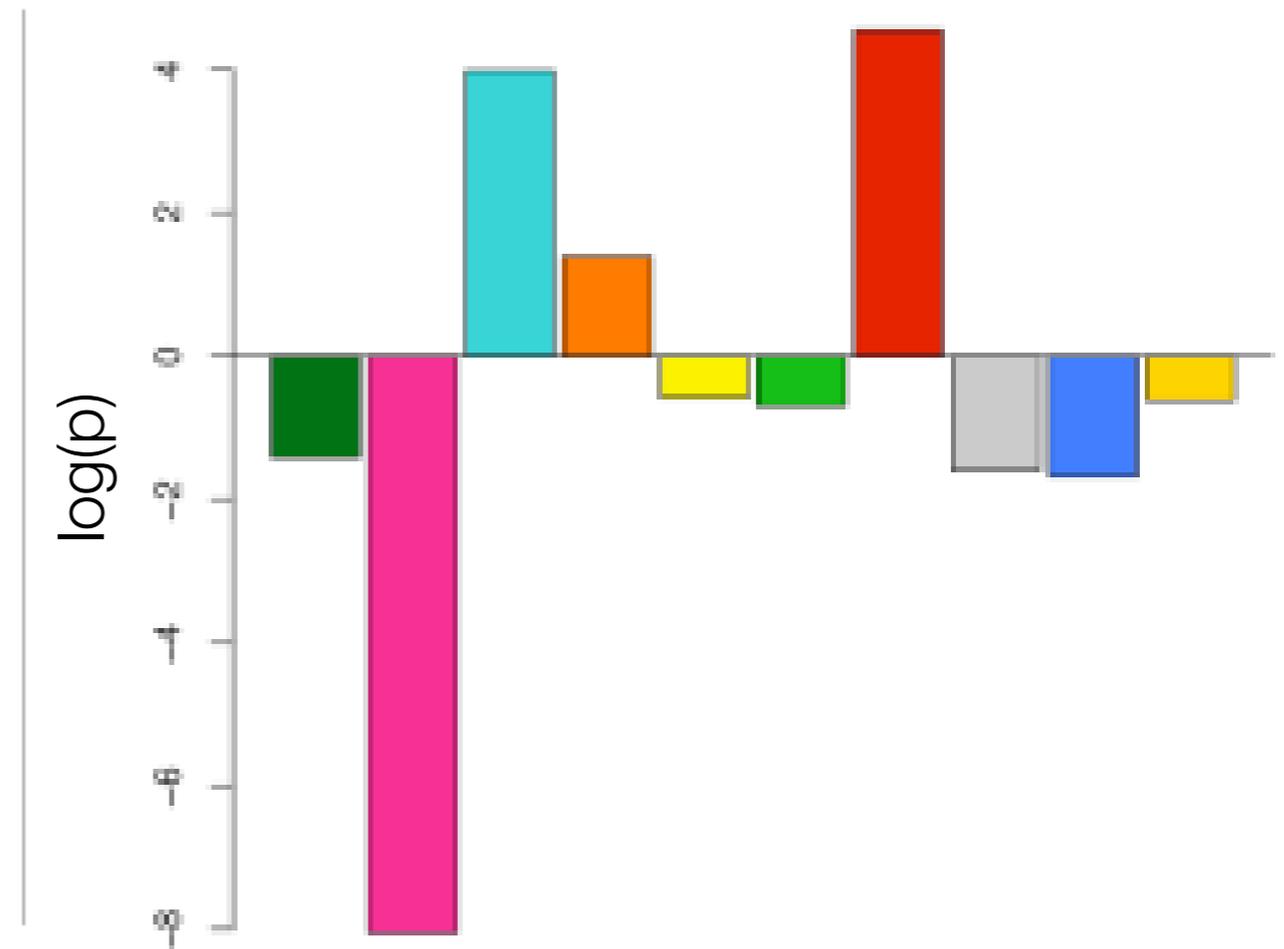
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Example



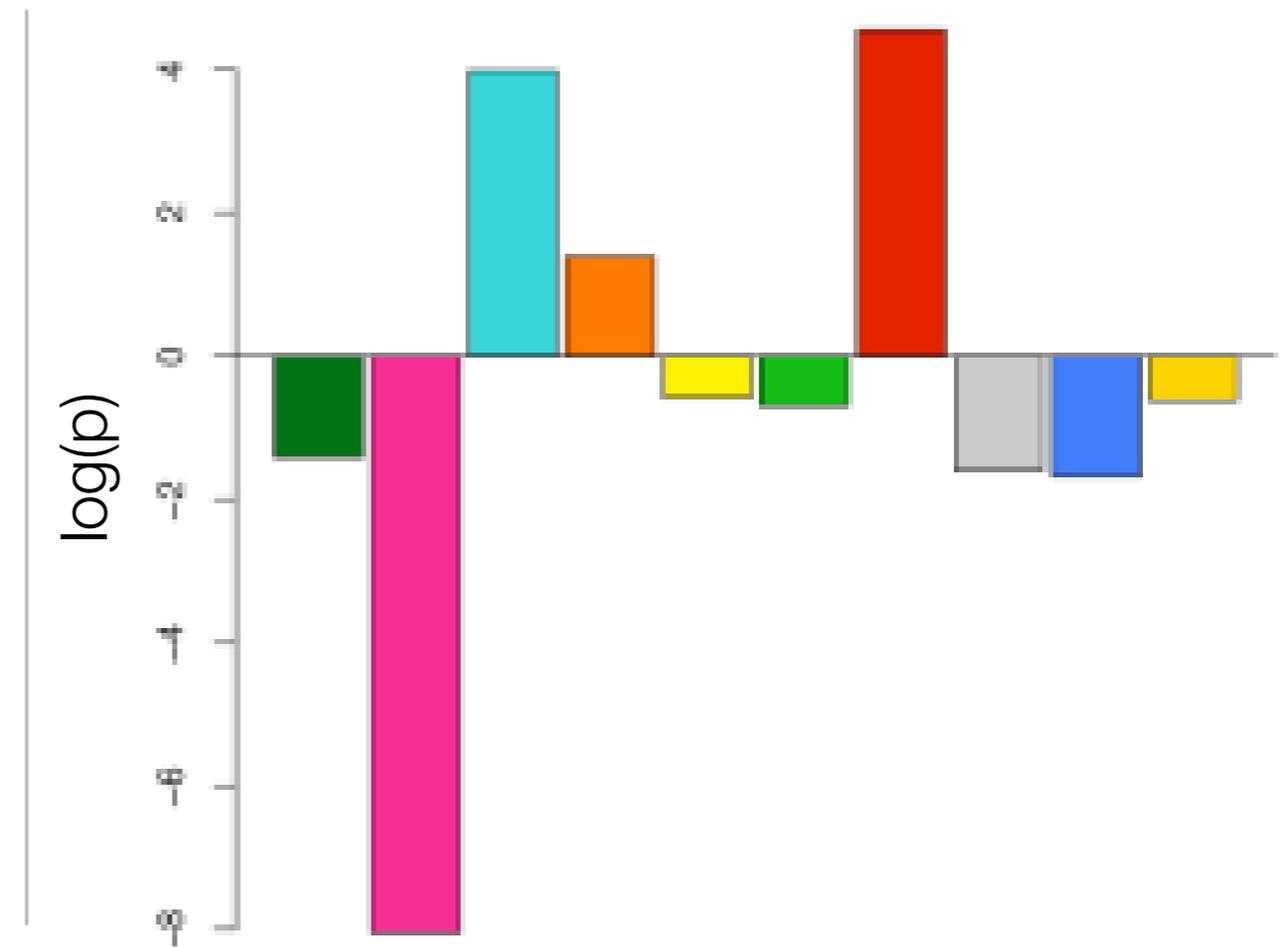
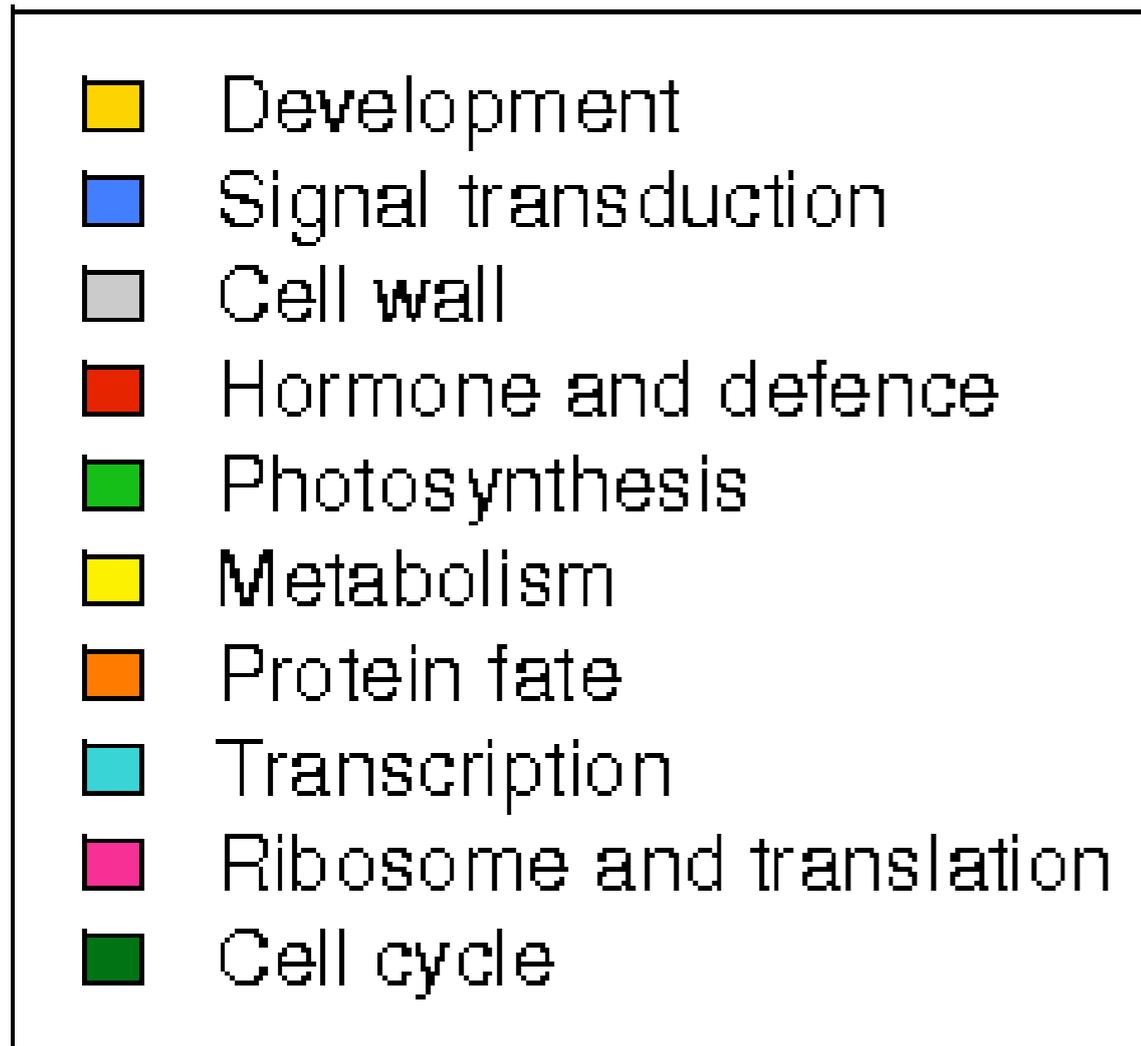
Example

