



# **A Mathematical Model of Cerebral Cortical Folding Development**

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# Outline

## 1. Hypotheses

**ATH (Axonal Tension Hypothesis)**

**DGH (Differential Growth Hypothesis)**

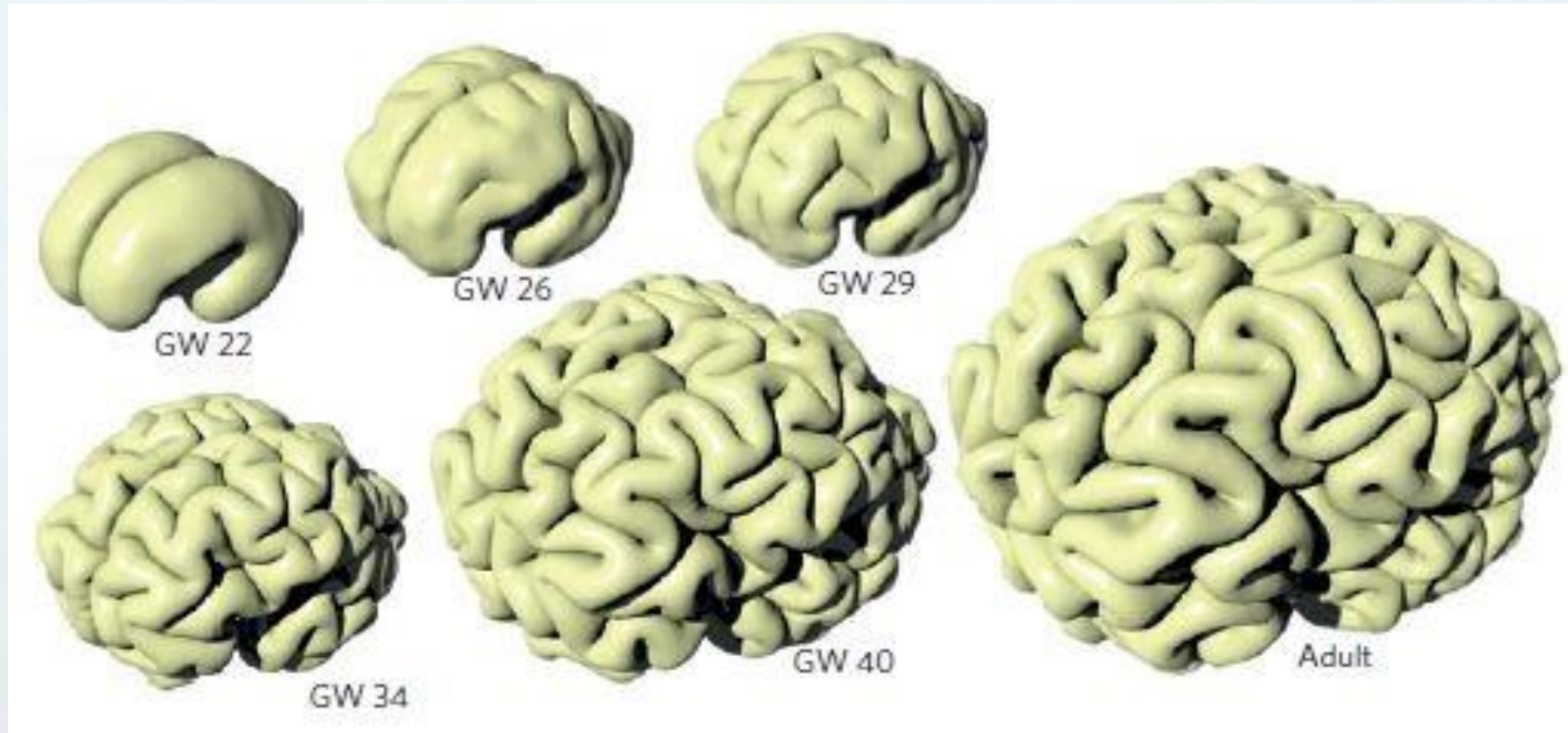
**IPH (Intermediate Progenitor Hypothesis)**

## 2. Biomechanical Models

**Kim's Linear Brain Folding Model**

## 3. Our New Model

All large mammals including humans have a **cerebral cortex** - the brain's outer folded layer.



*Figure adapted from [17] Toumas Tallinen, 2016*

In large mammals, cortex intricately folded into **gyri** (hills) and **sulci** (valleys).

