

PRISM Semantic Integration Approach

NCI Imaging Community Call
June 3, 2019

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**Uniform
management
of all non-
image data**

**Semantic
query
mechanisms
to enhance
data
exploration**

**Research
community
guidance on
priorities**

**Expand
capacity and
automate
curation of
current and
new data
types**

**Support
radiomic and
pathomic
feature sets**

**Extend
support for
challenges &
capture of
results**

**Expand
support for
pathology
data**

**Enable
efficient
deployment
and
integration
with cloud
providers**

**Enhance
support for
reproducible
research**

**Expand
existing data
publication
capacity**

Motivation



- ▶ The Cancer Imaging Archive hosts >11 million de-identified medical images related to cancer for research reuse
- ▶ Images are in DICOM-format collections, grouped by disease type, modality, research focus, etc.
- ▶ Many collections include diverse non-image datasets
 - ▶ in a variety of formats
 - ▶ lacking a common representation
 - ▶ not discoverable/queryable
 - ▶ not integrated

	BREAST-DIAGNOSIS	Breast-MRI-NACT-Pilot	CT-COLOMOGRAPHY	Head-Neck-PET-CT	ISPY1	Ivy-GAP	Leg-C-Pipelin	LIDC-IDRI	Lung-CT-Diagnosis	NSCLC-Radiogenomics	NSCLC-Radiomics	NSCLC-Radiomics-Genomics	PROSTATE-DIAGNOSIS	ON-Heart	ON-Breast-DE-MRI	REMBRANDT	Soft-tissue-Sarcoma	SPE-AMM-Lung-CT-Challenge	
Diagnosis	[Green bar]																		
Primary site	[Green bar]																		
Tumor site	[Green bar]																		
Disease/Cancer	[Green bar]																		
Laterality	[Green bar]																		
Staging	[Green bar]																		
Recurrence	[Green bar]																		
Nodules/diagnostics	[Green bar]																		
Polyps	[Green bar]																		
Measurements	[Green bar]																		
HPV Status	[Green bar]																		
Free text	[Green bar]																		
Histology	[Green bar]																		
Grading	[Green bar]																		
Response	[Green bar]																		
Genetic testing	[Green bar]																		
Demographics	[Green bar]																		
Treatment	[Green bar]																		
Primary: Chemo	[Green bar]																		
Primary: Surgery	[Green bar]																		
Primary: Radiation	[Green bar]																		
Adjuvant	[Green bar]																		
Morbidity	[Green bar]																		
Vital status	[Green bar]																		
Survival time	[Green bar]																		
Neurological testing	[Green bar]																		

LIDC-IDRI - The Cancer Imagin

Secure | https://wiki.cancerimagingarchive.net/display/Public/LIDC-IDRI#b7545650bbff4820b90cf400b7459ed9

Confluence Spaces

The Cancer Imaging Archive (TCIA) Public Access

Blog

SPACE SHORTCUTS

- How-to articles
- Troubleshooting articles

CHILD PAGES

- Collections
 - LIDC-IDRI
 - Lung Image Database Consorti...

Data Access

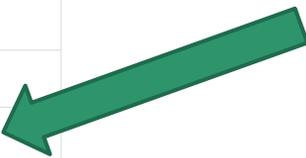
Choosing the Download option will provide you with a file to launch the TCIA Download Manager to download the entire collection. If you want to browse or filter the data to select only specific scans/studies please use the [Search By Collection](#) option.

Data Type	Download all or Query/Filter
Images (DICOM, 124GB)	Download Search
DICOM Metadata Digest (CSV)	Download
Radiologist Annotations/Segmentations (XML)	Download
Nodule Size List (web)	Search
Nodule Counts by Patient (XLS)	Download
Patient Diagnoses (XLS)	Download

Click the Versions tab for more info about data releases.

6 people like this

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Background photo courtesy of Dr. Christopher Nimsky, the University of Marburg, and Siemens Healthcare



