

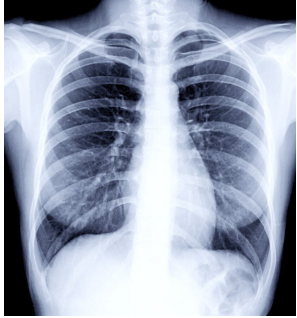
Emerging Neuroimaging Techniques for Brain Tumor Characterization and Beyond

Presenter: Jingwen Yao

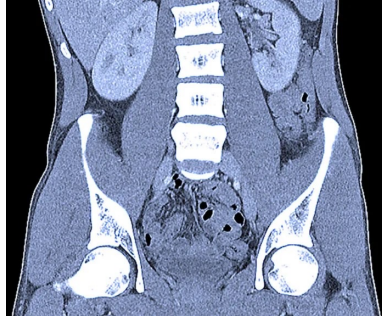
M229 Advanced Topics in MRI

May 30, 2023

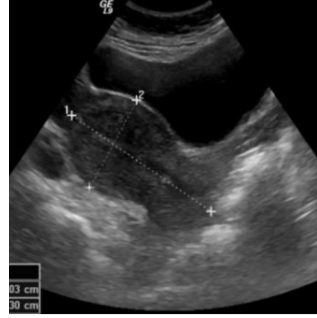
Medical Imaging Modalities



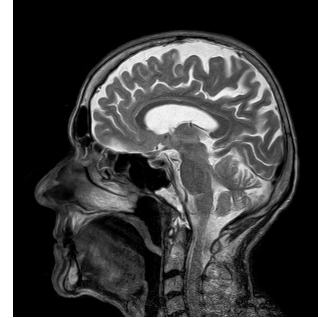
X-ray



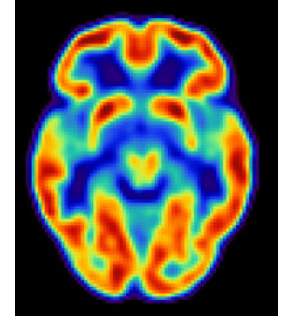
CT



US



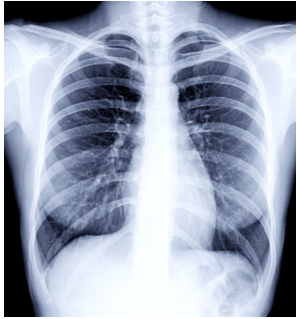
MRI



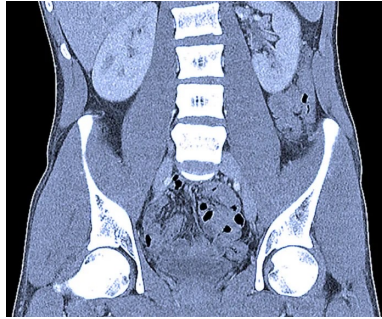
PET/SPECT

- Best for soft tissue contrast
- No ionizing radiation
- Full body multi-planar imaging
- External contrast optional

Medical Imaging Modalities



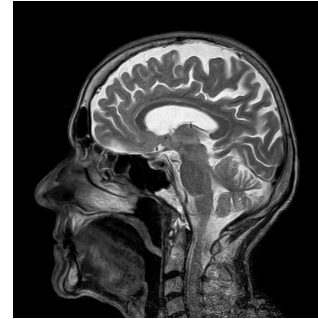
X-ray



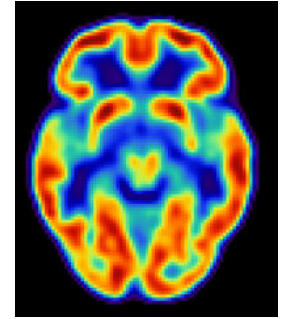
CT



US



MRI



PET/SPECT

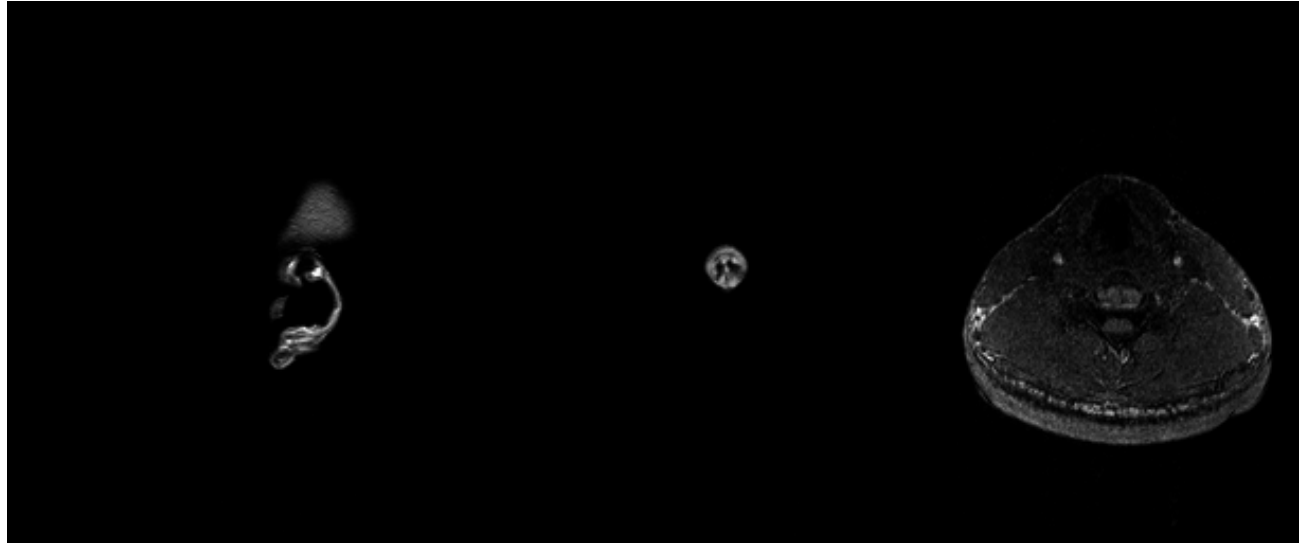
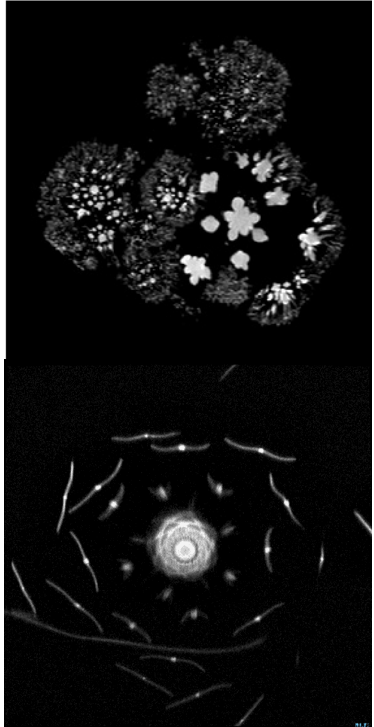
Higher spatial resolution

Lower spatial resolution

Structural information

Functional information

Magnetic Resonance Imaging



Neuroimaging



Anatomic imaging

- Structural information



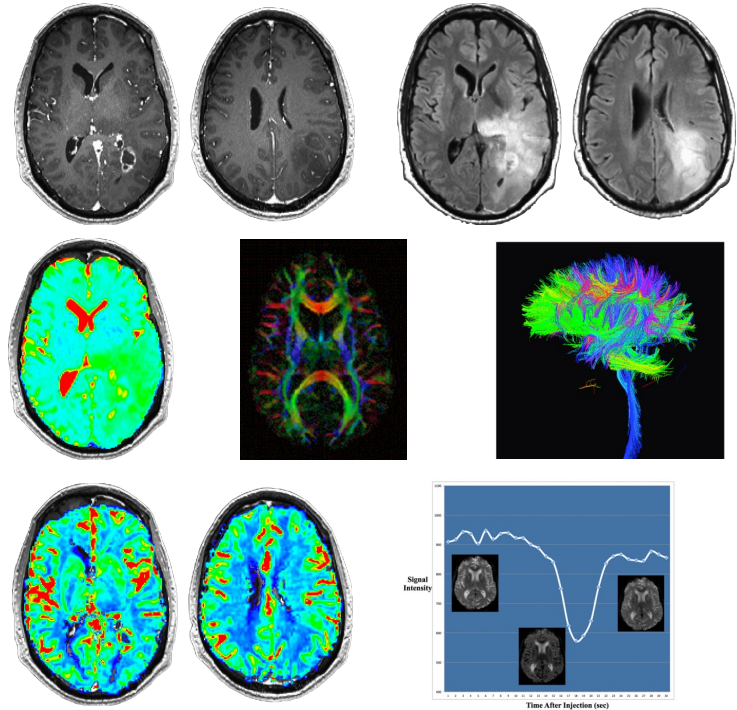
Diffusion Imaging

- Cellularity, neurite density, structural connectivity
- Surgery planning

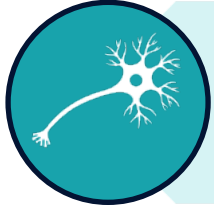


Perfusion Imaging

- Blood volume, blood flow, vessel permeability

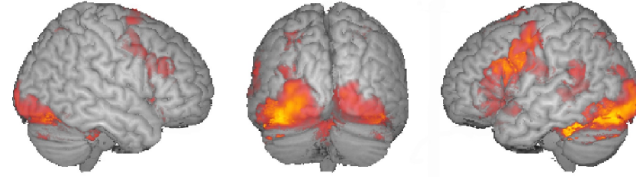


Neuroimaging



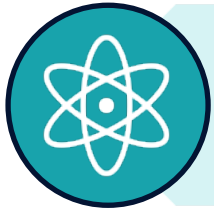
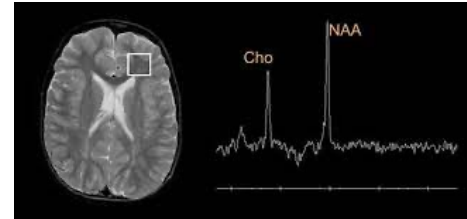
Functional MRI

- Activation map
- Functional connectivity



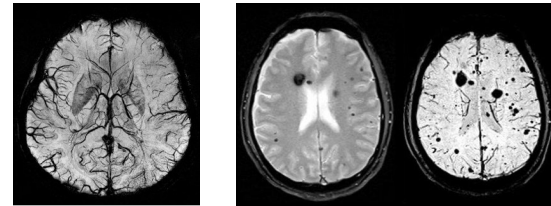
MR Spectroscopy

- Chemical composition

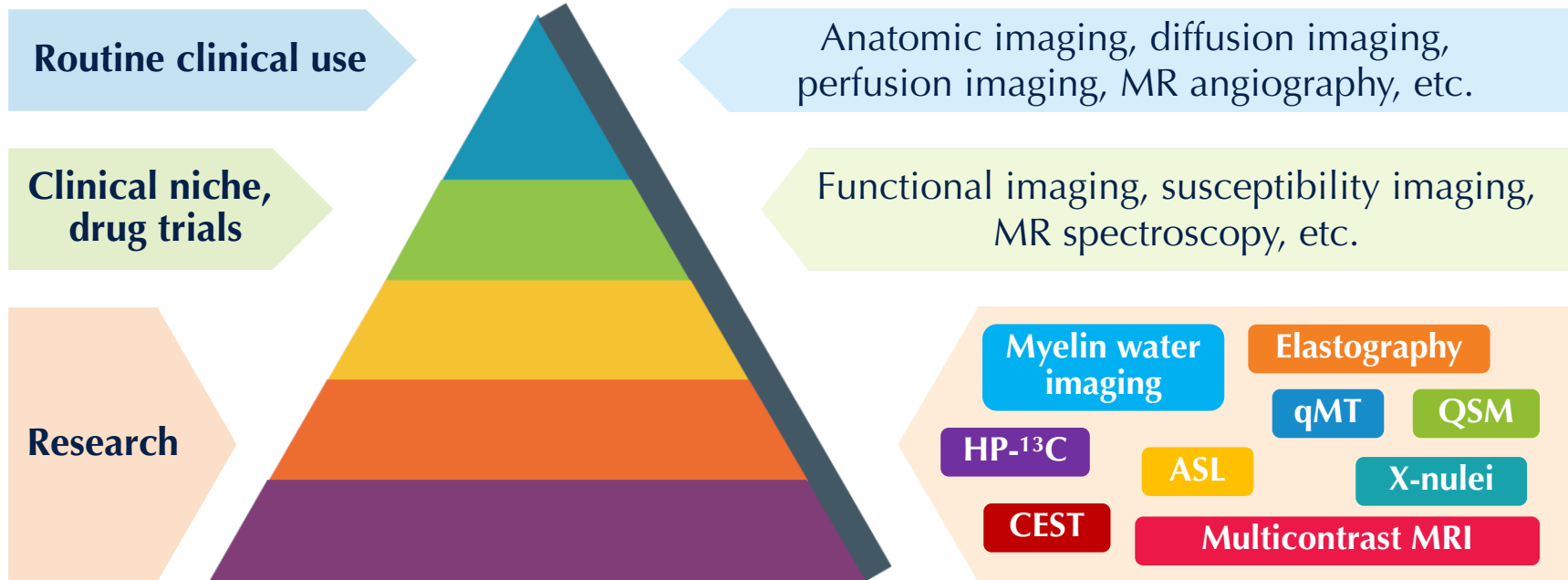


Susceptibility Imaging

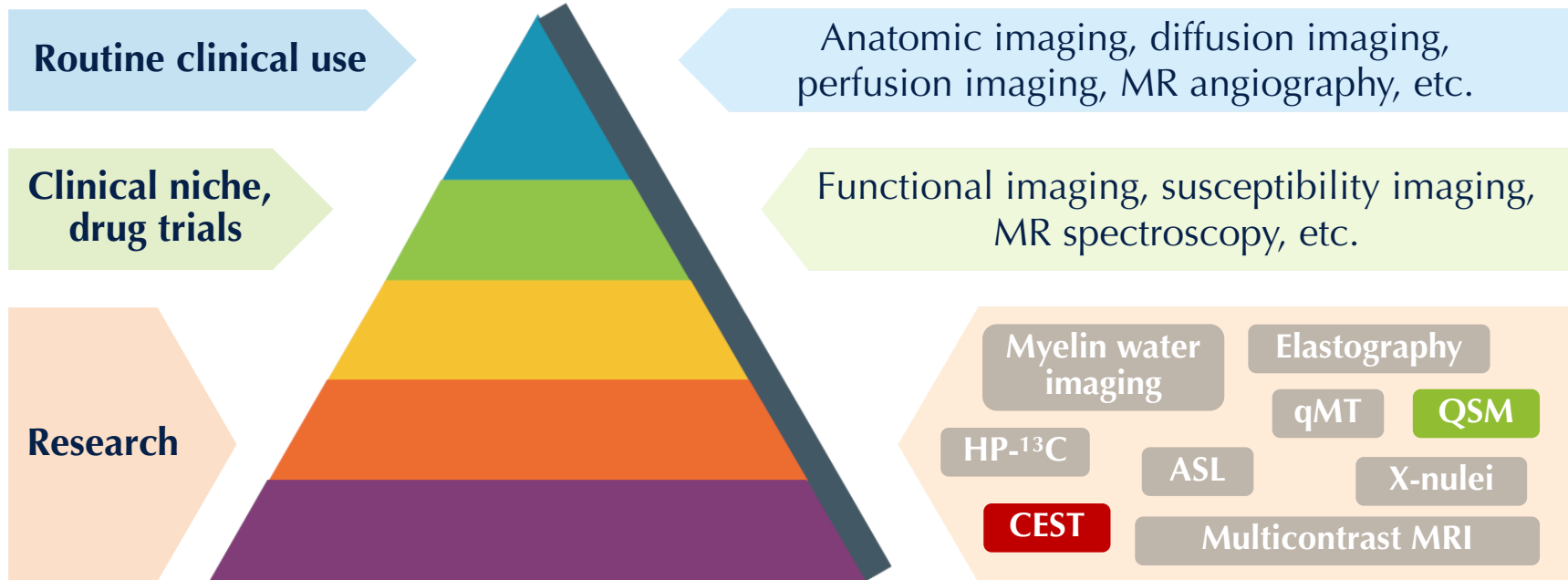
- Hemorrhage, microbleed, veins, iron deposition



Neuroimaging

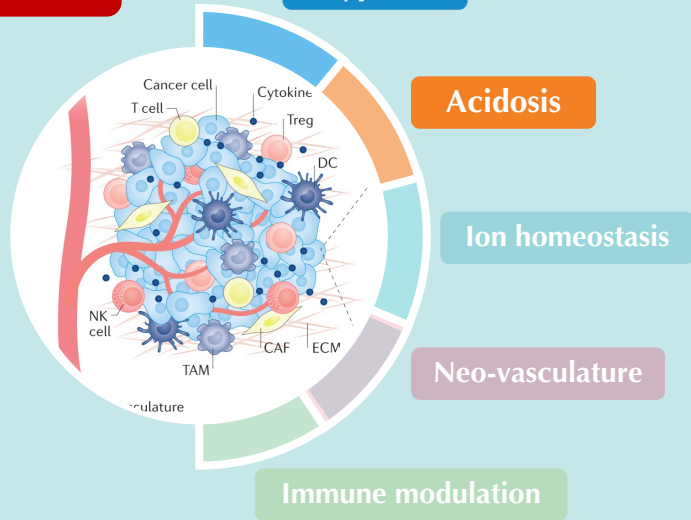


Neuroimaging



Outline

CEST



Glioma microenvironment

QSM

Brain iron imaging of subcortical nuclei in HD

Huntington's disease

Ongoing projects

1. Tumor associated macrophage imaging using ferumoxytol MRI
2. Understanding the role of cerebellum in HD

Glioma

Glioma

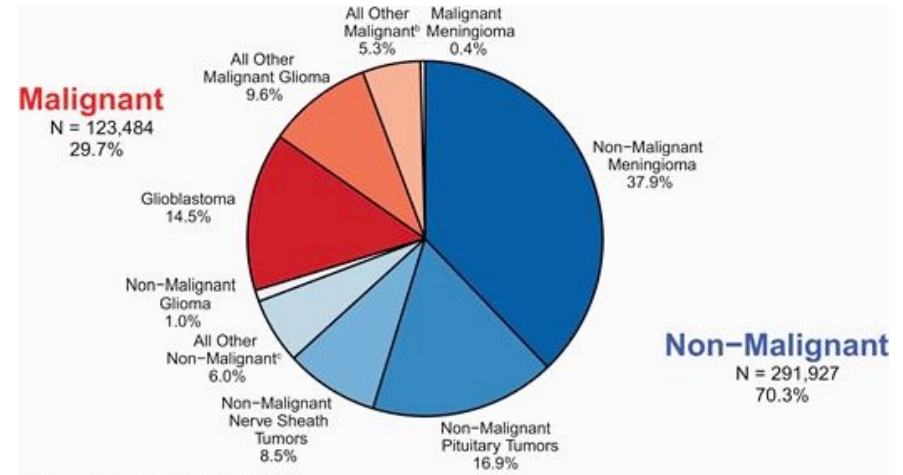
27% CNS tumors

81% malignant CNS tumors

Glioblastoma (GBM)

58% gliomas

5-year relative survival rate 7.2%

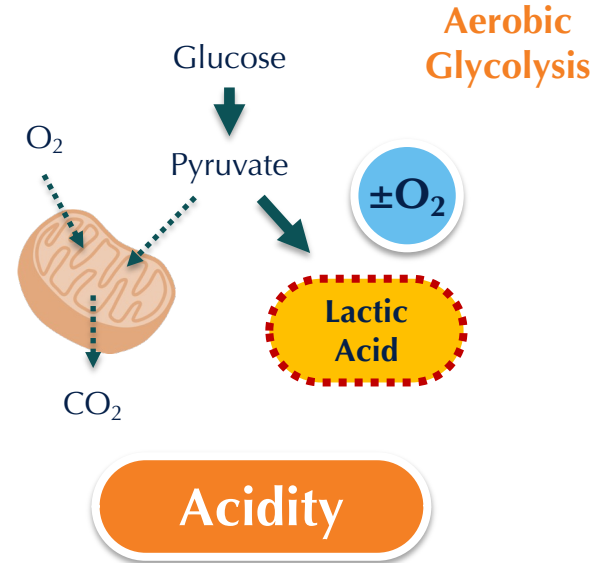
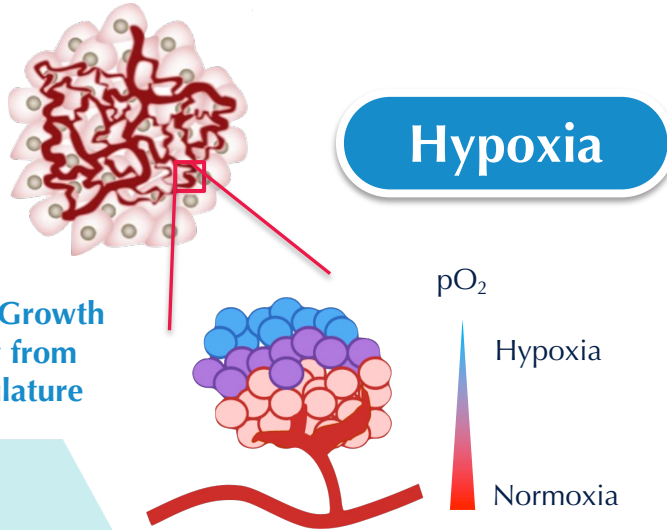


Tumor Metabolism and Microenvironment

Abnormal Vasculature

Tumor Growth Away from Vasculature

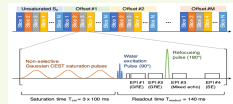
Tumor invasion
Angiogenesis
Resistance to therapy
Decreased immune function
...



