

[Home](#)[Contents](#)[Background](#)

- [Data](#)

[Details](#)

- [List of biomarkers](#)

[Metrics](#)

- [Standard Datasets](#)

- [Further information](#)

[Data](#)[Submit](#)[Data](#)[Contact](#)[Faq](#)

TADPOLE challenge participants are free to use **any data** for their predictions (such as when building predictive models). TADPOLE provides three "standard" data sets, derived from the ADNI study:

[School](#)[Teams](#)

- D1 - a comprehensive longitudinal data set for training;

[Fun](#)

- D2 - a comprehensive longitudinal data set on rollover subject forecasting;

[Results](#)

- D3 - a limited forecasting data set on the same rollover subject

[D4](#)

We also refer to D4, the future test set. The archive containing standard data and associated files is available from the ADNI website (login to ADNI, follow Download -> Study Data -> Test Data).

[Live](#)[Leaderboard](#)

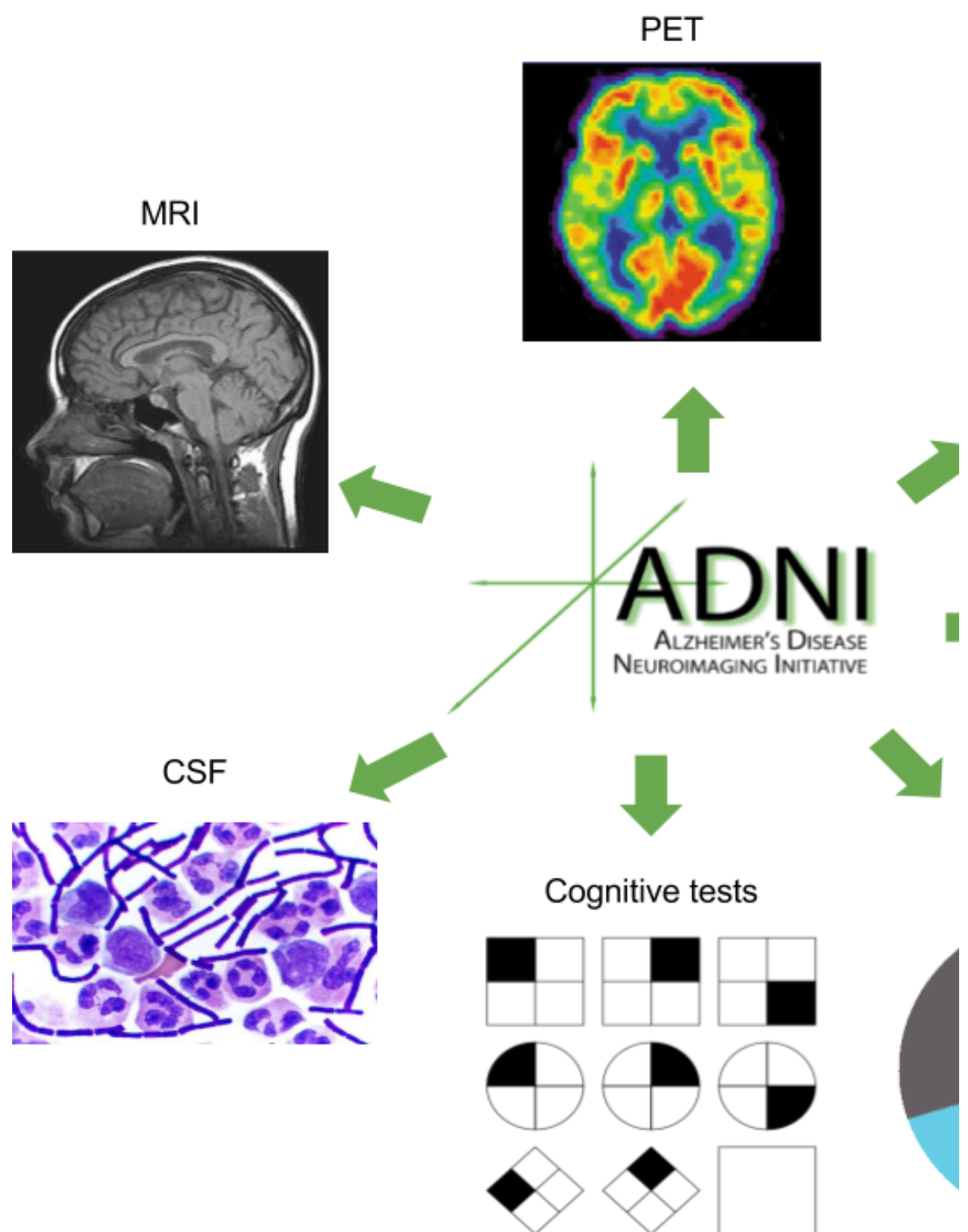
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Diagram showing TADPOLE biomarkers. Source of individual is [Commons](#)

