

Butterfly effect vs. homeostasis: implications in miRNA-guided repression and other gene regulation events

Hervé Seitz

IGH (UMR9002, CNRS and university of Montpellier)

October 19, 2018

Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

DNA  Biological characteristics

Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

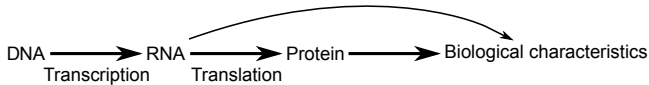
microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data



Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

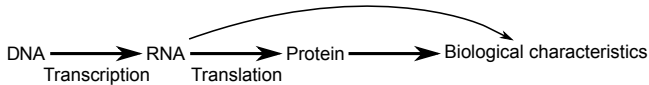
microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data



Paradox: in a pluricellular organism, every cell has (almost) the same DNA, yet various characteristics.

Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

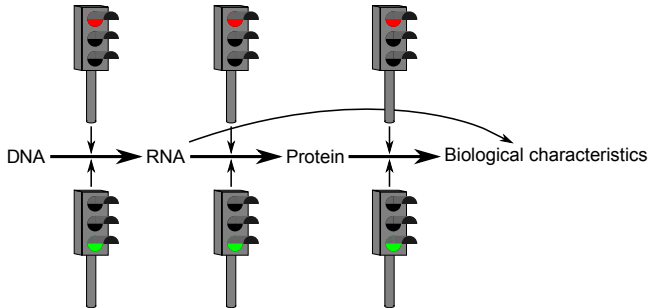
microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data



Paradox: in a pluricellular organism, every cell has (almost) the same DNA, yet various characteristics.

Gene expression regulation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

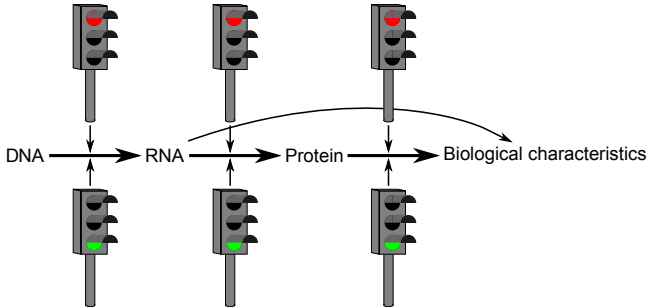
microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data



Paradox: in a pluricellular organism, every cell has (almost) the same DNA, yet various characteristics.

Mechanisms of “gene expression regulation” turn genes on or off in each cell type.

microRNAs

RNAs repressing the expression of other RNAs.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNAs

RNAs repressing the expression of other RNAs.

Specificity: they bind target RNAs by sequence complementarity.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

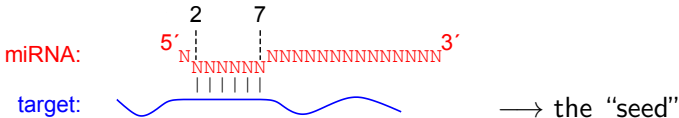
Conclusion

Supplementary
data

microRNAs

RNAs repressing the expression of other RNAs.

Specificity: they bind target RNAs by sequence complementarity.



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

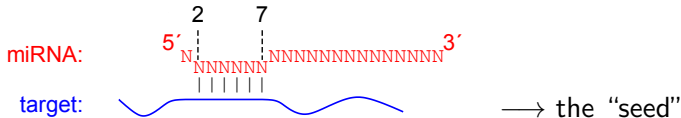
Conclusion

Supplementary
data

microRNAs

RNAs repressing the expression of other RNAs.

Specificity: they bind target RNAs by sequence complementarity.



High throughput experimental methods identify thousands of targets per microRNA.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

The concept of “biological relevance”



(illustration by D. Goodsell, Scripps Research Institute and
Rutgers University)

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

Problem #1: processing and comparing large experimental datasets.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

Problem #1: processing and comparing large experimental datasets.

Problem #2: even if its existence is proven: how important is a molecular interaction?

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

Problem #1: processing and comparing large experimental datasets.

Problem #2: even if its existence is proven: how important is a molecular interaction?