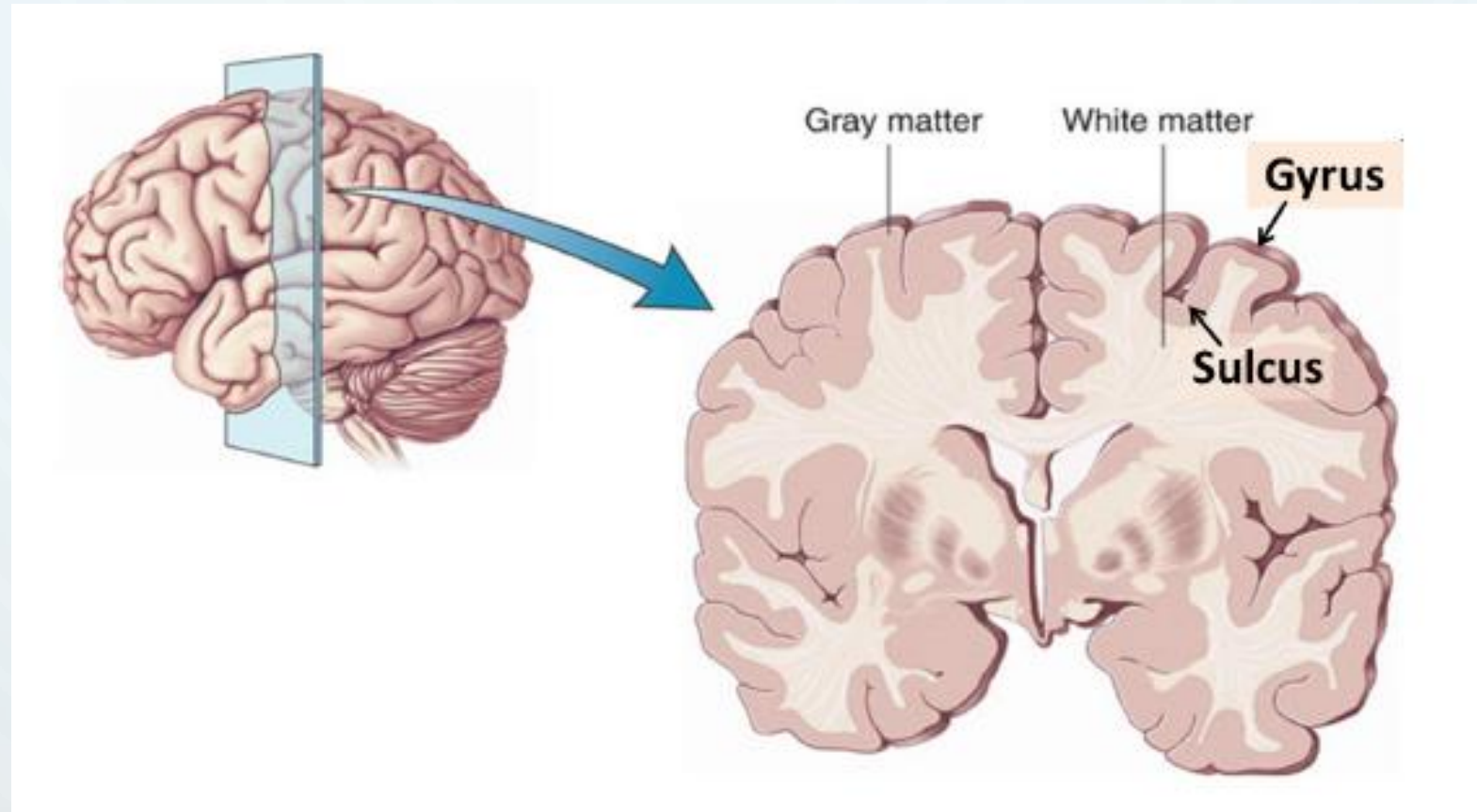


Figure adapted from [www.mednewsdigest.com/?p=3249](http://www.mednewsdigest.com/?p=3249)

## Three Main Hypotheses of Cortical Folding

- To date, there have been **three** leading biological hypotheses that explain the development of cortical folding.
- Two of them are biomechanical.