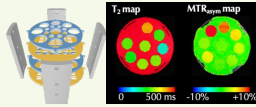
pH- and Oxygen-Sensitive Imaging for Glioma

Technical development and validation

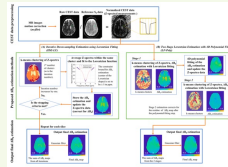
Sequence Design and Implementation



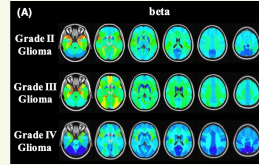
A Physical Phantom for CEST MRI



Improved B₀-Correction Algorithm

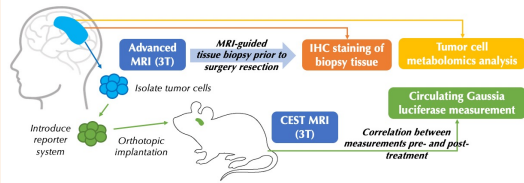


Evaluation of *in vivo* Variability

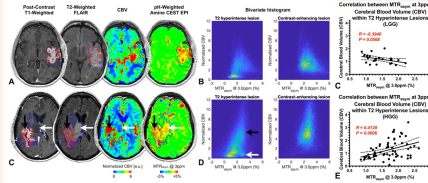


Biological validation

Correlation with Cellular Metabolomics, Tissue IHC Biomarkers, and Glioma Mice Model Tumor Burden



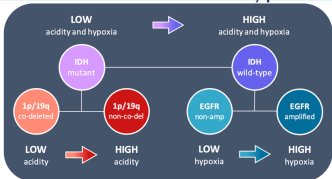
Correlation with Perfusion MRI



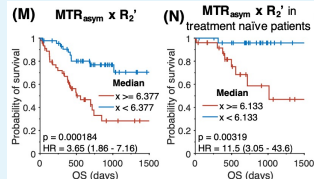
Development and validation of a pH- and oxygen-sensitive MRI technique

Clinical validation

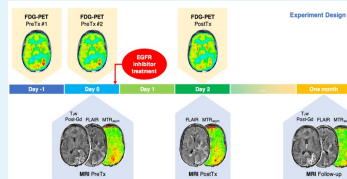
Metabolic Differences across Glioma Genotypes



Prognostics Biomarker for Glioma Patient Survival



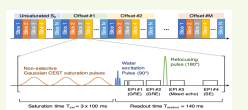
Imaging Biomarker for Treatment Efficacy Assessment



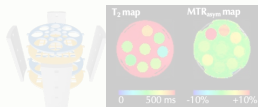
pH- and Oxygen-Sensitive Imaging for Glioma

Technical development and validation

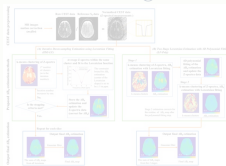
Sequence Design and Implementation



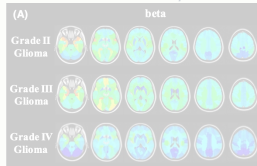
A Physical Phantom for CEST MRI



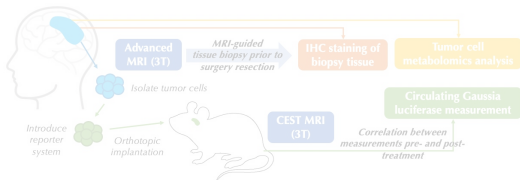
Improved B₀-Correction Algorithm



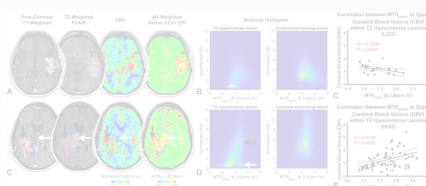
Evaluation of *in vivo* Variability



Correlation with Cellular Metabolomics, Tissue IHC Biomarkers, and Glioma Mice Model Tumor Burden



Correlation with Perfusion MRI

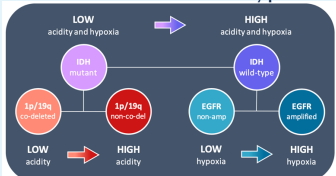


Biological validation

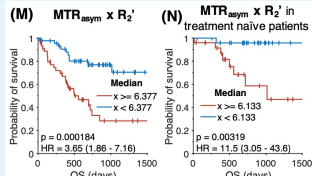
Development and validation of a pH- and oxygen-sensitive MRI technique

Clinical validation

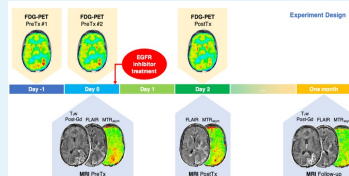
Metabolic Differences across Glioma Genotypes



Prognostic Biomarker for Glioma Patient Survival



Imaging Biomarker for Treatment Efficacy Assessment



CEST-SAGE-EPI Sequence

CEST

SAGE

EPI

Chemical Exchange Saturation Transfer

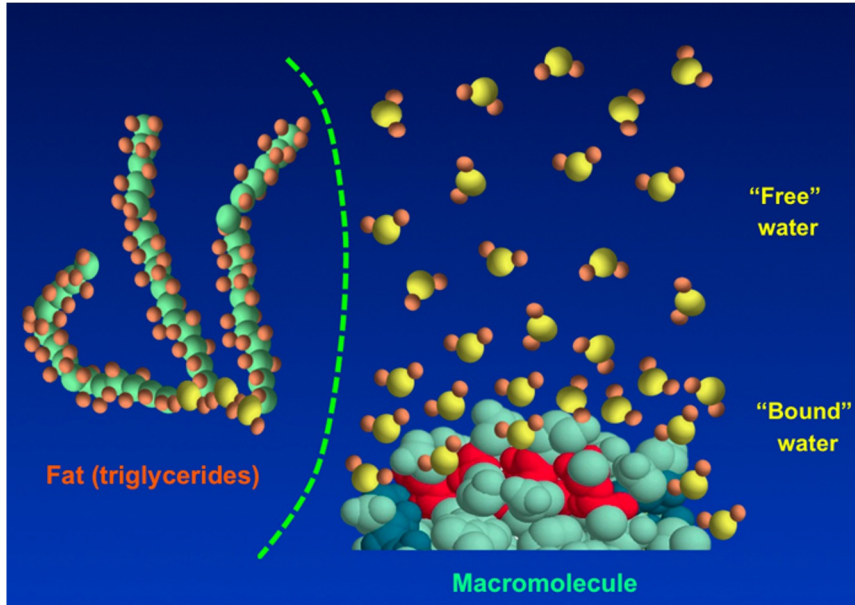
CEST

SAGE

EPI

Chemical Exchange Saturation Transfer

Source of MR signal



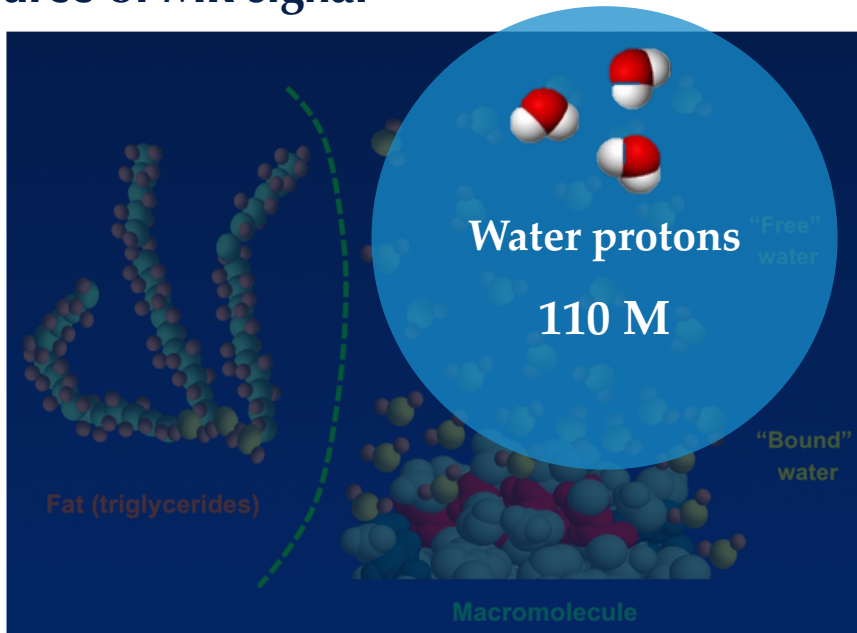
CEST

SAGE

EPI

Chemical Exchange Saturation Transfer

Source of MR signal



Labile
molecules

μM to mM



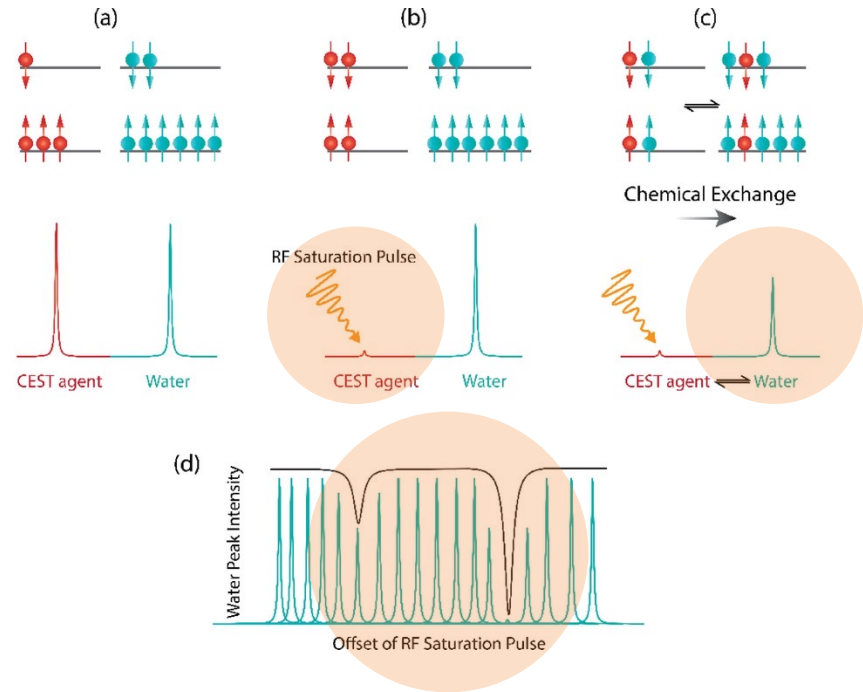
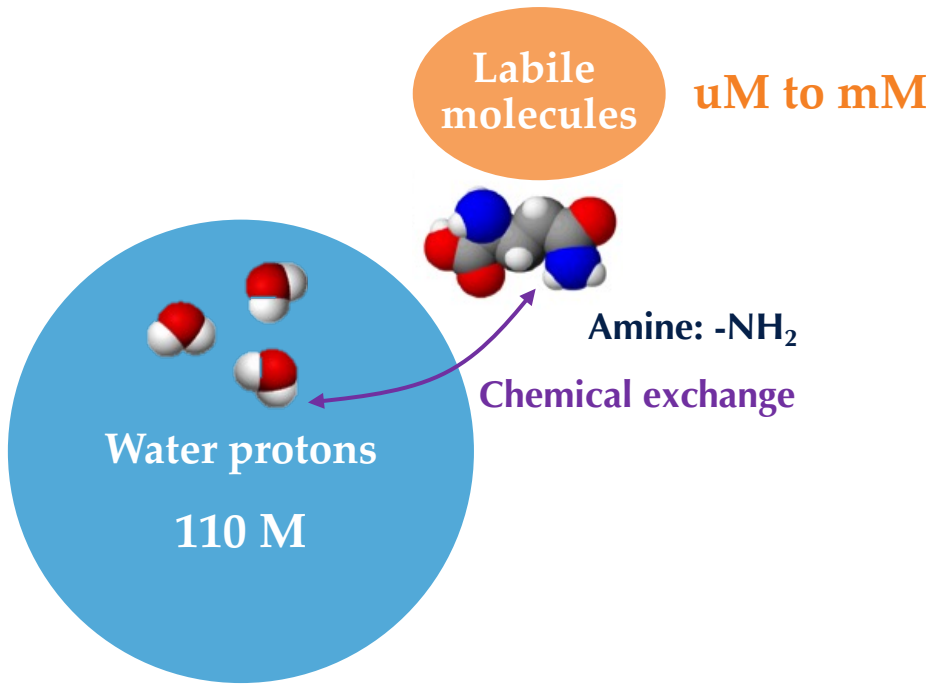
Amine: $-\text{NH}_2$

CEST

SAGE

EPI

Chemical Exchange Saturation Transfer



CEST

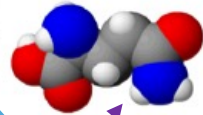
SAGE

EPI

Chemical Exchange Saturation Transfer

Labile molecules

uM to mM



Amine: -NH₂

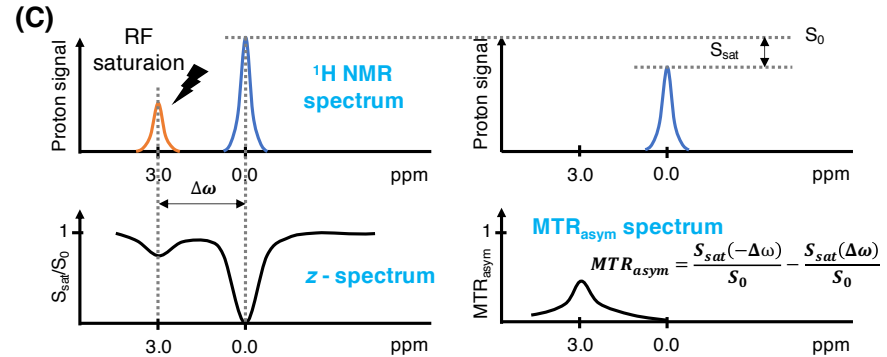
Chemical exchange

Water protons

110 M

Base catalyzed

$$k_b = k_0 + k_{\text{base}} * 10^{-(14-pH)}$$



- Metabolite concentration
- Chemical exchange rate

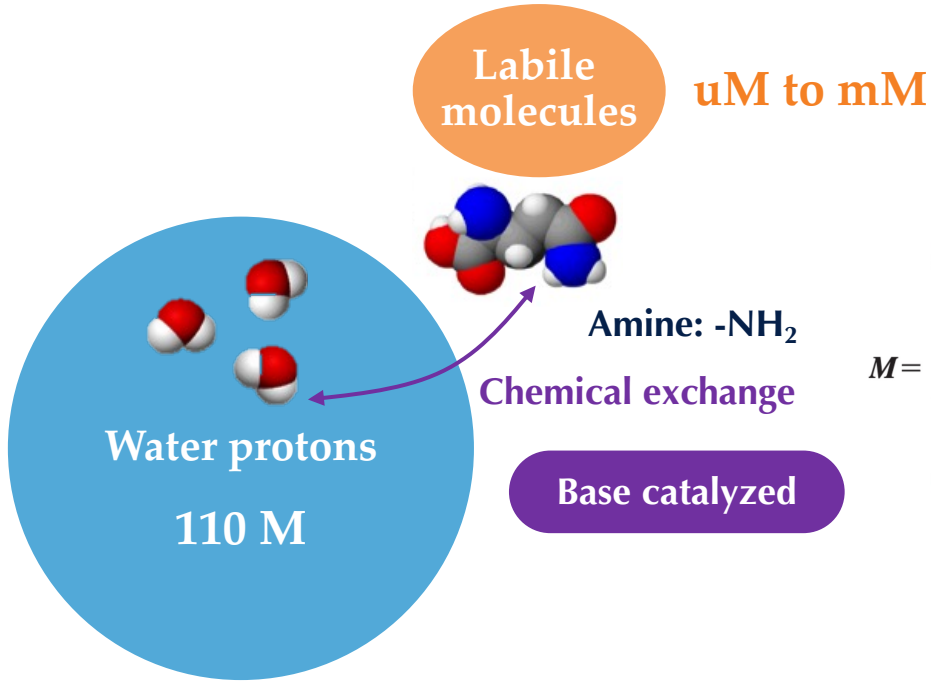
CEST effect

CEST

SAGE

EPI

Chemical Exchange Saturation Transfer



Bloch-McConnell equations

$$\frac{d\mathbf{M}(t)}{dt} = \mathbf{X} \cdot \mathbf{M}(t) - \mathbf{c},$$

$$\mathbf{M} = \begin{pmatrix} M_{ax} \\ M_{bx} \\ M_{ay} \\ M_{by} \\ M_{az} \\ M_{bz} \end{pmatrix}, \mathbf{X} = \begin{pmatrix} C_{2a} & k_b & -\delta a & 0 & 0 & 0 \\ k_a & C_{2b} & 0 & -\delta b & 0 & 0 \\ \delta a & 0 & C_{2a} & k_b & -\omega_1 & 0 \\ 0 & \delta b & k_a & C_{2b} & 0 & -\omega_1 \\ 0 & 0 & \omega_1 & 0 & C_{1a} & k_b \\ 0 & 0 & 0 & \omega_1 & k_a & C_{1b} \end{pmatrix}, \mathbf{c} = \begin{pmatrix} 0 \\ 0 \\ 0 \\ 0 \\ M_{az0}/T_{1a} \\ M_{bz0}/T_{1b} \end{pmatrix},$$