- Development
- Signal transduction
- Cell wall
- Hormone and defence
- Photosynthesis
- Metabolism
- Protein fate
- Transcription
- Ribosome and translation
- Cell cycle

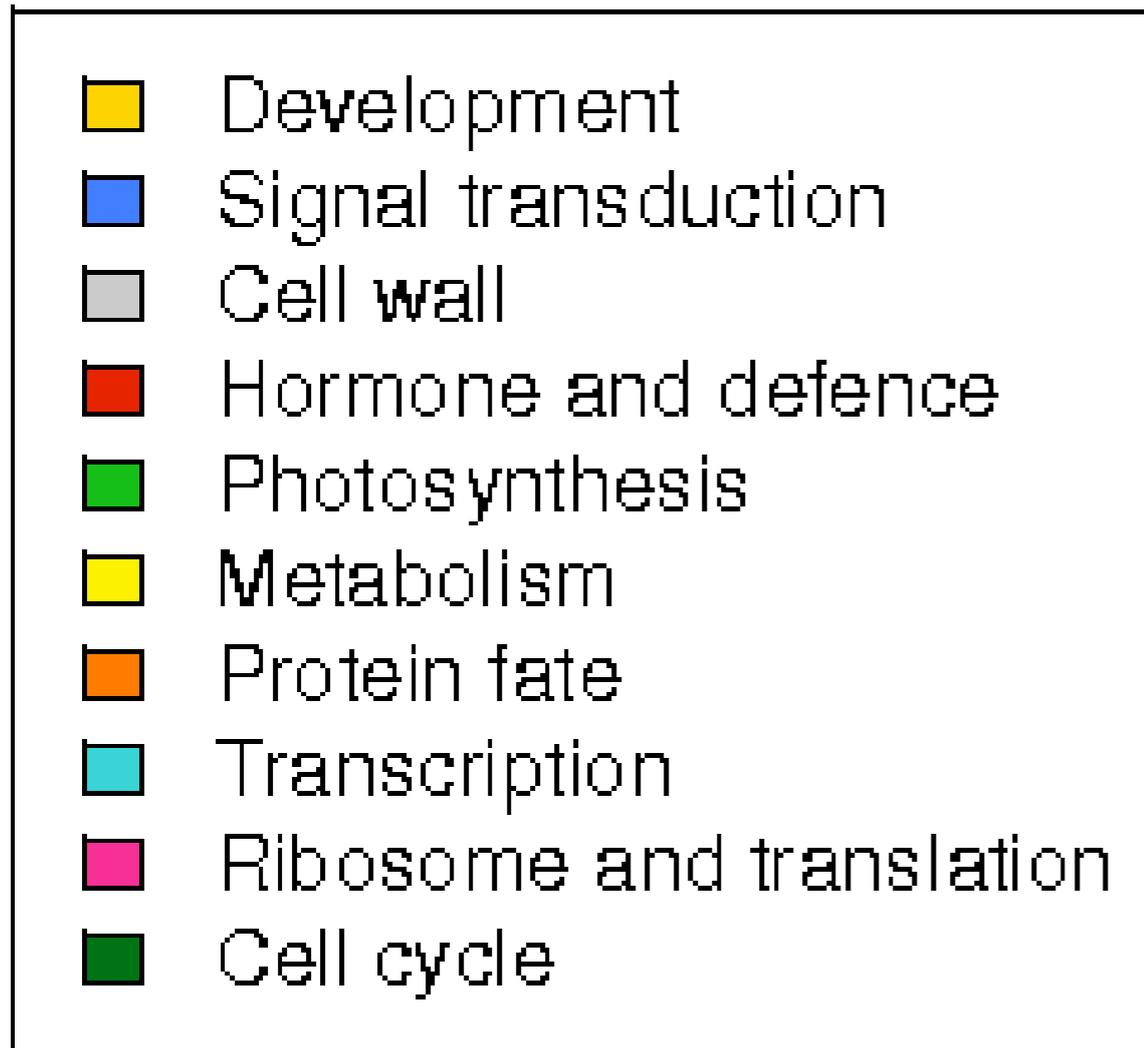


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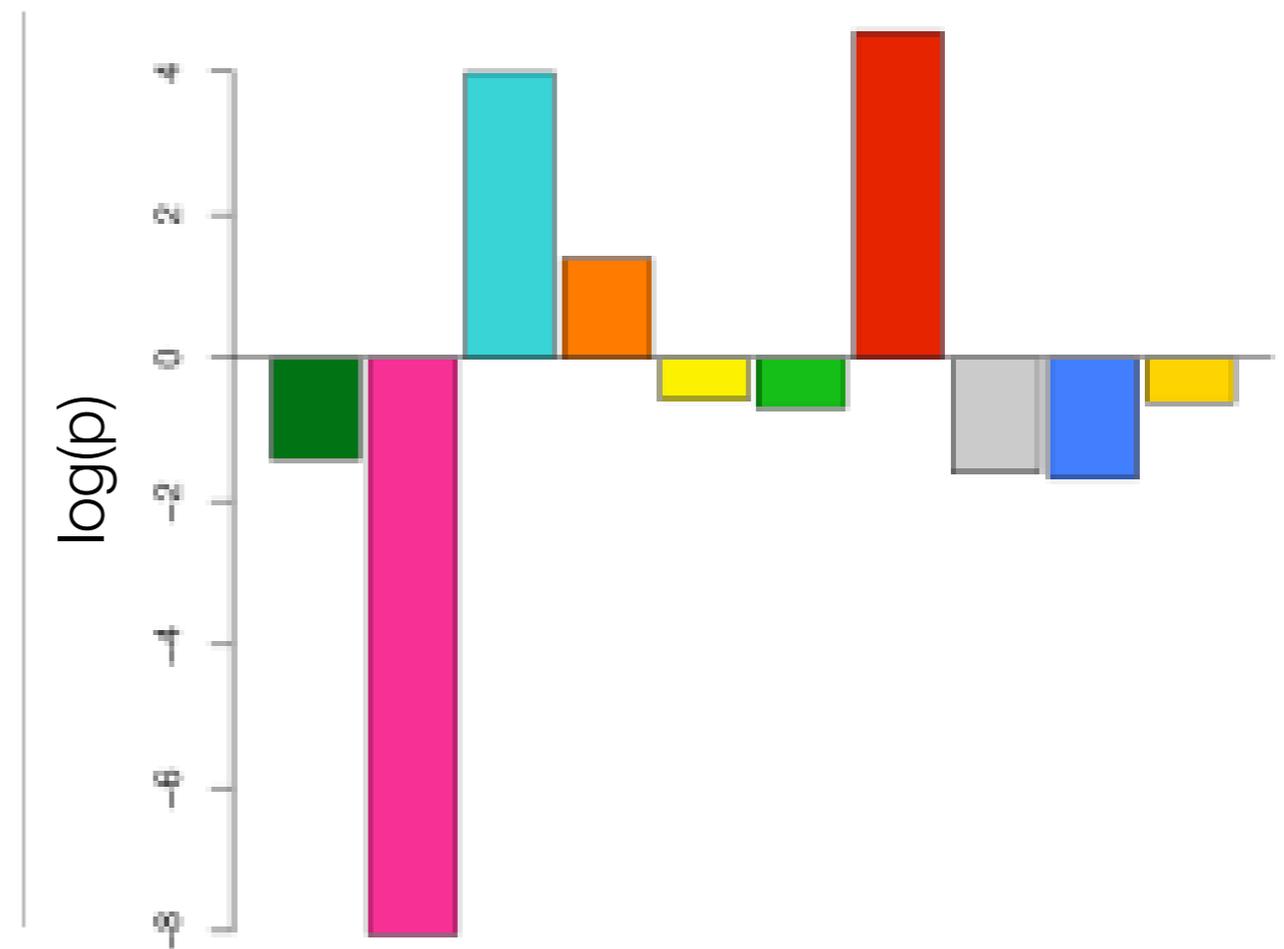
Over-representation



