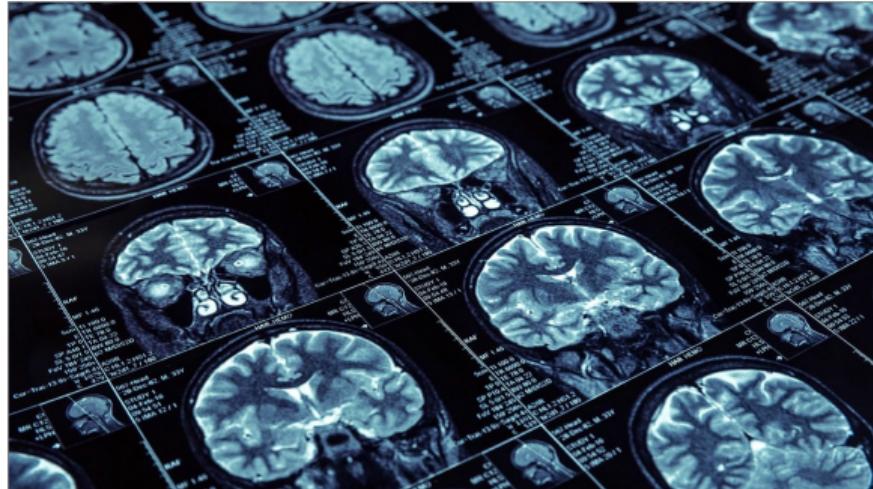


## Accurate diagnosis and prognosis through ML

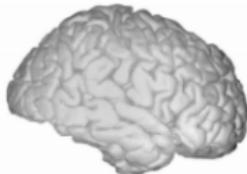


## ML to augment doctors

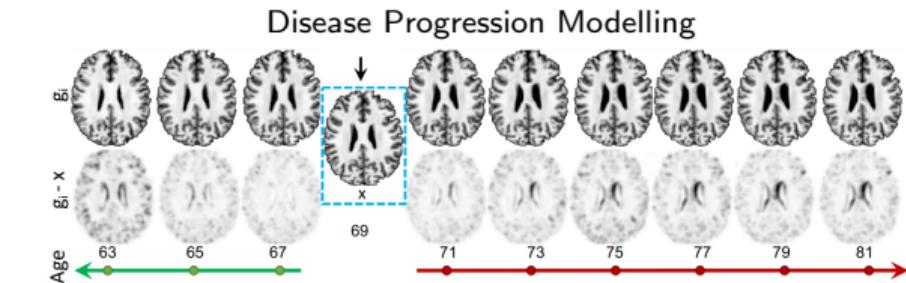
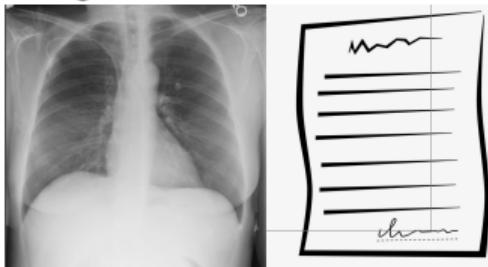


## Future work

### Biological anatomy simulators



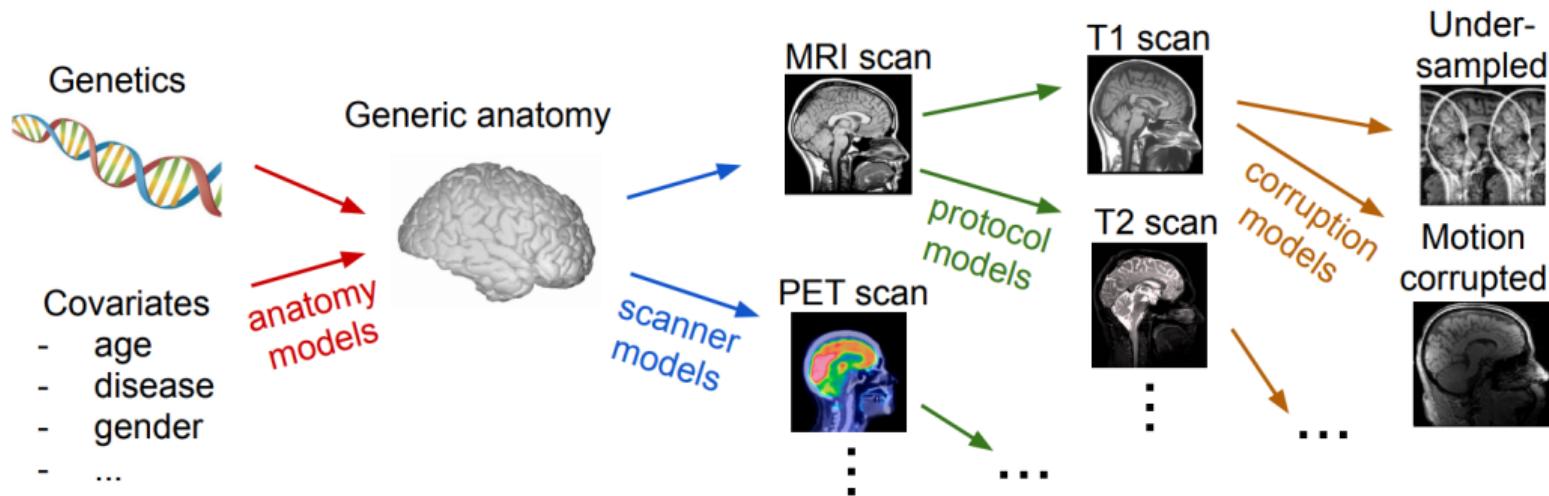
### Multimodal modelling images + text + structural data