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

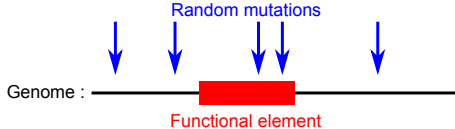
Conclusion

Supplementary
data

How to make sense of big data?

Problem #1: processing and comparing large experimental datasets.

Problem #2: even if its existence is proven: how important is a molecular interaction?



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

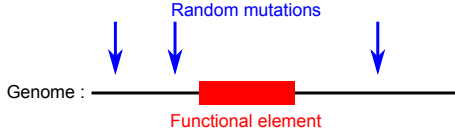
Conclusion

Supplementary
data

How to make sense of big data?

Problem #1: processing and comparing large experimental datasets.

Problem #2: even if its existence is proven: how important is a molecular interaction?



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

The availability of genome sequences profoundly changed the practice of biology:

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

The availability of genome sequences profoundly changed the practice of biology:

- ▶ use *grep* instead of Southern blotting;

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

How to make sense of big data?

The availability of genome sequences profoundly changed the practice of biology:

- ▶ use *grep* instead of Southern blotting;
- ▶ compare genomic sequences to find phylogenetically conserved elements.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

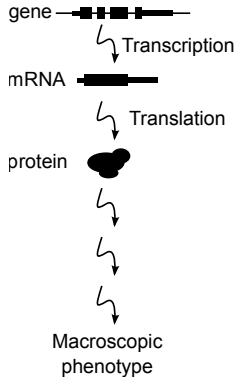
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

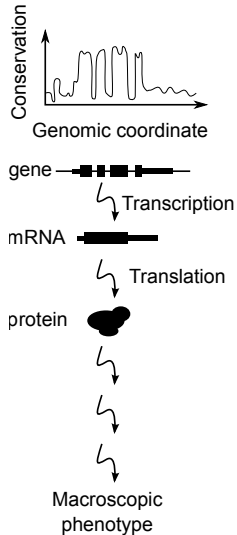
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

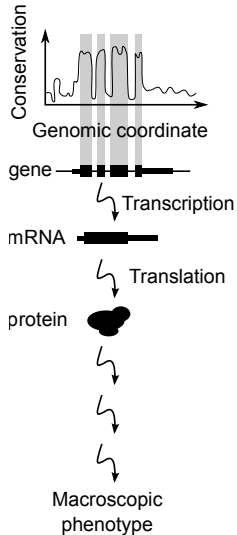
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

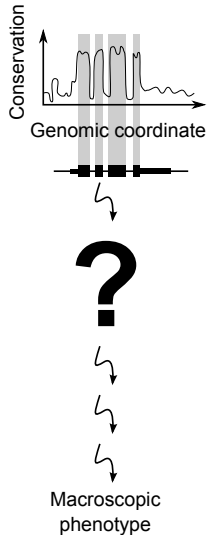
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets


Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

miRNA: 5' N NNNNNN NNNNNNNNNNNNNN 3'

target:  → the “seed”

Making sense of big data

Comparative genomics

microRNA target prediction

Robustness of predicted targets

Comparative genomics yield false positives

Conclusion

microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

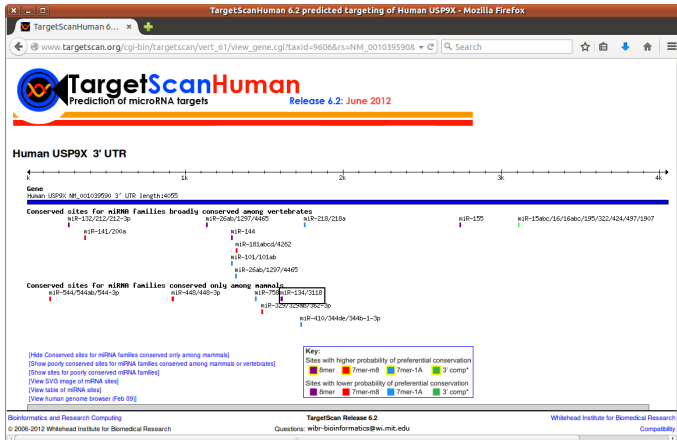
microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data



microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Such short matches are very frequent (60 % of human coding genes seem to be targeted: Friedman *et al.*, 2009).

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Such short matches are very frequent (60 % of human coding genes seem to be targeted: Friedman *et al.*, 2009).