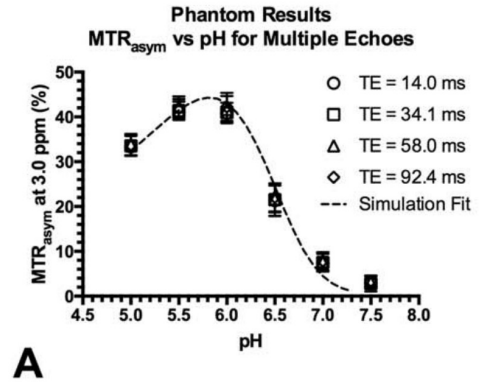
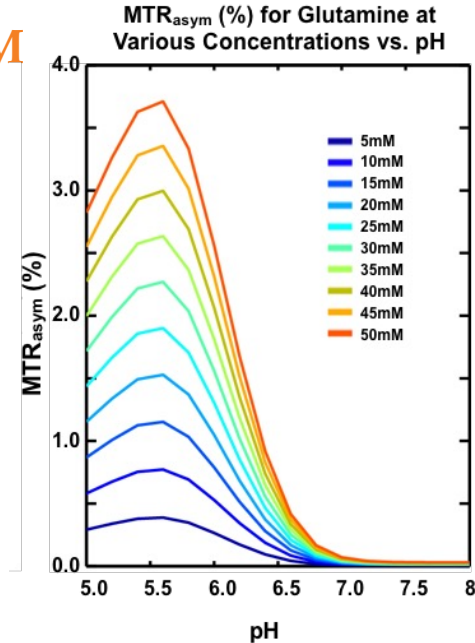
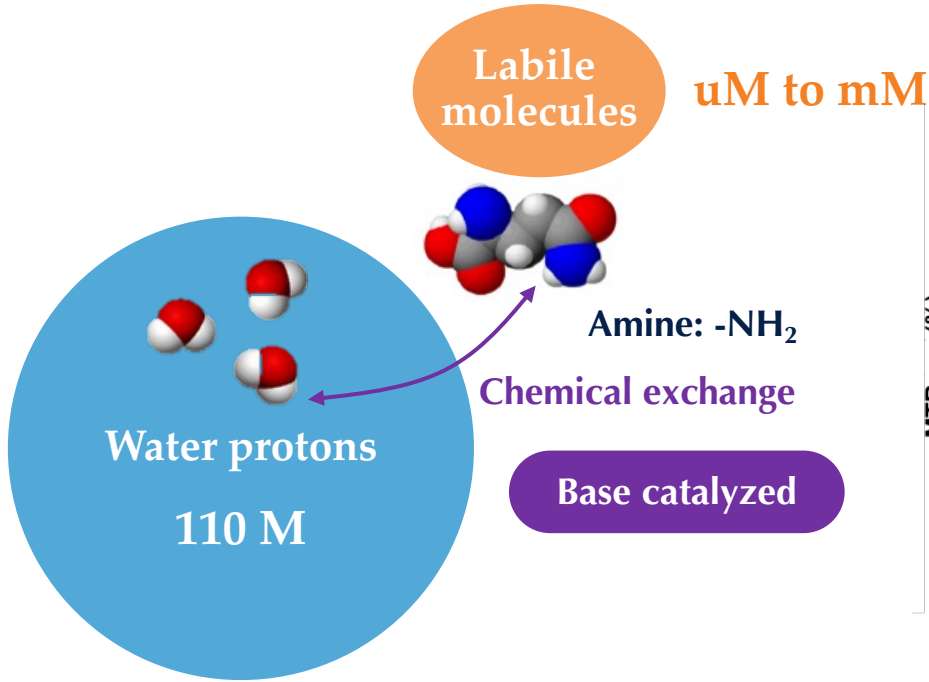
CEST

SAGE

EPI

Chemical Exchange Saturation Transfer

Bloch-McConnell equations



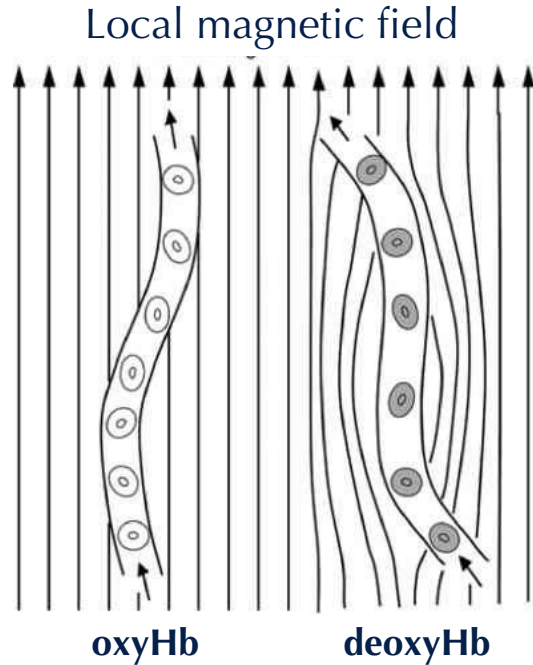
Harris RJ*, Yao J*, et al., MRM, 2018

CEST

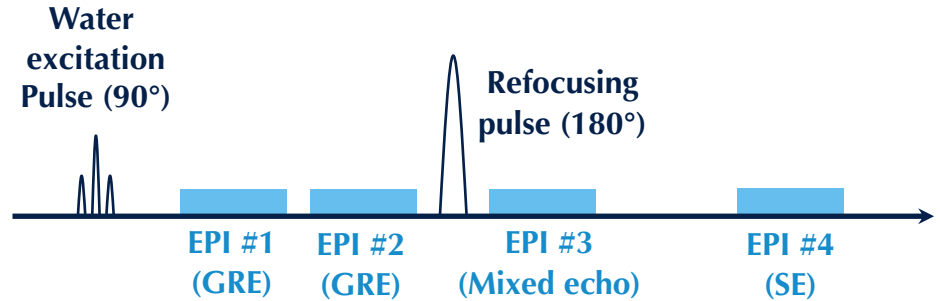
SAGE

EPI

Spin-And-Gradient Echo



- **Blood-oxygenation level dependent (BOLD)** effect
- Reversible transverse relaxation rate R_2'



CEST

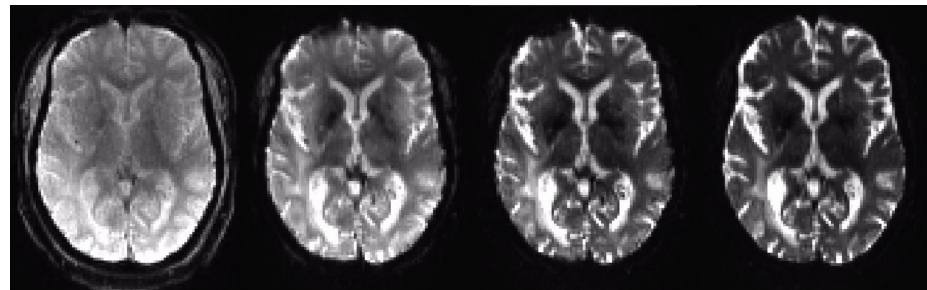
SAGE

EPI

Spin-And-Gradient Echo

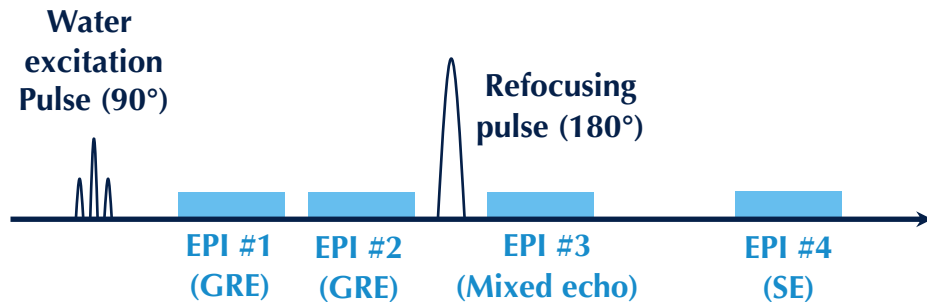
$$A = Y^{-1}S$$

$$S = \begin{pmatrix} \ln(S_1) \\ \ln(S_2) \\ \ln(S_3) \\ \ln(S_4) \end{pmatrix}, Y = \begin{pmatrix} 1 & 0 & -TE_1 & 0 \\ 1 & 0 & -TE_2 & 0 \\ 1 & -1 & -TE_4 + TE_3 & TE_4 - 2 \cdot TE_3 \\ 1 & -1 & 0 & -TE_4 \end{pmatrix}, A = \begin{pmatrix} \ln(S_0) \\ \ln(\delta) \\ R_2^* \\ R_2 \end{pmatrix}$$



$$R_2' = R_2^* - R_2$$

$$rOEF = \frac{R_2'}{\left(\frac{4}{3} \gamma \cdot \pi \cdot \Delta\chi \cdot B_0\right) \cdot rCBV}$$

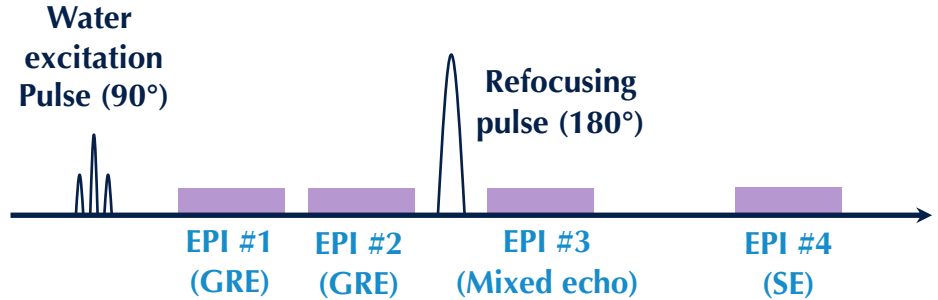
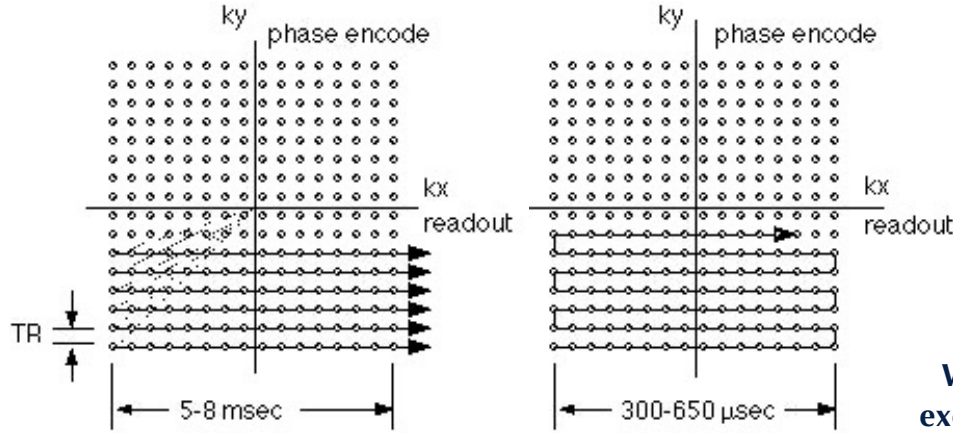


CEST

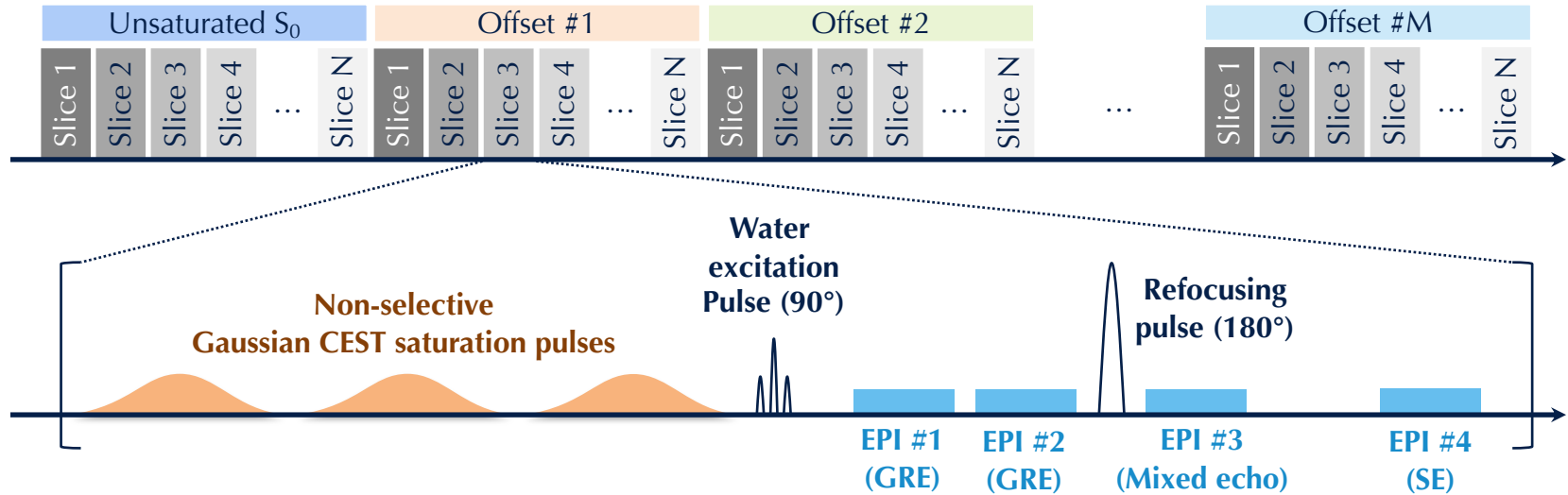
SAGE

EPI

Echo-Planar Imaging



CEST-SAGE-EPI sequence



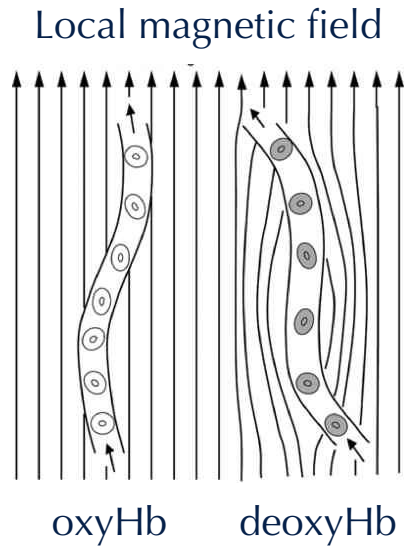
CEST

pH-sensitive

SAGE-EPI

Oxygen-sensitive

CEST-SAGE-EPI sequence

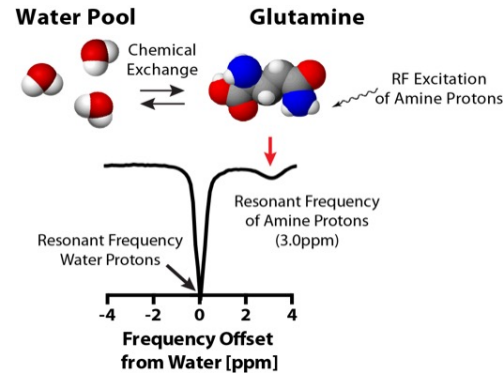


Hypoxia

Reversible
transverse relaxation
 $R_2' = R_2^* - R_2$

Spin-and-gradient
echo (SAGE)