	E	F	G	H	I	J	K	L	M
disease	Nodule 1 Diagnosis at the Nodule Level 0=Unknown 1=benign or non- malignant disease 2= malignant, primary lung cancer 3 = malignant metastatic)	Nodule 1 Diagnosis Method at the Nodule Level 0 = unknown 1 = review of radiological images to show 2 years of stable nodule 2 = biopsy 3 = surgical resection 4 = progression or response	Nodule 2 Diagnosis at the Nodule Level 0=Unknown 1=benign or non-malignant disease 2= malignant, primary lung cancer 3 = malignant metastatic)	Nodule 2 Diagnosis Method at the Nodule Level 0 = unknown 1 = review of radiological images to show 2 years of stable nodule 2 = biopsy 3 = surgical resection 4 = progression or response	Nodule 3 Diagnosis at the Nodule Level 0=Unknown 1=benign or non- malignant disease 2= malignant, primary lung cancer 3 = malignant metastatic)	Nodule 3 Diagnosis Method at the Nodule Level 0 = unknown 1 = review of radiological images to show 2 years of stable nodule 2 = biopsy 3 = surgical resection 4 = progression or response	Nodule 4 Diagnosis at the Nodule Level 0=Unknown 1=benign or non- malignant disease 2= malignant, primary lung cancer 3 = malignant metastatic)	Nodule 4 Diagnosis Method at the Nodule Level 0 = unknown 1 = review of radiological images to show 2 years of stable nodule 2 = biopsy 3 = surgical resection 4 = progression	Nodule 5 Diagnosis at the Nodule Level 0=Unknown 1=benign or non-malignant disease 2= malignant, primary lung cancer 3 = malignant metastatic)
LIDC-IDRI-0068	3	4	Head & Neck Cancer	3	4				
LIDC-IDRI-0071	3	1	Head & Neck	1	1				
LIDC-IDRI-0072	2	4	Lung Cancer	1	4				
LIDC-IDRI-0088	3	0	Uterine Cancer	0	0				
LIDC-IDRI-0090	2	3	NSCLC	2	3				
LIDC-IDRI-0091	3	4	urothelial carcinoma	3	4				
LIDC-IDRI-0100	3	1	Testis	1	1				
LIDC-IDRI-0118	3	0	Prostate	0	0				
LIDC-IDRI-0124	3	2	colon cancer	3	4				
LIDC-IDRI-0129	3	4	colon	3	4				
LIDC-IDRI-0135	3	4	Metastatic colon cancer	3	4				
LIDC-IDRI-0137	3	3	Basaloid squamous carcinoma	3	3				
LIDC-IDRI-0138	2	2	Lung Cancer	2	2				
LIDC-IDRI-0143	3	3	osteosarcoma	0	0				
LIDC-IDRI-0149	1	1	chondrosarcoma	1	1				
LIDC-IDRI-0159	3	2	thyroid carcinoma	3	4				
LIDC-IDRI-0161	3	2	pancreatic cancer	3	2				
LIDC-IDRI-0162	1	1	gallbladder	1	1				
LIDC-IDRI-0163	2	2	non small cell lung	2	2				
LIDC-IDRI-0164	3	3	colorectal cancer	3	4				
LIDC-IDRI-0165	3	4	vaginal cancer	3	4				
LIDC-IDRI-0166	2	2	stage III lung cancer	2	2				
LIDC-IDRI-0167	1	1	LGL (T cell lymphoma)	1	1				
LIDC-IDRI-0168	1	3	organizing pneumonia, also leukemia	1	3				
LIDC-IDRI-0169	3	4	granular cell tumor of the trachea	3	4				
LIDC-IDRI-0171	1	1	Lymphoma	1	1	1	4		
LIDC-IDRI-0173	0	0	bladder	0	0				
LIDC-IDRI-0174	2	3	nonsmall cell lung cancer	2	3	3	4		
LIDC-IDRI-0175	3	2	thyroid carcinoma	3	4				
LIDC-IDRI-0176	0	0	nonsmall cell lung cancer	1	1				
LIDC-IDRI-0178	1	1	melanoma	1	1				
LIDC-IDRI-0179	3	2	nonsmall cell lung cancer	3	2				
LIDC-IDRI-0180	1	1	LGL (T cell lymphoma)	1	1				

Patient ID	Diagnosis at the Patient Level	Diagnosis Method	Primary tumor site for metastatic disease
ID1	3	4	Head & Neck Cancer
ID2	3	1	Head & Neck
ID3	3	0	Uterine Cancer
ID4	2	3	NSCLC
ID5	3	4	urothelial carcinoma
ID6	3	1	Testis
ID7	3	0	Prostate
ID8	3	2	colon cancer
ID9	3	4	colon
ID10	3	4	Metastatic colon cancer

Ten entries for diagnosis, diagnosis method, and tumor site

Diagnosis at the Patient Level	Diagnosis Method
0=Unknown	0 = unknown
1=benign or non-malignant disease	1 = review of radiological images to show 2 years of stable nodule
2= malignant, primary lung cancer	2 = biopsy
3 = malignant metastatic	3 = surgical resection
	4 = progression or response

LIDC-IDRI patient-level diagnosis data key

Armato III, Samuel G., McLennan, Geoffrey, Bidaut, Luc, McNitt-Gray, Michael F., Meyer, Charles R., Reeves, Anthony P., ... Clarke, Laurence P. (2015). Data From LIDC-IDRI. The Cancer Imaging Archive.

<http://doi.org/10.7937/K9/TCIA.2015.LO9QL9SX>

Sex	Diag	Site	Grade	T	N	M	Stage	HPV status
Male	CA tonsil	Oropharynx	moderately to poorly diff.	4	2b	0	IVA	
Male	CA larynx	Glottis	poorly diff.	3	0	0	III	
Male	CA BOT	Oropharynx	moderately diff.	1	2a	0	IVA	
Male	CA tonsil	Oropharynx	poorly diff.	2	2b	0	IVA	
Male	CA BOT	Oropharynx	poorly diff.	1	2b	0	IVA	positive
Male	CA BOT	Oropharynx	poorly diff.	1	2b	0	IVA	negative
Male	CA tonsil	Oropharynx	moderately diff.	2	2a	0	IVA	
Male	CUP	CUP	well diff.	0	2b	0	IVA	
Female	NPC	Nasopharynx	poorly diff.	4	2	0	IVA	
Male	CA tonsil	Oropharynx	moderately to poorly diff.	4a	3	0	IVB	



Sex	Primary Site	T-stage	N-stage	M-stage	TNM group stage	HPV status
M	Larynx	T3	N0	M0	stage III	-
M	Nasopharynx	T1	N1	M0	stage IIB	-
M	Larynx	T3	N2b	M0	stage IVA	N/A
M	Nasopharynx	T3	N1	M0	stage III	N/A
M	Nasopharynx	T1	N1	M0	stage IIB	-
F	Nasopharynx	T1	N2b	M0	stage III	N/A
M	Oropharynx	T4	N2b	M0	stage IVA	+
M	Oropharynx	T2	N2b	M0	stage IVA	N/A
M	Larynx	T3	N0	M0	stage III	-
F	Oropharynx	T2	N2b	M0	stage IVA	-

