## Human cortex development is shaped by molecular and cellular brain systems

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## Research motivation & impact

<sup>1</sup> Bethlehem, R. A. I. et al. (2022). Brain charts for the human lifespan. *Nature*, *604*(7906), Article 7906

<sup>2</sup> Rutherford, S. et al. (2022). Charting brain growth and aging at high spatial precision. *eLife*, *11*, e72904.

<sup>4</sup> Vidal-Pineiro, D., et al. (2020). Cellular correlates of cortical thinning throughout the lifespan. *Sci. Rep., 10*(1), Article 1.

<sup>6</sup> Hawrylycz, M.J. et al. (2012). An anatomically comprehensive atlas of the adult human brain transcriptome. *Nature*, 489(7416), 391–399.

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

<sup>3</sup> Dukart, J. et al. (2021). JuSpace: A tool for spatial correlation analyses of magnetic resonance imaging data with nuclear imaging derived neurotransmitter maps. *Hum. Brain Mapp., 42*(3), 555–566.

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

<sup>9</sup> Schumann, G. et al. (2010). The IMAGEN study: Reinforcement-related behaviour in normal brain function and psychopathology. *Mol. Psychiatry*, *15*(12), Article 12.

<sup>7</sup> Lake, B.B. et al. (2016). Neuronal subtypes and diversity revealed by single-nucleus RNA sequencing of the human brain. *Science*, *352*(6293), 1586–1590.

<sup>8</sup> Casey, B.J. et al. (2018). The Adolescent Brain Cognitive Development (ABCD) study: Imaging acquisition across 21 sites. *Dev. Cogn. Neuro., 32*, 43–54.

- Human cerebral cortex morphology is subject to complex and diverse changes over the lifespan<sup>1,2</sup>.
- Several factors might influence cortical thickness (CT) development and maturation, but human data are scarce.
- Through spatial correlation approaches<sup>3,4</sup>, recent advances in normative modeling of population-scale neuroimaging data<sup>1,2</sup>, and availability of multi-level atlases of molecular and cellular brain systems<sup>5–7</sup>, 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
  - further emphasizes the value of normative modeling frameworks in neurodevelopmental research.

## SYSTEMS NEUROSCIENCE















cate in independent

longitudinal data.

6 biological systems

explain up to 59% of

cohort-average and

CT development.

18% of single-subject

adj.  $R^2 = 0.56$ 

-4 -2 0
Observed CT change [%]

Observed CT change [%]

