

Human cortex development is shaped by molecular and cellular brain systems

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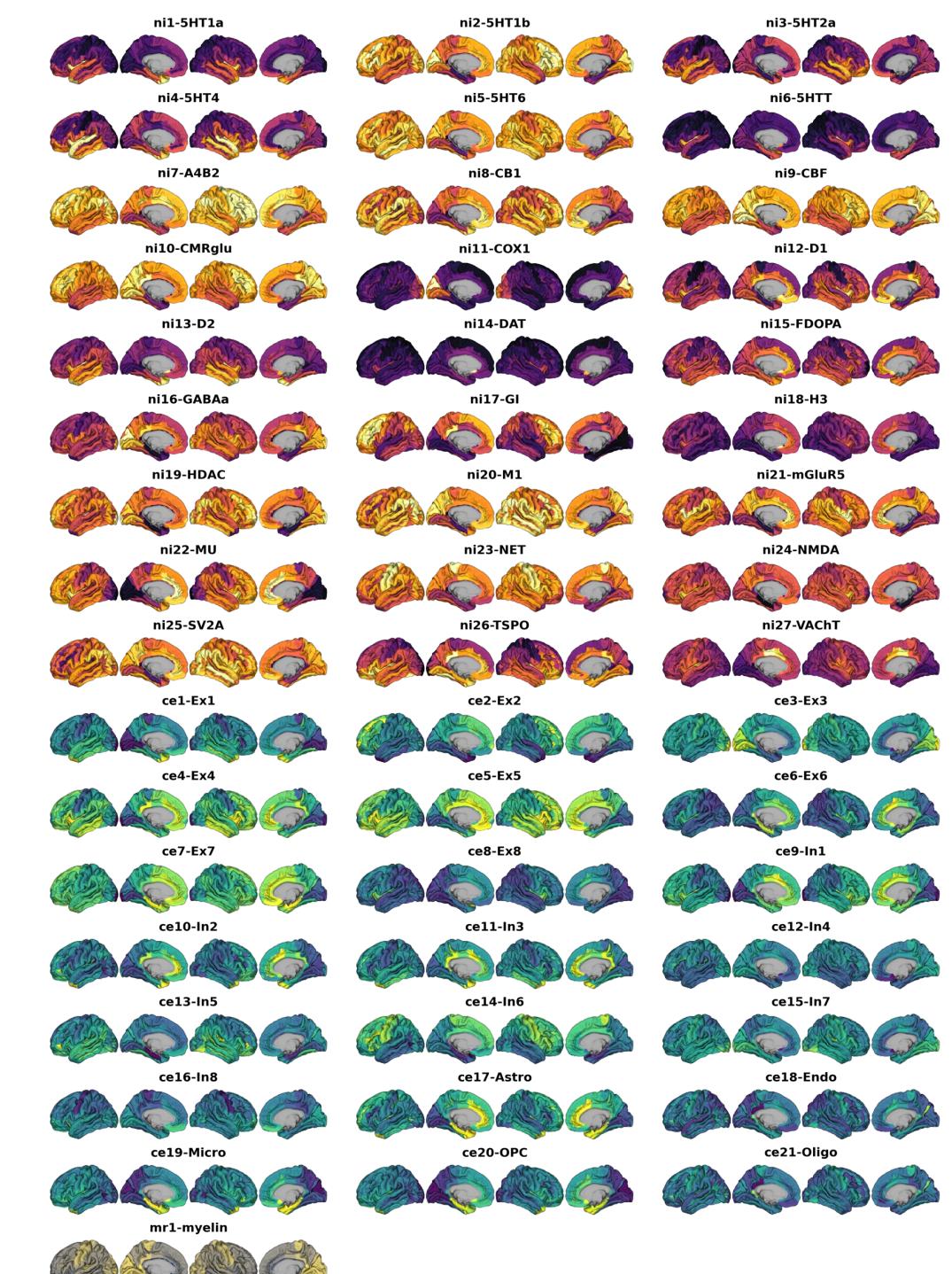
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Research motivation & impact