## Future work: Brain tissue and anatomy simulator

Simulator for brain anatomy from genetics:

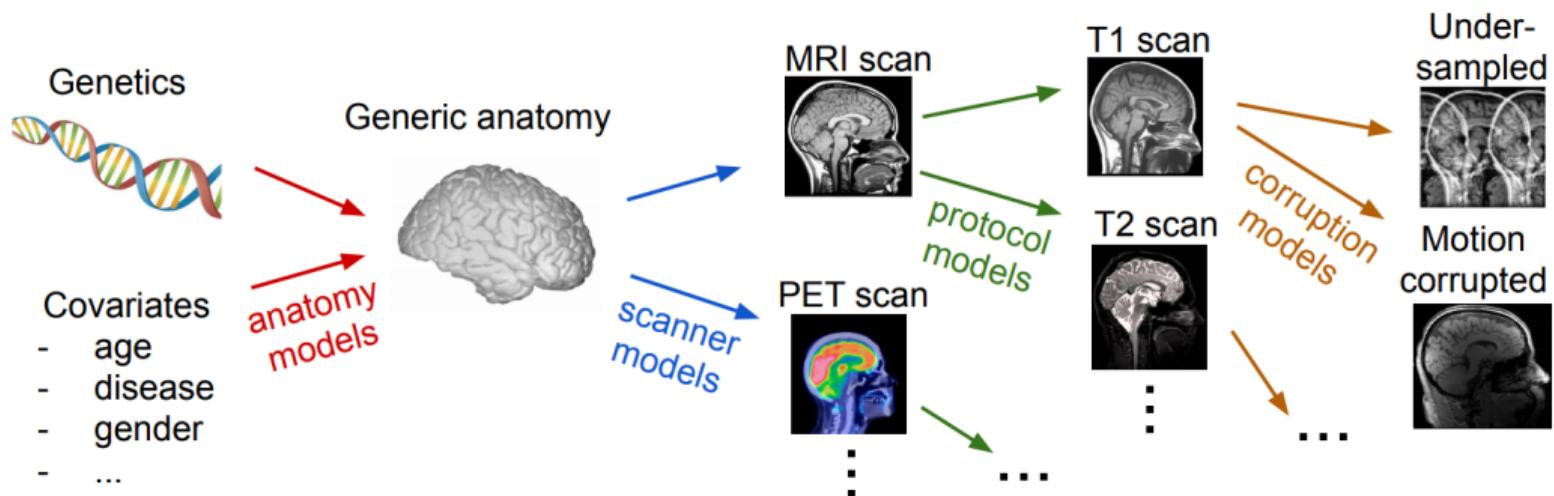
- ▶ Using deep generative models
- ▶ Accounting for distributions shifts
- ▶ Following causal principles



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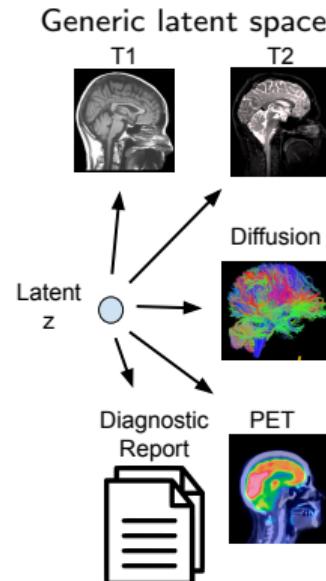


Can compute posterior over any variable, e.g. posterior over PET given motion corrupted (MOT) scan:

$$p(\text{PET}|\text{MOT}) = \sum_{\text{GEN}} p(\text{GEN})p(\text{PET}|\text{GEN}) \sum_{\text{MRI}} p(\text{MRI}|\text{GEN}) \sum_{\text{T1}} p(\text{T1}|\text{MRI})p(\text{MOT}|\text{T1})$$

