Supplementary material

Computational insights on the molecular mechanisms across breast cancer progression combining gene differential expression and co-expression *

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Abstract

As a complex disease with mechanisms that are not fully understood, breast cancer pathology and progression is expected to be determined not only by individual genes, but also by their coordinated effects though a more systemic framework. In this contribution, we combine gene differential analysis (single gene view) with gene co-expression analysis (systemic view) to provide insights on the implicated molecular mechanisms across breast cancer progression. Important gene-gene links in a gene coexpression network are identified and clustered with DeDiCo algorithm, which has been recently published by members of our groups. This algorithm presents very good performance regarding its accuracy on both synthetic and real-life datasets and ability to determine arbitrarily shaped clusters without any assumptions on the shape and the number of the clusters. This work provides a pipeline, exploiting a novel clustering algorithm, in order to analyse gene-gene links based on their co-expression relationships and gene differential analysis across breast cancer progression stages. Existing bibliography verifies the validity of the resulted clusters while exclusive pathways per breast cancer stage as well as a common pathway signature across all breast cancer stages are reported and proper discussion takes place.

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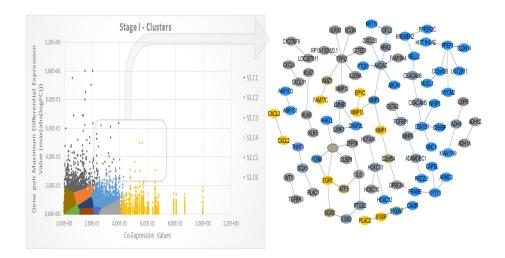


Figure 1: Stage I: Scatterplot regarding the gene-pair maximum differential expression value vs gene-pair co-expression value. A rectangular region in this scatterplot with down-left corner at (Dif.Expr. Threshold, Coexpr.Threshold) = (0.25, 0.25) includes the best gene-gene links of simultaneous high co-expression and dif. expression values. The small network pieces that correspond to these links are embedded in a picture-in-picture mode.

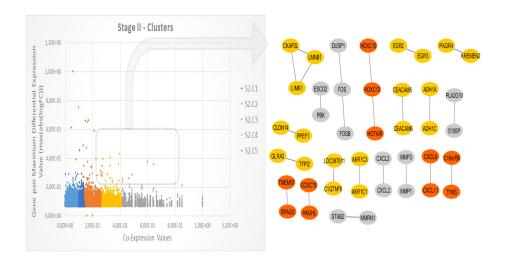


Figure 2: Stage II: Scatterplot regarding the gene-pair maximum differential expression value vs gene-pair co-expression value. A rectangular region in this scatterplot with down-left corner at (Dif.Expr. Threshold, Coexpr.Threshold) = $(0.25,\,0.25)$ includes the best gene-gene links of simultaneous high co-expression and dif. expression values. The small network pieces that correspond to these links are embedded in a picture-in-picture mode.

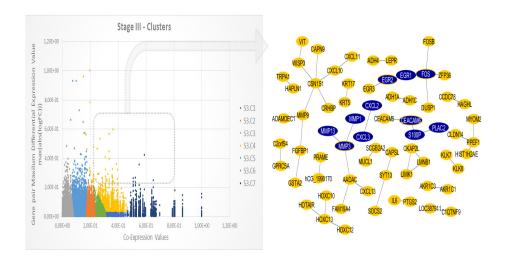


Figure 3: Stage III: Scatterplot regarding the gene-pair maximum differential expression value vs gene-pair co-expression value. A rectangular region in this scatterplot with down-left corner at (Dif.Expr. Threshold, Coexpr.Threshold) = (0.25, 0.25) includes the best gene-gene links of simultaneous high co-expression and dif. expression values. The small network pieces that correspond to these links are embedded in a picture-in-picture mode.

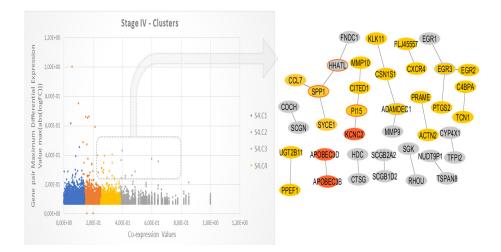


Figure 4: Stage IV: Scatterplot regarding the gene-pair maximum differential expression value vs gene-pair co-expression value. A rectangular region in this scatterplot with down-left corner at (Dif.Expr. Threshold, Coexpr.Threshold) = (0.25, 0.25) includes the best gene-gene links of simultaneous high co-expression and dif. expression values. The small network pieces that correspond to these links are embedded in a picture-in-picture mode.