Grossberg A, Mohamed A, Elhalawani H, Bennett W, Smith K, Nolan T, Chamchod S, Kantor M, Browne T, Hutcheson K, Gunn G, Garden A, Frank S, Rosenthal D, Freymann J, Fuller C.(2017). **Data from Head and Neck Cancer CT Atlas**. The Cancer Imaging Archive. DOI: [10.7937/K9/TCIA.2017.umz8dv6s](https://doi.org/10.7937/K9/TCIA.2017.umz8dv6s)

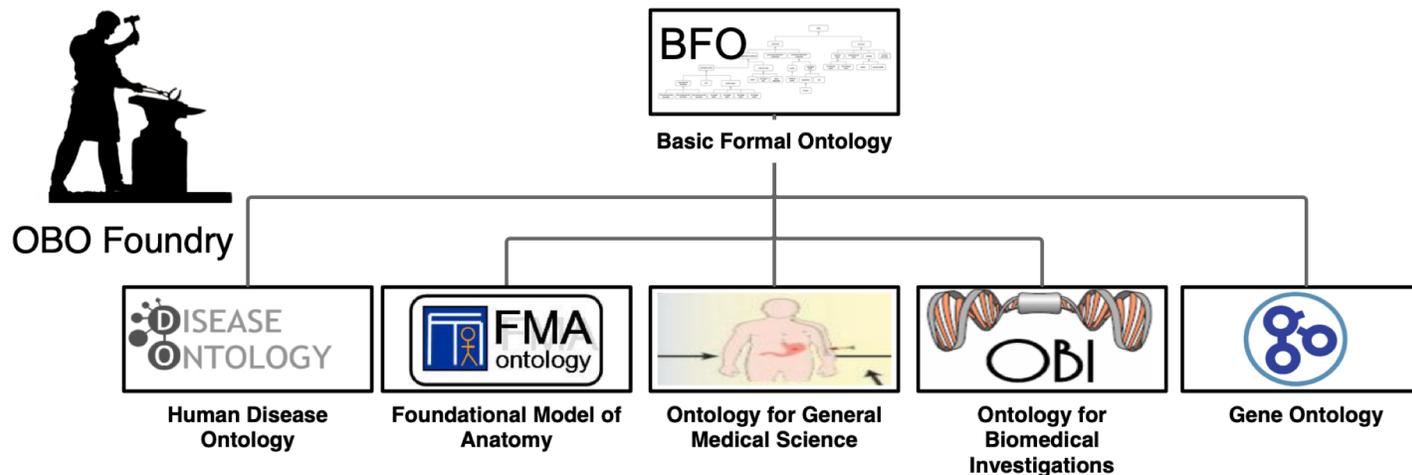
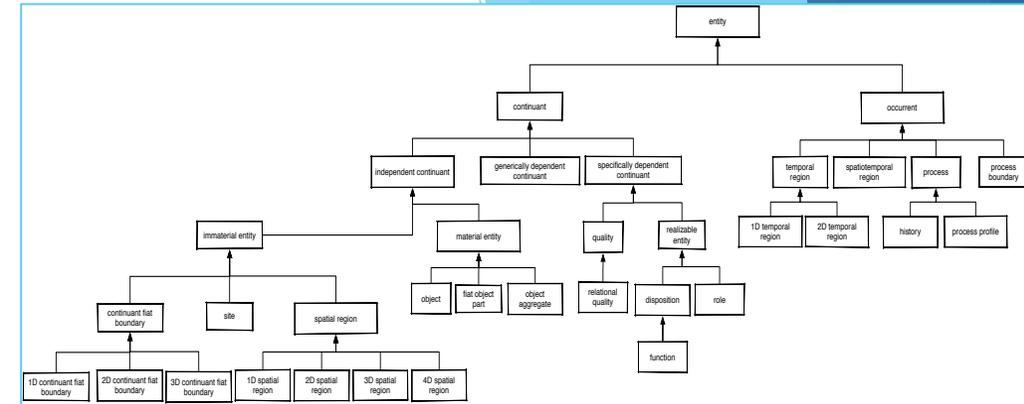
Martin Vallières, Emily Kay-Rivest, Léo Jean Perrin, Xavier Liem, Christophe Furstoss, Nader Khaouam, Phuc Félix Nguyen-Tan, Chang-Shu Wang, Khalil Sultanem. (2017). **Data from Head-Neck-PET-CT**. The Cancer Imaging Archive. DOI: [10.7937/K9/TCIA.2017.8oje5q00](https://doi.org/10.7937/K9/TCIA.2017.8oje5q00)

Semantic integration

- ▶ Integrate and manage data using shared representations that account for both explicit and implicit connections among the data across the source data sets
- ▶ Removing obstacles to:
 - ▶ Working with **different source representations for the same type of information.**
 - ▶ Connecting and interpreting **different types of data that are about the same phenomena.**
 - ▶ Combining **diverse data sets that are about the same individuals.**