Example

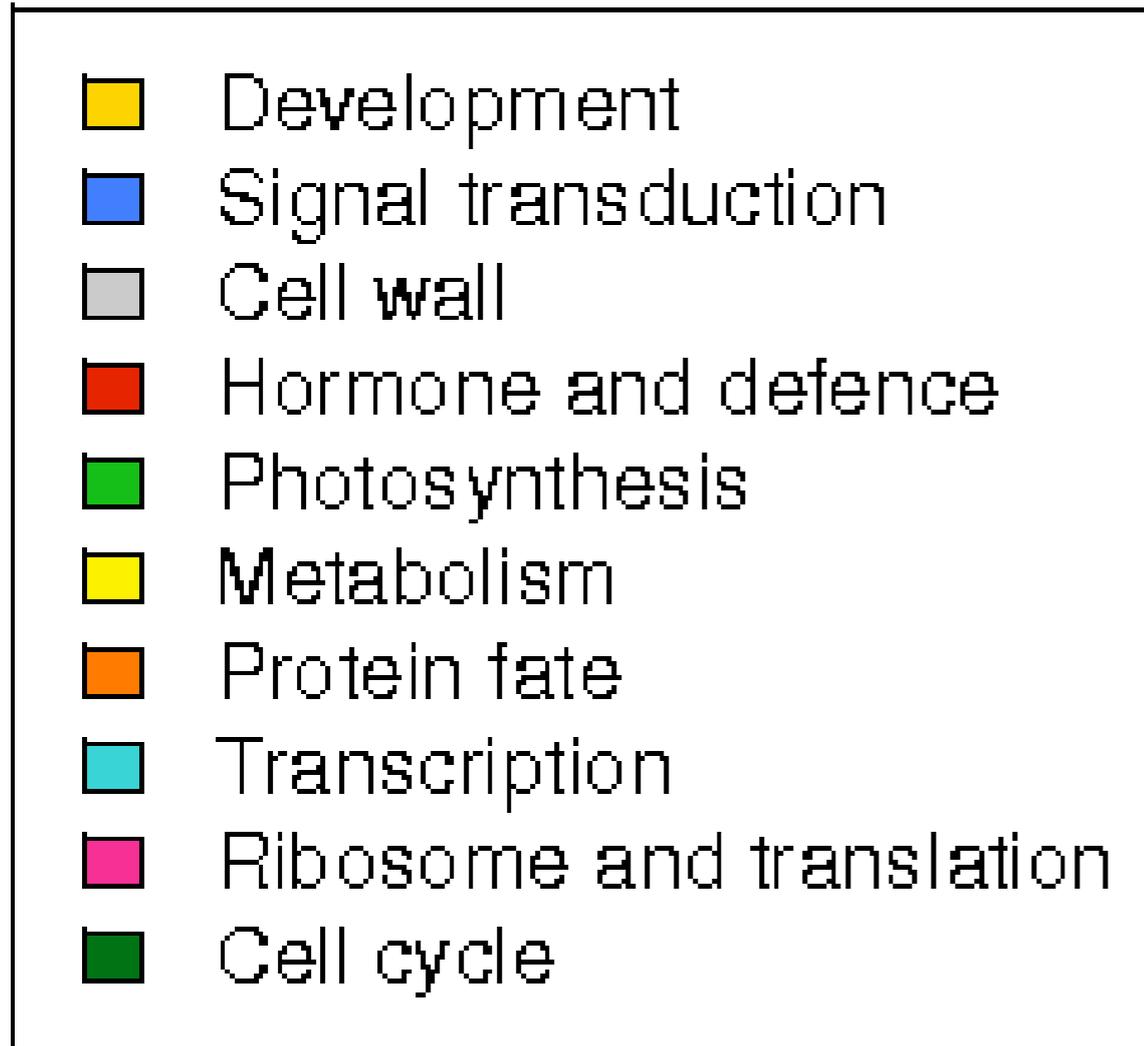


Over-representation

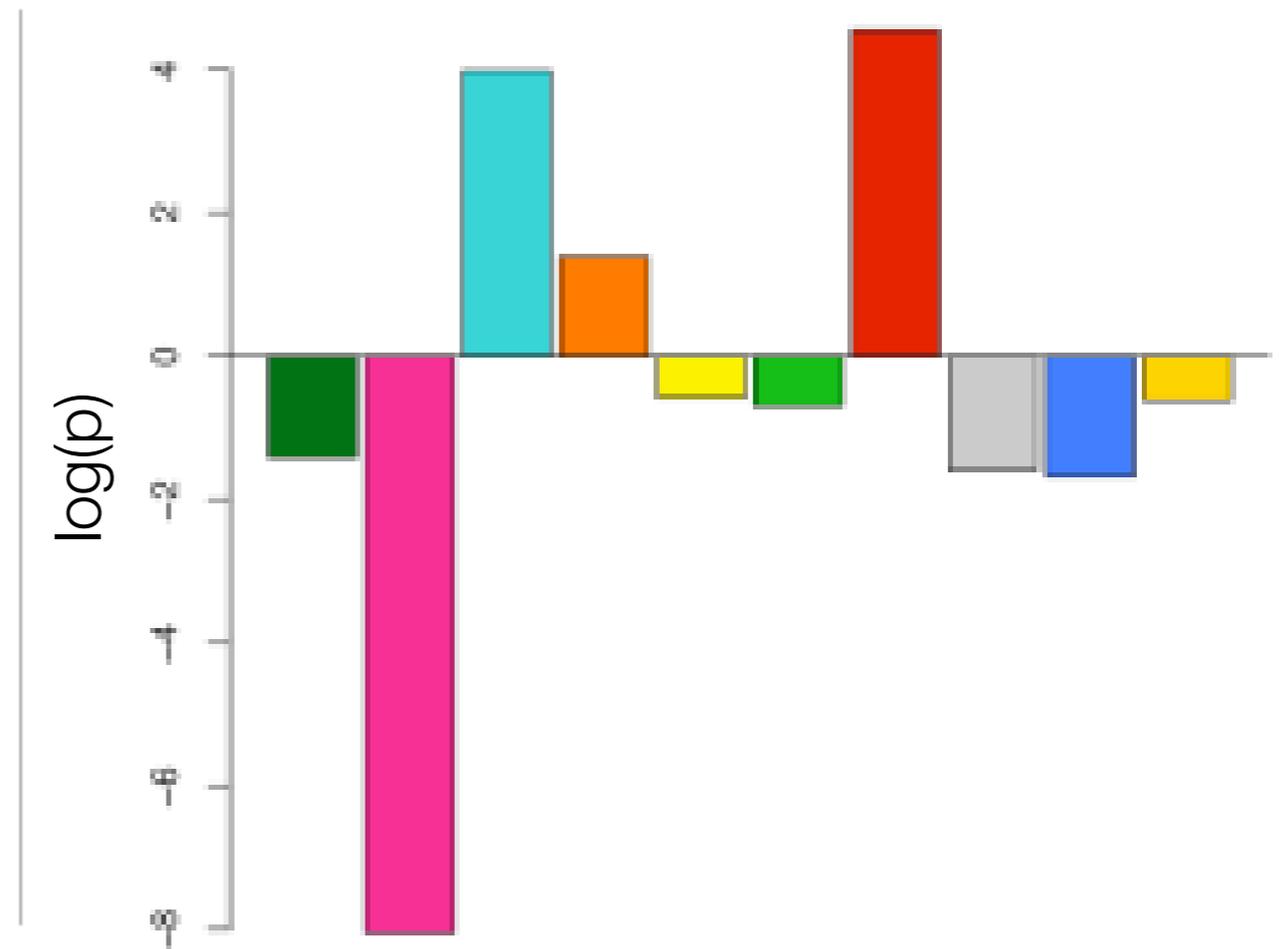


Under-representation

Example



Over-representation

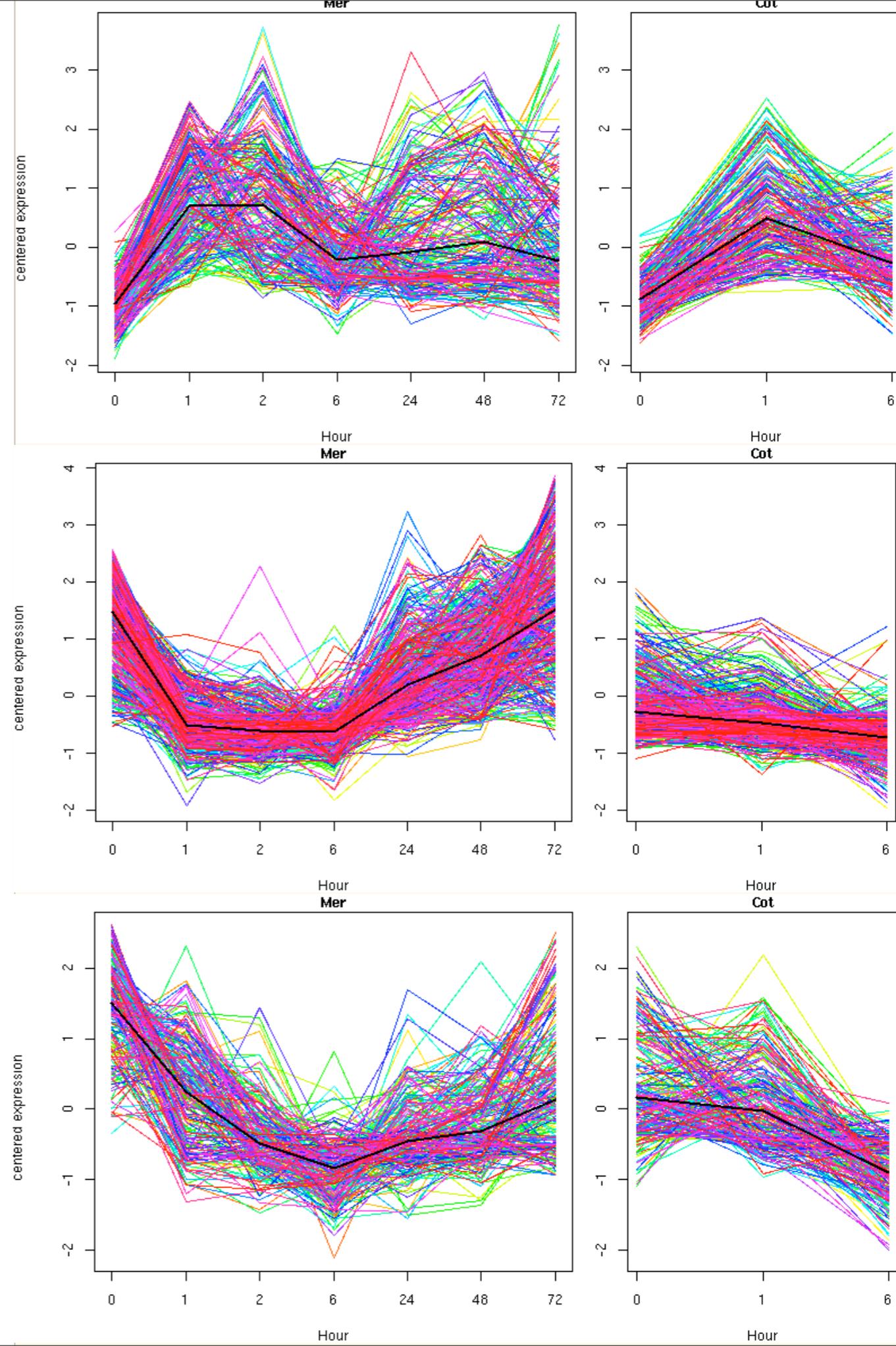


Under-representation

p-value over(under) abundance computed using hypergeometric distribution

