# Co-expression Network Analysis of the Developing Human Brain Implicates Synaptogenesis and Mitochondrial Function as Central Mechanisms in Autism

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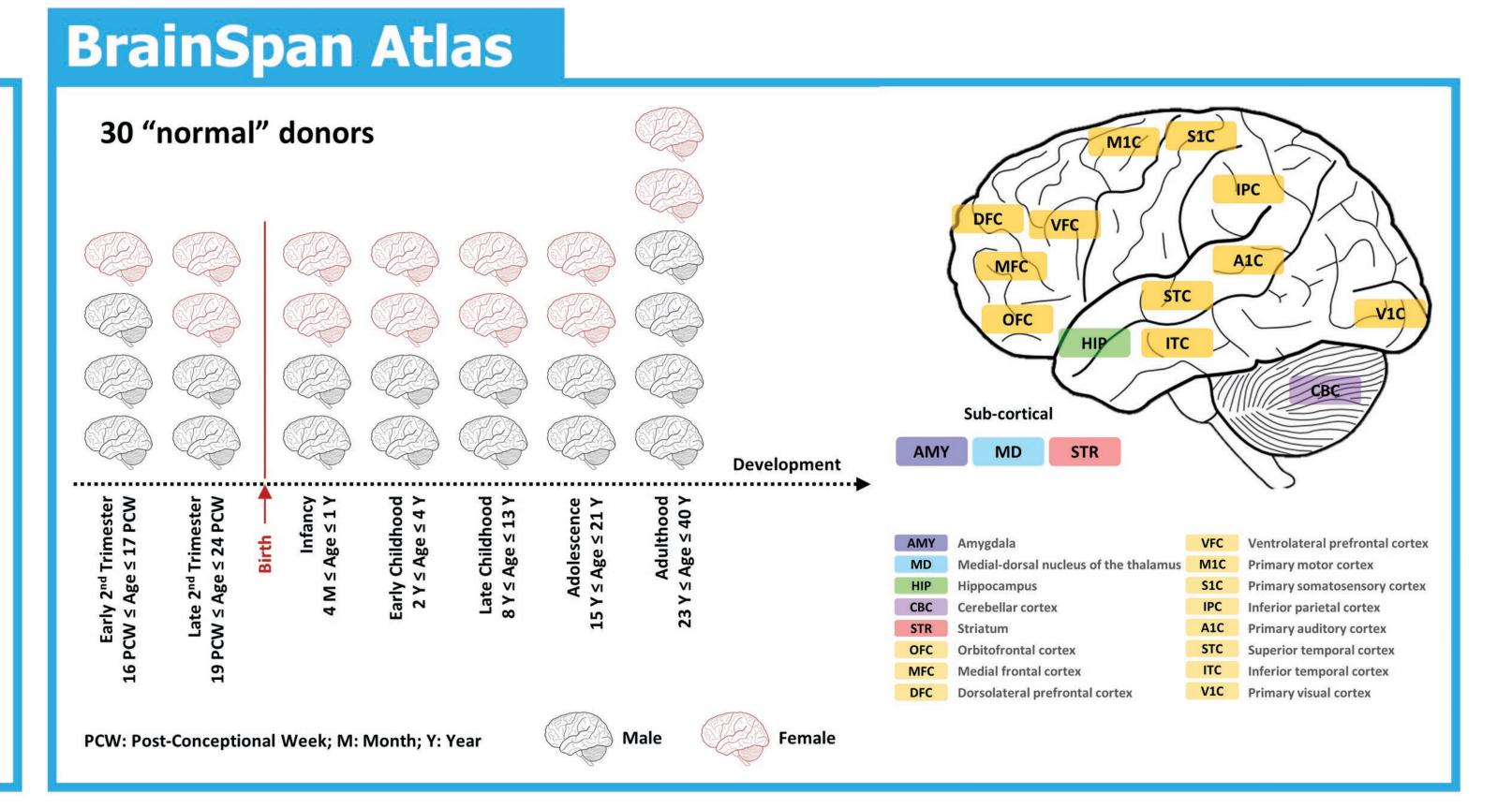
#### Summary

We analyzed the spatial-temporal co-expression relationships of 455 genes previously implicated in Autism spectrum disorder (ASD) using the BrainSpan transcriptome atlas. Understanding how the heterogenous set of ASD-related genes contribute to normal brain development helps identifying cellular/molecular processes which are commonly disrupted in ASD.