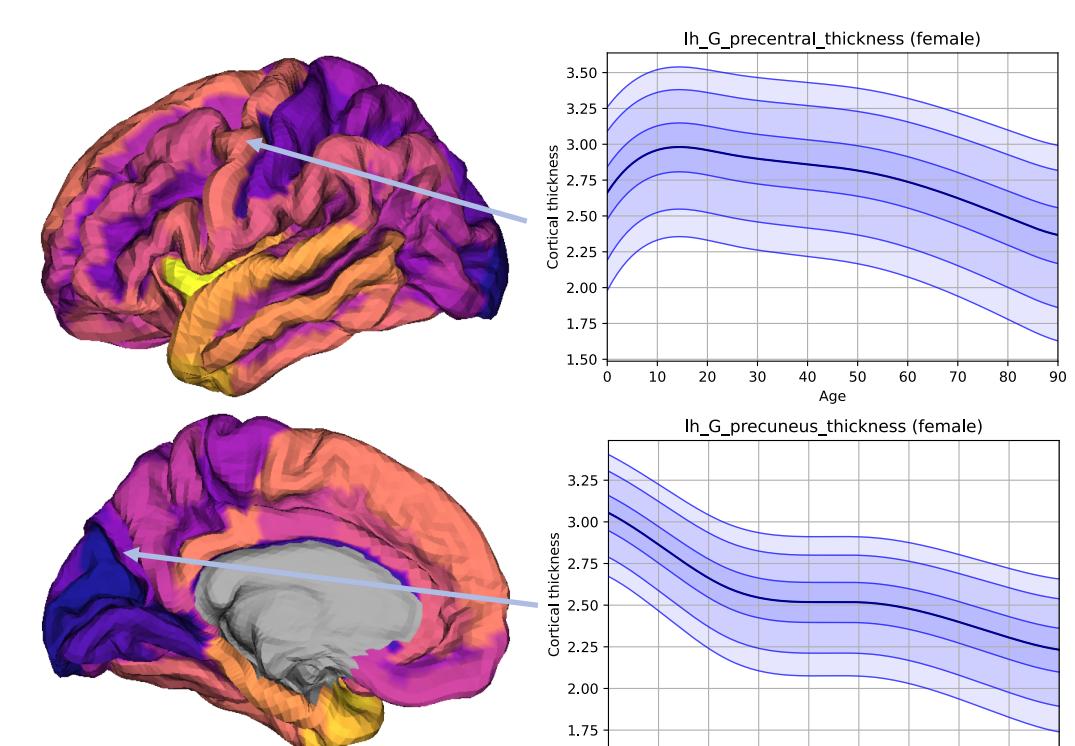
- Human cerebral cortex morphology is subject to complex and diverse changes over the lifespan^{1,2}.
- Several factors might influence cortical thickness (CT) development and lifespan changes, but human data are scarce.
- Through spatial correlation approaches^{3,4}, recent advances in normative modeling of population-scale neuroimaging data^{1,2} and availability of brain atlases covering a wide range of neural cell populations and neurobiological processes⁵⁻⁷, we identify potential mechanisms underlying human CT development.
- This work...
 - 1) provides new hypotheses on mechanisms involved in human cortex development,
 - 2) introduces a framework for studying neurodevelopmental mechanisms *in vivo* on the individual level, promising new insights into typical and atypical neurodevelopment alike, and
 - 3) further emphasizes the value of normative modeling frameworks in neurodevelopmental research.

Data sources

Atlasses of molecular and cellular "neurobiological markers"⁵⁻⁷
(n=49, nuclear imaging, ABA, MRI)



Normative models of "representative" CT development²
(n=58,836; ~2 to 100 years; 148 regions)



ABCD longitudinal CT data⁸
(n=6,789; ~10 and 12 years)