Gene regulation by
microRNAsMaking sense of
big dataComparative
genomicsmicroRNA target
predictionRobustness of
predicted targetsComparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Such short matches are very frequent (60 % of human coding genes seem to be targeted: Friedman *et al.*, 2009).

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Such short matches are very frequent (60 % of human coding genes seem to be targeted: Friedman *et al.*, 2009).

⇒ miRNAs are implicated in every physiological process in animals.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

microRNA target prediction

Computational programs for target prediction: look for seed matches in 3' UTRs, select the ones that were conserved in evolution.

Such short matches are very frequent (60 % of human coding genes seem to be targeted: Friedman *et al.*, 2009).

⇒ miRNAs are implicated in every physiological process in animals.

miRNA-mediated repression is very modest (usually < 2-fold): lower than well tolerated fluctuations in gene expression (e.g., haplosufficiency). Why have these sites been conserved if they are not functional?

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

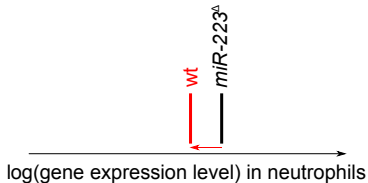
Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Robustness of predicted targets

miR-223 in mouse neutrophils.



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

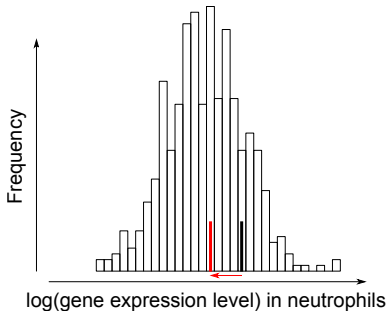
Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Robustness of predicted targets

miR-223 in mouse neutrophils.



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

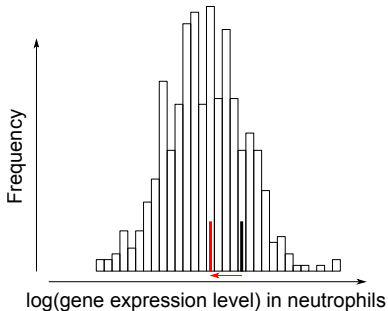
Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Robustness of predicted targets

miR-223 in mouse neutrophils.



For 150 predicted targets out of 192: inter-individual variability among 5 wild-type mice is larger than miRNA-mediated repression.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

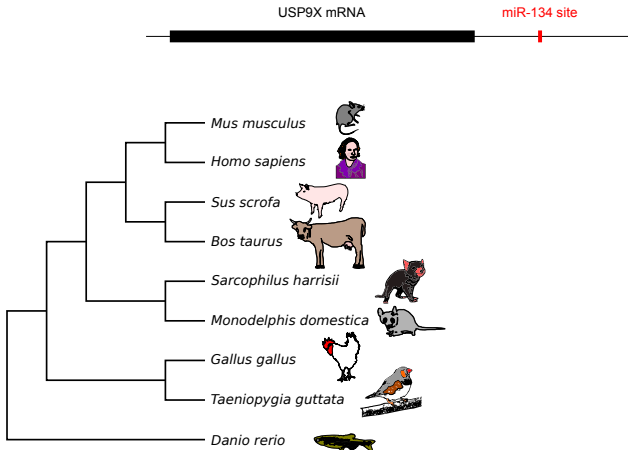
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

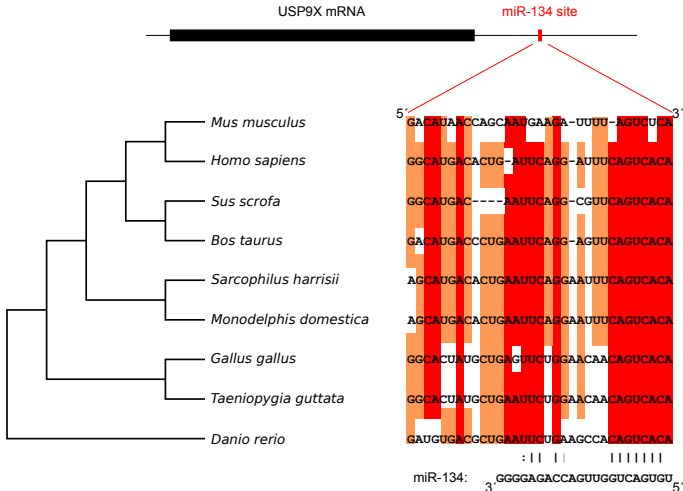
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives