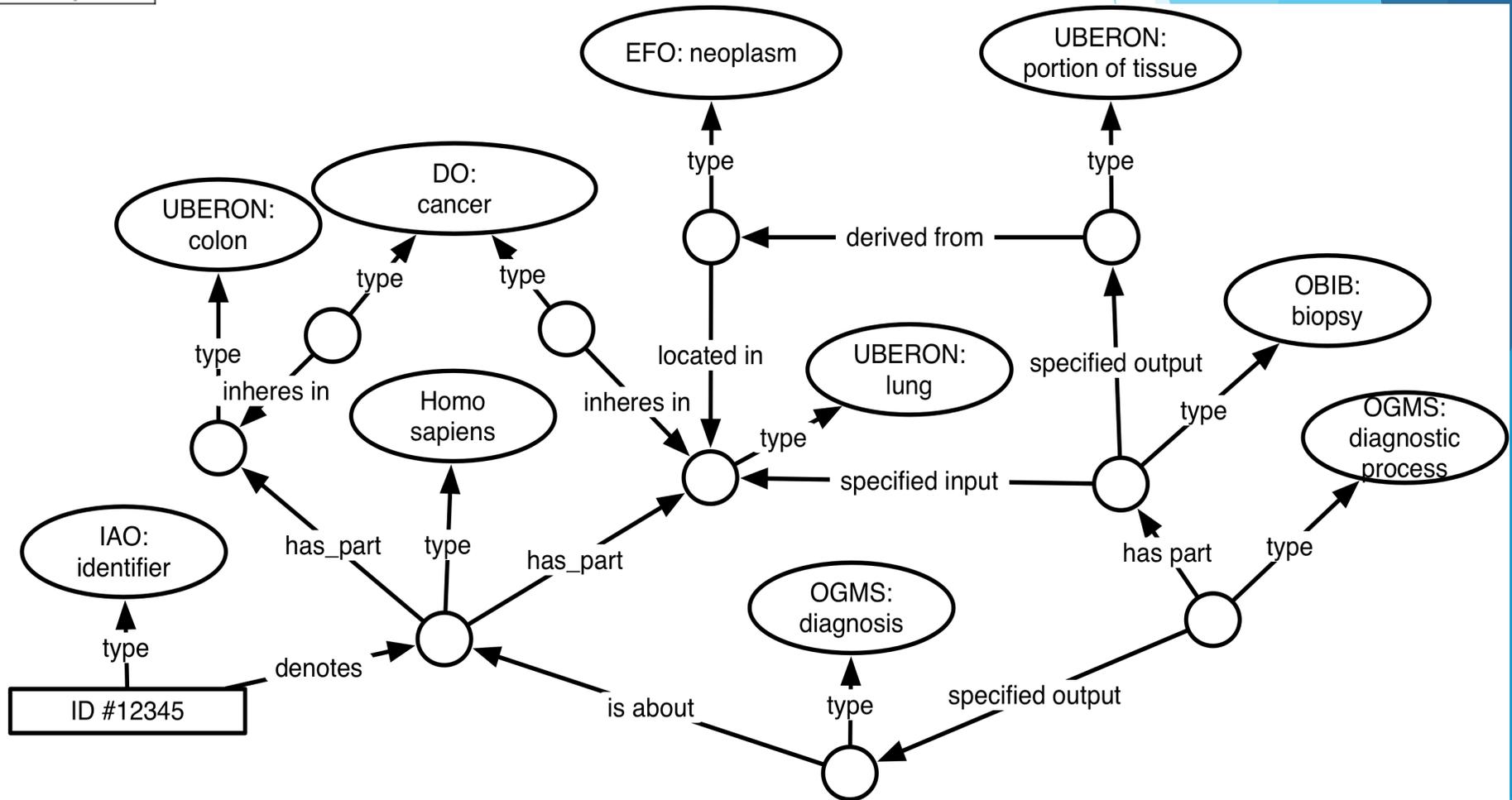
Semantic integration with ontologies

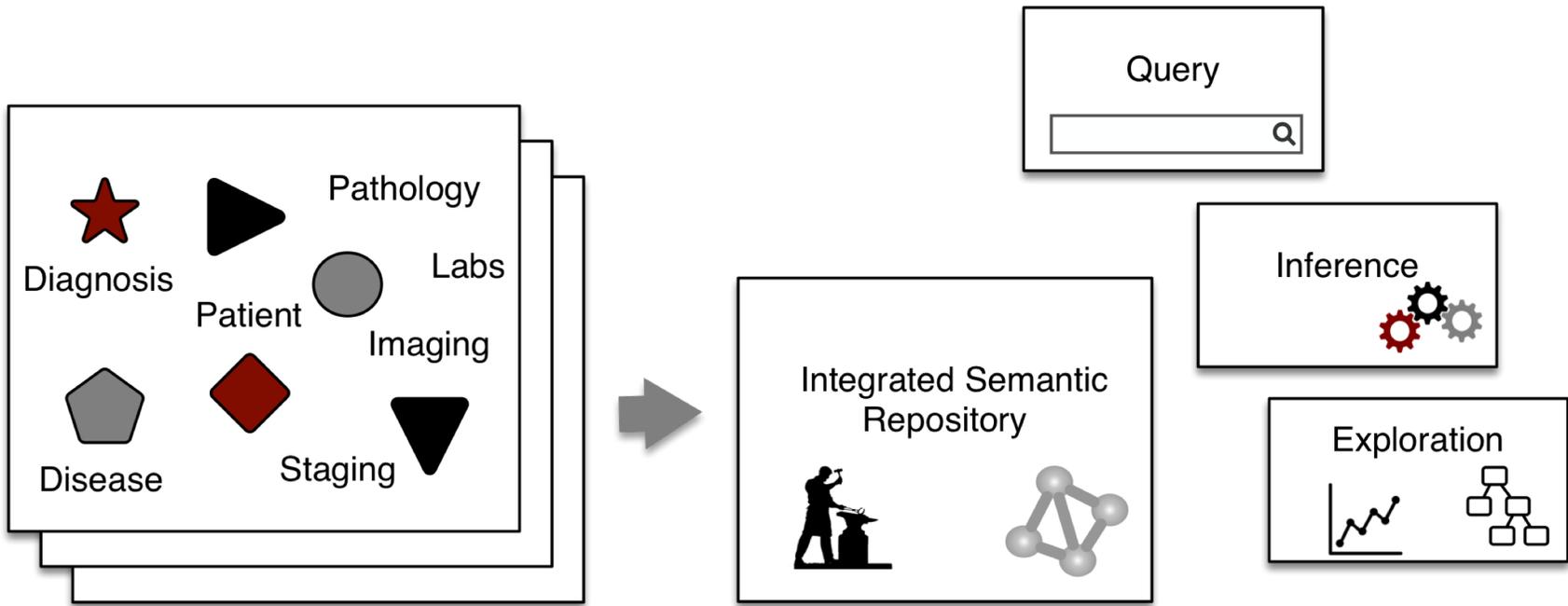
- ▶ Open Biomedical Ontologies Foundry
 - ▶ Shared design principles
 - ▶ Common upper level Basic Formal Ontology (BFO)
 - ▶ Consistent representation