mean adj.  $R^2 = 0.16$ 

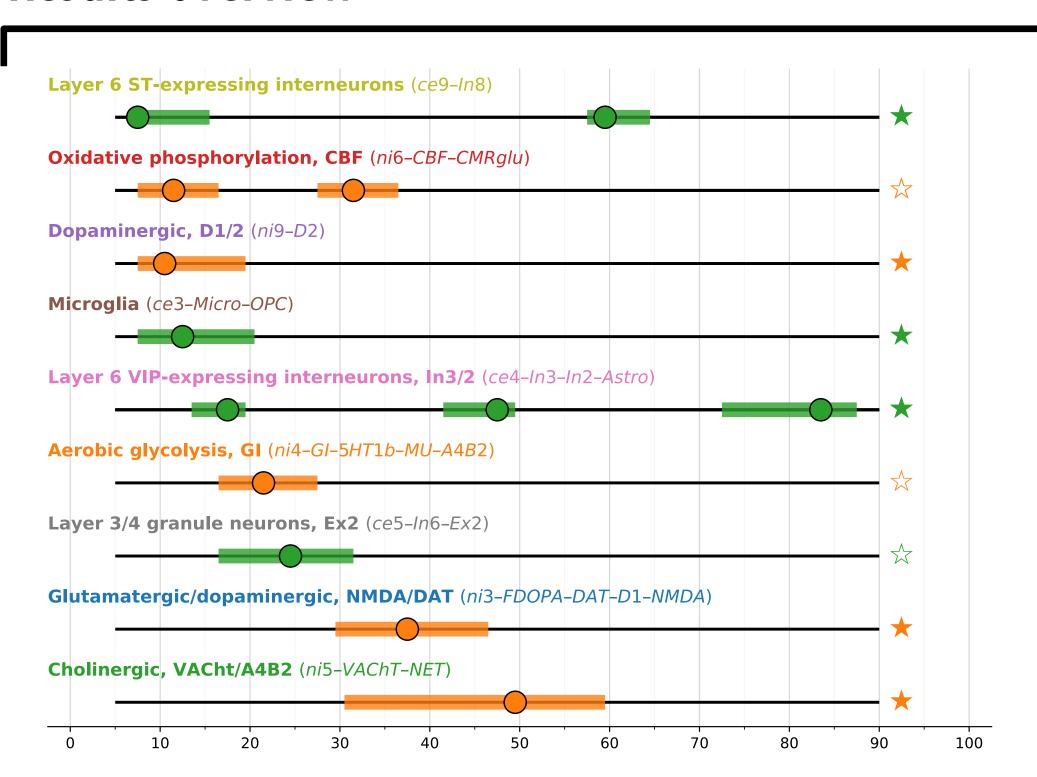
adj.  $R^2 = 0.25$ 

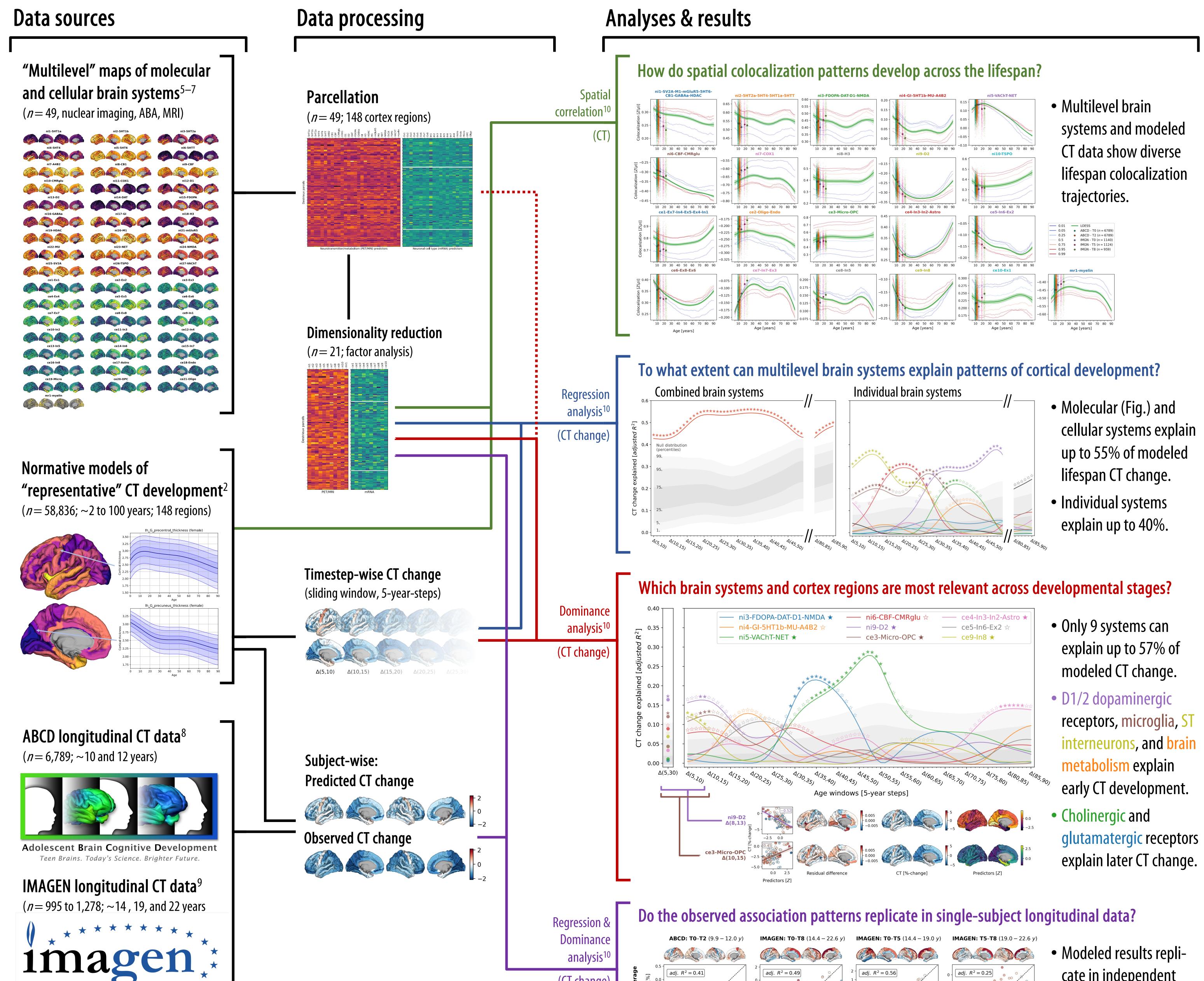
-3 -2 -1 0 Observed CT change [%]

Observed CT change [%]

mean adj.  $R^2 = 0.13$ 

## Results overview





adj.  $R^2 = 0.41$ 

-2.0 -1.5 -1.0 -0.5 0.0 0.5

Observed CT change [%]

Observed CT change [%]

mean adj.  $R^2 = 0.09$ 

(CT change)

adj.  $R^2 = 0.49$ 

-8 -6 -4 -2 0 Observed CT change [%]

Observed CT change [%]

mean adj.  $R^2 = 0.18$