■ : conserved in 8 or 9 species out of 9 ■ : conserved in 6 or 7 species out of 9 □ : conserved in less than 6 species out of 9

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

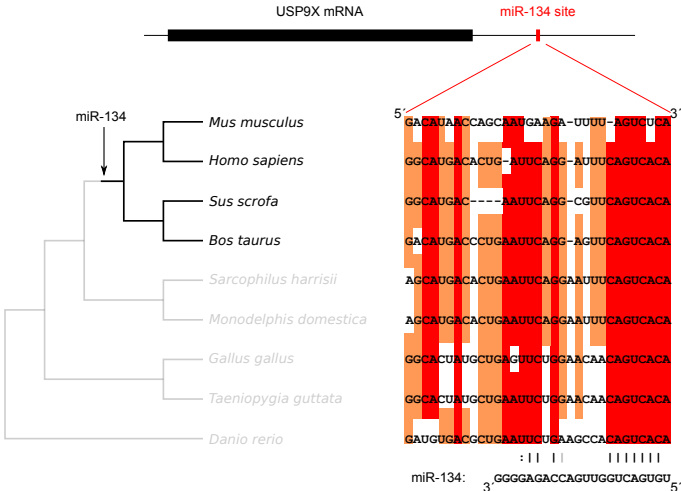
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives



■ : conserved in 8 or 9 species out of 9 ■ : conserved in 6 or 7 species out of 9 □ : conserved in less than 6 species out of 9

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

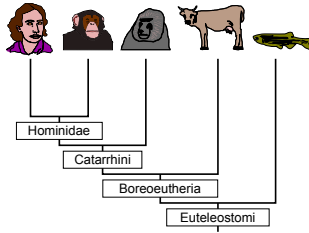
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

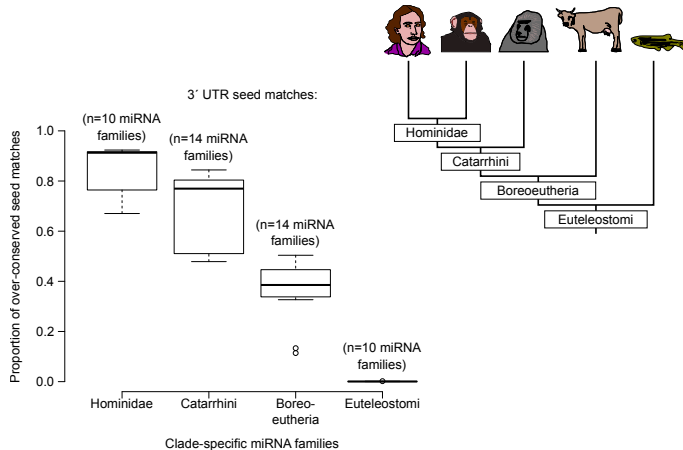
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Comparative genomics yield false positives



► Comparison to prediction programs

► Effect of tree architecture

Conclusion: revisiting microRNA target definition

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Conclusion: revisiting microRNA target definition

Every measurable change in gene expression does not translate into a macroscopic, evolutionarily selectable phenotype.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Conclusion: revisiting microRNA target definition

Every measurable change in gene expression does not translate into a macroscopic, evolutionarily selectable phenotype.

Among the (many !) predicted targets: finding those that are responsible for visible phenotypes.

Conclusion: revisiting “gene regulation” definition

High-throughput identification of transcription factor or RNA-binding protein targets: thousands of genes are bound, many of them are not under selective pressure to keep these binding sites.

► [Supplementary data](#)

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Conclusion: revisiting “gene regulation” definition

High-throughput identification of transcription factor or RNA-binding protein targets: thousands of genes are bound, many of them are not under selective pressure to keep these binding sites.

► [Supplementary data](#)

Microscopic events which are neutral in evolutionary terms.

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Conclusion: revisiting “gene regulation” definition

High-throughput identification of transcription factor or RNA-binding protein targets: thousands of genes are bound, many of them are not under selective pressure to keep these binding sites.