Higher R_2'
↓
More hypoxic



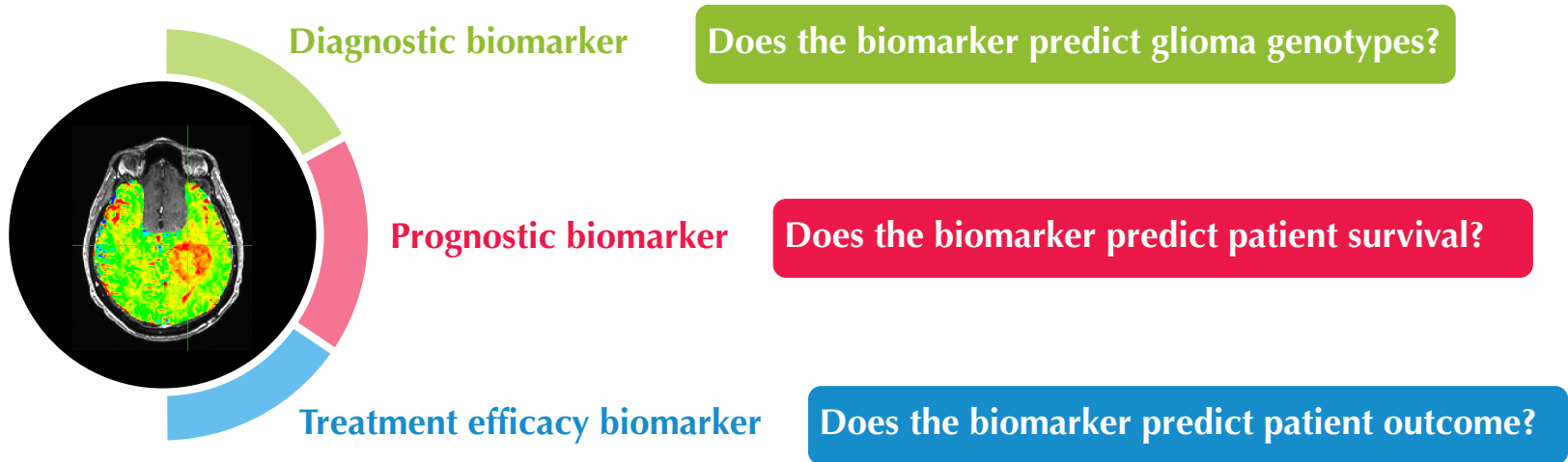
Acidity

pH-sensitive
amineCEST

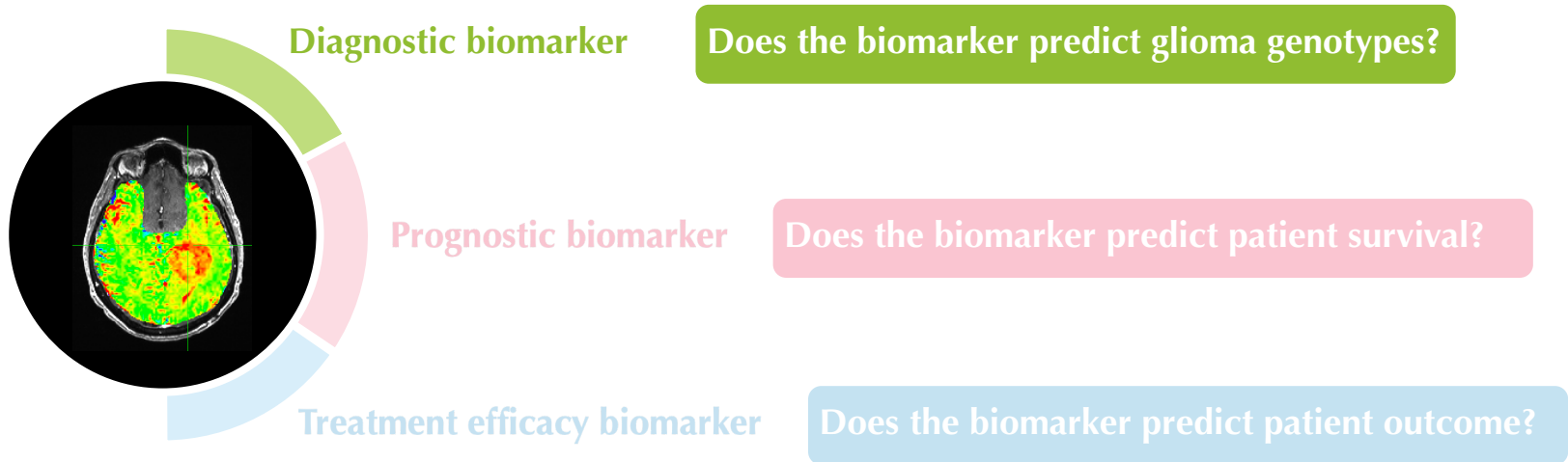
Chemical exchange
saturation transfer

Higher MTR_{asym}
↓
More acidic

Clinical validation of pH- and oxygen-sensitive MRI



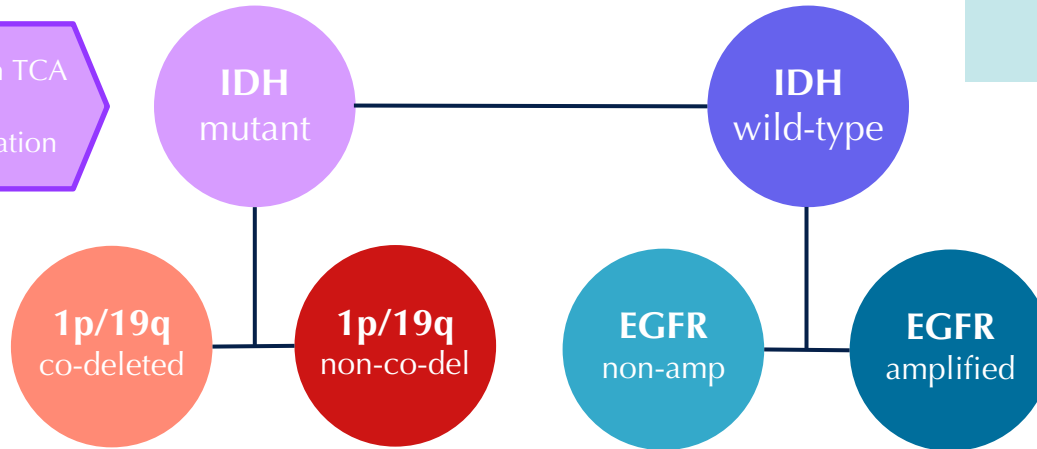
Clinical validation of pH- and oxygen-sensitive MRI



Clinical validation: differentiating glioma genotypes

- Higher dependency on TCA cycle
- Reduced lactate generation

- Silenced NHE-1
- CIC mutations cooperatively regulate 2-HG levels



- Prognostic factors
- Little is known about the *in vivo* microenvironment characteristics

- Triggered by hypoxic tumor environment
- Promote angiogenesis

Patient demographics

Retrospective Study

Inclusion criteria

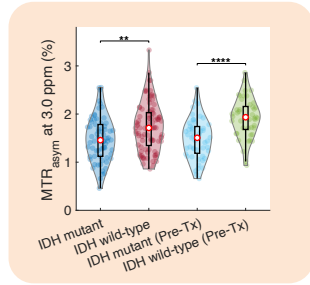
- Adult patient
- Pathologically confirmed glioma
- IDH status available
- Received CEST-EPI / CEST-SAGE-EPI scan

	2016 WHO Grading			
	All patients	Grade II	Grade III	Grade IV
No. of patients <i>(treatment naive / on treatment)</i>	159 (96/63)	42 (33/9)	38 (28/10)	79 (35/44)
Age <i>median [range]</i>	52 [19 - 90]	41 [22 - 90]	48.5 [21 - 70]	59 [19 - 83]
Sex <i>male / female</i>	101/58	24/18	24/14	53/26
IDH status <i>wild-type / mutant</i>	89/70	3/39	13/25	73/6
1p/19q status in IDH mutant <i>non-codeleted / codeleted / NA</i>	35/29/6	16/20/3	15/9/1	4/0/2
EGFR status in IDH wild-type <i>wild-type / amplified / NA</i>	42/40/7	2/1/0	9/3/1	31/36/6

Clinical validation: differentiating glioma genotypes

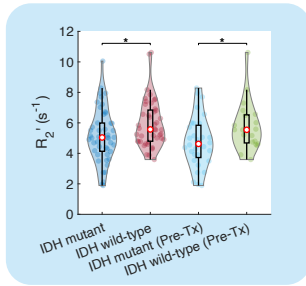
Acidity

Mutant ◀ Wild-type



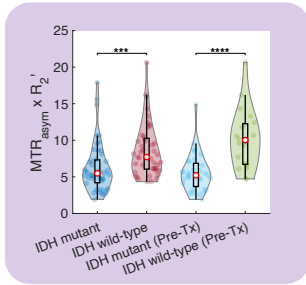
Hypoxia

Mutant ◀ Wild-type



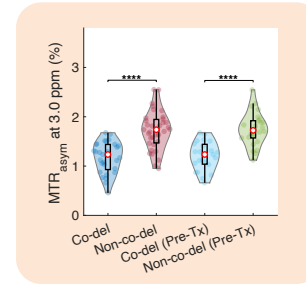
Acidity + Hypoxia

Mutant ◀ Wild-type



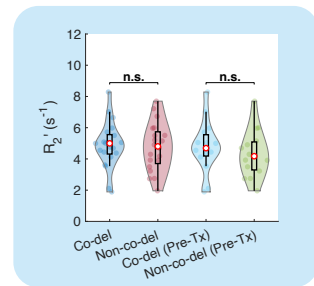
Acidity

Co-del ◀ Non-co-del

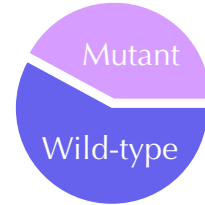


Hypoxia

Co-del ≈ Non-co-del



IDH



1p/19q
Co-deleted



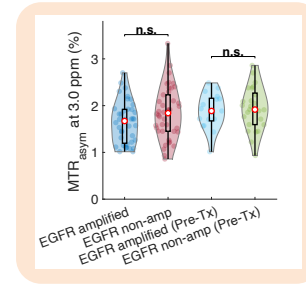
Non-co-deleted

EGFR
Amplified

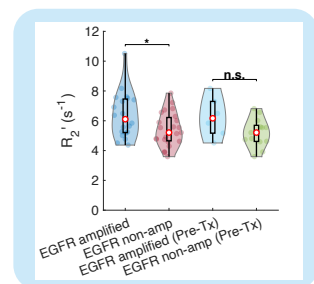


Non-amplified

Amplified ≈ Non-amp

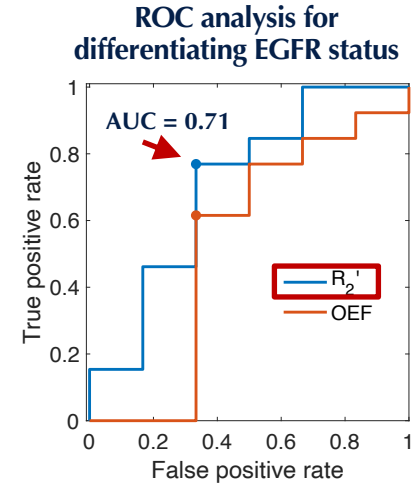
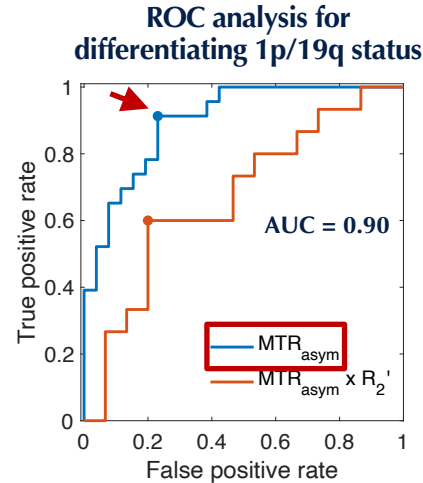
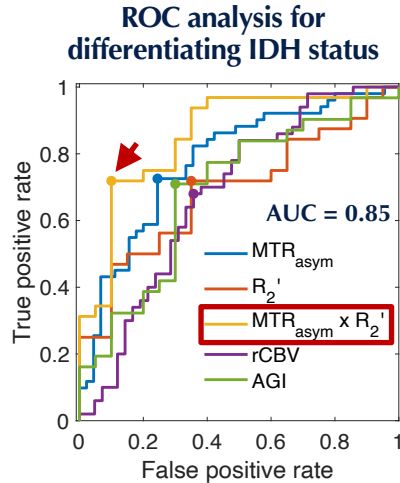


Amplified ▶ Non-amp

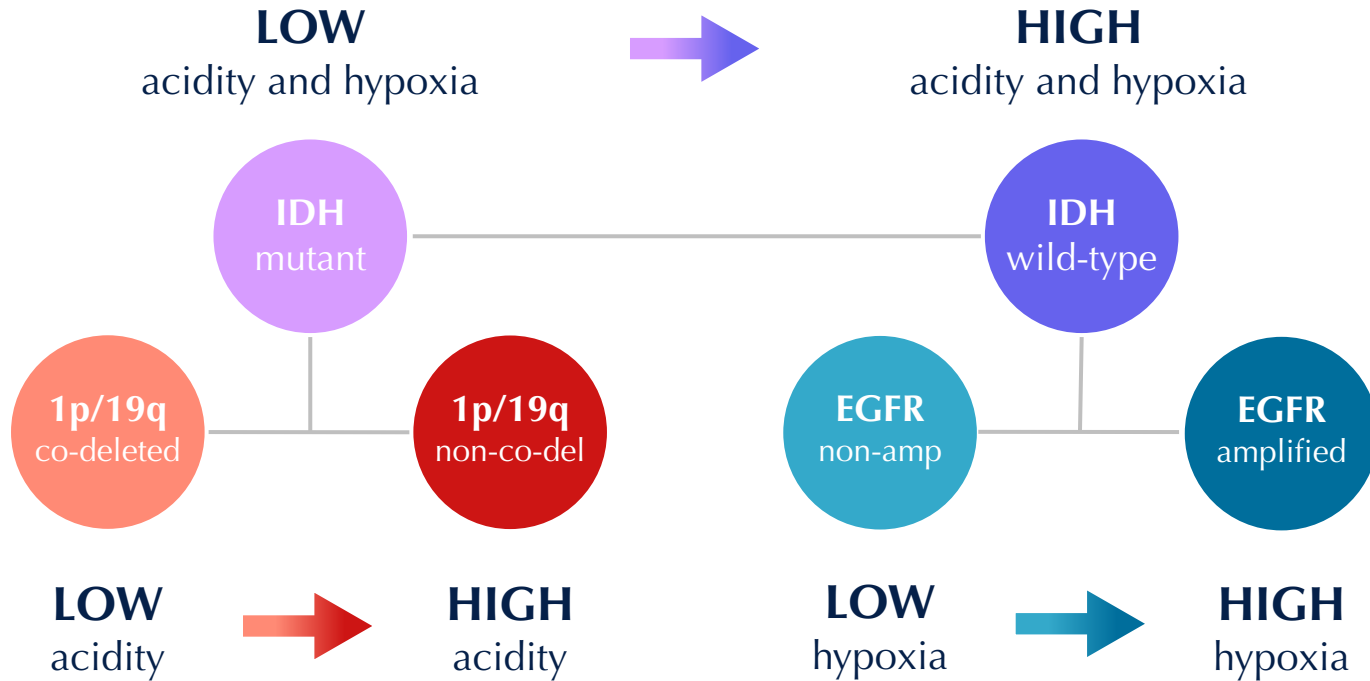


Clinical validation: differentiating glioma genotypes

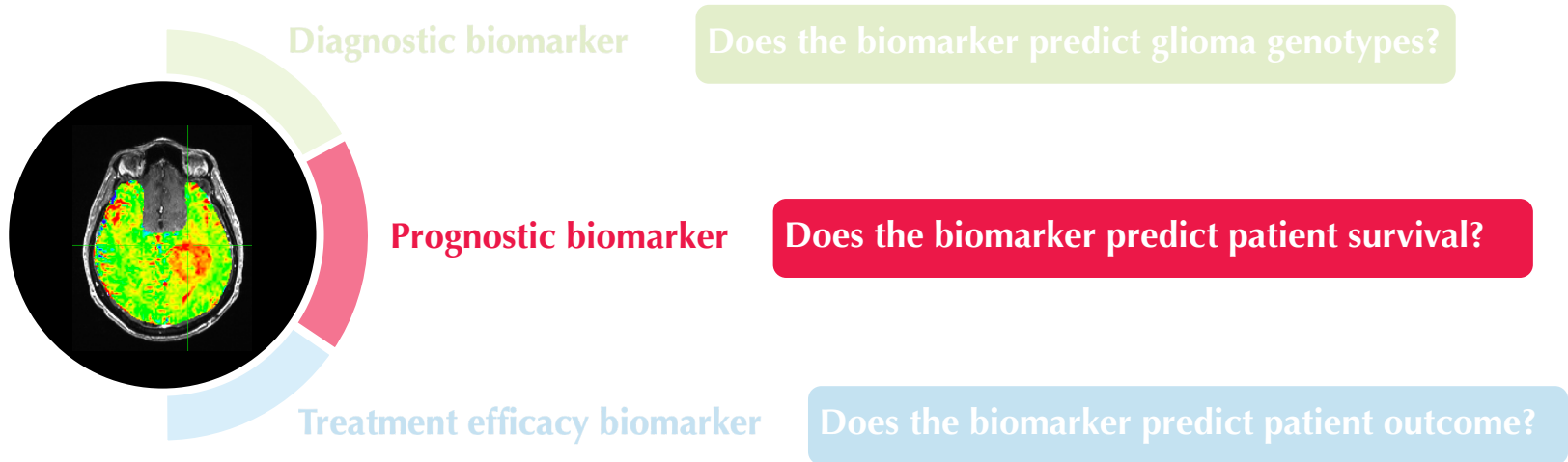
ROC analysis (treatment naïve patients N = 96)



Clinical validation: differentiating glioma genotypes



Clinical validation of pH- and oxygen-sensitive MRI



Clinical validation: predicting patient survival

Overall survival

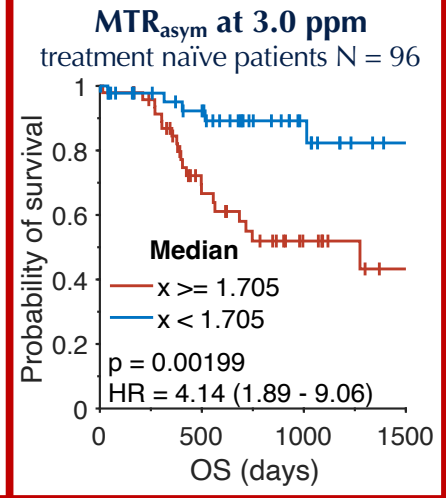
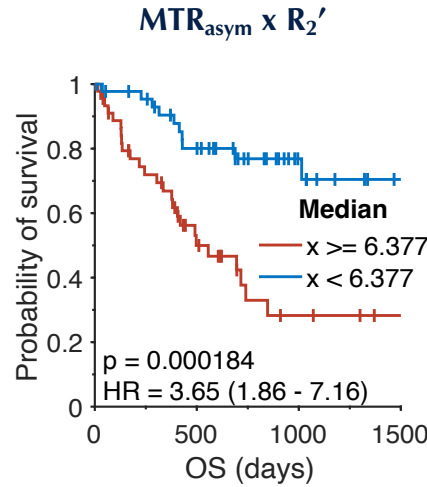
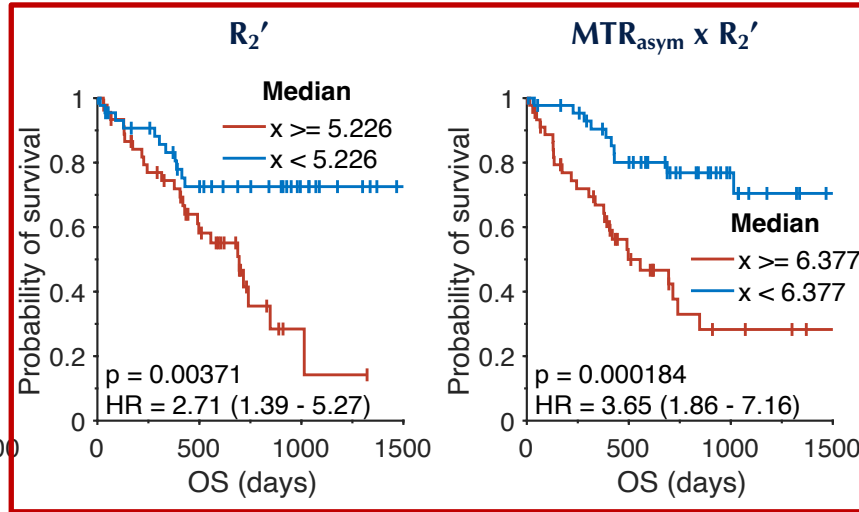
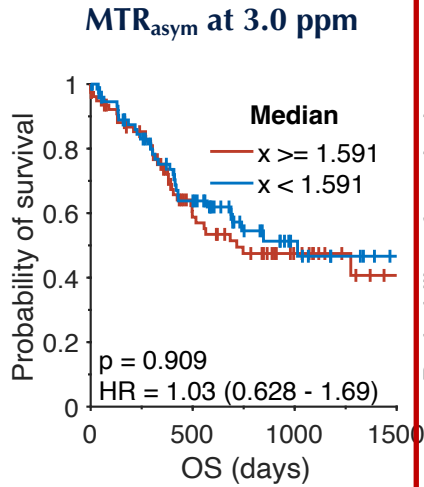
Cox Proportional-Hazards

Model Analysis

- Univariate
- Multivariate with age, treatment status, and IDH status as covariates