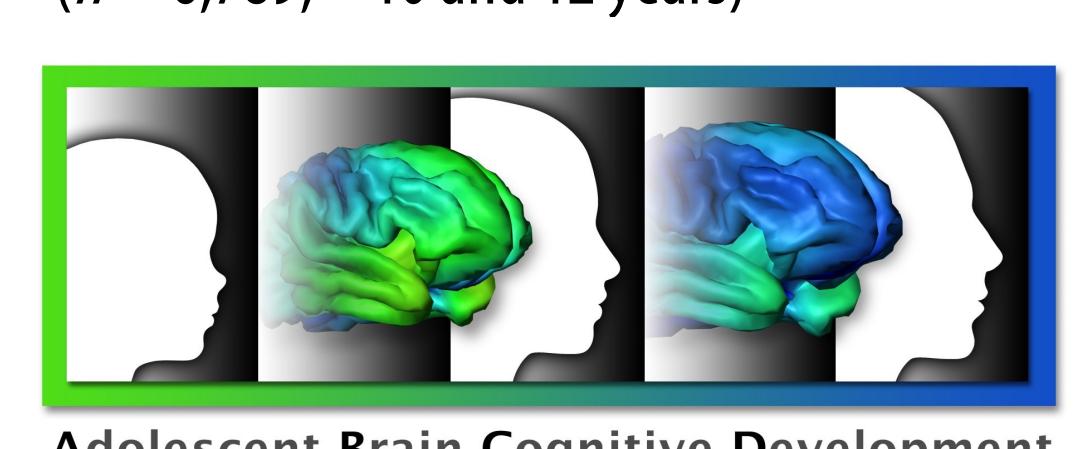
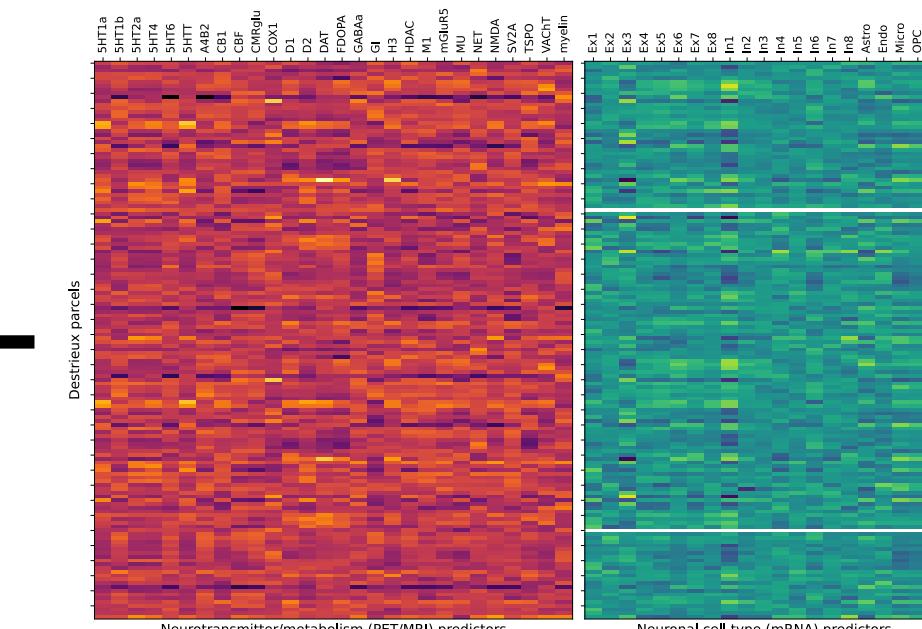


IMAGEN longitudinal CT data⁹
(n=995 to 1,278; ~14, 19, and 22 years)