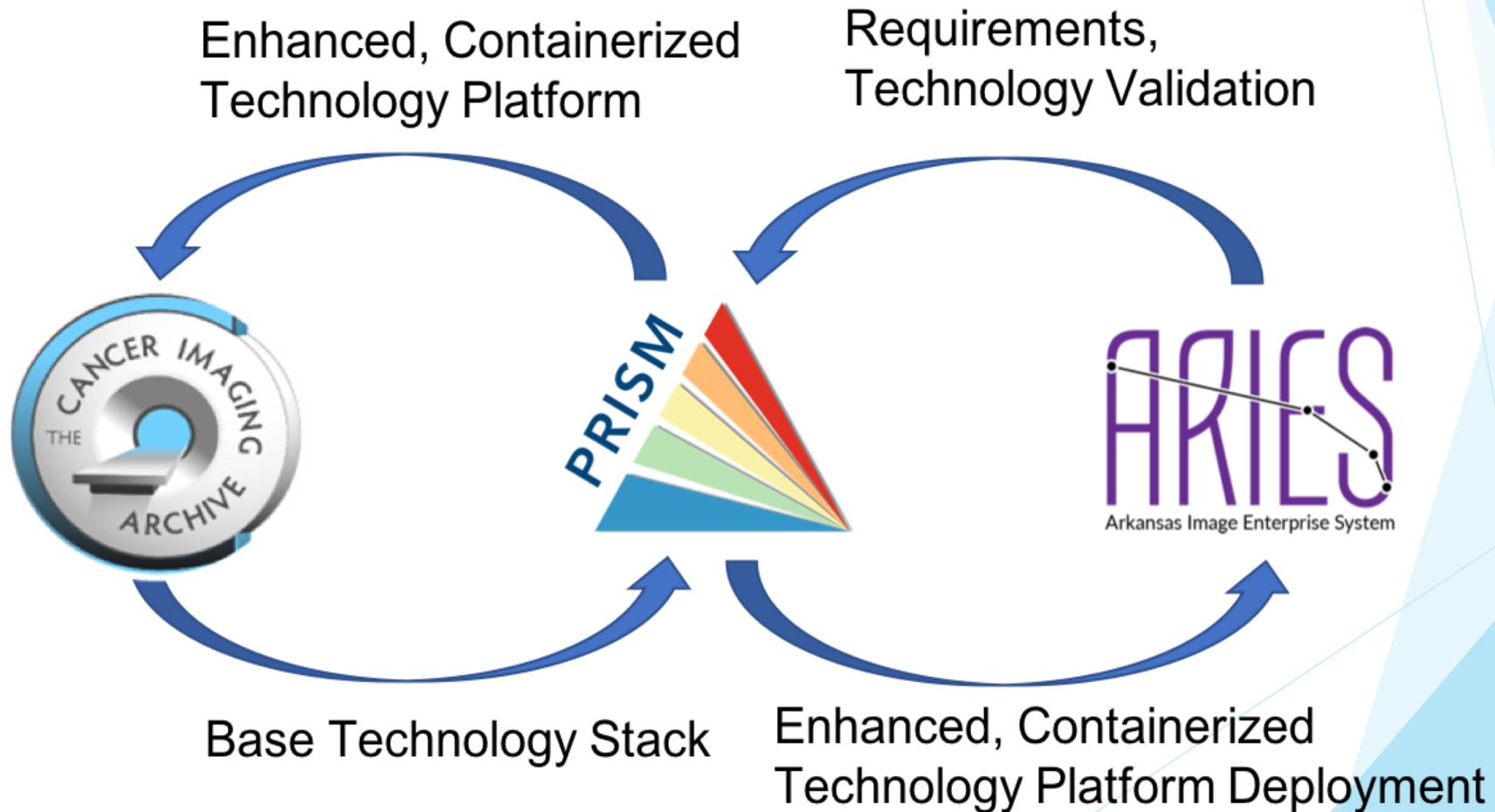
Diagnosis at the Patient Level	Diagnosis Method
0=Unknown	0 = unknown
1=benign or non-malignant disease	1 = review of radiological images to show 2 years of stable nodule
2= malignant, primary lung cancer	2 = biopsy
3 = malignant metastatic	3 = surgical resection
	4 = progression or response

12345	3	2	colon cancer
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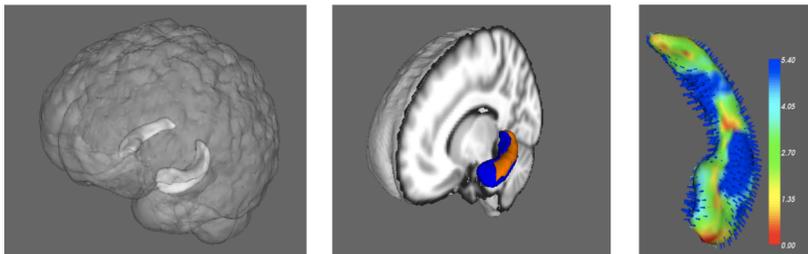


The Arkansas Image Enterprise System (ARIES) is a PRISM instance



The Arkansas Image Enterprise System (ARIES) is a PRISM instance

- ▶ Data from three collaborating investigative teams seeking to identify common pathways of neurodegeneration.
- ▶ Pilot data from three unique study cohorts diagnosed with Parkinson’s disease (PD), Mild Cognitive Impairment (MCI), or Cancer-Related Cognitive Impairment (CRCI).
- ▶ These datasets include **images and image-derived features, motor assessments, cognitive assessments, clinical rating scales, demographics, and clinical data.**
- ▶ Pilot test case: linking image-derived measures of hippocampal volumes to a diverse set of cognitive assessment results.