# 1. Biomechanical Hypothesis: Axonal Tension Hypothesis (ATH)

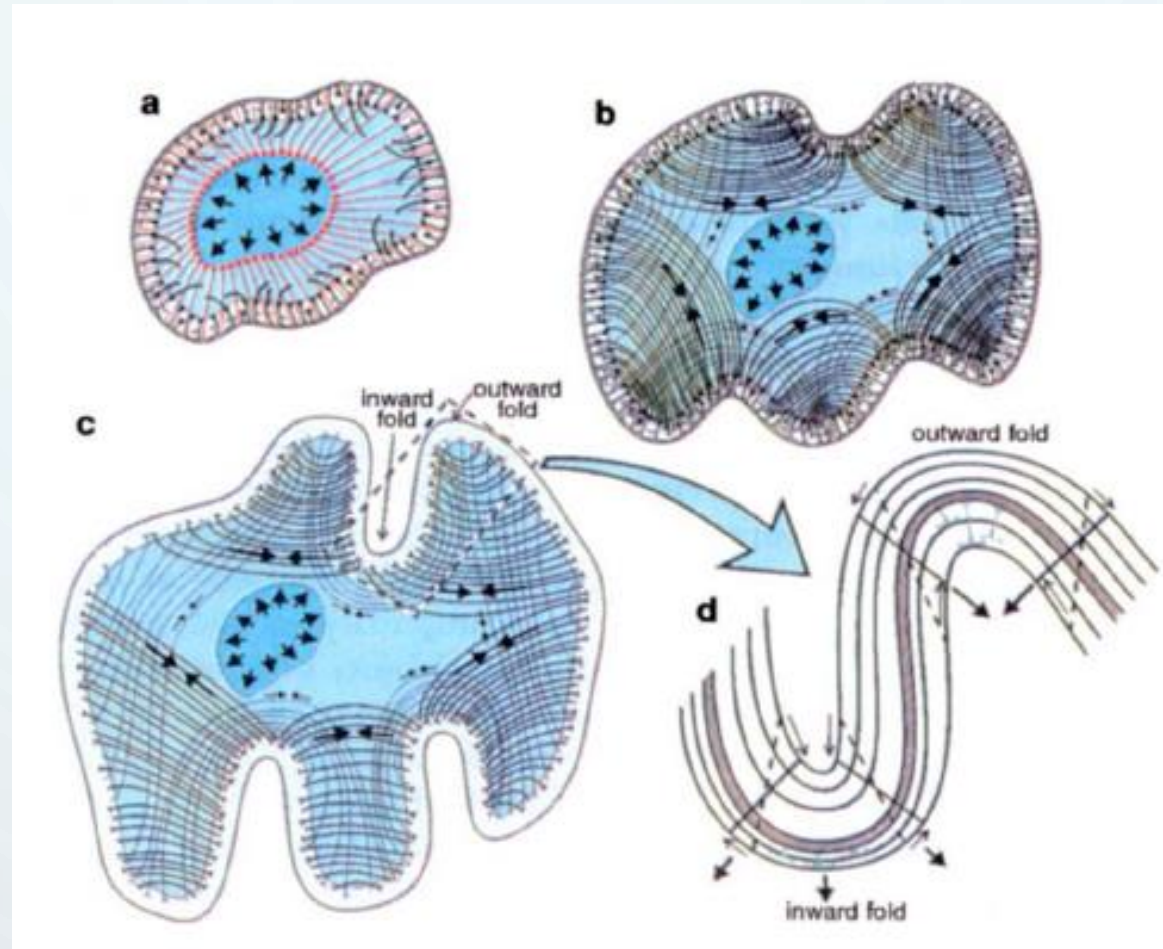


Figure adapted from [4] D.C. Van Essen, 1997

## 2. Biomechanical Hypothesis: Differential Growth Hypothesis (DGH)

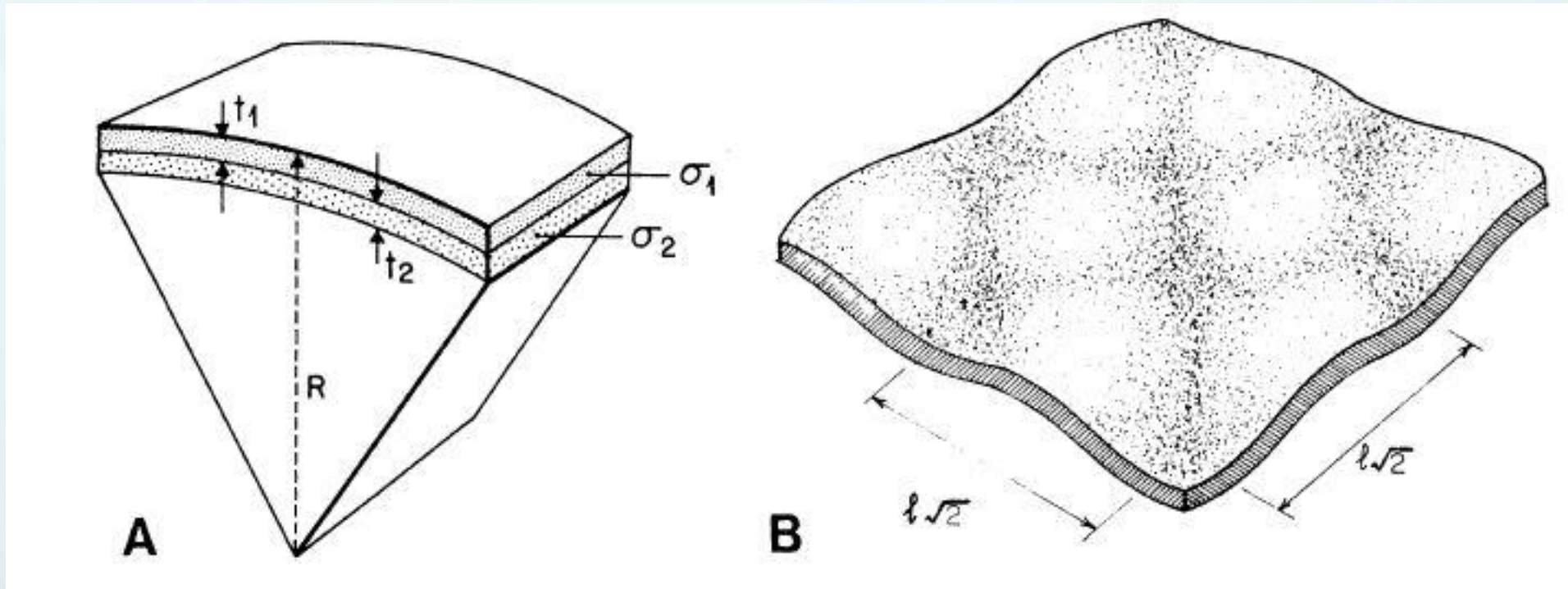
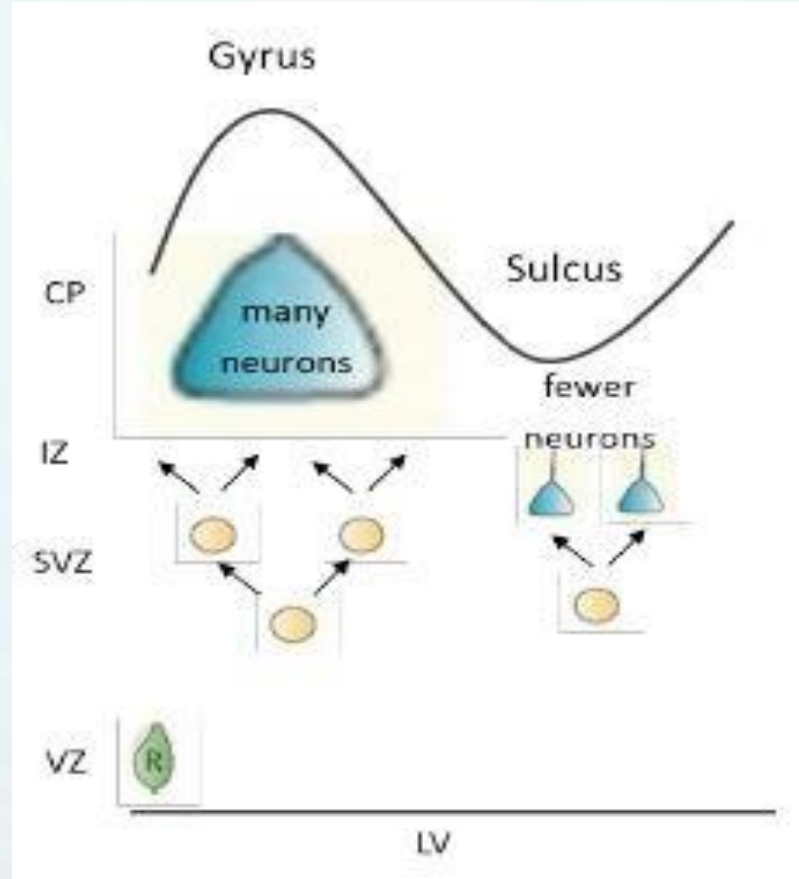


Figure adapted from [5] D.P. Richman, 1975

### 3. Biochemical Hypothesis: Intermediate Progenitor Hypothesis (IPH)



*CP: Cortical Plate,  
IZ: Intermediate Zone,  
SVZ: Sub Ventricular Zone,  
VZ: Ventricular Zone,  
LV: Lateral Ventricles.*

*Figure adapted from [6] A. Kriegstein, 2006*



## An Ideal Model

- The one that utilizes all three leading hypotheses
- No such combined model to date.

## A Previous Biomechanical Model

- Kim's model [1] assumes that the major mechanism causing cerebral cortical folding is the axonal tension forces (ATH).
- The cortico-cortical connections are explained by the biochemical hypothesis (IPH).