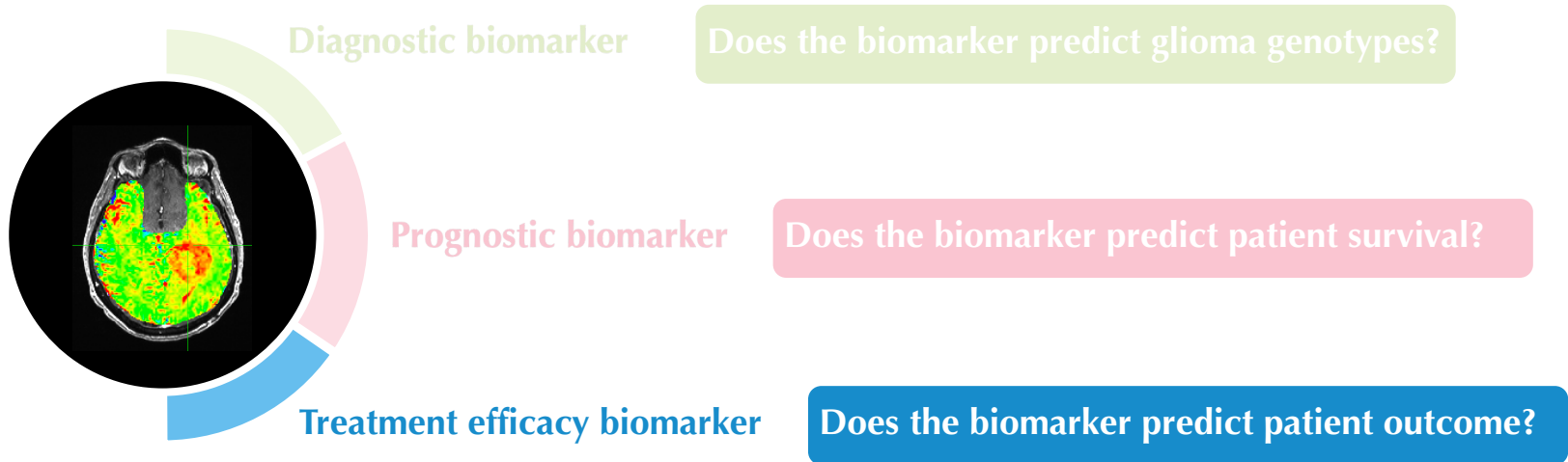
Characteristics	OS (Univariate)			OS (Multivariate)		
	<i>p</i> -value	HR	HR [CI]	<i>p</i> -value	HR	HR [CI]
Age	0.0002	1.035	1.017 - 1.054		Covariate	
Treatment status	< 0.0001	3.748	2.250 - 6.241		Covariate	
IDH status	< 0.0001	0.093	0.042 - 0.206		Covariate	
MTR _{asym} at 3.0 ppm	0.2280	1.360	0.825 - 2.242	0.5474	1.1841	0.683 - 2.053
R ₂ '	0.0002	1.440	1.188 - 1.746	0.0445	1.2703	1.006 - 1.604
MTR _{asym} × R ₂ '	0.0008	1.140	1.056 - 1.231	0.0019	1.1655	1.058 - 1.284
CET+NET volume	< 0.0001	1.007	1.003 - 1.010	0.1526	1.0027	0.999 - 1.006
Acidic volume	0.0003	1.020	1.009 - 1.031	0.0931	1.0103	0.998 - 1.023
Acidic volume fraction	0.0410	1.021	1.001 - 1.041	0.3563	1.0098	0.989 - 1.031

Clinical validation: predicting patient survival



- **Tumor acidity and hypoxia** measured using pH- and oxygen-sensitive MRI are **significant prognostic factors** in glioma.
- Patients with more acidic and hypoxic tumors have significantly shorter survival.

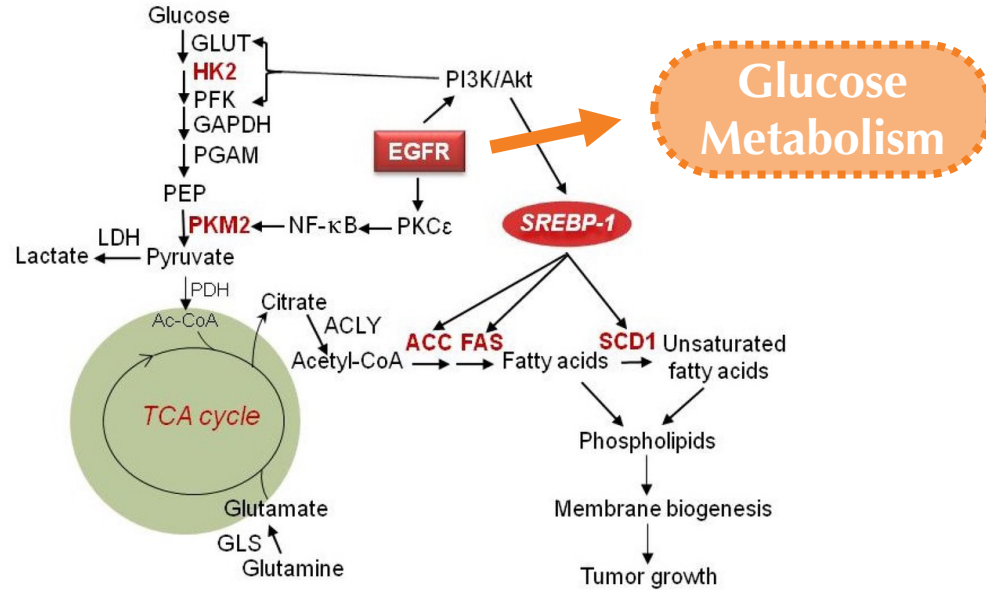
Clinical validation of pH- and oxygen-sensitive MRI



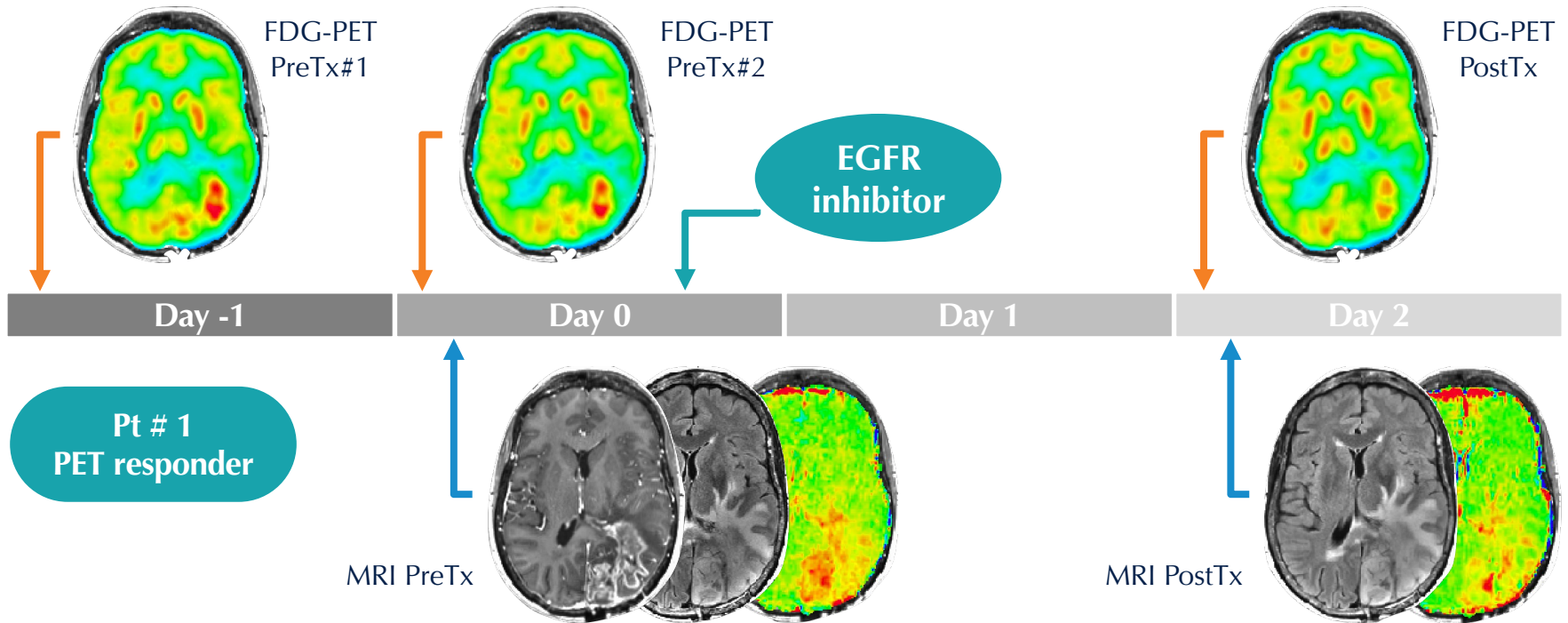
Clinical validation: predicting treatment response

EGFR
inhibitor

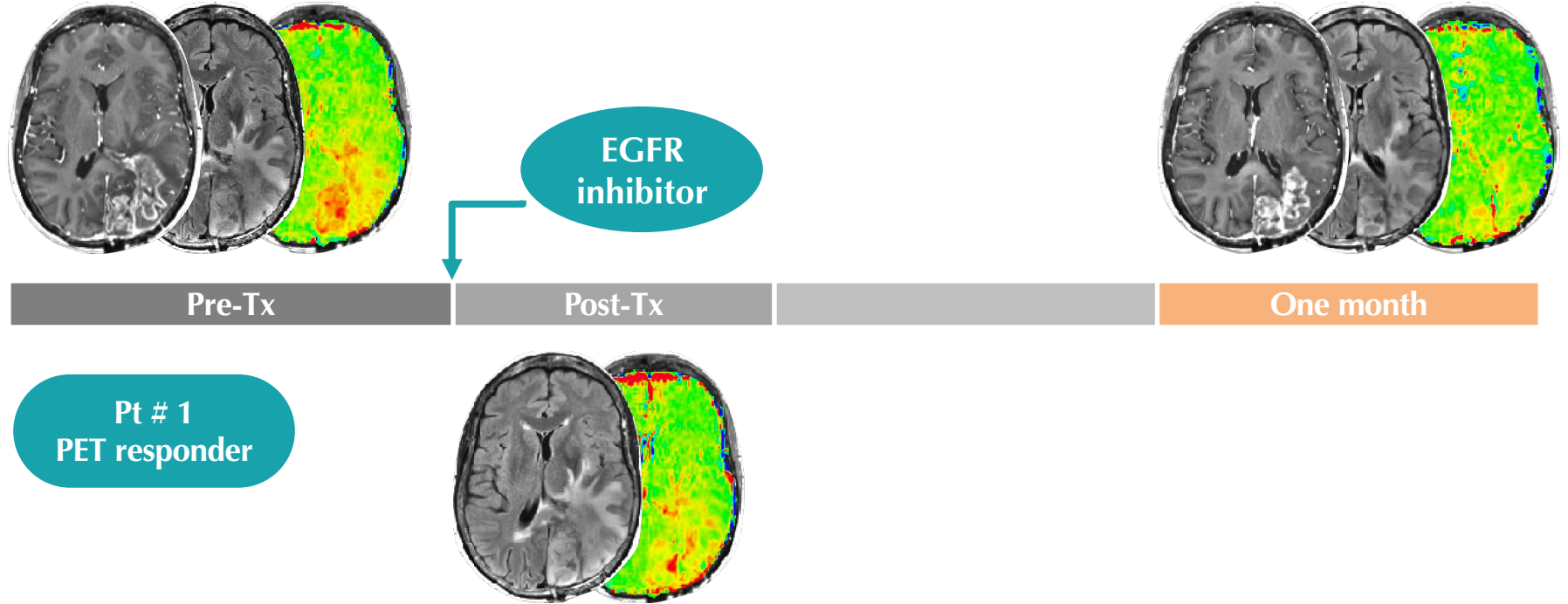
- Target oncogene-driven glucose metabolism



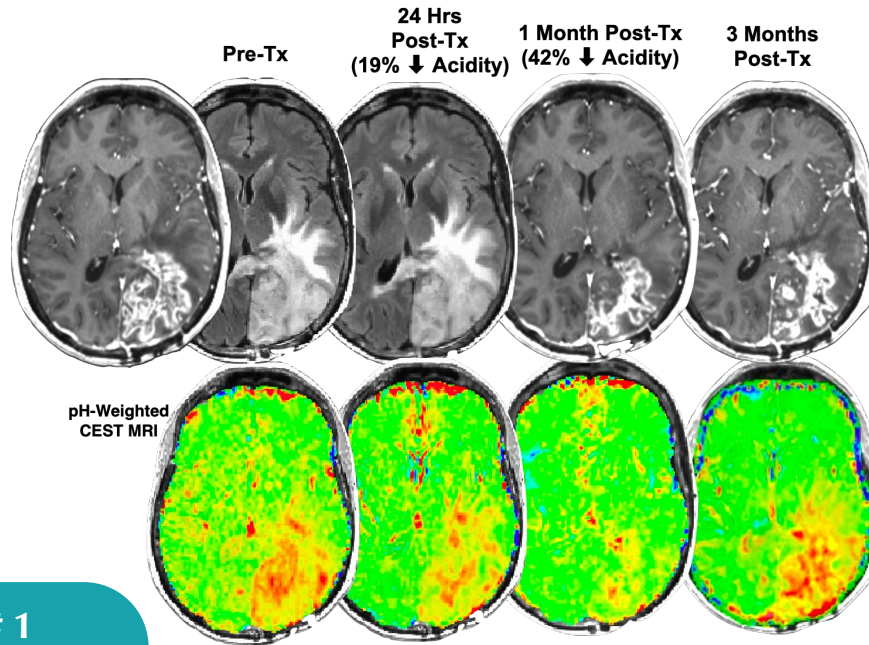
Clinical validation: predicting treatment response



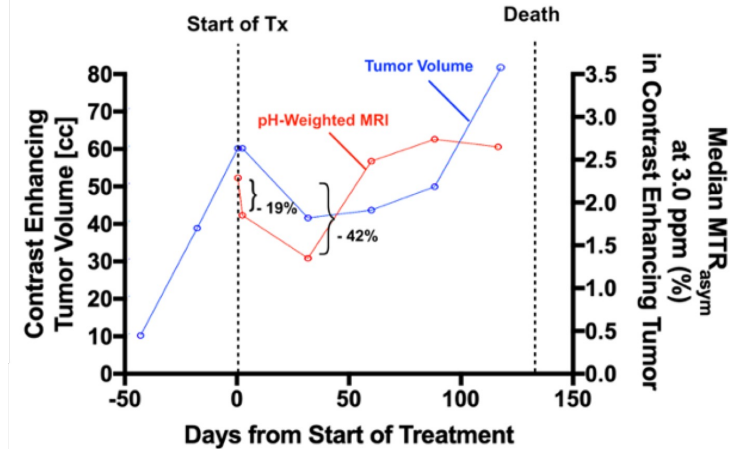
Clinical validation: predicting treatment response



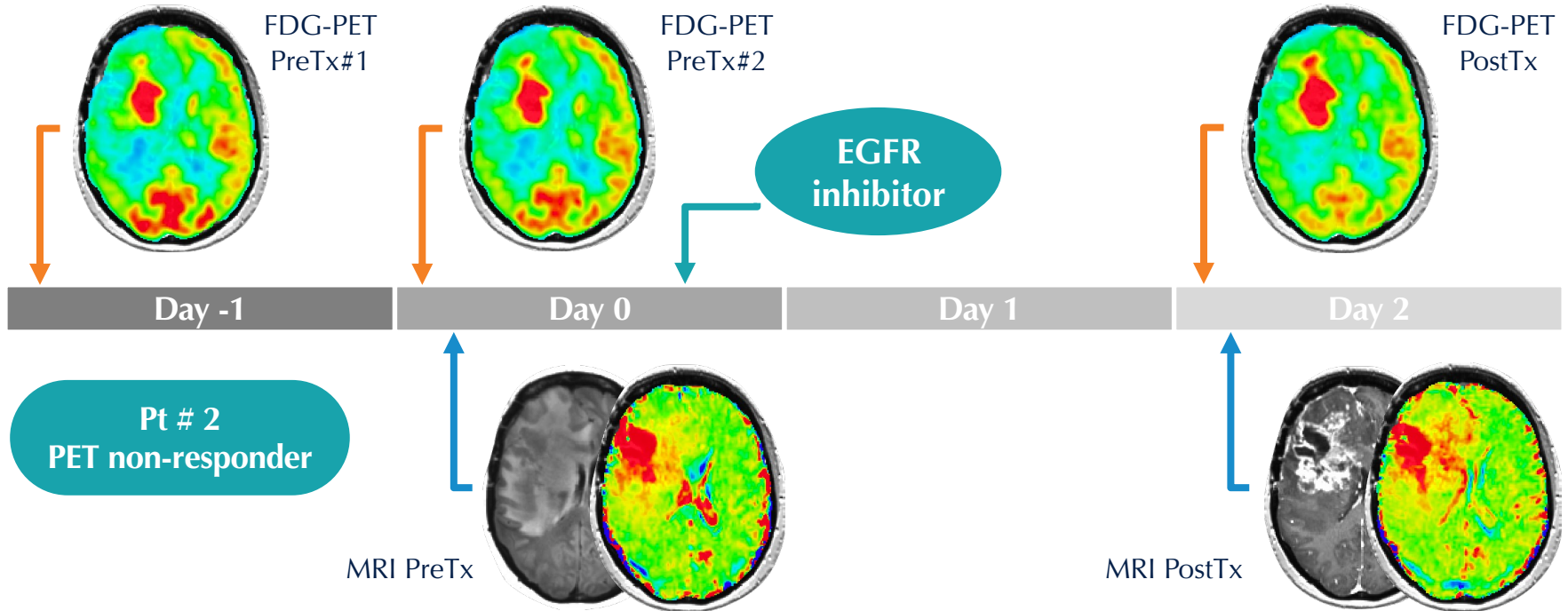
Clinical validation: predicting treatment response