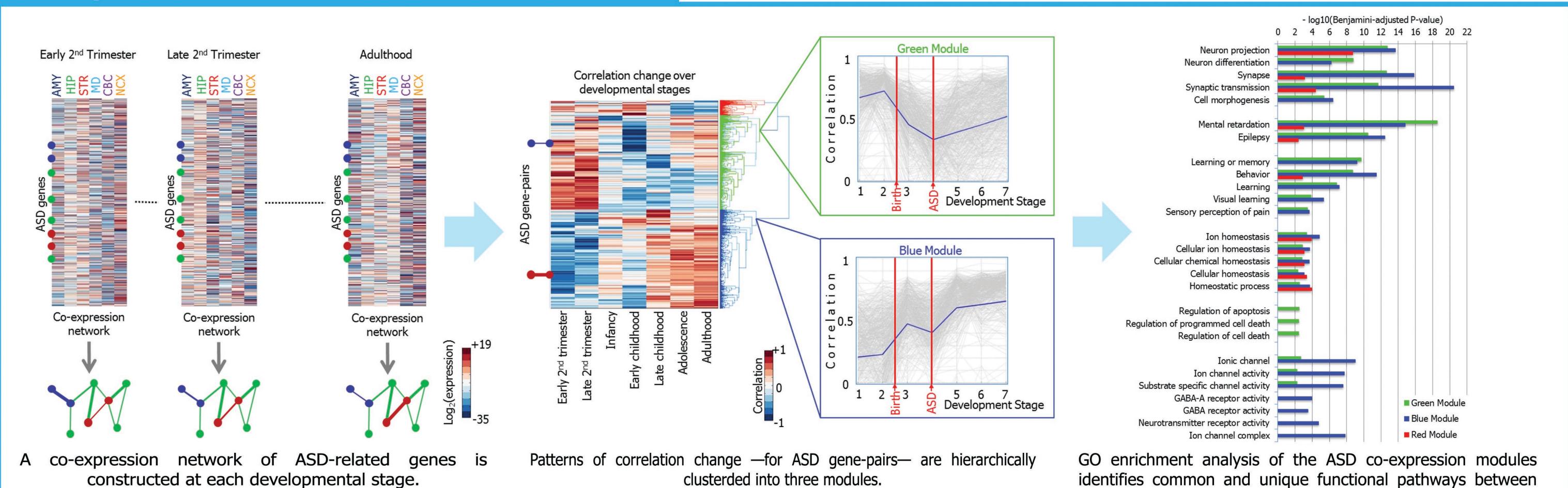
*First,* we discovered modules among ASD candidates with biologically relevant temporal co-expression dynamics. These modules were related to the processes of synaptogenesis, apoptosis, and the neurotransmitter γ-aminobutyric acid (GABA).

**Second**, we created a transcriptome-wide co-expression network to discover significant Molecular Interaction Modules, and demonstrated that ASD candidate genes are enriched in modules related to the processes of synaptogenesis, mitochondrial function, protein translation, and ubiquitination.