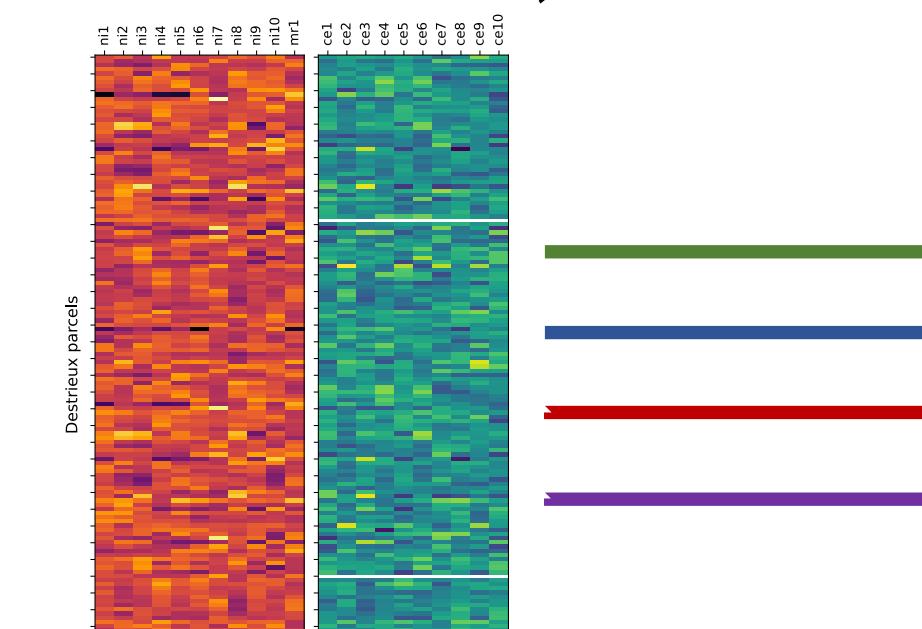


Data processing

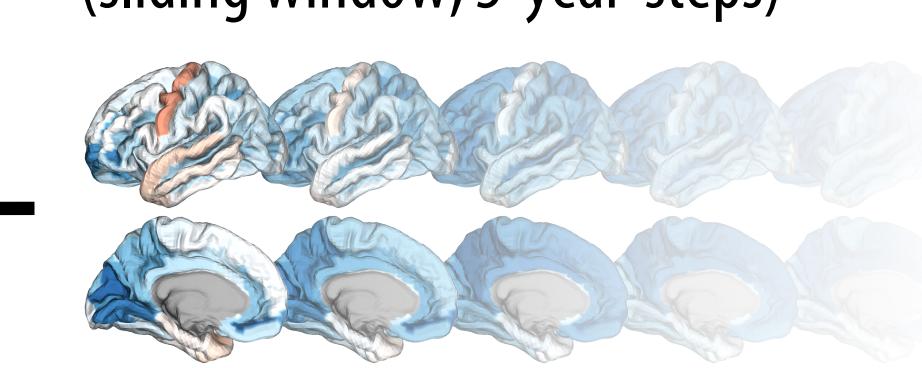
Parcellation
(n=49; 148 cortex regions)



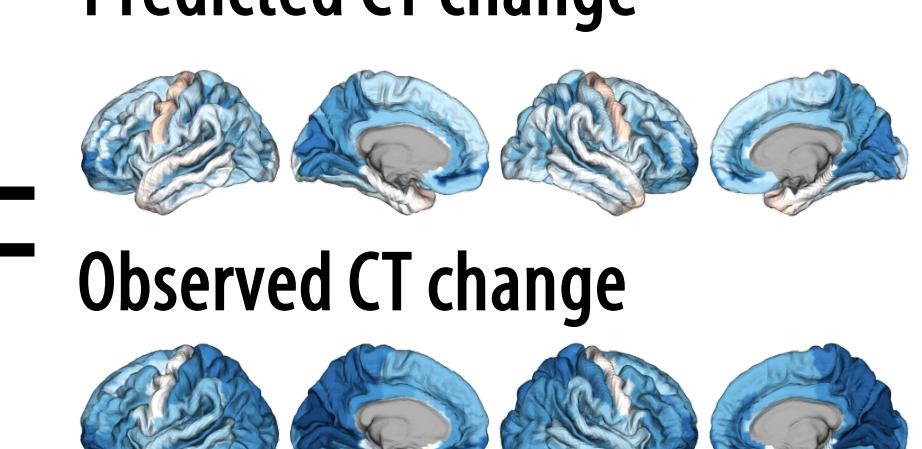
Dimensionality reduction
(n=21; factor analysis)



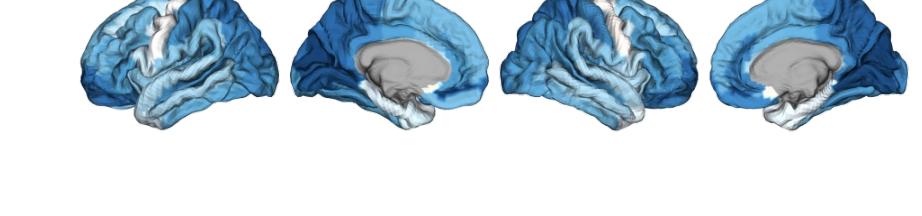
Timestep-wise CT change
(sliding window, 5-year-steps)