*[1] S. Kim, PhD Thesis, Florida State University, 2015*

## A Previous Biomechanical Model

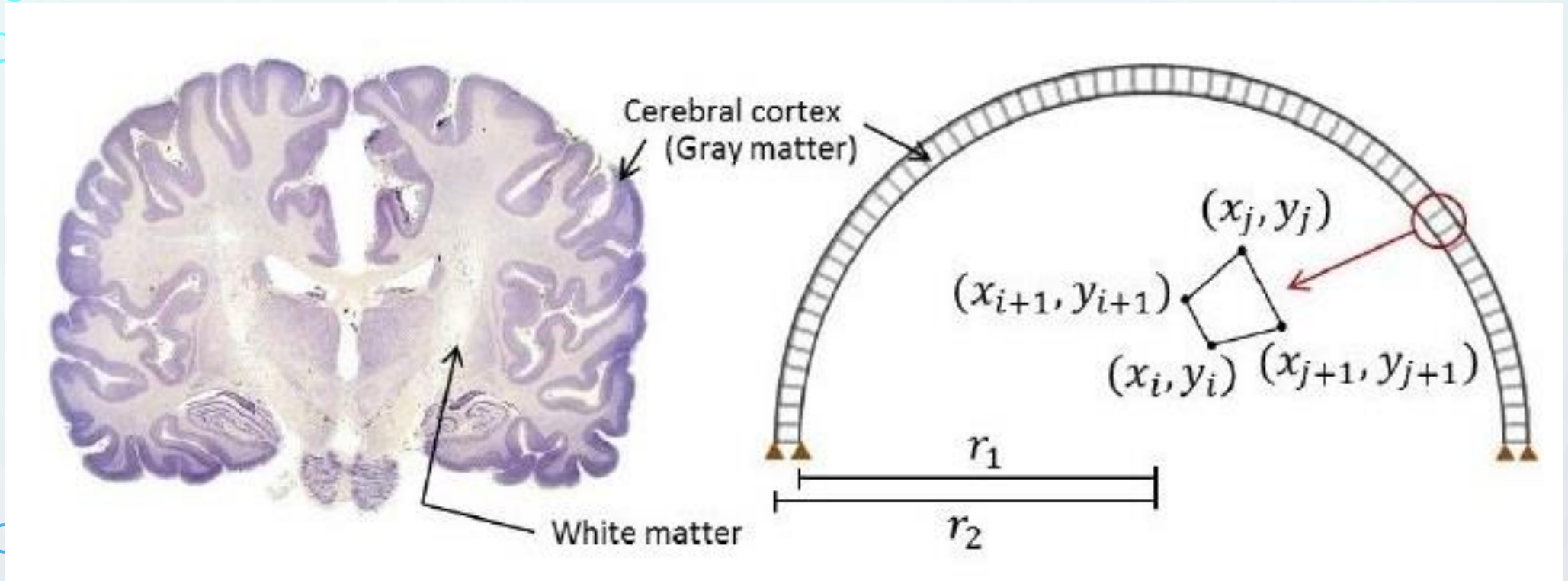


Figure adapted from [1] S. Kim, 2015

## IPM and ATH

- The biochemical hypothesis (IPM) and that of biomechanical hypothesis (ATH) coincide on the claim that:  
**an area which includes a densely packed cell population develop into gyri.**
- Turing Reaction-Diffusion system [1] is used to determine the level of morphogen. The magnitude of applied forces are determined by the Turing patterns.