► [Supplementary data](#)

Microscopic events which are neutral in evolutionary terms.

A central feature of biological systems: their robustness to external insults. Hard to reconcile with the extreme sensitivity required for fine-tuning (the “butterfly effect” has probably been counter-selected).

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Acknowledgements

Anna
Sergeeva:



Laura
Martinez:



Blaise
Li:



Natalia
Pinzón:



Isabelle
Busseau:



Sophie
Mockly:



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Acknowledgements

Anna
Sergeeva:



Laura
Martinez:



Blaise
Li:



Natalia
Pinzón:



Isabelle
Busseau:



Sophie
Mockly:



Jessy Presumey and Florence Apparailly (INM, Montpellier)

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Acknowledgements

Anna
Sergeeva:



Laura
Martinez:



Blaise
Li:



Natalia
Pinzón:



Isabelle
Busseau:



Sophie
Mockly:



Jessy Presumey and Florence Apparailly (INM, Montpellier)



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Supplementary data

Introduction:

- ▶ Mechanism of target repression

Results:

- ▶ Robustness of biological pathways
- ▶ Over-conserved sites in prediction programs

Conclusion:

- ▶ Pseudo-targets for other regulators?
- ▶ Propagation of gene expression perturbation

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

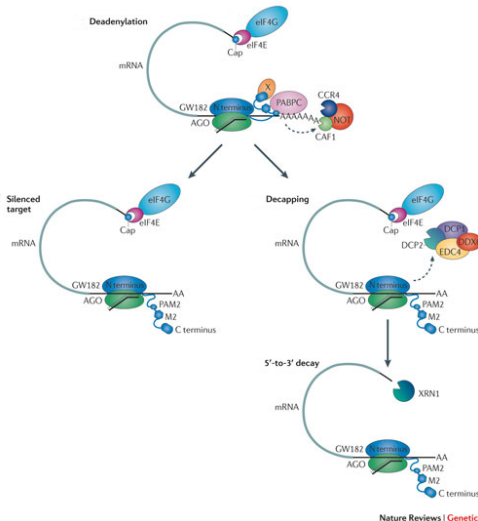
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

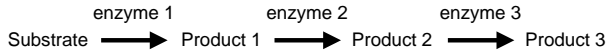
Supplementary
data

miRNA target repression



(adapted from Huntzinger and Izaurralde, 2011)

Biological robustness



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

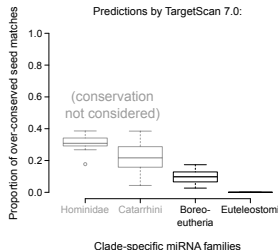
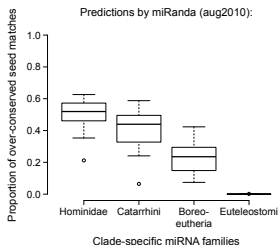
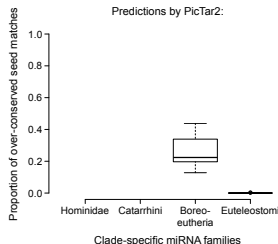
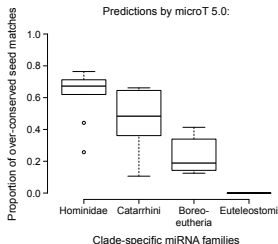
Robustness of
predicted targets

Comparative
genomics yield
false positives

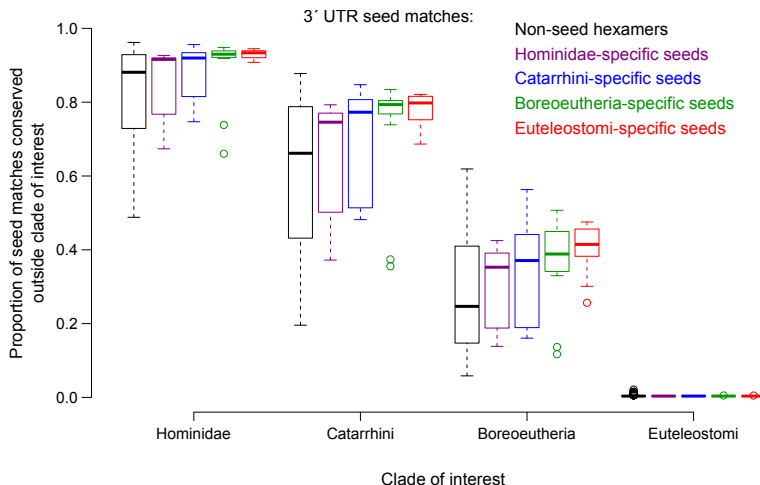
Conclusion

Supplementary
data

Over-conservation in prediction programs



Effect of tree architecture



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Pseudo-targets for other regulators?