		Cohort 1	Cohort 2	Cohort 3
Imaging & derived features	MRI	█	█	█
	MRI-derived imaging features	█	█	█
	Gait video	█	█	█
	Gait-derived features	█	█	█
	Resting Electroencephalography (EEG)	█	█	█
Motor assessments	Gait-assessment floor mat	█	█	█
	Accelerometry from wearable body sensors	█	█	█
	digitized gloves	█	█	█
Cognitive assessments	handwriting/drawing assessments on a digitizing tablet	█	█	█
	Montreal Cognitive Assessment	█	█	█
	St Louis University Mental Status	█	█	█
	Repeatable Battery for Assessment of Neuropsychological Status	█	█	█
	SCales for Outcomes in PArkinson's disease - COGNition	█	█	█
	Neuropsychological Assessment Battery	█	█	█
Clinical rating scales	Frontal Assessment Battery	█	█	█
	etc	█	█	█
Demographics		█	█	█
Clinical		█	█	█

MOCA_exec1	MOCA_exec2	MOCA_clock1	MOCA_clock2	MOCA_clock3	MOCA_clocktotal	MoCAexec_total	MOCA_naming1	MOCA_naming2	MOCA_naming3
1.00	0.00	1.00	1.00	1.00	3.00	4.00	1.00	1.00	1.00
0.00	0.00	1.00	0.00	0.00	1.00	1.00	1.00	0.00	1.00
1.00	1.00	1.00	1.00	1.00	3.00	5.00	1.00	1.00	1.00

MONTREAL COGNITIVE ASSESSMENT (MOCA)
Version 7.1 Original Version

Education: _____ Date of birth: _____
Sex: _____ DATE: _____

VISUOSPATIAL / EXECUTIVE

Copy cube

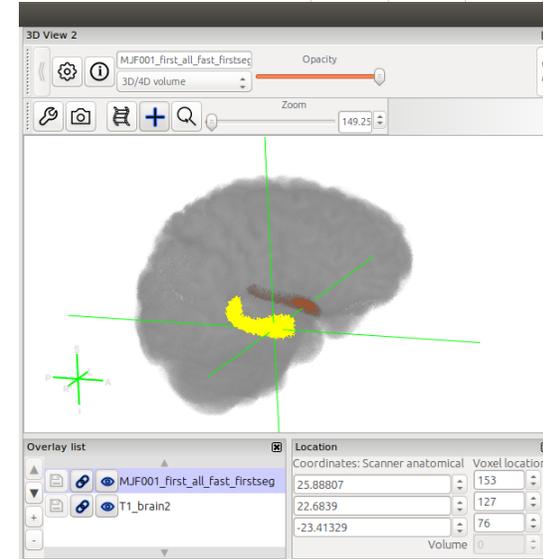
Draw CLOCK (Ten past eleven) (3 points)

POINTS: _____ /5

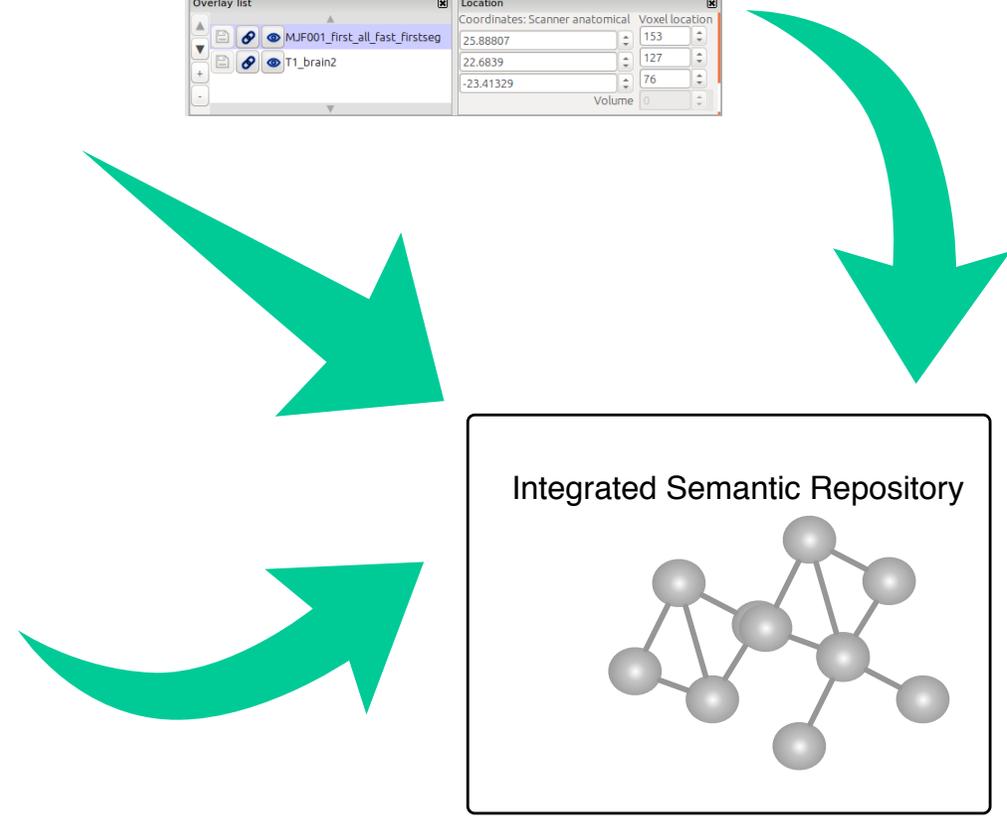
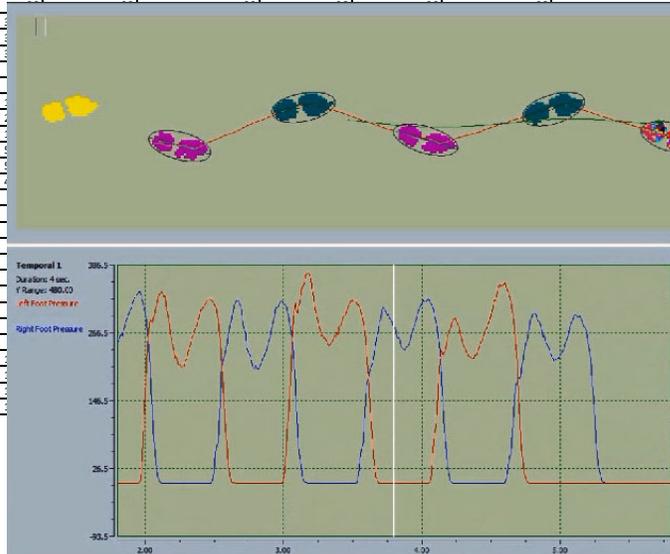
NAMING