[1] *A.M. Turing, 1952*

# A Previous Biomechanical Model - Simulations

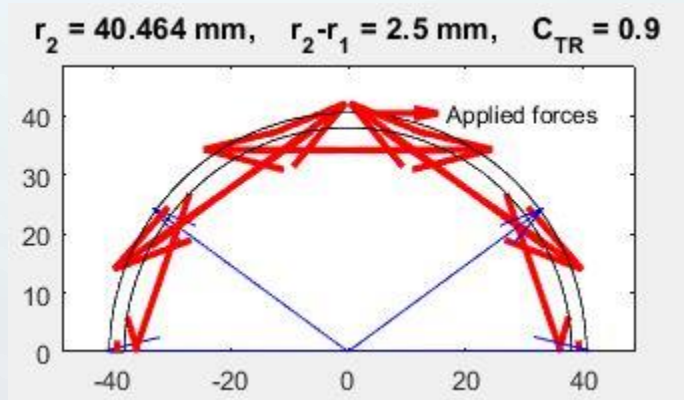
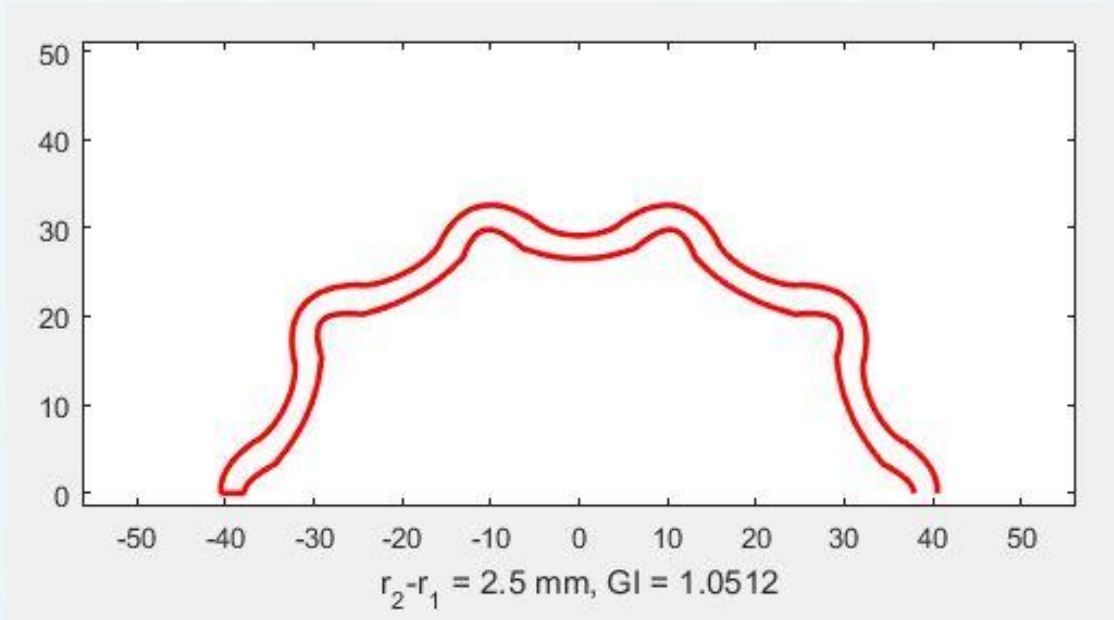


Figure adapted from [1] S. Kim, 2015



## A New Model for Cortical Folding

- Tangential growth of the cortex drives the folding process
- Deeper layers grow in response to the resulting growth-induced stress, i.e., the core is allowed to grow.
- Brain tissue is assumed to be isotropic, hyperelastic material.

## A New Model for Cortical Folding

- Brain tissue is assumed as isotropic, hyperelastic material.

$F$  : the deformation gradient tensor

$F^*$  : elastic tensor

$G$  : growth tensor

$\sigma$  : Cauchy stress tensor

$J^* := \det F^*$

$W$ : Strain energy density function

- $$\sigma = J^{*-1} \cdot F^* \cdot \frac{\partial W}{\partial F^{*T}}$$

## A New Model for Cortical Folding

A standard neo-Hookean material model [1] is used.  
Strain energy density function:

$$W = \frac{\mu}{2} (I_1^* \cdot J^{*-2/3} - 3) + \frac{\kappa}{2} (J^* - 1)^2$$

$\mu$  : shear modulus

$\kappa$  : bulk modulus

$I_1^*$  : trace of  $F^{*T} F^*$

[1] Holzapfel G. A., 2000

## A New Model for Cortical Folding

- Both cortex and subcortical foundation were hyperelastic.
- In the cortex, growth rate was taken as linear, and no growth in radial direction.
- Both tangential and radial growth were stimulated by corresponding stress components.

## Experimental Setup

*Parameters:* The following parameters are used and were obtained from actual data of the human brain:

- $r = 0.0404$  m: radius of brain at 28<sup>th</sup> week
- $t = 2.5$  mm: thickness of the gray matter
- $E_g = 1.389$  kPa: Young's Modulus of gray matter
- $E_w = 1.895$  kPa: Young's Modulus of white matter
- $\nu = 0.4583$ : Poisson ratio of brain tissue
- $d = 1.1$  g/cm<sup>3</sup> : density of brain tissue