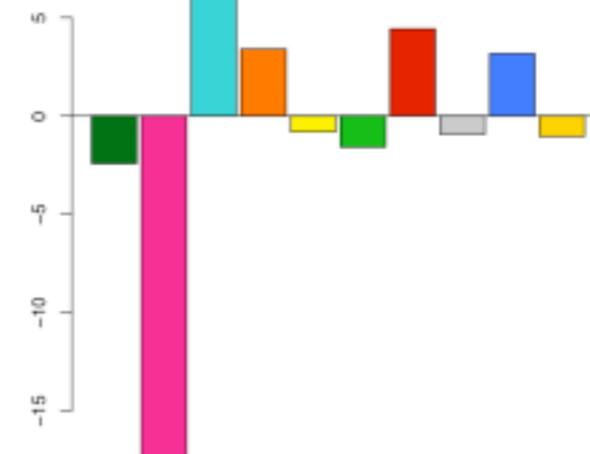
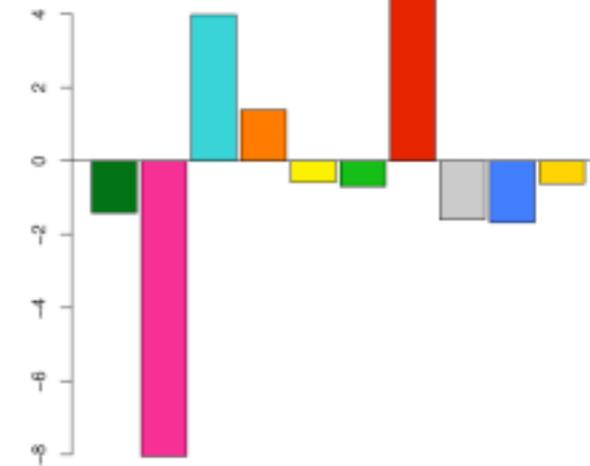
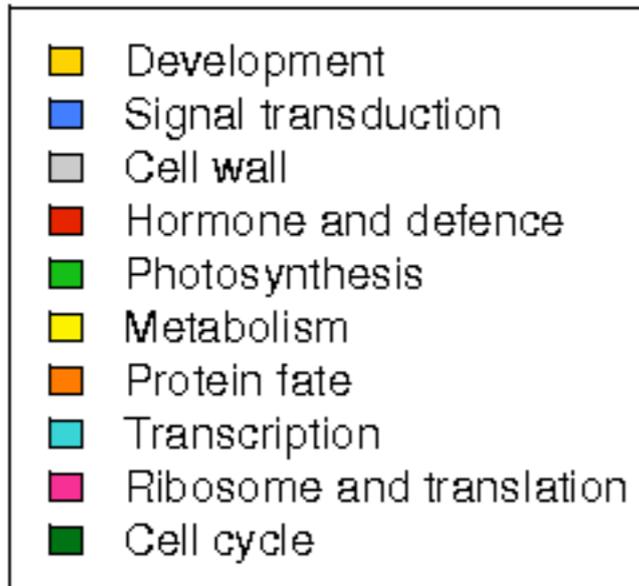
First Phase (0-1 hours)

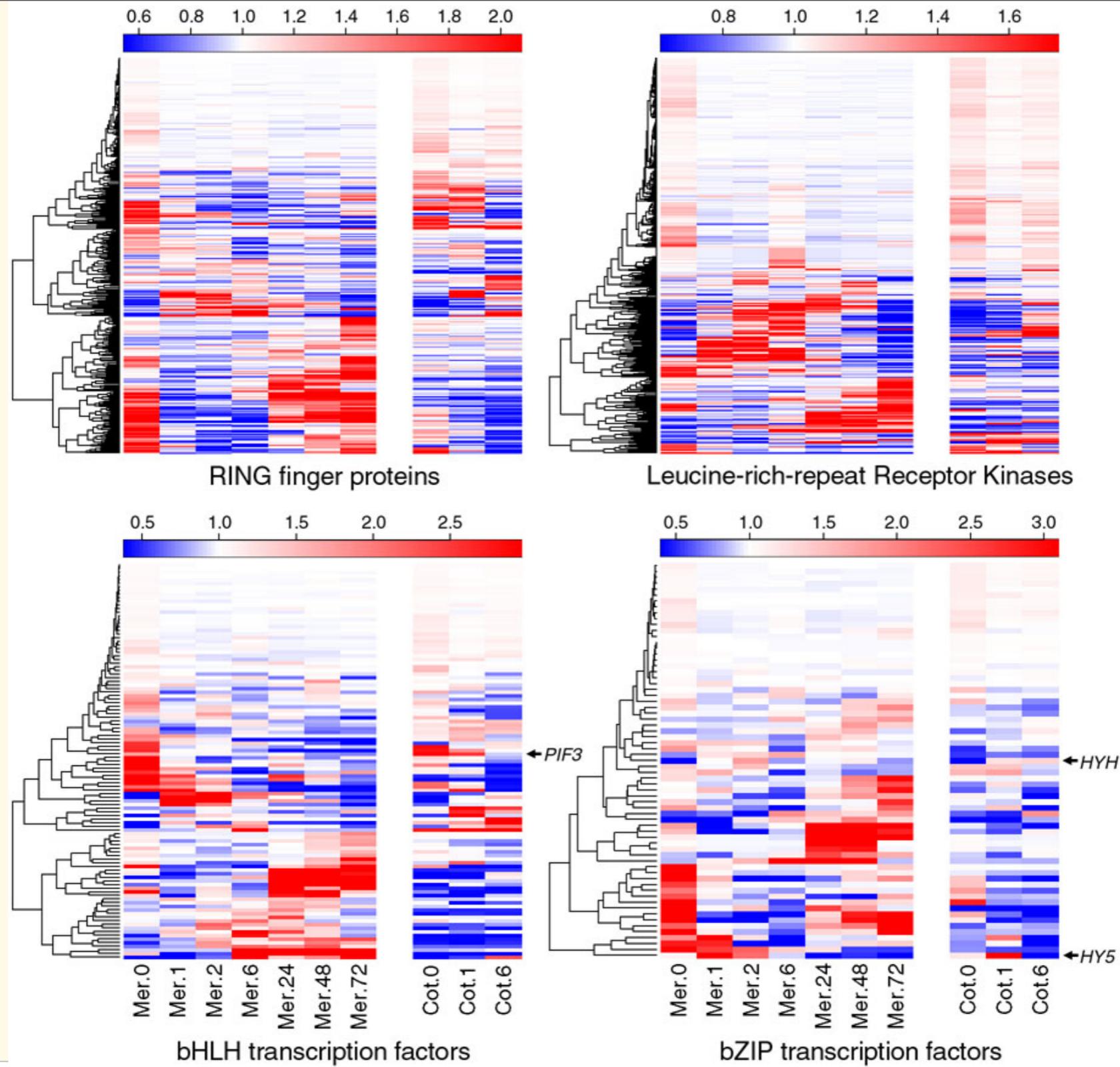
- Transcription Factors (down reg.)
- Ubiquitination, (down reg.)
- Hormones, kinases (up reg.)