Subject-wise:
Predicted CT change

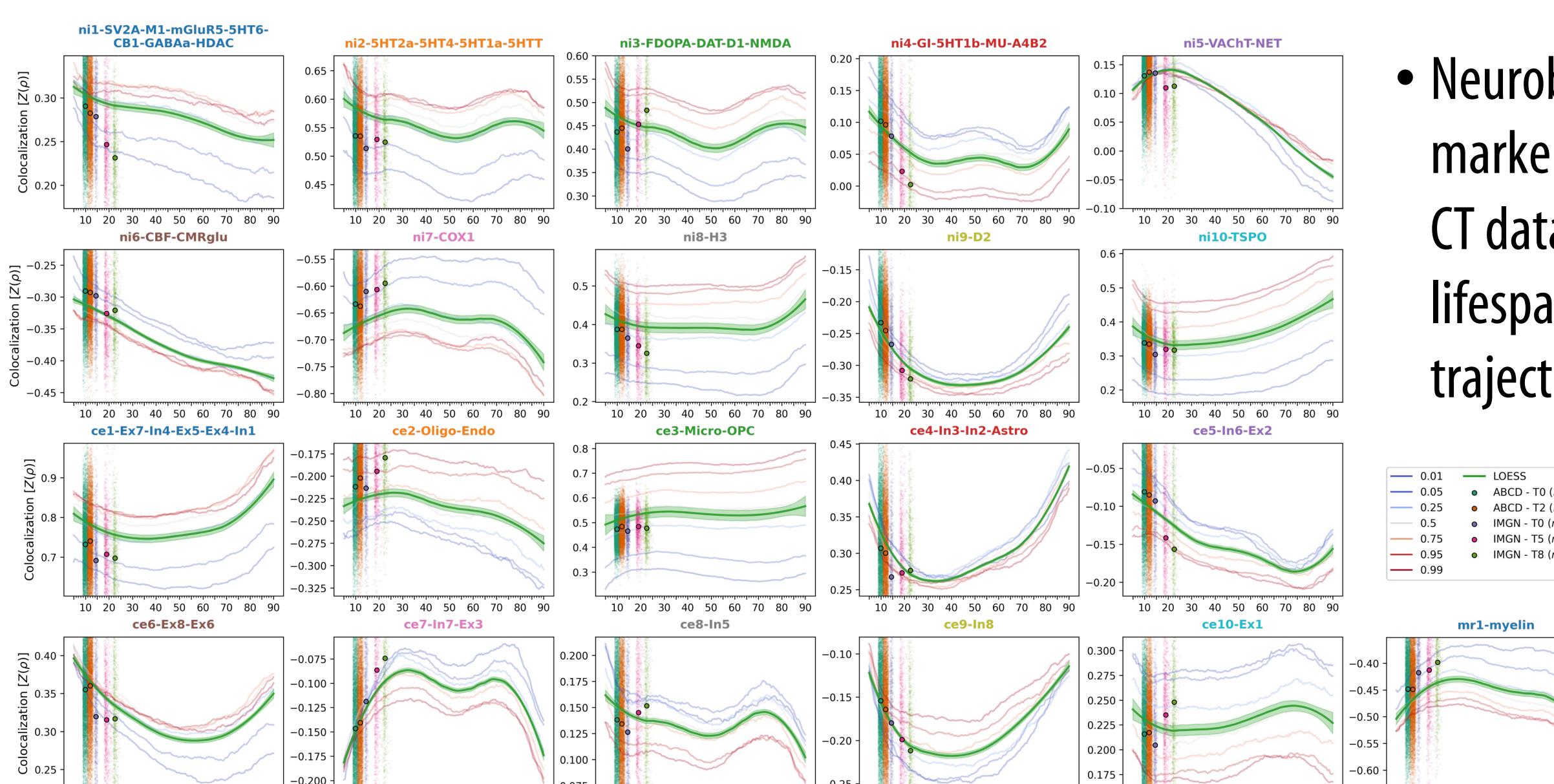


Observed CT change