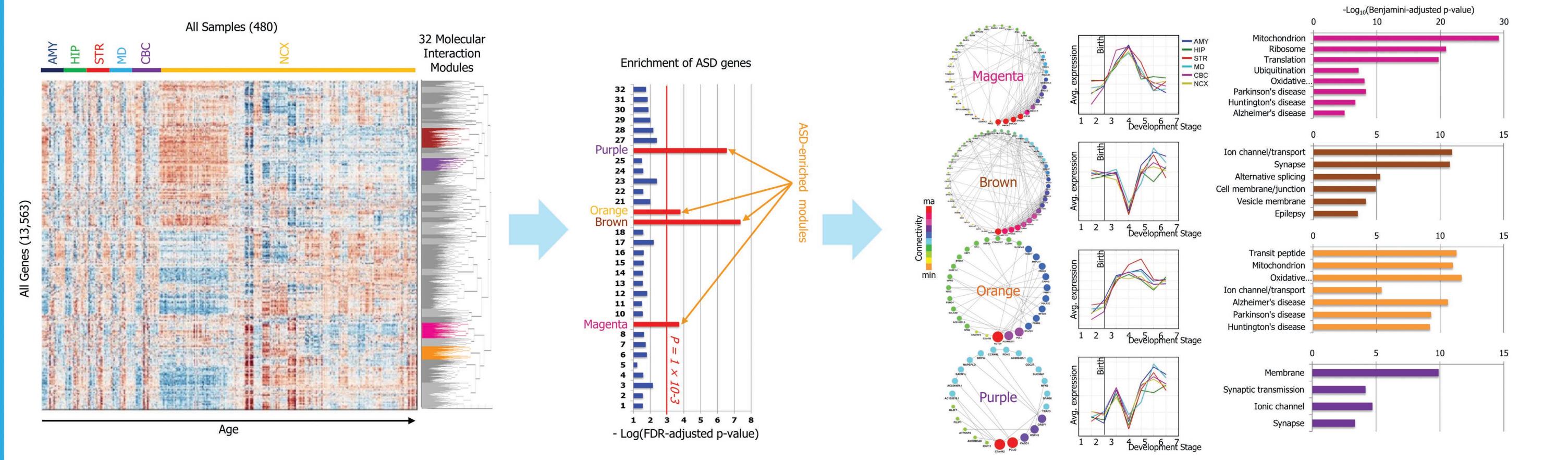
Finally, we identified hub genes within the ASD-enriched Molecular Interaction Modules, which may serve as additional ASD candidate genes, potential biomarkers, or therapeutic targets.



# Co-expression Networks of Autism Genes



# Transcriptome-wide Molecular Interaction Network



A transcriptome-wide co-expression network is constructed by hirarchially clustering all genes (13,563) based on the correlation between their expression profile across all samples (480).

The resulting Molecular Interaction Modules are tested for enrichment of ASD genes.

GO enrichment analysis of the ASD-enriched modules shows that the disruption of synaptogenesis in autism is related to basic cellular processes: alternative splicing, protein translation, and ubiquitination. Hub genes of each ASD-enriched modules provide potential additional high-yield ASD candidates.

neurodevelopmental transcriptional modules.

### Conclusion

We analyzed the transcriptional co-expression networks of autism candidate genes throughout the developing human brain. We identified ASD modules with enrichment for synaptogenesis, apoptosis, and GABA-ergic signaling, suggesting that pathways previously independently implicated in autism are related to each other through shared neurodevelopmental transcriptional networks. We demonstrated shared relationships between ASD-enriched transcriptome-wide Molecular Interaction Modules and mitochondrial function, splicing, and protein turnover presenting a firsthand attempt to integrate the various pathways implicated in autism into a broader functional framework. Our analysis of this multi-dimensional expression data suggests pathways previously independently implicated in autism are related to each other through shared neurodevelopmental transcriptional networks.

### References

American Psychiatric Association. 2000. Diagnostic and statistical manual of mental disorders. American Psychiatric Association, Washington, D.C.

Kang H, Kawasawa Y, Cheng F, Zhu Y, Xu X, Li M, Sousa AM, Pletikos M, Meyer K, Sedmak G et al. 2011. Spatio-temporal transcriptome of the human brain. Nature 478(7370): 483-489.

BrainSpan: Atlas of the Developing Human Brain [Internet]. Funded by ARRA Awards 1RC2MH089921-01, 1RC2MH090047-01, and 1RC2MH089929-01. © 2011. Available from: http://developinghumanbrain.org.