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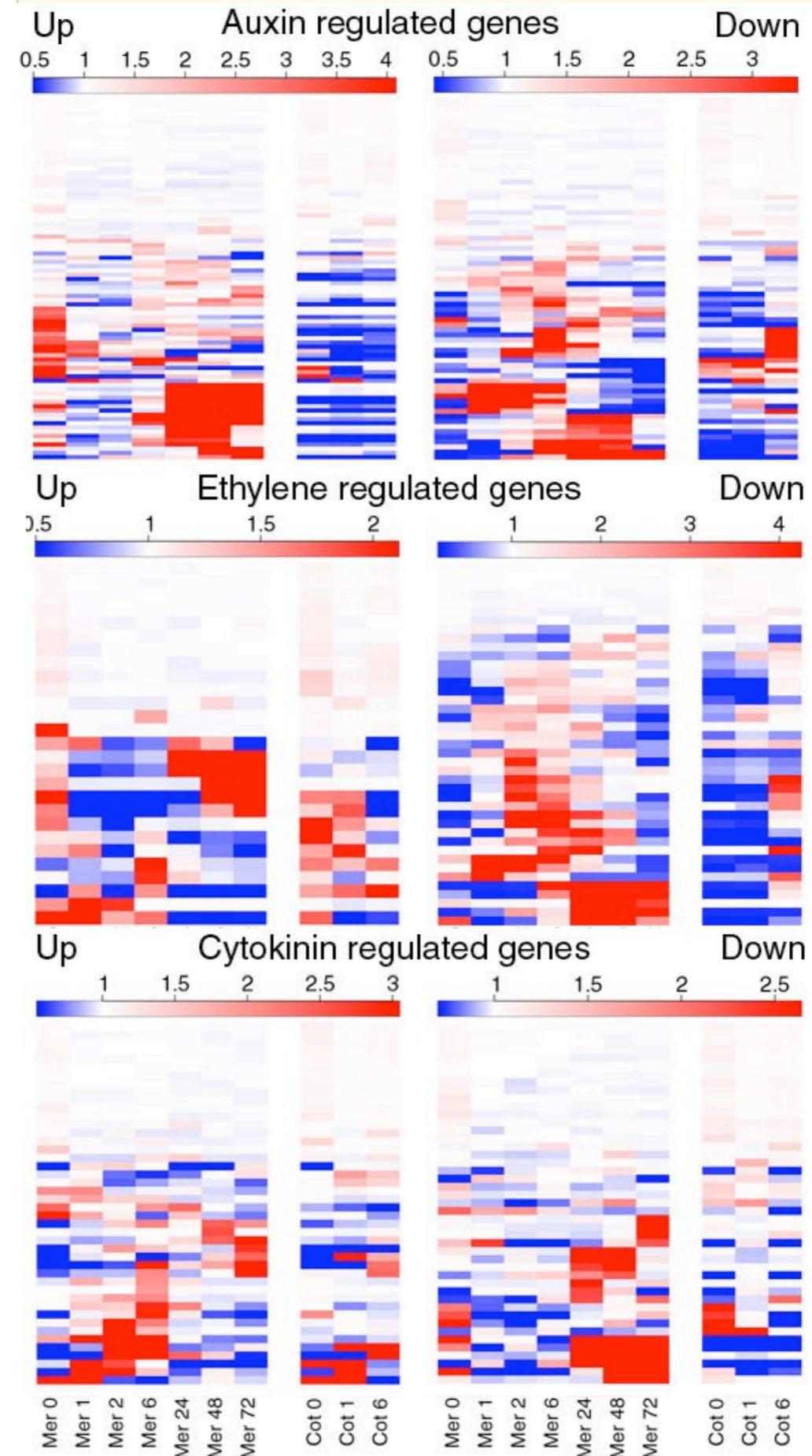


Regulator (?) classes

Including non-selected genes

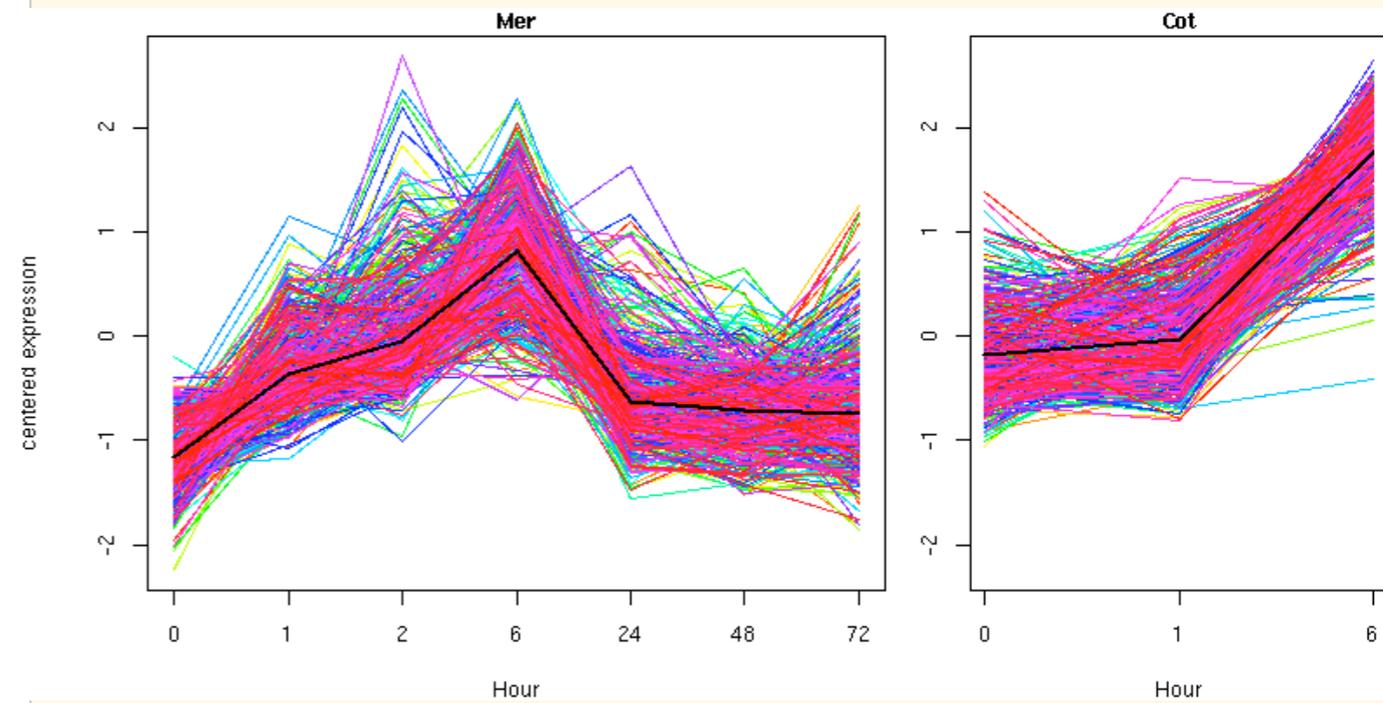
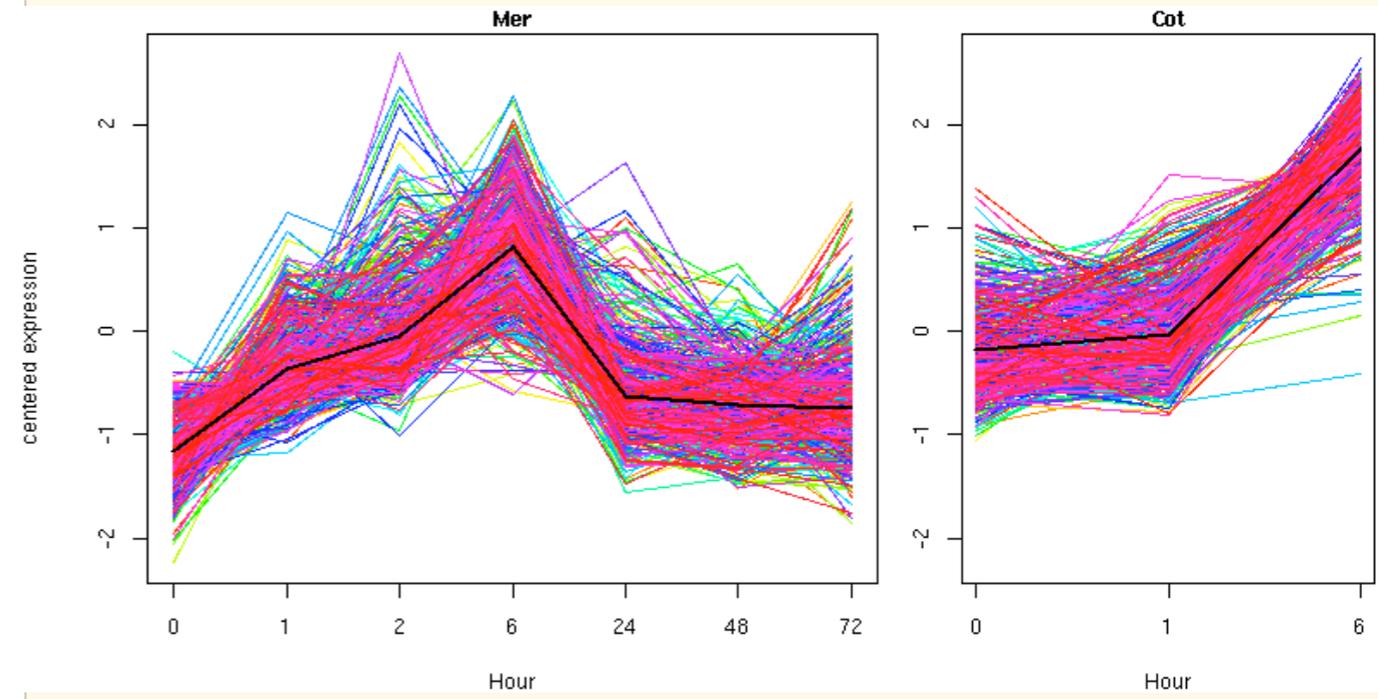
Hormones

- Auxin, Ethylene promote growth (elongation).
- Cytokinin repress elongation.
- Cannot track hormone concs.
- Follow activity of genes regulated by hormones (strictly differentially expressed).
- Auxin, Ethylene “repressed”.
- Cytokinin “promoted”.