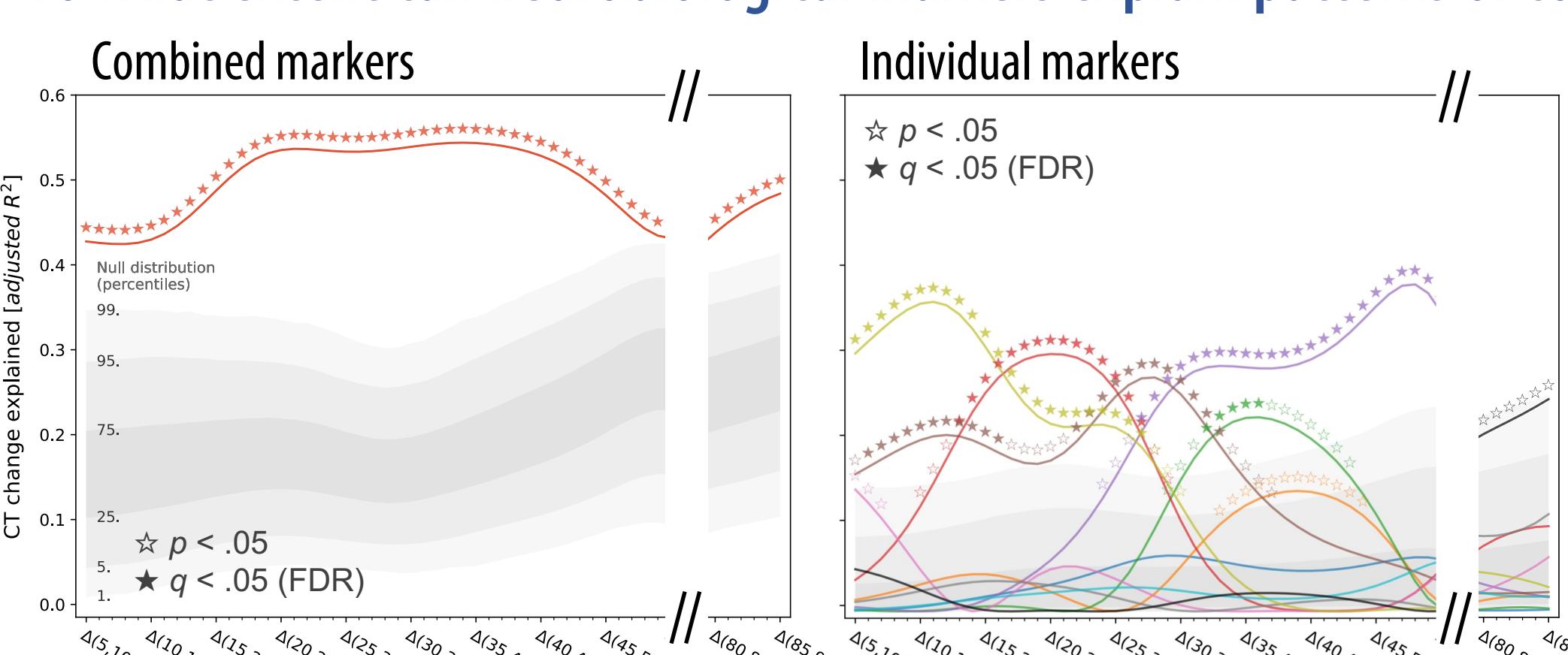


Analyses & results

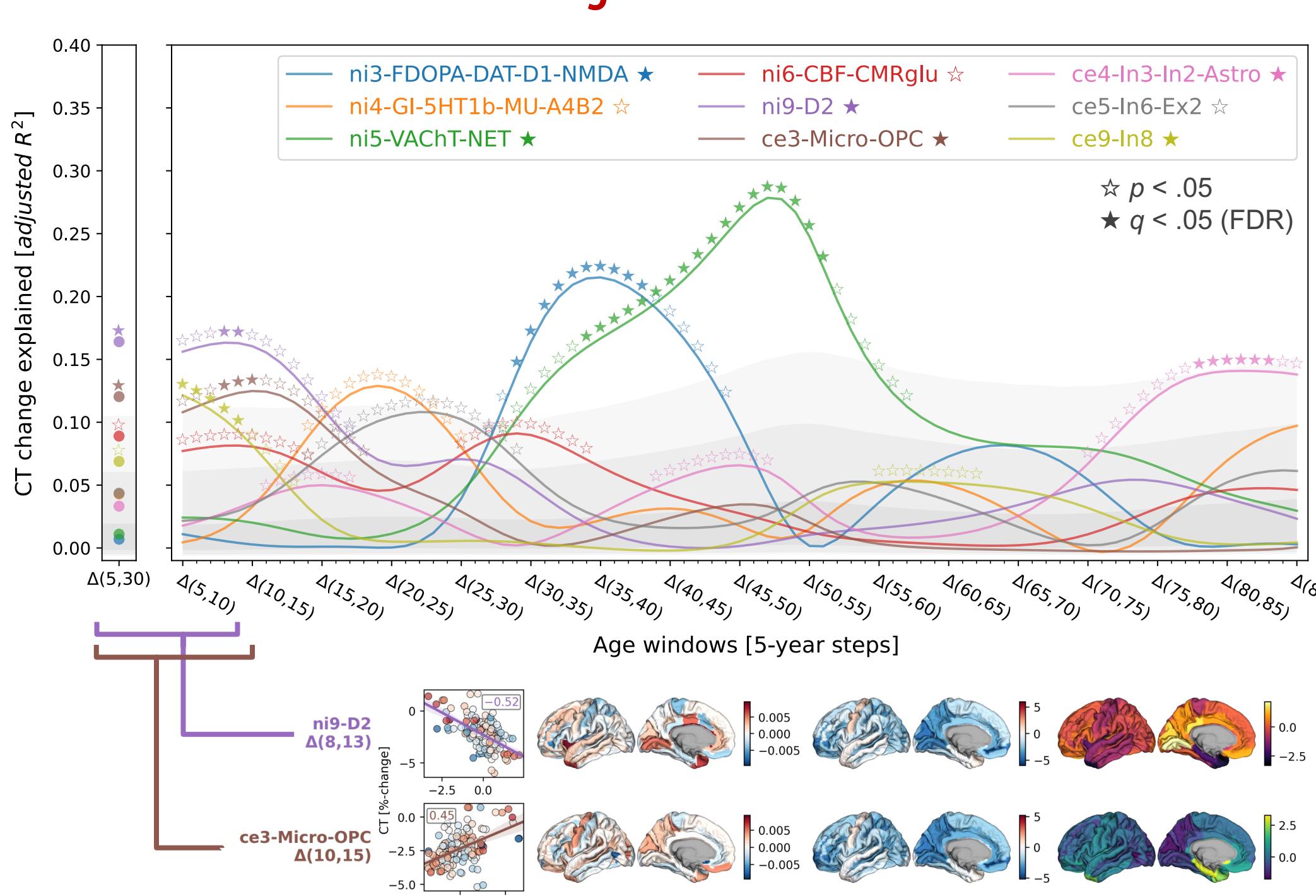
How do spatial colocalization patterns develop across the lifespan?