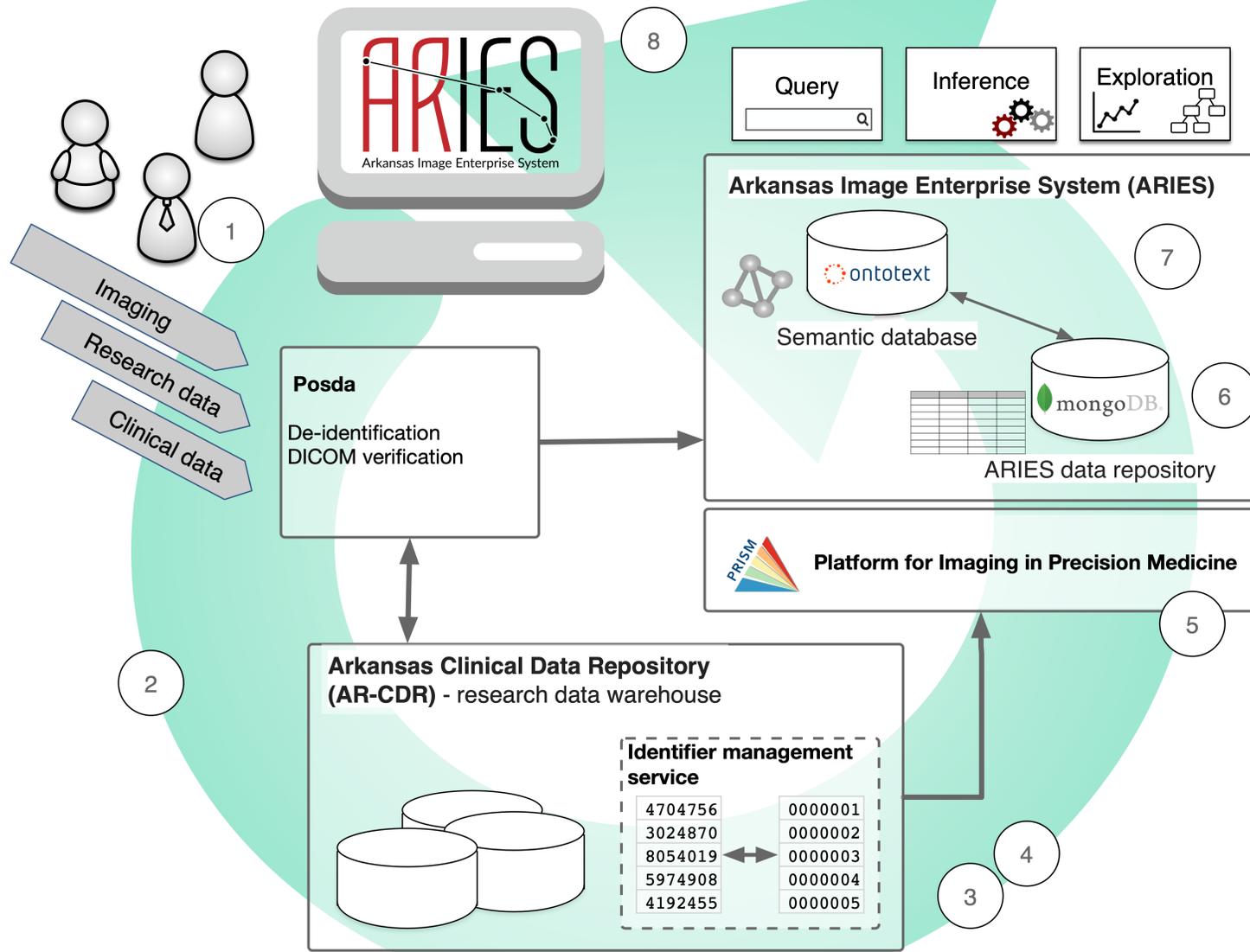
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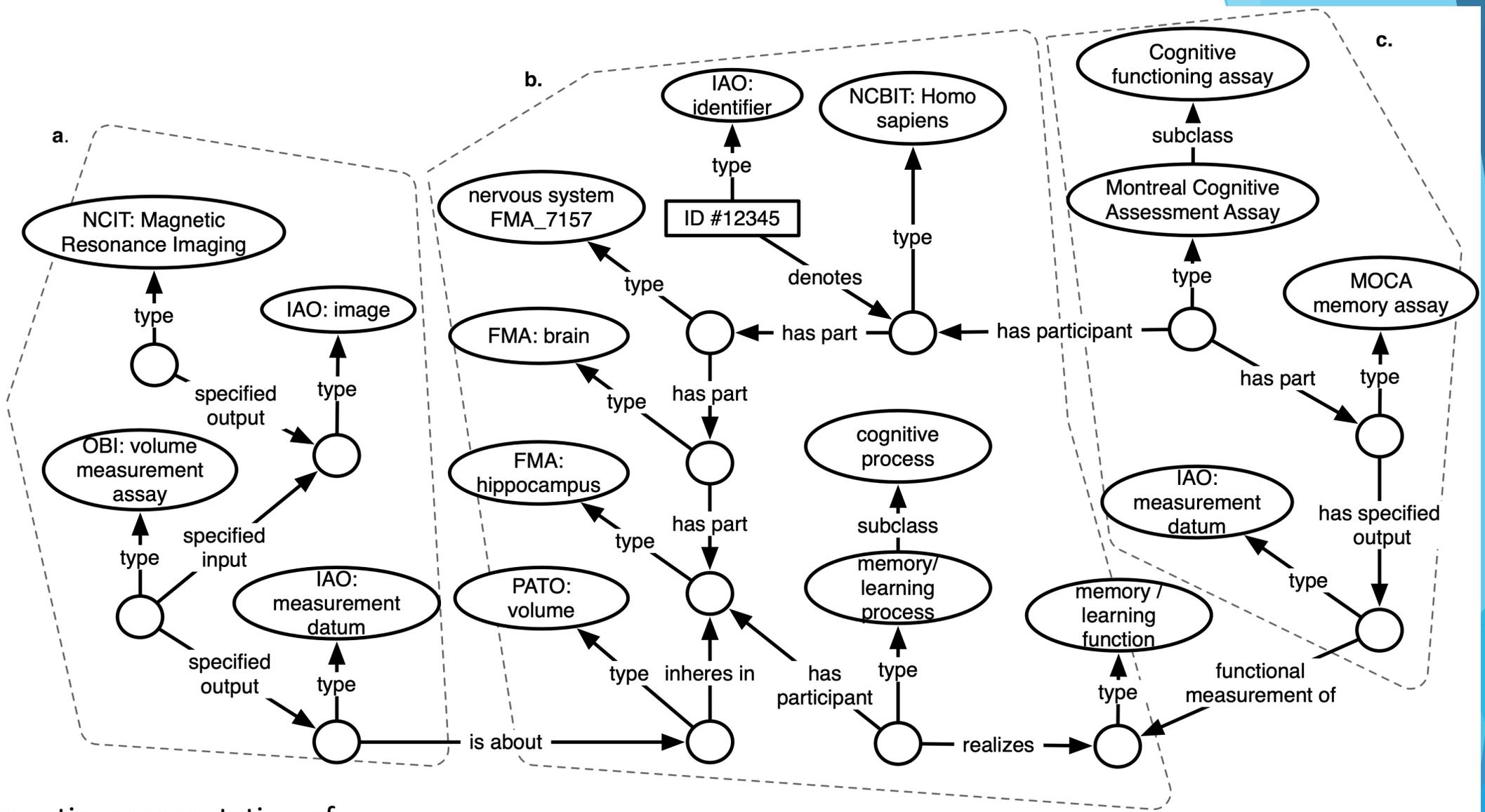
Dx	group	R_Hipp	L_Hipp	ICV
1		4018		4052
				3970
				3446
				3333
				3784
				4575
				4202
				3297
				3795
				3649
				2915
				4235
				3985
				3267
				3658
				4400
				3630
				4789
				3361