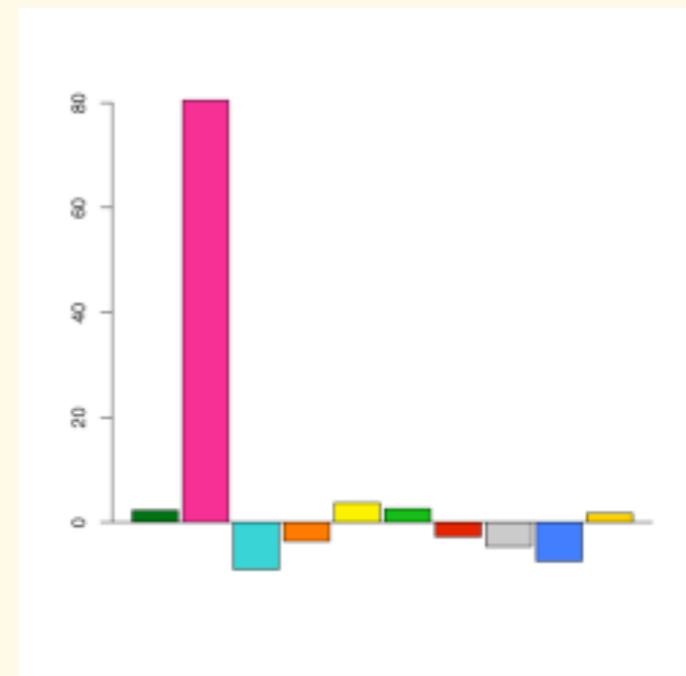
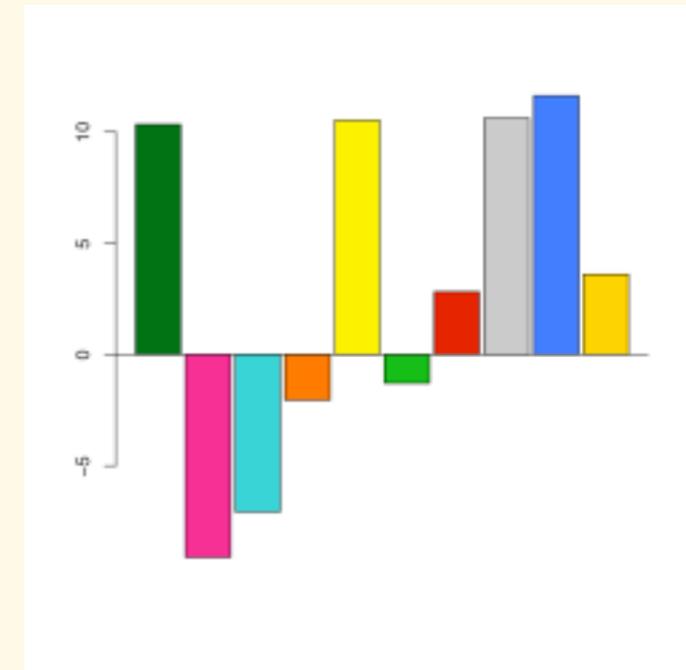
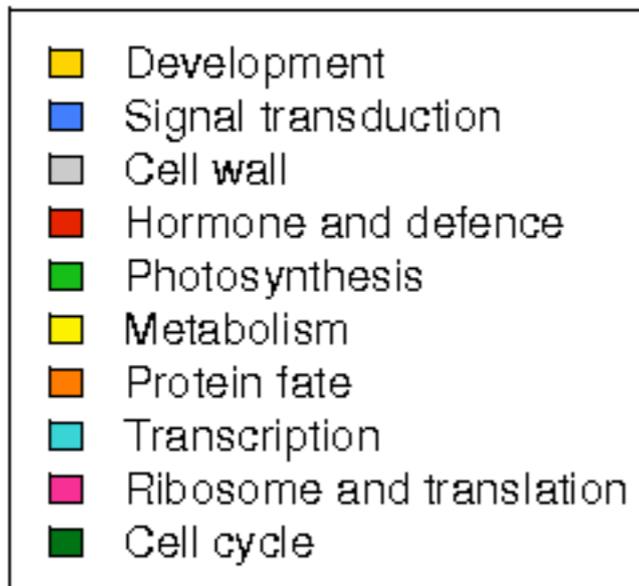
Second Phase (1-24 hours)

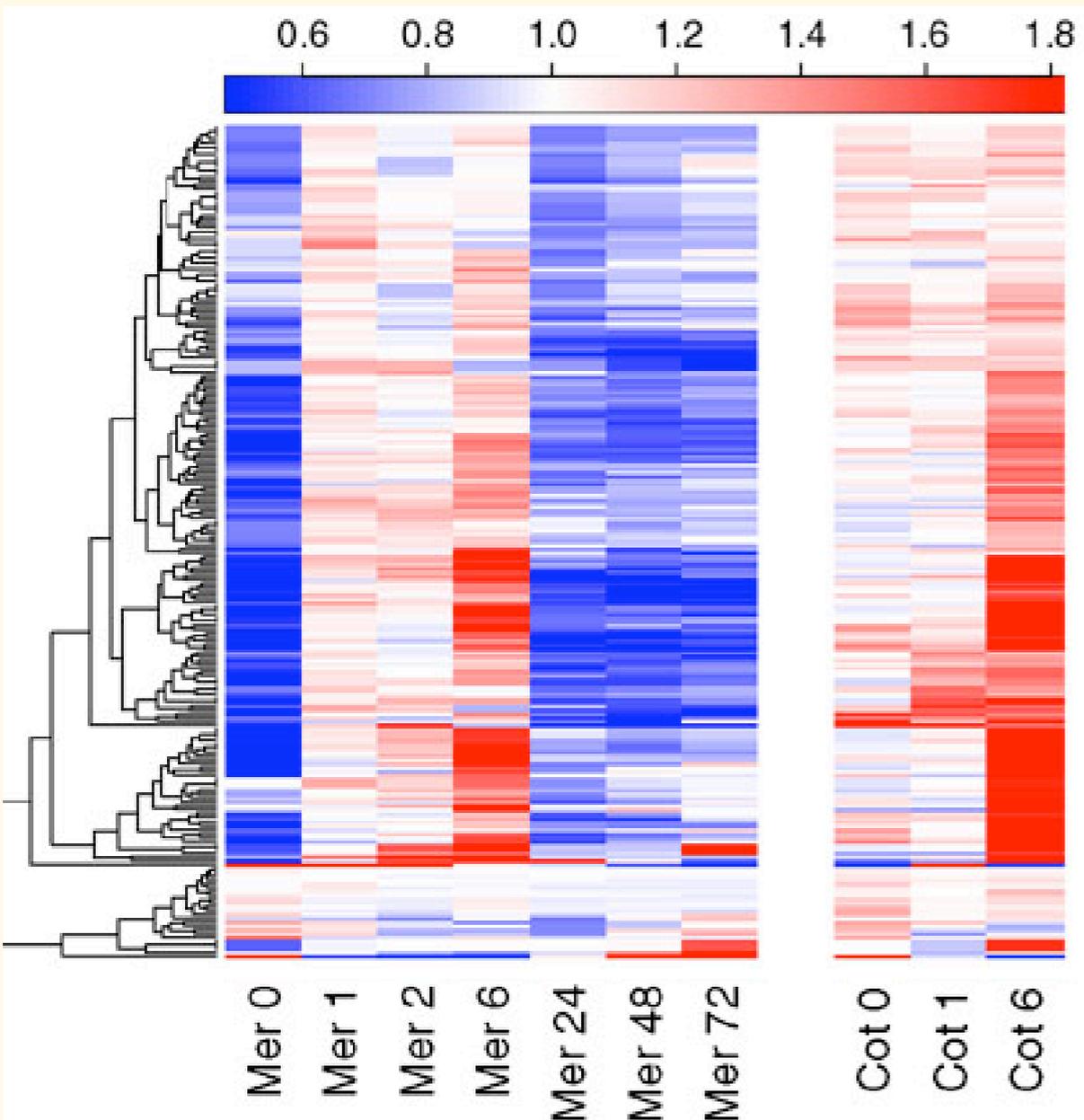
- Ribosomal activity
- cell cycle



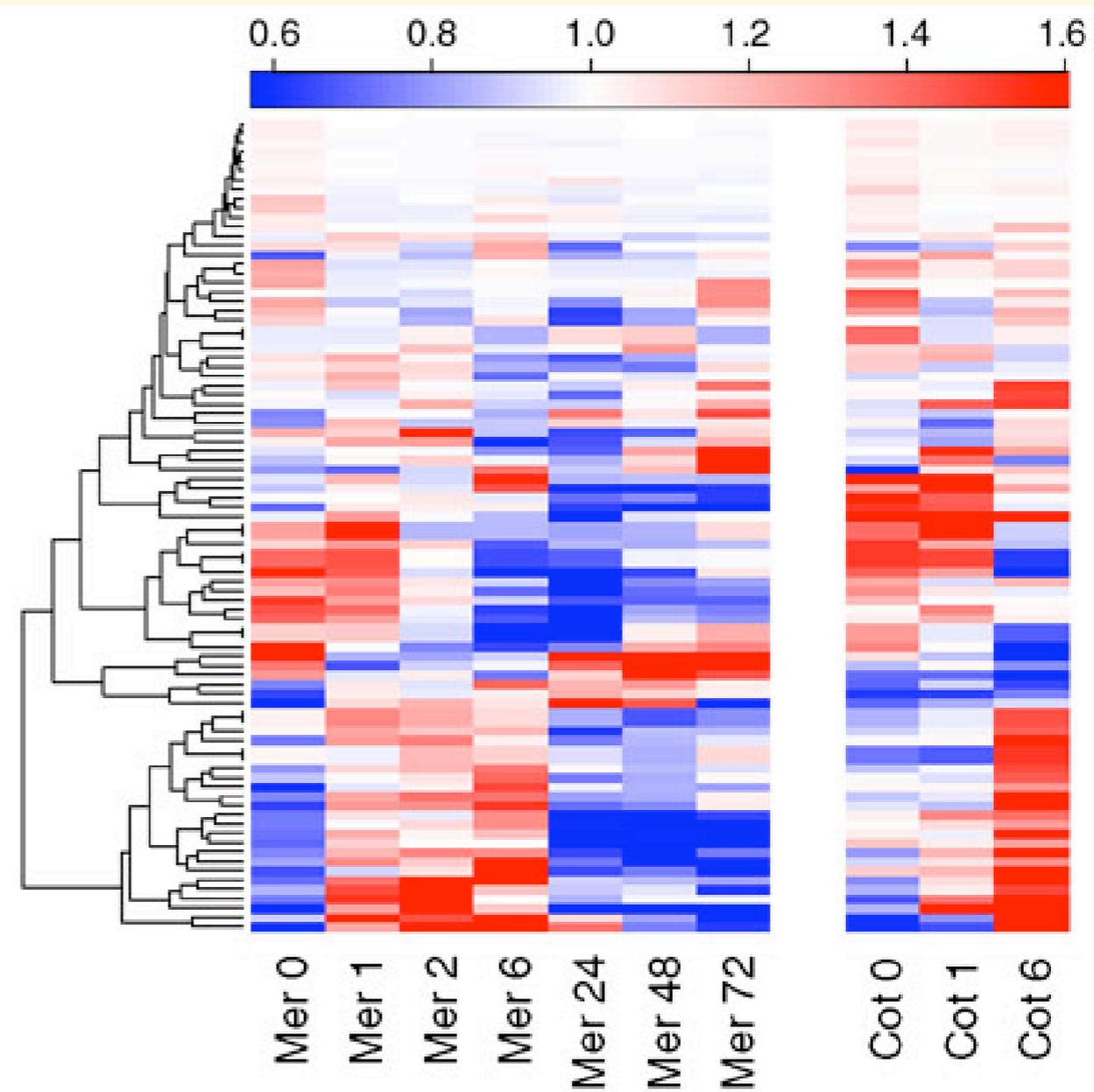
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Ribosomal proteins