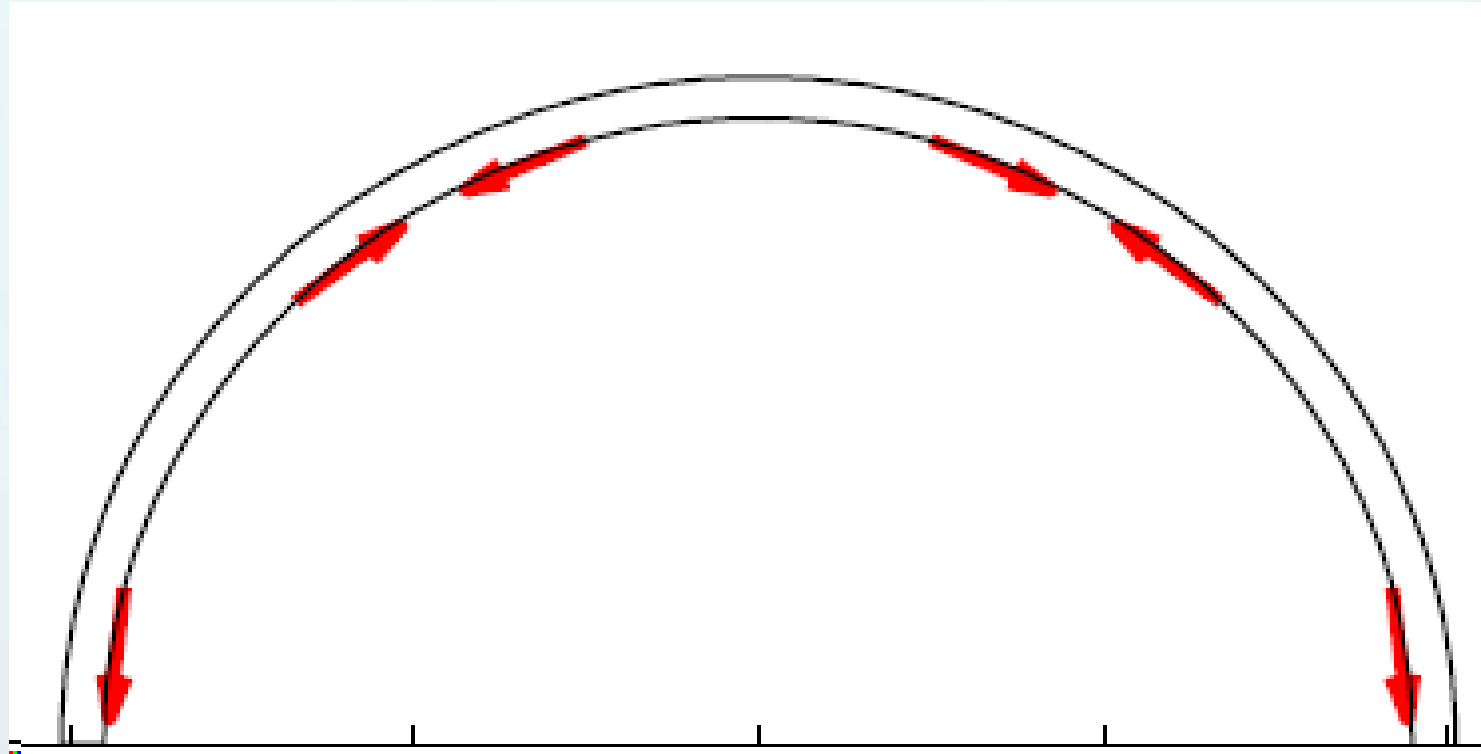


# Geometry

Simulations are performed in

- a two-dimensional (2D) semi-circular domain
- a 2D semi-elliptical domain

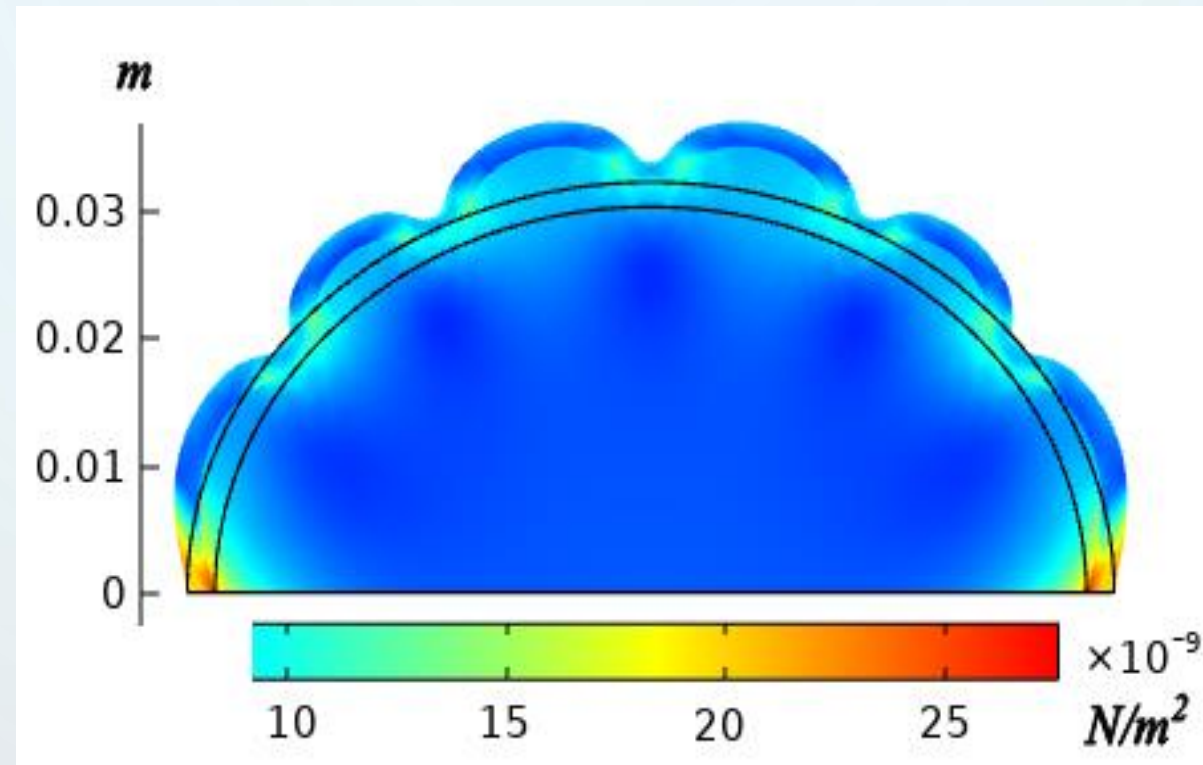
# Boundary Loads



*Figure adapted from [3] P. V. Bayly, 2013*

## Simulations

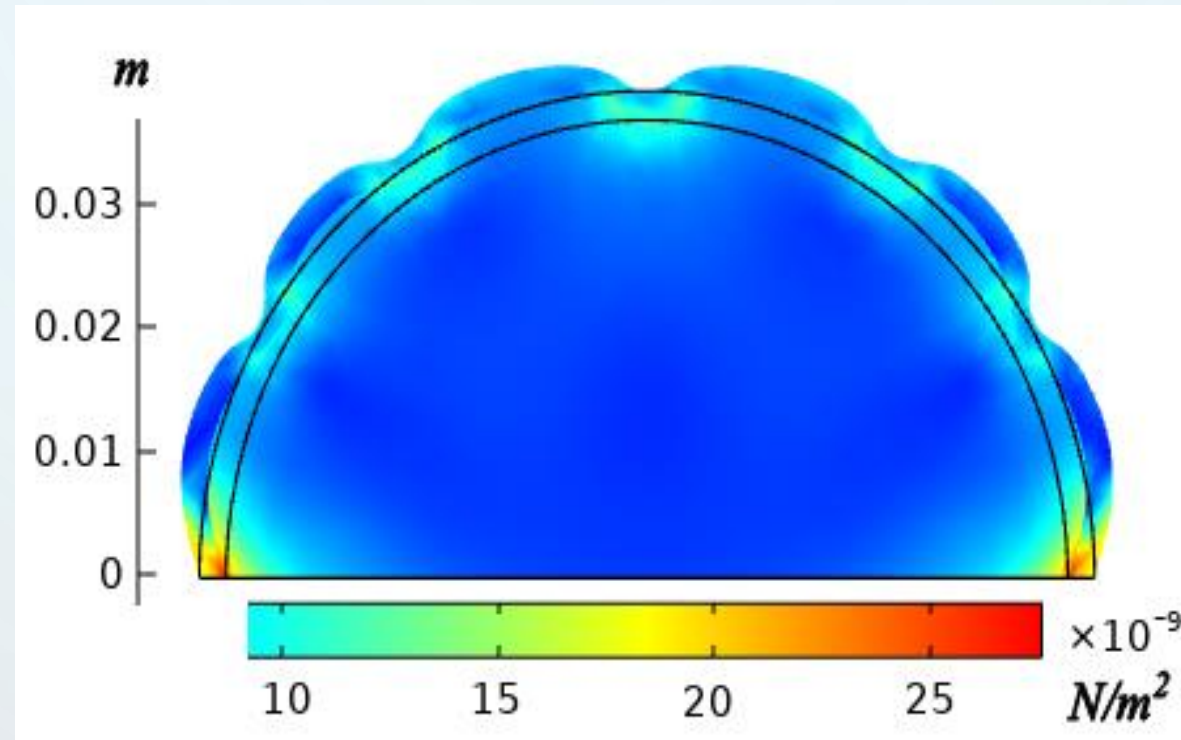
*Semi-elliptical domain:* The human brain is more like a semi-ellipsoid, that is why we first prefer 2D semi-elliptical domain for



*Simulation with a 2D semi-elliptical domain. The colors represent the Von Mises stress.*

# Simulations

*Semi-circular domain:* To compare with other models that use a semi-circular domain, the following simulation was done:



*Simulation with a 2D semi-circular domain.*

## Conclusion & Future Directions

- The current model is distinct from previous models since it utilizes all three leading hypotheses of the cortical folding
- More biologically relevant compared to most other models in terms of being time-dependent, nonlinear, and the fact hyperelastic material is used.
- Obtaining improved patterns and extending simulations to 3D are the next steps.



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**THANK YOU!**