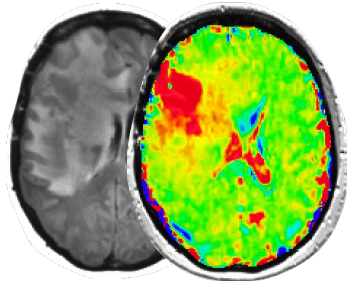
Pt # 1
PET responder



Clinical validation: predicting treatment response



Clinical validation: predicting treatment response

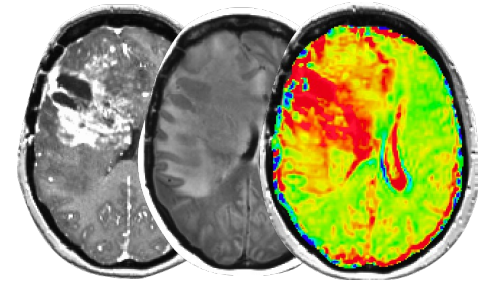


Pre-Tx

EGFR
inhibitor

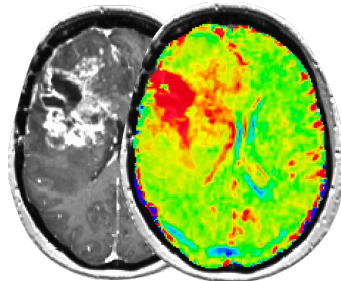


Post-Tx



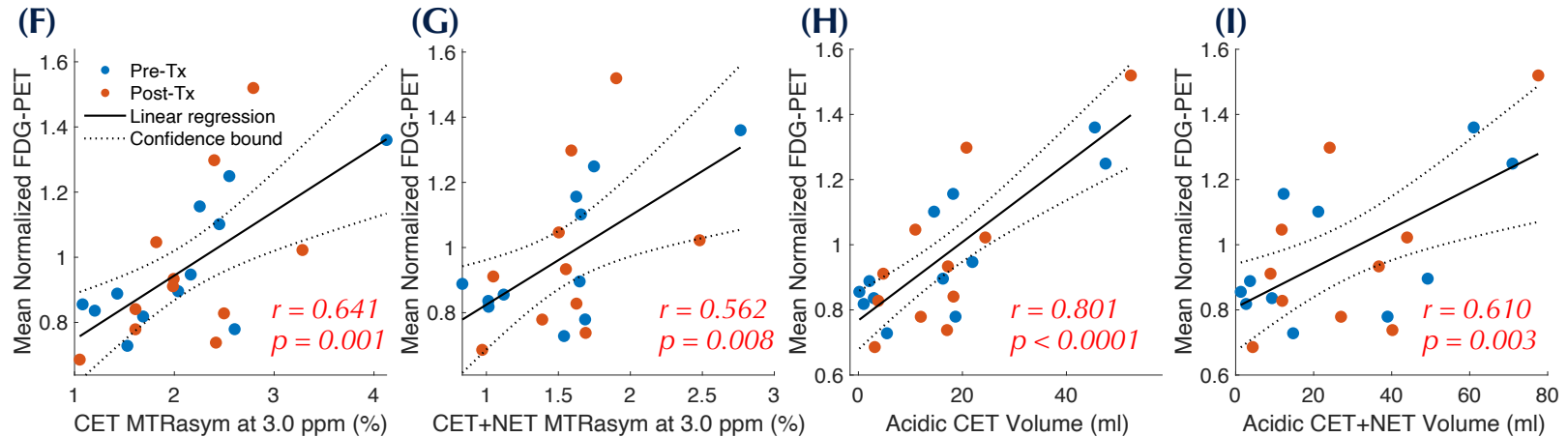
One month

Pt # 2
PET non-responder



Clinical validation: predicting treatment response

- ▶ Baseline scan (Day 0)
- ▶ Post-Tx scan (Day 2)
- ▶ **FDG-PET measurements correlate with CEST measurements**



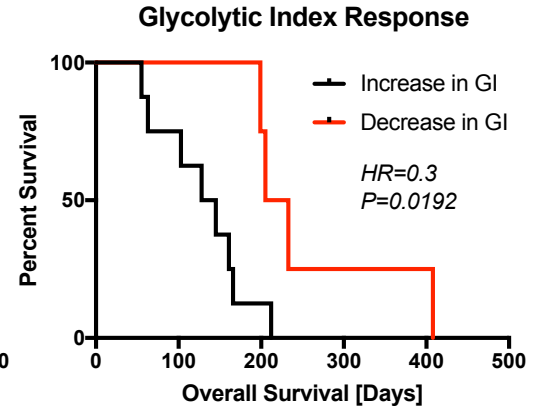
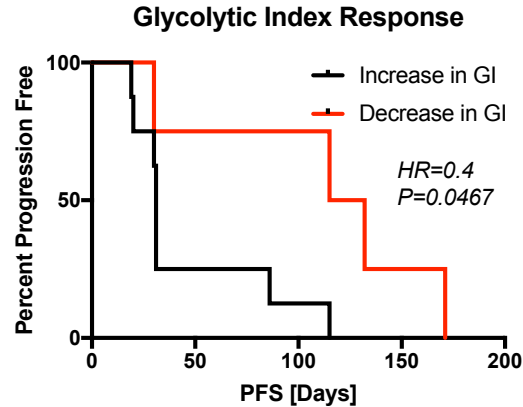
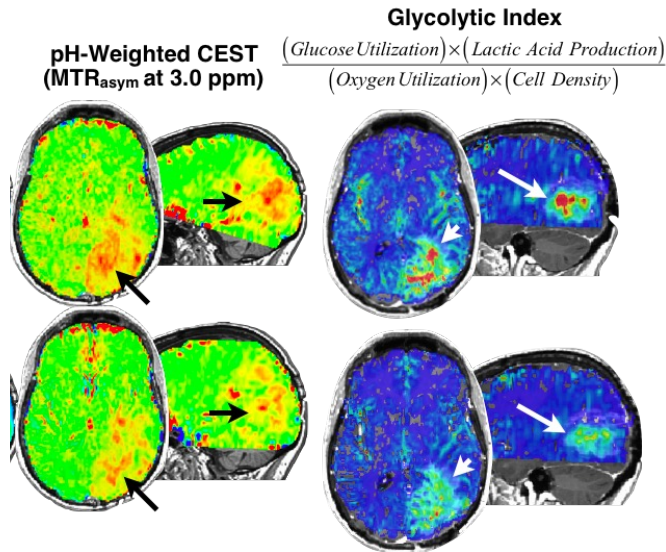
Clinical validation: predicting treatment response

Characteristic	PFS (Univariate)			PFS (Multivariate)		
	p-value	z-score	HR	p-value	z-score	HR
Volume						
Baseline	0.42	0.81	1.00 (0.98-1.02)	0.39	0.87	1.01 (0.99-1.02)
Normalized FDG						
Baseline	0.53	0.64	2.43 (0.16-37.32)	0.57	0.57	2.16 (0.15-31.39)
Post-Tx	0.33	0.98	4.12 (0.24-70.64)	0.38	0.87	3.48 (0.21-57.08)
Change	0.33	0.99	1.05 (0.95-1.17)	0.29	1.07	1.06 (0.95-1.18)
MTR_{asym} at 3.0 ppm						
Baseline	0.77	-0.29	0.85 (0.28-2.56)	0.67	-0.42	0.78 (0.24-2.53)
Post-Tx	0.02	2.39	12.93 (1.58-105.69)	0.02	2.35	13.38 (1.54-115.92)
Change	0.06	1.85	1.02 (1.00-1.05)	0.04	2.01	1.03 (1.01-1.06)
Acidic CET+NET Volume						
Baseline	0.73	0.34	1.01 (0.98-1.04)	0.80	0.26	1.00 (0.97-1.04)
Post-Tx	0.02	2.32	1.07 (1.01-1.14)	0.02	2.37	1.08 (1.01-1.14)
Change	0.12	1.56	1.01 (1.00-1.01)	0.10	1.67	1.01 (1.00-1.01)

- Post treatment CEST contrast and change in CEST contrast are predictive of patient outcome

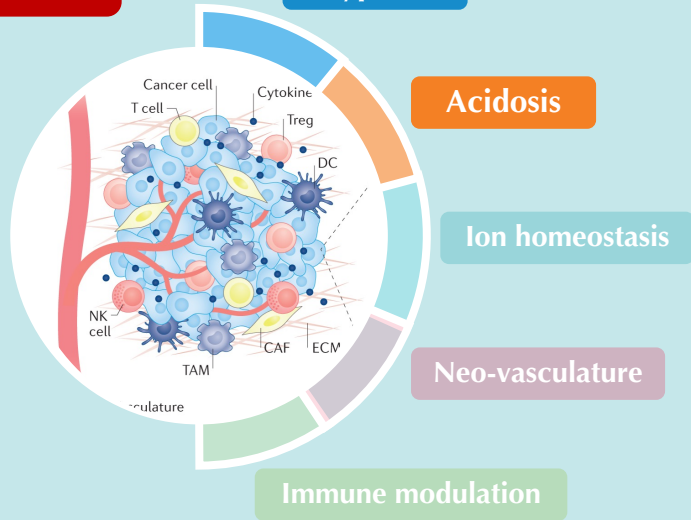
Clinical validation: predicting treatment response

Decrease in Glycolytic Index (25%, 4 of 12) → Significant Increase in PFS ($HR=0.4$, $P=0.0467$) and OS ($HR=0.3$, $P=0.0192$)



Outline

CEST



Glioma microenvironment

QSM

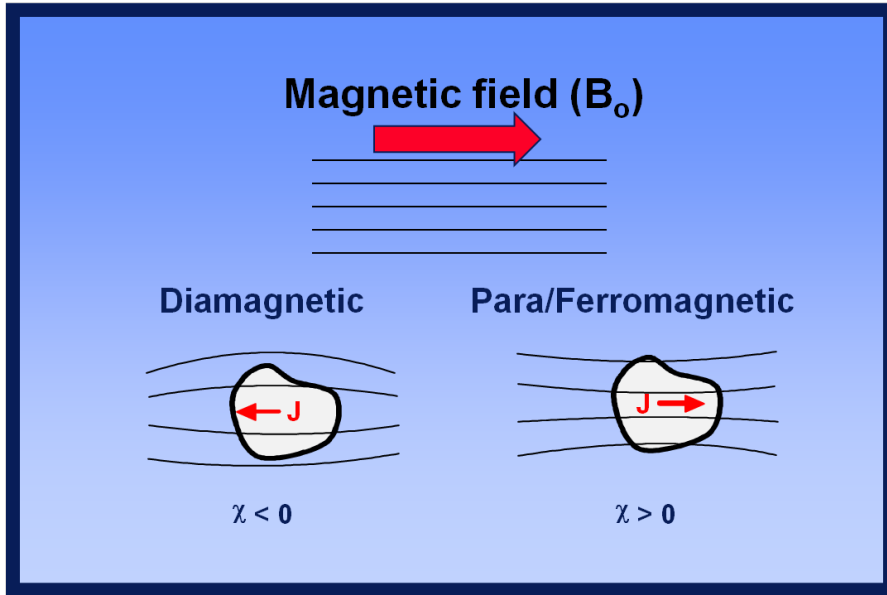
Brain iron imaging of subcortical nuclei in HD

Huntington's disease

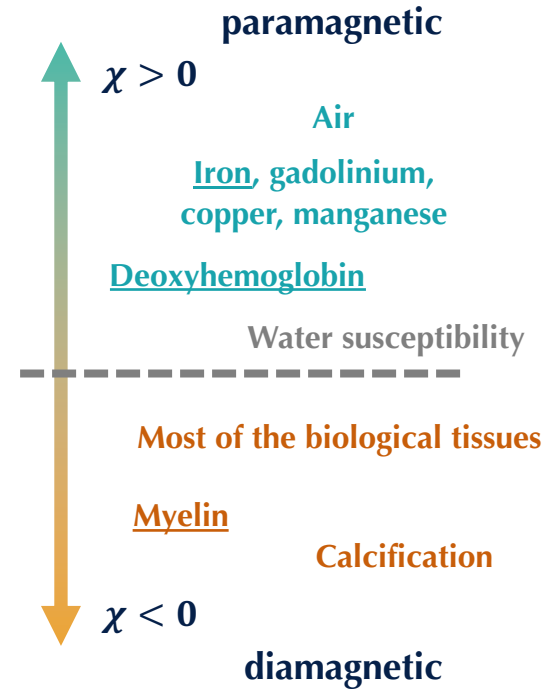
Ongoing projects

1. Tumor associated macrophage imaging using ferumoxytol MRI
2. Understanding the role of cerebellum in HD

Iron imaging: Susceptibility MRI

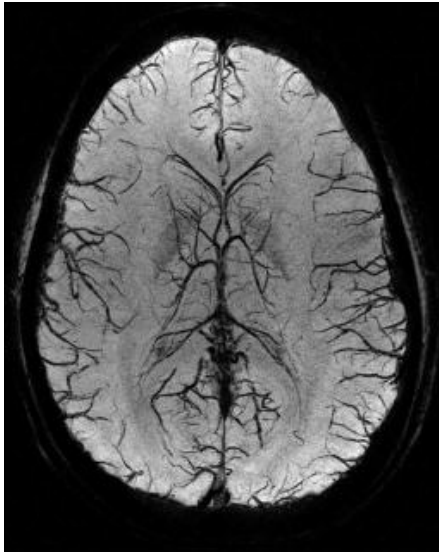


$$J = \chi B_0$$

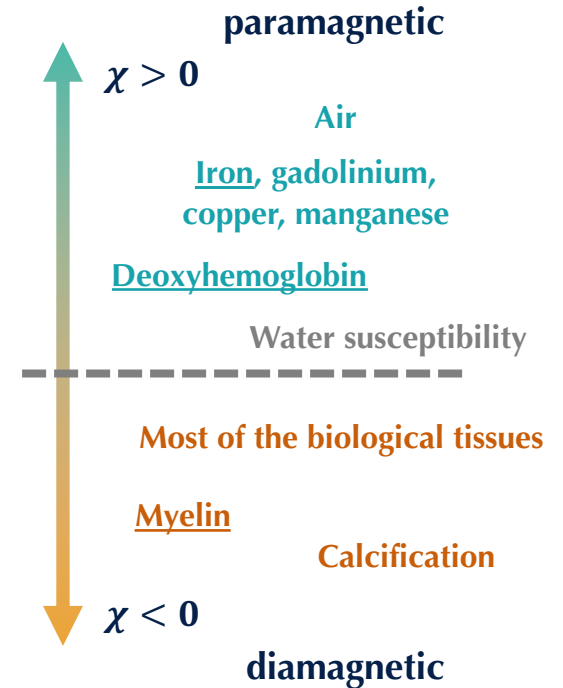
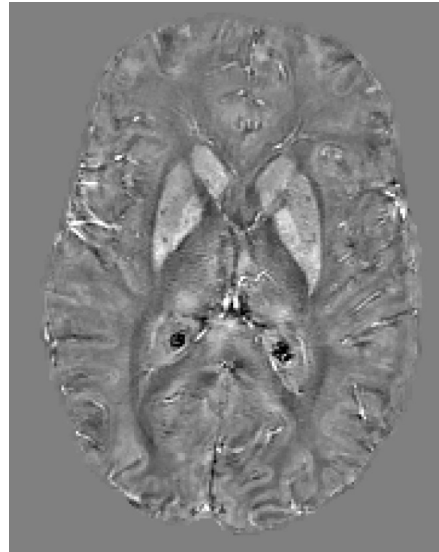


Iron imaging: Susceptibility MRI

Susceptibility-weighted imaging

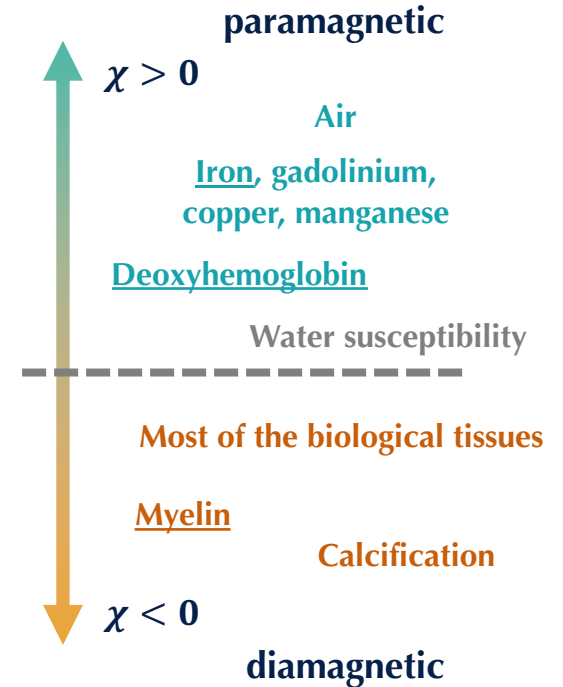
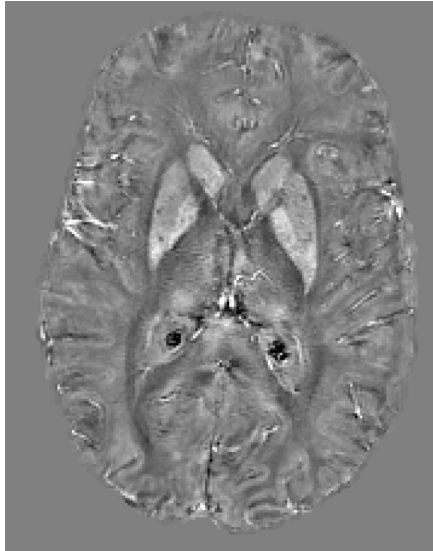
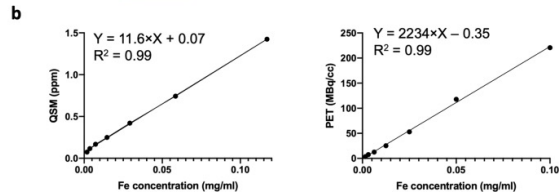
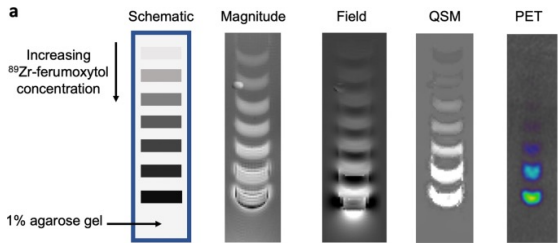


Quantitative susceptibility mapping



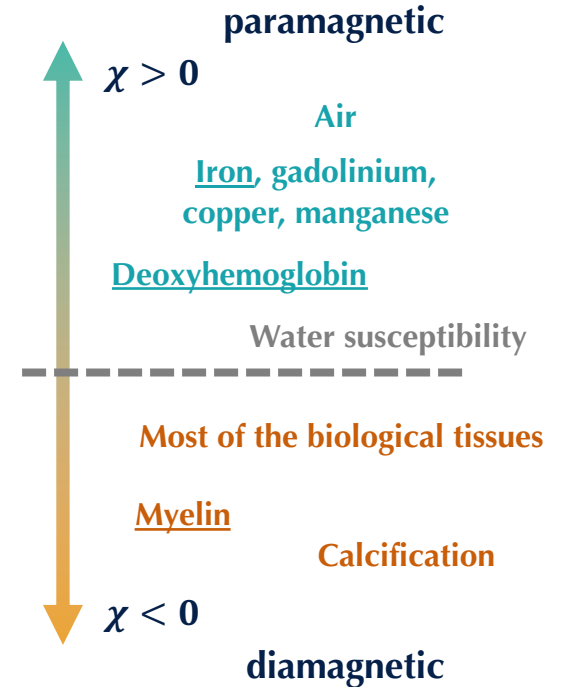
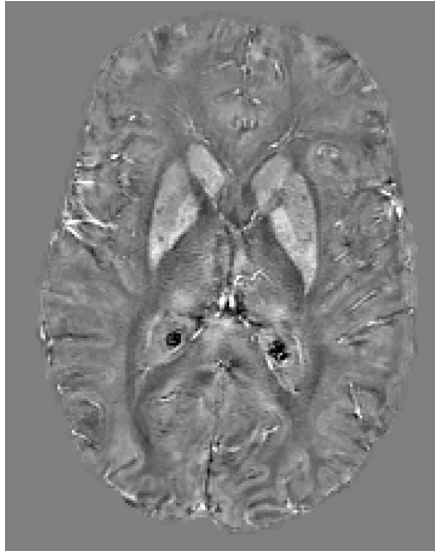
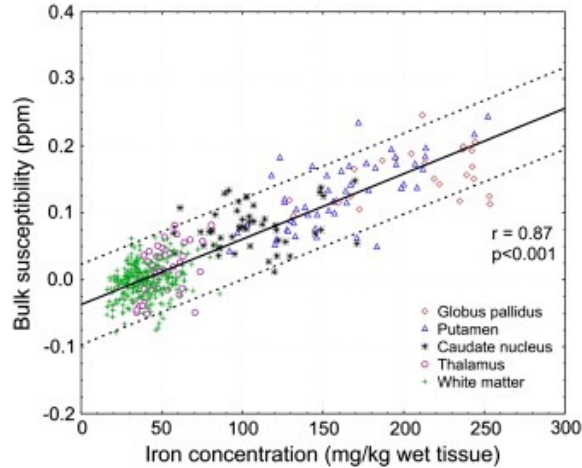
QSM: Iron imaging biomarker