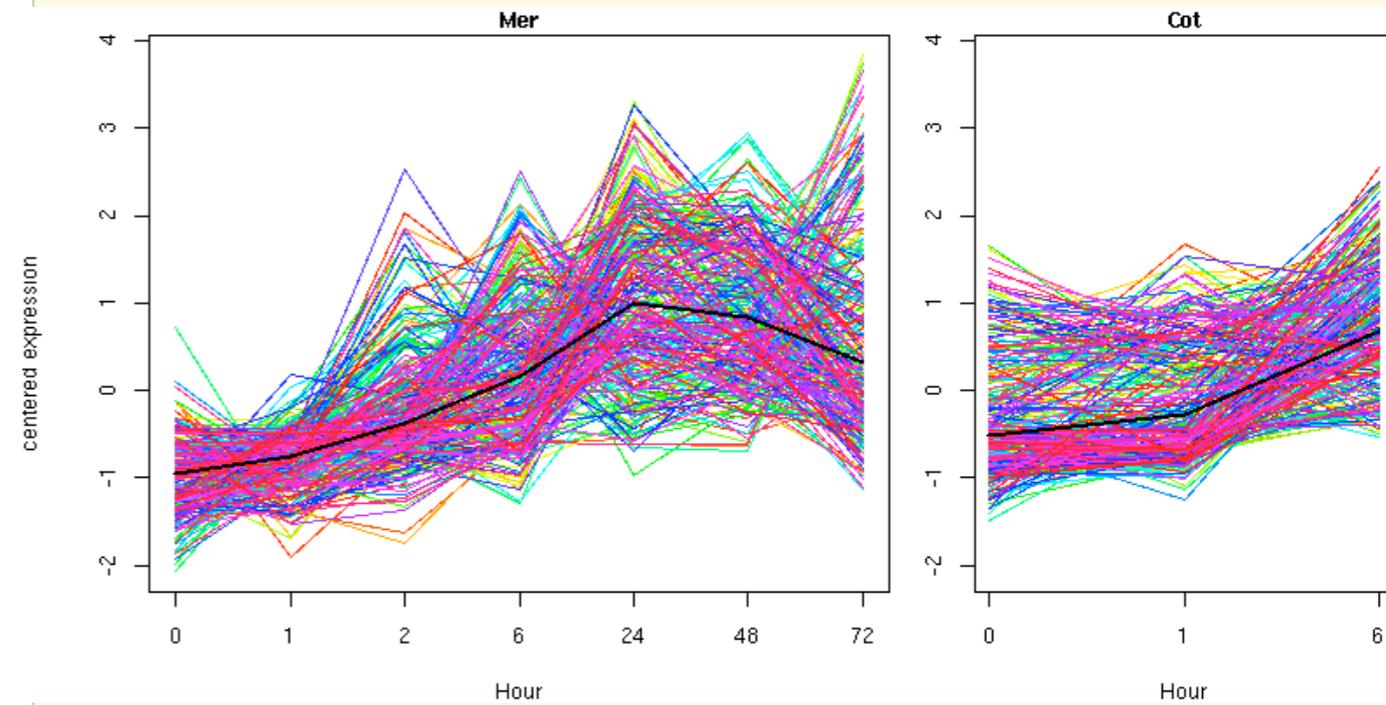
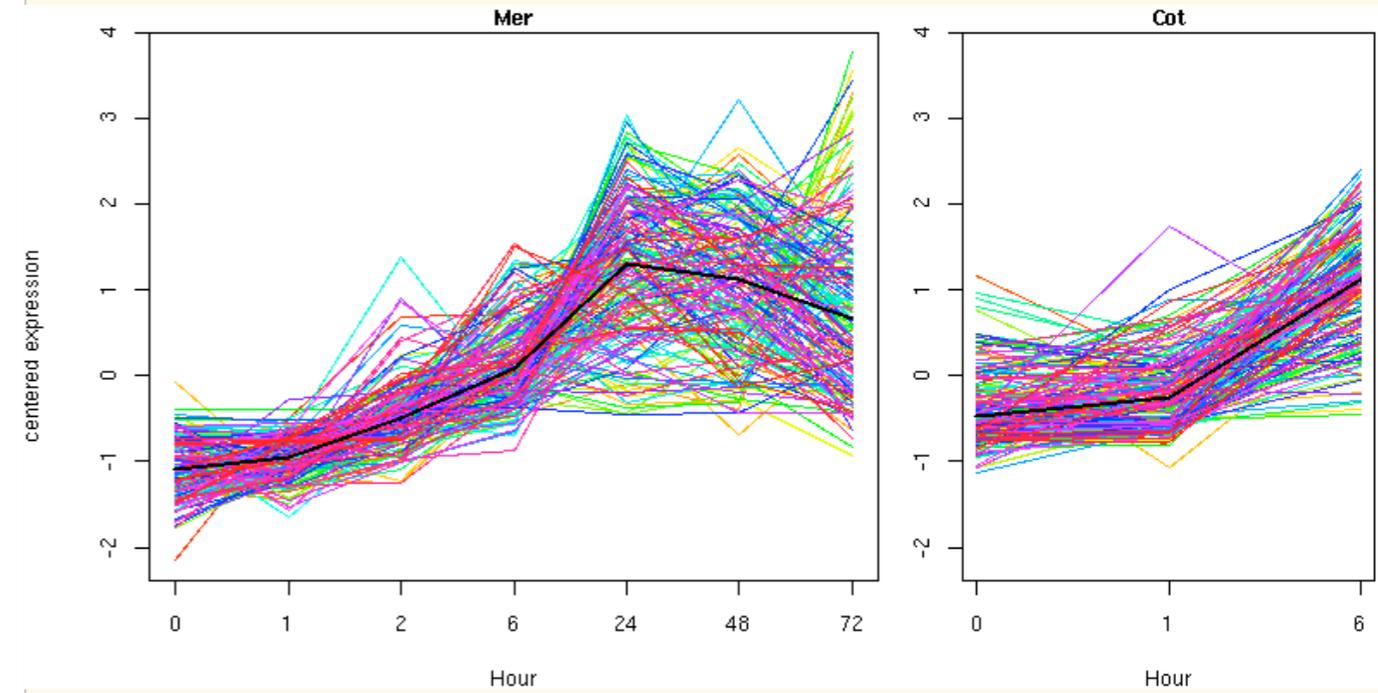


Translation factors

Ribosome working overtime

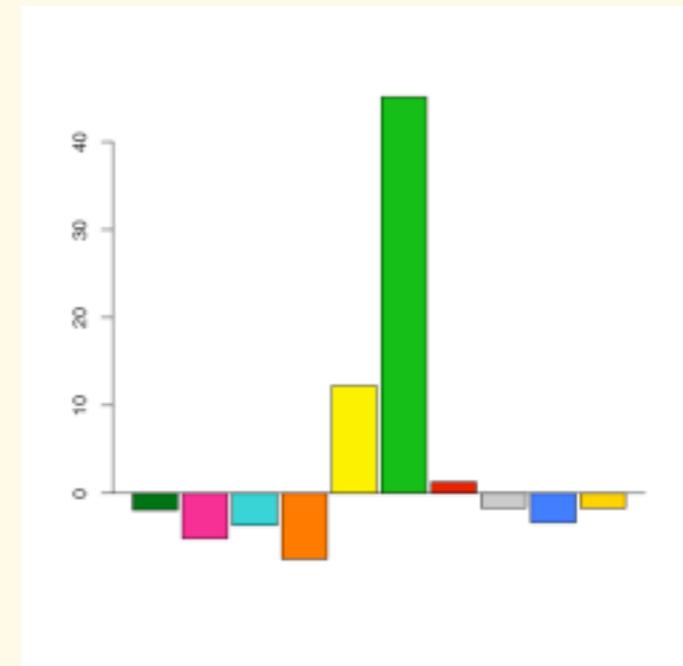
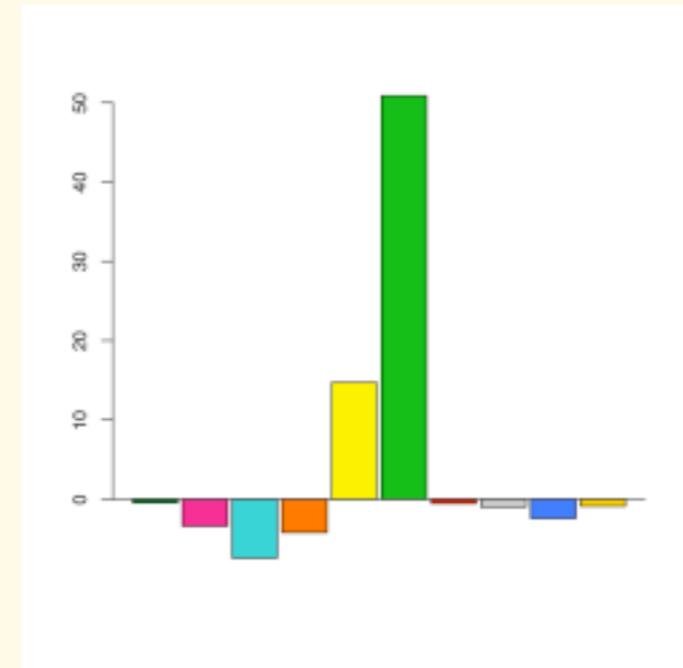
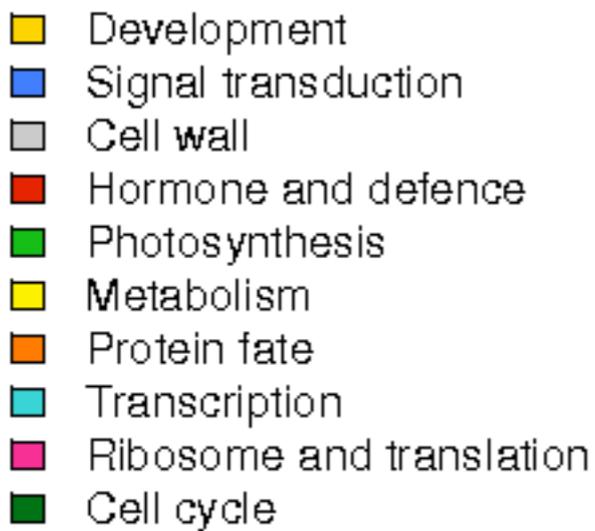
Third Phase (24- hours)