		First Contact (sec.)	Last Contact (sec.)	Integ. Pressure (p x sec.)	Foot Length (cm.)	Foot Width (cm.)	Foot Area (cm. x cm.)	Toe In/Out Angle (degrees)	Foot Center X Location (cm.)
#Samples		70	70	70	70	70	70	54	70
#Samples	Left	32	32	32	32	32	32	24	32
#Samples	Right								38
Mean									301.06
Mean	Left								300.438
Mean	Right								301.584
Ratio	L/R								0.996
ASI									0.381
S.D.									152.741
S.D.	Left								139.398
S.D.	Right								165.003
%CV									50.735
%CV	Left								46.398
%CV	Right								54.712
1:	Left 1								64.996
2:	Right 1								124.614
3:	Left 2								185.82
4:	Right 2								251.687
5:	Left 3								306.941
6:	Right 3								366.126
7:	Left 4								433.597
8:	Right 4								504.269
9:	Left 1								530.622
10:	Right 1								470.14
11:	Left 2								410.177
12:	Right 2								348.868
13:	Left 3								287.326







Semantic representation of
 a) an image capture and image-derived volume measure
 b) the subject
 c) a cognitive assessment

Ongoing work

- ▶ Ongoing representation & integration of TCIA collections data
- ▶ PRISM semantic use cases
- ▶ Semantic query interface development
- ▶ Testing and use of PRISM platform within ARIES project

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- Erich Bremer
- Rajrishi Gupta MD
- Tahsin Kurc, PhD
- Tammy DiPrima



▶ **The PRISM Team**