Phantom validation



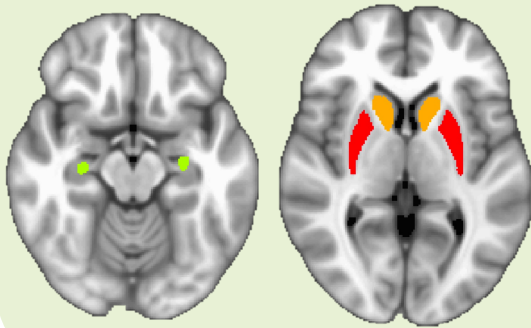
QSM: Iron imaging biomarker

Tissue validation

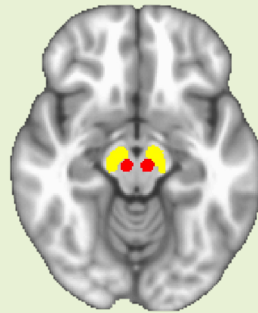


QSM: Iron imaging biomarker for neurodegenerative diseases

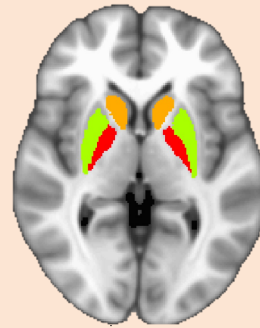
Alzheimer's Disease



Parkinson's Disease

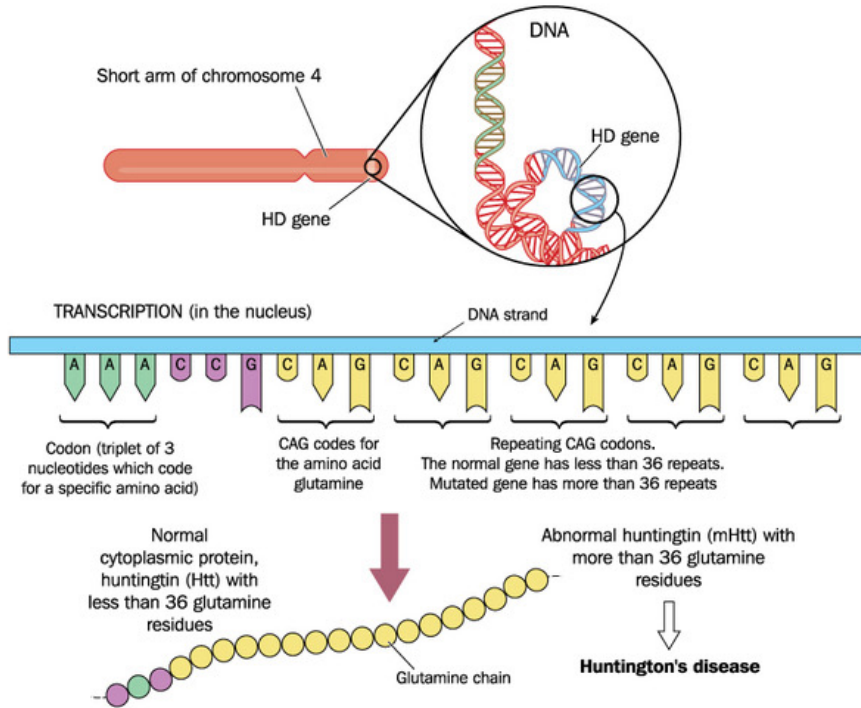


Huntington's Disease

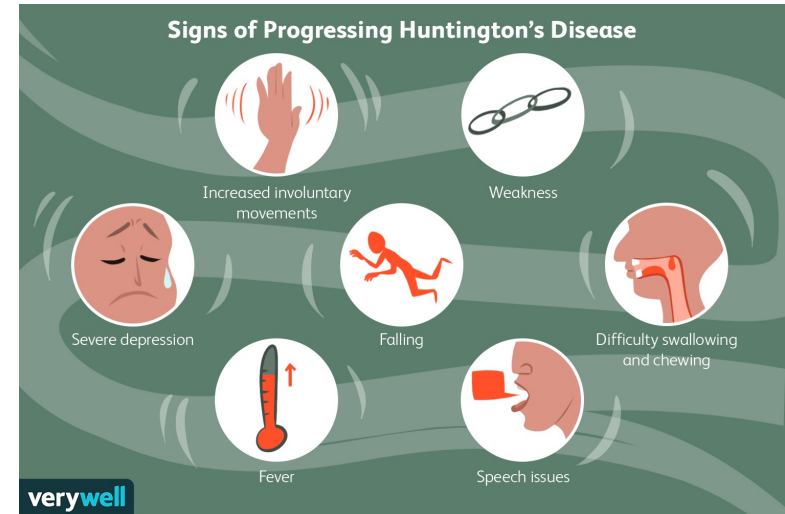


Abnormal iron deposition in the subcortical brain regions in neurodegenerative diseases.

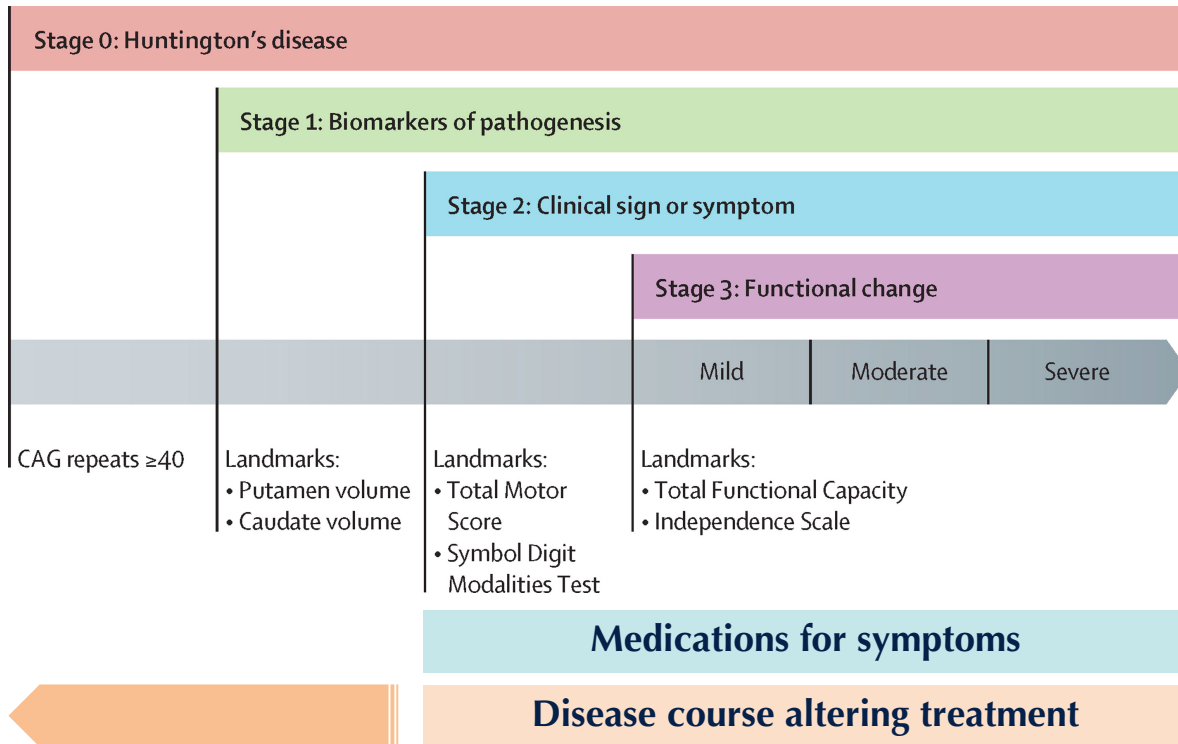
Huntington's disease



- Rare autosomal dominant disorder
- Huntingtin (HTT) gene mutation
 - CAG repeat length > 36



Huntington's disease



We need a **robust and quantitative method** to **monitor disease progression** and assess treatment efficacy before symptom onset.

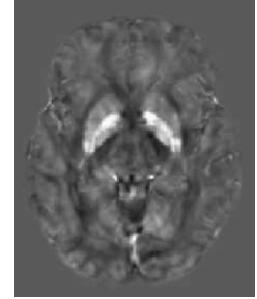
Tabrizi SJ et al. 2022

Characterizing HD with advanced MRI

Characterize the **iron dysregulation** and **microstructural alteration** in subcortical brain regions with HD progression, using 7T MRI.

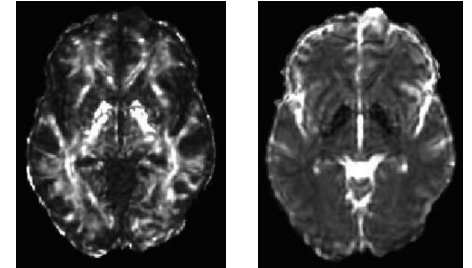
Quantitative susceptibility mapping (QSM)

Sensitive to iron deposition



Diffusion Tensor Imaging

Fractional anisotropy (FA)
Mean diffusivity (MD)

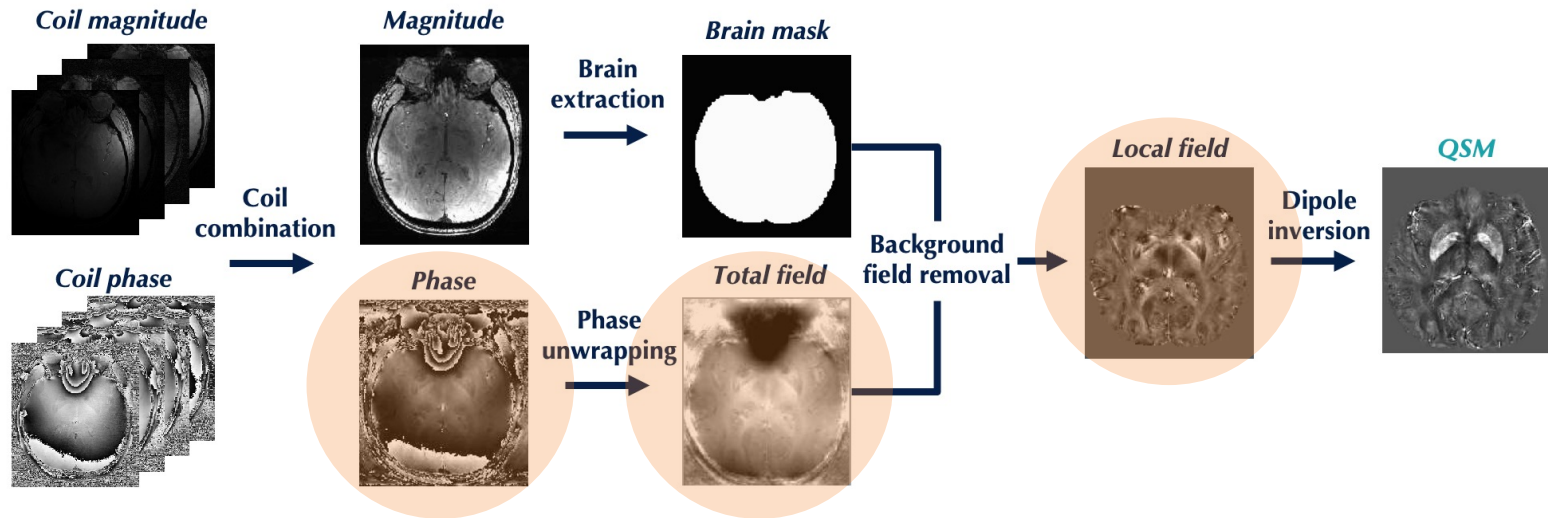


Study population

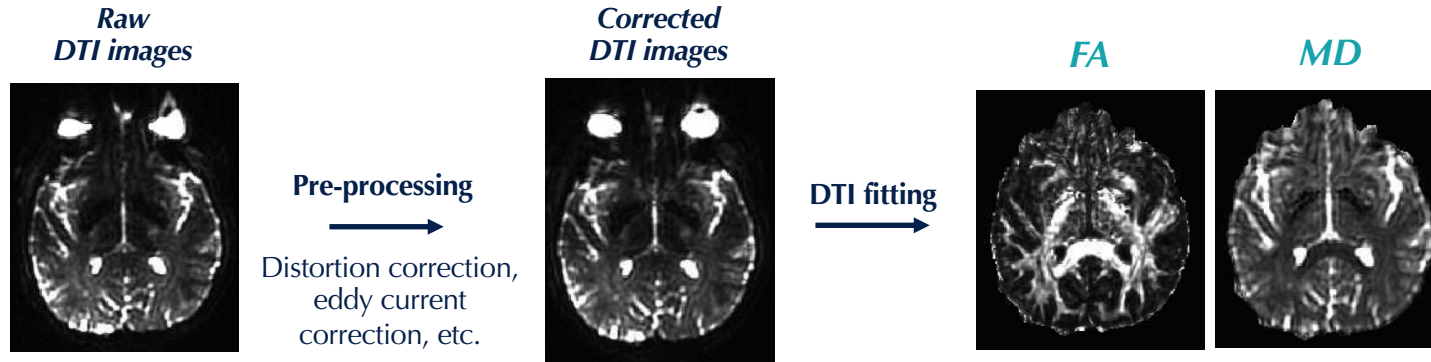
	Healthy Controls	All HD	PM Far From Onset (YTO > 15yr)	PM Near Onset (YTO < 15yr)	Manifest HD
Number	33	35	6	8	21
Sex (male/female)	16/17	15/20	3/3	2/6	10/11
Age (year)	43.9±12.2	44.7±12.8	36.3±10.7	39.3±11.8	49.1±12.1
CAG Repeat	N/A	42.3±2.8	40.7±1.6	43.1±2.3	42.5±3.1
CAPS	N/A	0.8±0.3	0.6±0.1	0.8±0.1	0.9±0.3
Estimated Year To Onset	N/A	8.7±12.2	23.5±5.7	9.6±5.2	N/A
TMS (total motor score)	N/A	11.4±10.1	2.0±2.3	3.0±2.5	17.3±8.8
TFC (total functional capacity)	N/A	12.3±1.5	13.0±0.0	12.5±0.9	12.0±1.8
DCL (diagnosis confidence level)	N/A	1.8±1.3	0.7±0.8	0.6±0.7	2.6±1.0

Imaging methods – iron imaging

T_2^* -weighted sequence



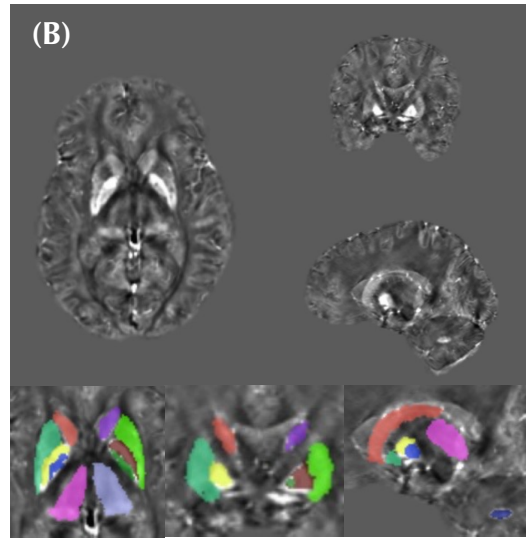
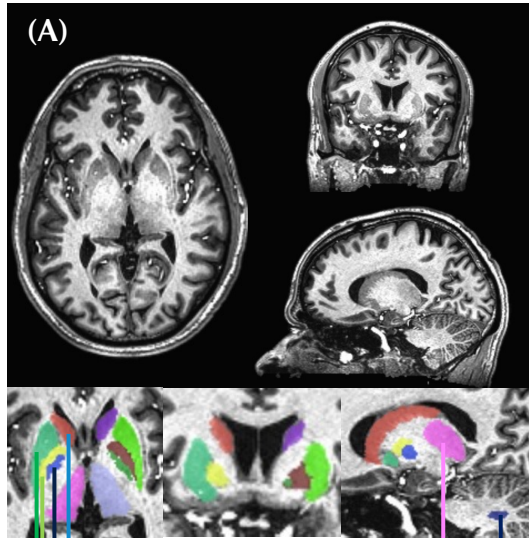
Imaging methods – microstructural imaging



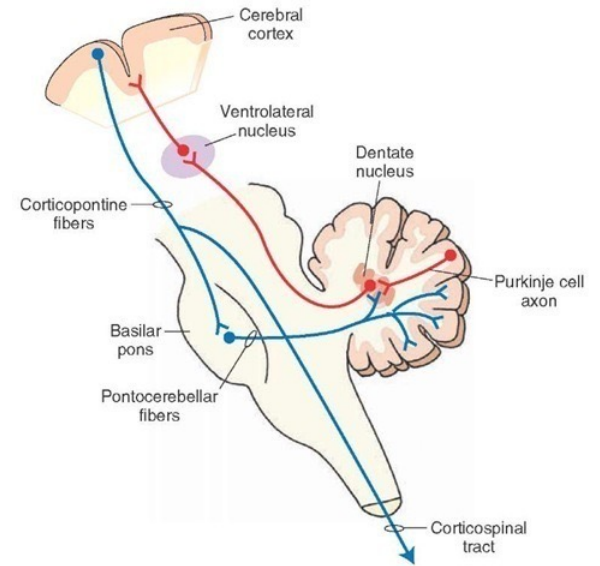
- Degree of directionality of water diffusion
- Axon and myelin integrity