- Photosynthesis
- Cell wall loosening



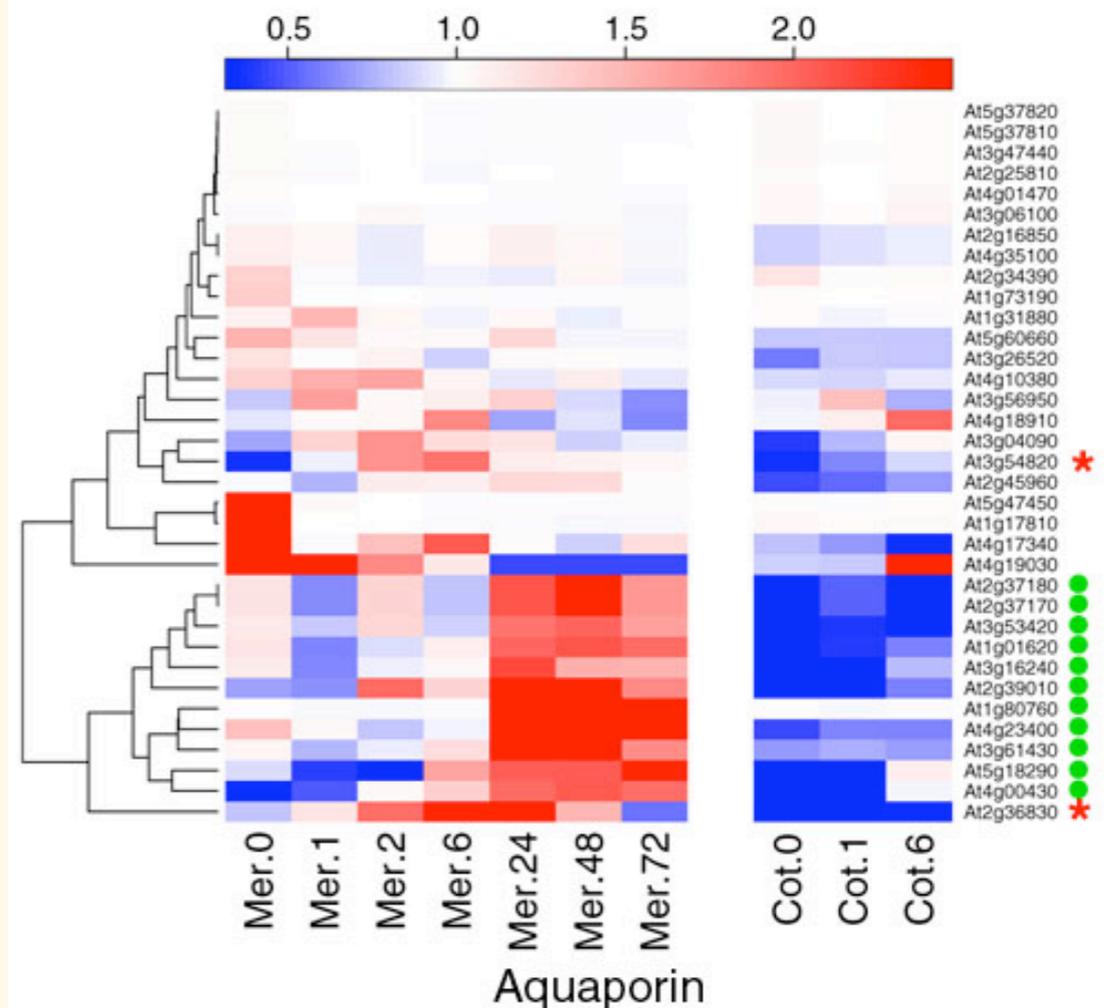
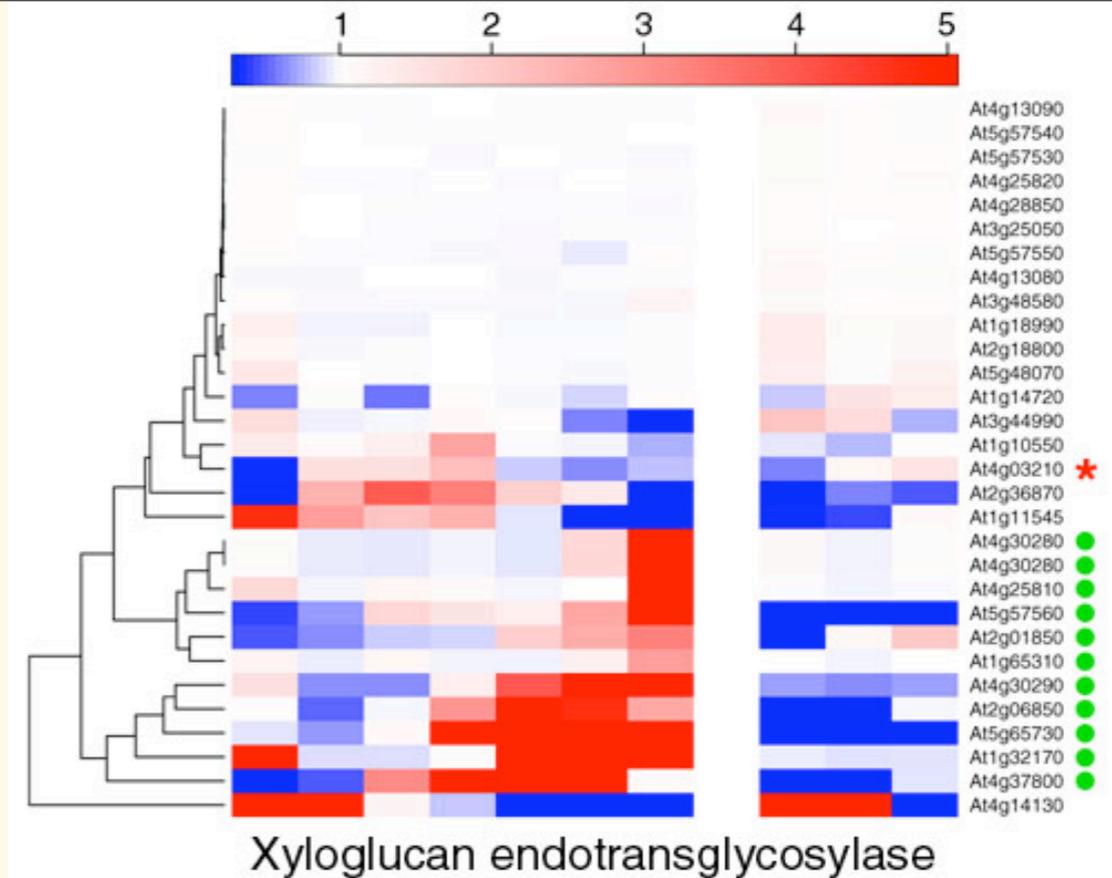
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Cell Wall

- Plant cells have rigid cell walls.
- Expansion implies that cell walls must become less rigid.
- Complicated process between cell wall modification and internal turgor pressure.
- Nonetheless, see late expression in genes controlling this behaviour.



Summary

- After constructing a set of genes which are strictly differentially expressed we find:
- An early burst (0-1 hours after exposure to light) of genes in the meristem that are regulatory in nature and are in general down rather than up-regulated.
- Around 6 hours after exposure to light evidence for cell division and repression of growth.
- At later times, parts of meristem are already starting to behave like leaves and we see growth through expansion rather than division (up-regulation of relevant hormone-related genes, down-regulation of ribosomal genes).
- Promoter searches bear this out :- Abscissic Acid Response Element Motif very common at early times, ribosomal motif at later times.

Lessons learnt

- Selecting the right tissue may be very tedious but well worth the effort.
- Time series data is absolutely crucial in understanding developmental processes.
- In the absence of large co-expression sets for network building
 - Focus on functional classes of genes (GSEA or ANCOVA).
 - Gene Ontology may not be appropriate.
 - Shared known upstream motifs can provide additional evidence.

Acknowledgements

Acknowledgements

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