- ▶ Transcription factors: experimentally identified binding sites are poorly conserved among vertebrates (Odom *et al.*, 2007 and Schmidt *et al.*, 2010).

Pseudo-targets for other regulators?

- ▶ Transcription factors: experimentally identified binding sites are poorly conserved among vertebrates (Odom *et al.*, 2007 and Schmidt *et al.*, 2010).
- ▶ RNA-binding proteins are poorly specific (thousands of experimentally validated targets for each analyzed protein: Hafner *et al.*, 2010; Lebedeva *et al.*, 2011 and Hafner *et al.*, 2013).

Pseudo-targets for other regulators?

- ▶ Transcription factors: experimentally identified binding sites are poorly conserved among vertebrates (Odom *et al.*, 2007 and Schmidt *et al.*, 2010).
- ▶ RNA-binding proteins are poorly specific (thousands of experimentally validated targets for each analyzed protein: Hafner *et al.*, 2010; Lebedeva *et al.*, 2011 and Hafner *et al.*, 2013).

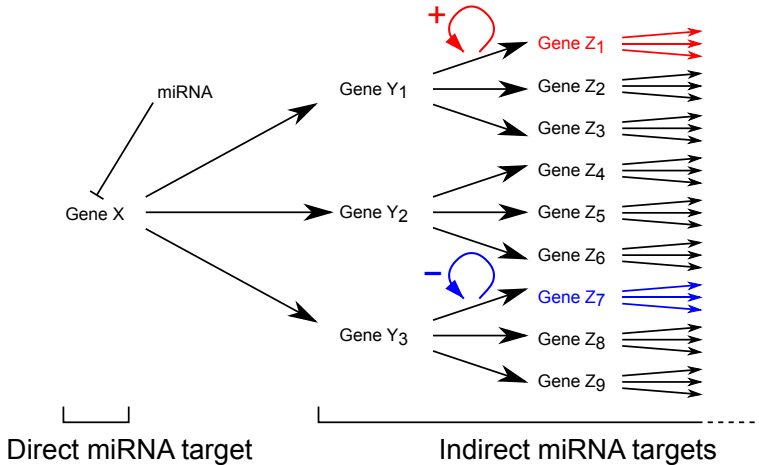
Real molecular events, which are neutral in evolutionary terms?

Gene regulation by
microRNAsMaking sense of
big dataComparative
genomicsmicroRNA target
predictionRobustness of
predicted targetsComparative
genomics yield
false positives

Conclusion

Supplementary
data

Propagation of gene expression perturbation



Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

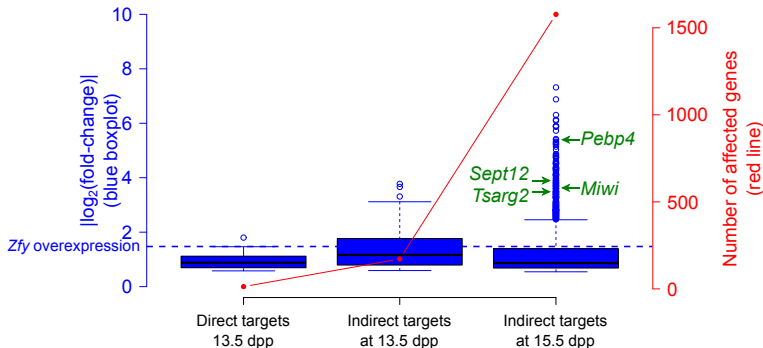
Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data

Propagation of gene expression perturbation



(in collaboration with H. Royo and J. Turner, MRC, London)

Gene regulation vs.
homeostasis

Gene regulation by
microRNAs

Making sense of
big data

Comparative
genomics

microRNA target
prediction

Robustness of
predicted targets

Comparative
genomics yield
false positives

Conclusion

Supplementary
data