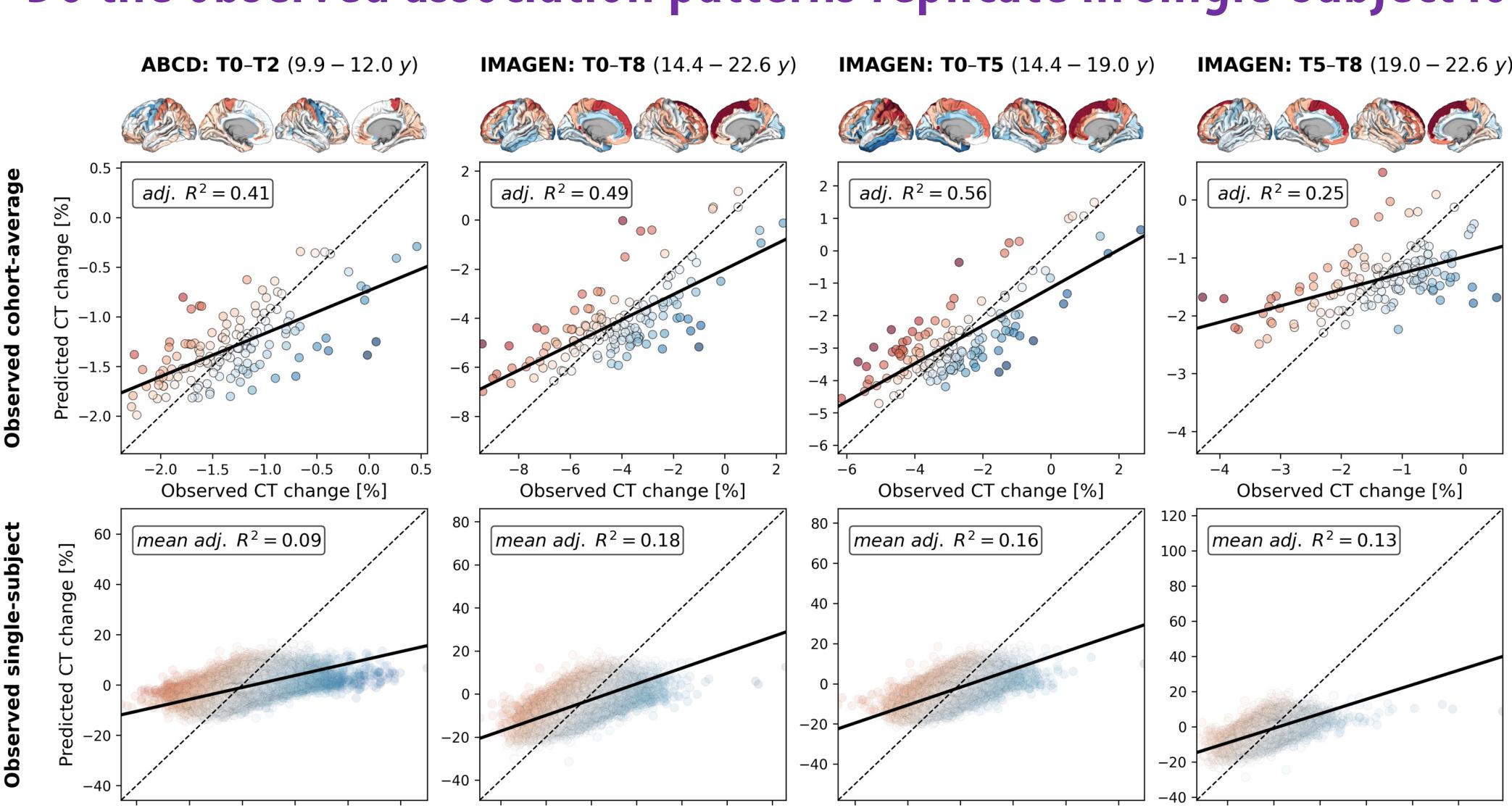
To what extent can neurobiological markers explain patterns of cortical development?



Which markers and cortex regions are most relevant across developmental stages?



Do the observed association patterns replicate in single-subject longitudinal data?



- Neurobiological markers and modeled CT data show diverse lifespan colocalization trajectories.

- Molecular (Fig.) and cellular markers explain up to 55% of modeled lifespan CT change.
- Individual markers explain up to 40%.

- Only 9 markers can explain up to 57% of modeled CT change.
- D1/2 dopaminergic receptors, microglia, ST interneurons, and brain metabolism explain early CT development.
- Cholinergic and glutamatergic receptors explain later CT change.

- Modeled results replicate in independent longitudinal data.
- 6 biological markers explain up to 59% of cohort-average and 18% of single-subject CT development.

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⁵Hansen, J.Y. et al. (2022). Mapping neurotransmitter systems to the structural and functional organization of the human neocortex. *Nat. Neurosci.*, 25, 1569–1581.

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¹⁰Lotter, L.D. and Dukart, J. (2022). JuSpice - a toolbox for flexible assessment of spatial associations between brain maps. *Zenodo*.