- Overall diffusivity
- Cell density, edema, tissue microstructure

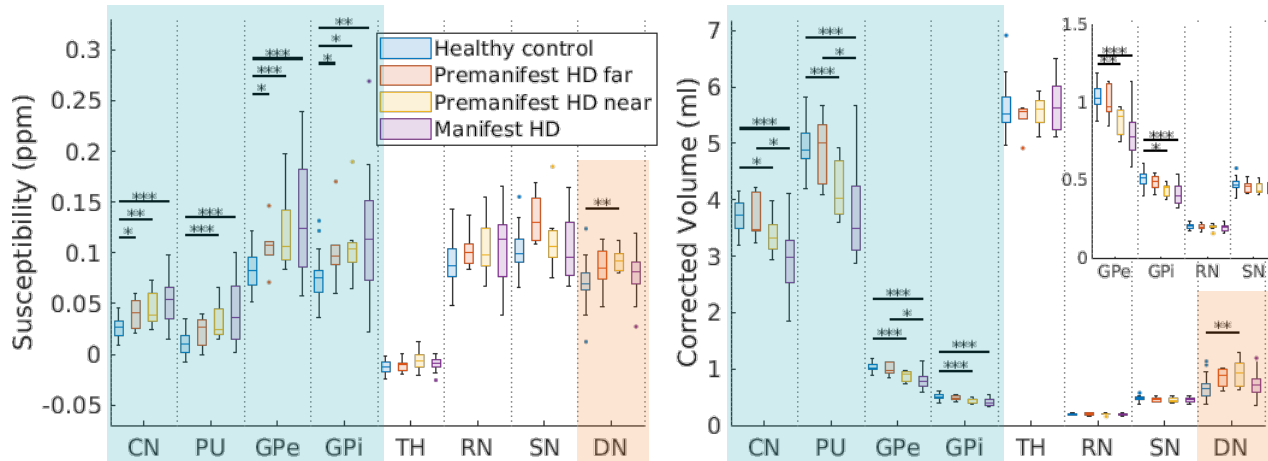
Subcortical brain regions



- Caudate nucleus
- Putamen
- Globus Pallidus Externa
- Globus Pallidus Interna
- Thalamus
- Dentate nucleus



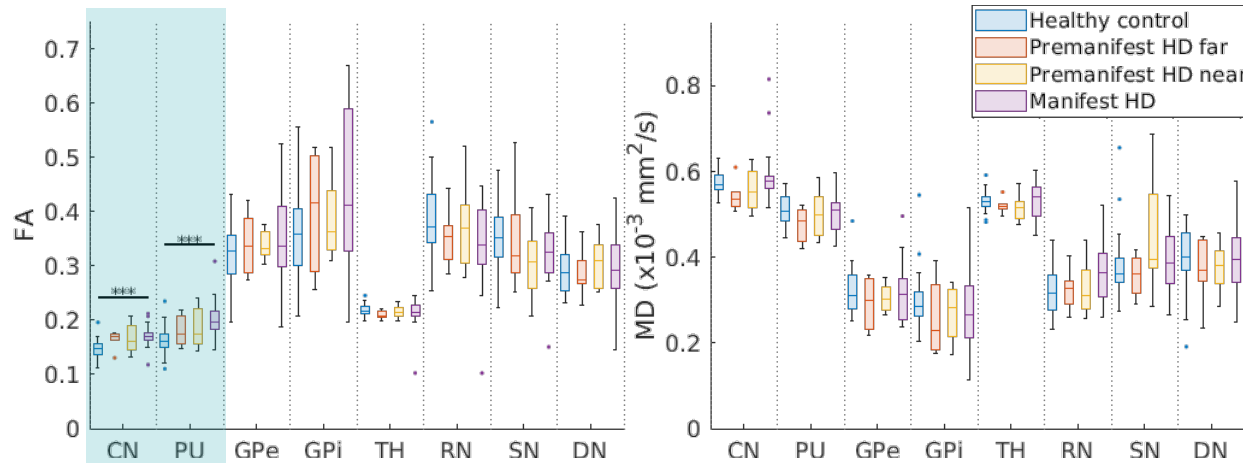
Cross-sectional comparisons of subcortical nuclei susceptibility & volume



Iron deposition precedes volume changes.

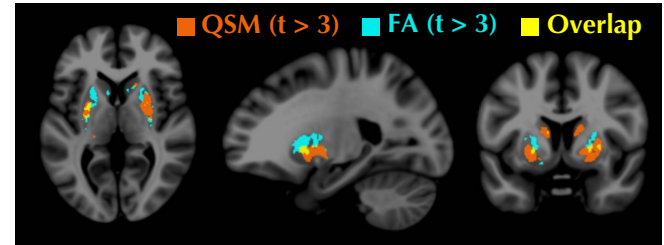
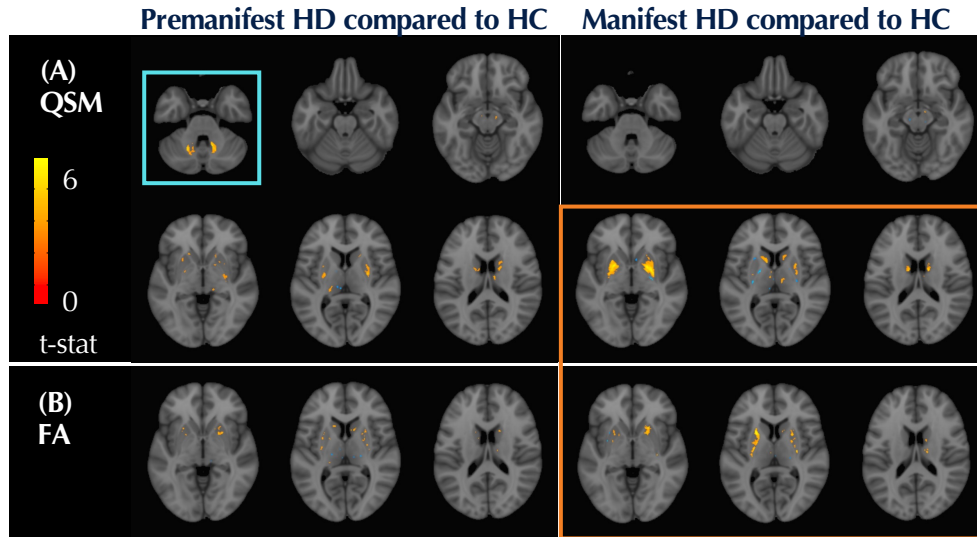
Transient increases of volume and iron in the dentate nucleus of premanifest HD subjects suggest a new **early biomarker**.

Cross-sectional comparisons of subcortical nuclei FA & MD

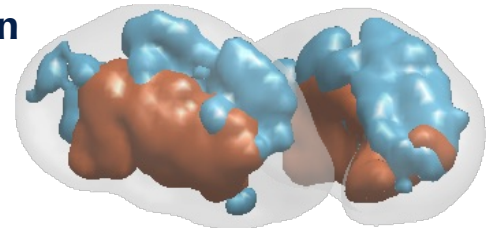


Striatum FA is elevated in HD.

Voxel-wise comparisons of susceptibility and FA

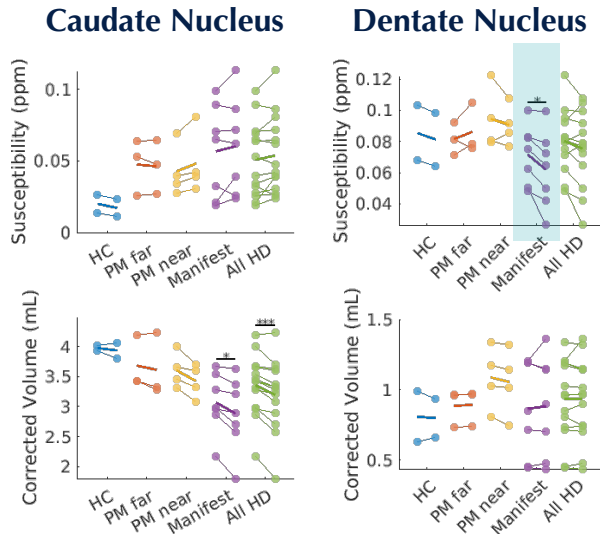


Putamen



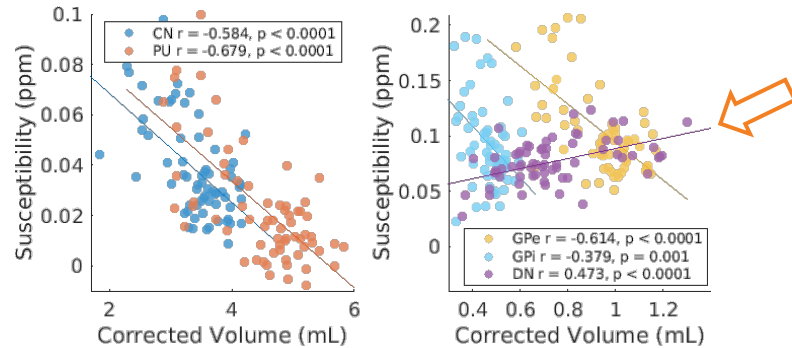
Elevated susceptibility and FA affect different subregions of striatum in HD.

Longitudinal analysis and correlation between susceptibility and volume



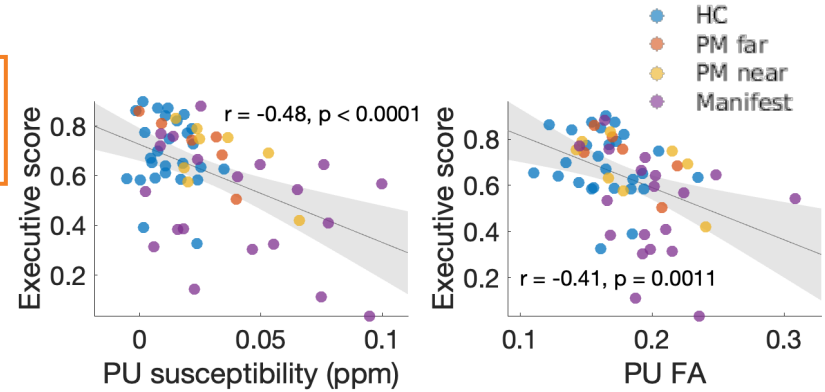
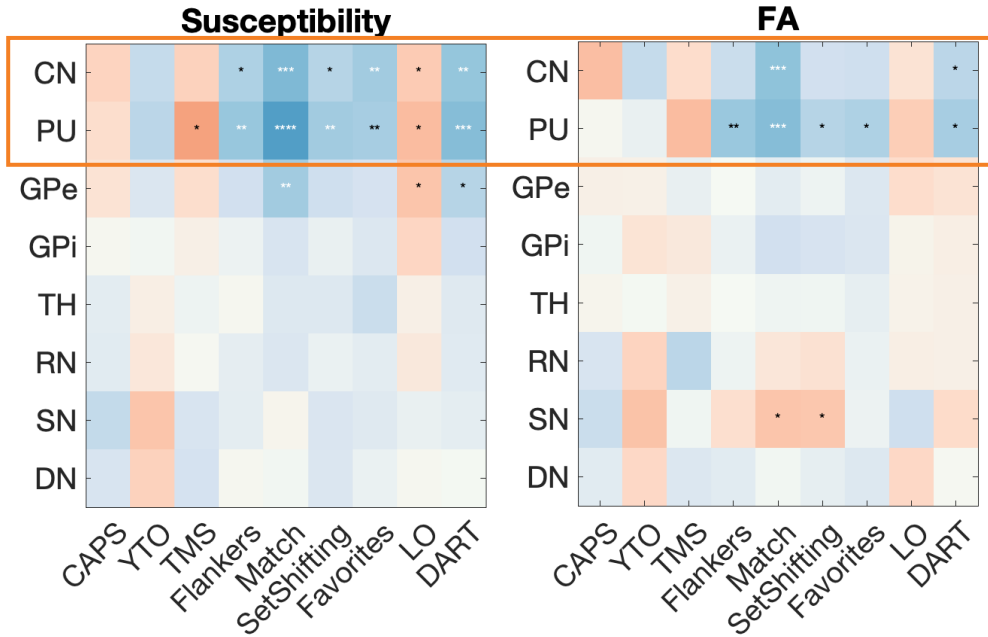
Iron deposition in dentate nucleus may follow **non-monotonic changes** as HD progress.

Correlation between susceptibility and volume



Iron deposition **correlates positively** with volume in **dentate nucleus**, potentially indicative of a previously less understood mechanism of HD pathogenesis.

Correlation with clinical assessments

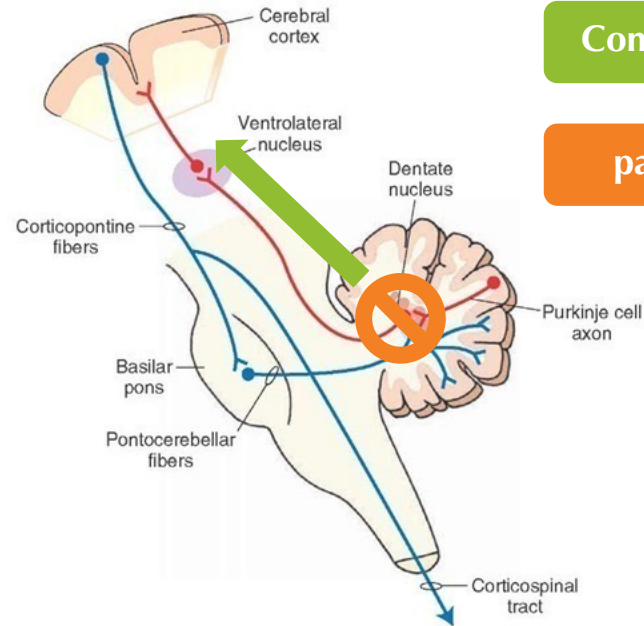


Increased caudate and putamen susceptibility/FA correlates with cognitive decline, showing the **strongest correlation with processing speed**.

Ongoing projects

Characterization of cerebellum in pre-manifest HD using multimodal MRI

- Validate **QSM as an early imaging biomarker** of HD at clinical field strength (3T)
- Elucidate the role of cerebellum in HD disease progression: **compensatory or pathologic?**



Compensatory ?

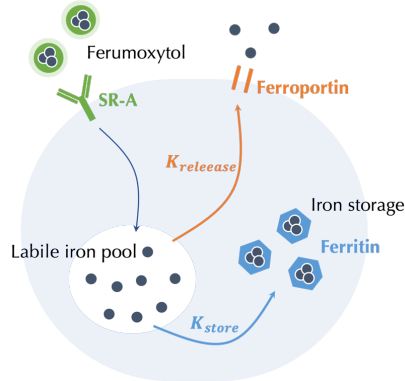
pathologic ?

Ongoing projects

Tumor associated macrophage (TAM) imaging using QSM

Ferumoxytol-enhanced MRI

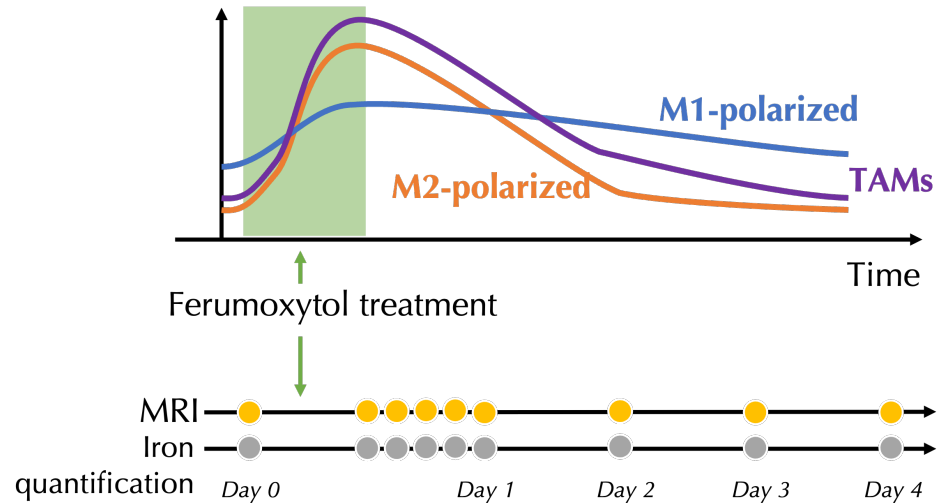
- Evaluate response to immune modulating therapies in glioma patients
- Develop phenotype-specific imaging biomarkers of TAMs



M1: iron-storing pro-inflammation

M2: iron-recycling pro-tumor

Iron imaging contrast ($R2^*/$ Susceptibility)





Brain Tumor Imaging Lab

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 Catalina Raymond
 Dr. Chencai Wang
 Talia Oughourlian
 Nicholas Cho
 Dr. Robert Harris
 Dr. Ararat Chakhoyan
 Dr. Akifumi Hagiwara
 Dr. Hiroyuki Tatekawa
 Dr. Kunal Patel
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UCLA Scientists and Clinicians

Dr. Timothy Cloughesy
 Dr. David Nathanson
 Dr. Noriko Salamon
 Dr. Holden Wu
 Dr. Denise Aberle
 Dr. Whitney Pope
 Dr. Albert Lai
 Dr. Phioanh L. Nghiemphu
 Dr. Linda Liao
 Dr. Kim-Lien Nguyen
 Dr. Robert Prins
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Larson Lab

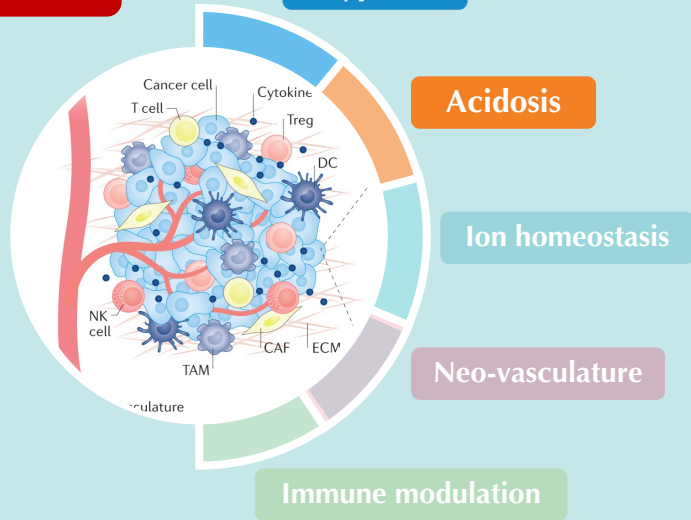
Dr. Abhejit Rajagopal
 Dr. Xiaoxi Liu
 Nikhil Deveshwar
 Sule Sahin
 Fei Tan
 Avantika Sinha
 Anna Bennett
 Dr. Elizabeth Smith
 Dr. Nick Dwork
 Dr. Jessica Scholey
 Dr. Andrew Leynes
 Dr. Jeremy Gordon
 Dr. Manuska Vaidya

UCSF/UCB Scientists and Clinicians

Dr. Yan Li
 Dr. Duan Xu
 Dr. Joseph Vu
 Dr. Eduardo Caverzasi
 Dr. Christopher Hess
 Dr. Javier Villanueva-Meyer
 Dr. Henry Roland

Outline

CEST



Glioma microenvironment

QSM

Brain iron imaging of subcortical nuclei in HD

Huntington's disease

Ongoing projects

1. Tumor associated macrophage imaging using ferumoxytol MRI
2. Understanding the role of cerebellum in HD