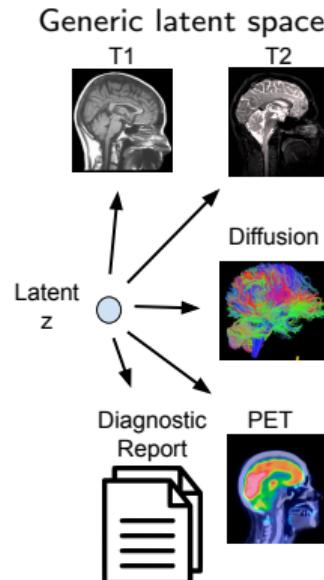
- Extend models for multimodal generation: scan contrasts (T1/T2), Diffusion imaging, PET, diagnostic report, cognitive tests

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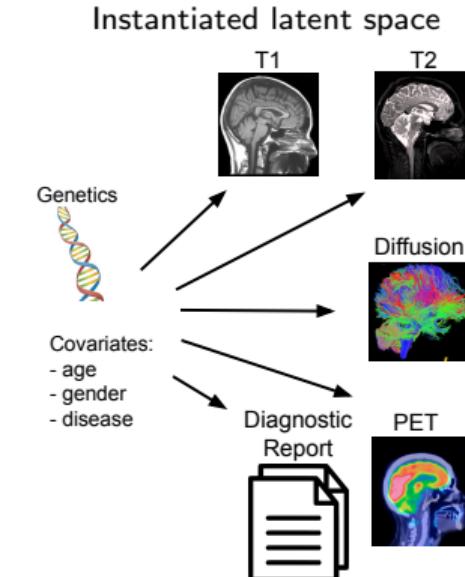
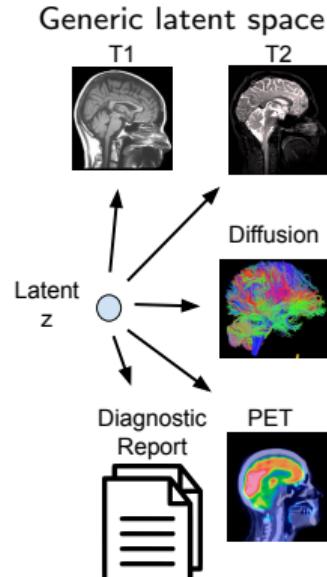
$$\min_G \max_D \mathbb{E}_{\mathbf{X}, \mathbf{Y}} [\log D(\mathbf{X}, \mathbf{Y})] + \mathbb{E}_z [\log(1 - D(G_x(z), G_y(z)))]$$



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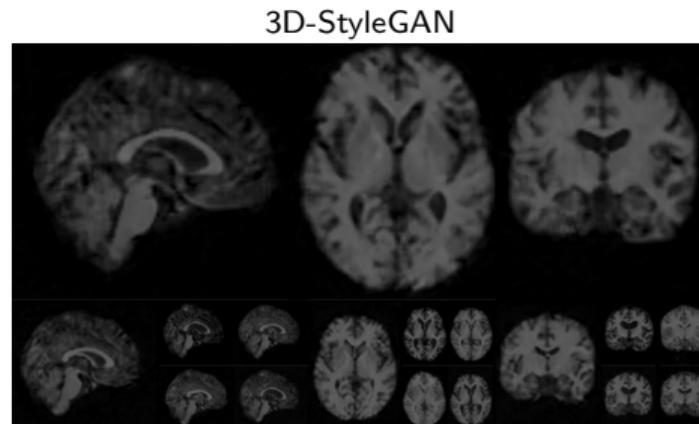
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- Later on, replace latent with genetics and covariates



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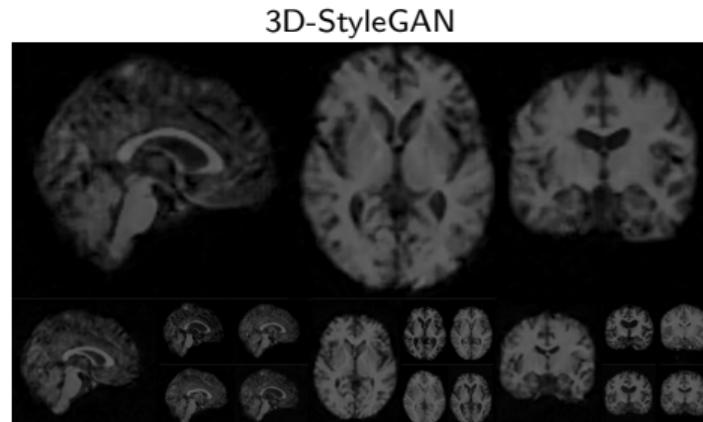


(submitted to MICCAI 2021)

# Disease Progression Modelling

- ▶ Current models mostly work with features extracted from scans (low dimensionality)
- ▶ Aim: model progression **directly in the space of 3D MRI scans**
  1. Build a good 3D brain MRI generator
  2. Estimate progression over time, e.g. through a conditional variable

$$\min_G \max_D \mathbb{E}_{X,a}[\log D(X, a)] + \mathbb{E}_{z,\textcolor{red}{a}}[\log(1 - D(G(z, \textcolor{red}{a})))]$$



(submitted to MICCAI 2021)