Challenges -> "Tadpole Challenge Data"). You will need [ADNI and apply to access these data](#) files. In the archive, contains both data sets D1 and D2, with row-wise memory by a 1 in the "D1" and "D2" columns, respectively. The file D3.

All queries on the structure and meaning of the standard posted on the [Google group](#). The rest of this page provides content and construction of the TADPOLE standard data sets.

# List of biomarkers

For advancing the diagnosis of dementia, assessment of biomarkers (medical measurements that can indicate a diagnosis) in addition to cognitive tests is of great value. The five most common biomarkers were recently included in the revised diagnosis of dementia and MCI due to AD (Albert et al., 2011; McKhann et al., 2011). Biomarkers can be divided into two categories: measures of amyloid beta protein and measures of damage to nerve cells (Jernigan et al., 2011). In the first category, amyloid beta can be measured using cerebrospinal fluid (CSF) puncture or amyloid positron emission tomography (PET). For the second category, damage to nerve cells can be measured indirectly by quantifying the fraction of tau protein in CSF or using tau-PET, or directly by quantifying brain metabolism using fluoro-deoxyglucose (FDG) PET or atrophy using magnetic resonance imaging (MRI).

TADPOLE standard datasets contain some or all of the following biomarkers:

1. Main cognitive tests (excluding subtypes): - neuropsychological tests administered by a clinical expert

1. CDR Sum of Boxes

2. ADAS11

3. ADAS13

4. MMSE

5. RAVLT

6. Moca

7. Ecog

2. MRI ROIs (Freesurfer) - measures of brain structural integrity

1. volumes

2. cortical thicknesses

3. surface areas

3. FDG PET ROI averages - measure cell metabolism, where cells show reduced metabolism

4. AV45 PET ROI averages - measures amyloid-beta load in the brain. Amyloid-beta is a protein that mis-folds (i.e. its 3D structure is disrupted), which then leads to AD

5. AV1451 PET ROI averages - measures tau load in the brain, where tau is another protein which, when abnormal, damages neurons and synapses

6. DTI ROI measures - measures microstructural parameters related to axons (cell radial diffusivity, axonal diffusivity, etc ... )

1. Mean diffusivity

2. Axial diffusivity

3. Radial diffusivity

7. CSF biomarkers - amyloid and tau levels in the cerebrospinal fluid opposed to the cerebral cortex

8. Others:

1. APOE status - a gene that is a risk factor for developing AD

2. Demographic information: age, gender, education, etc

3. Diagnosis: either cognitively normal (CN), mild cognitive impairment (MCI) or Alzheimer's disease (AD).

## Getting started

In TADPOLE\_D1\_D2.csv, each row represents data for one subject, and each column represents a feature (commonly called biomarker) from the subject at that point in time.

first columns in the spreadsheet contain unique identifiers. VISCODE uniquely identifies every subject, VISCODE (visit code) when the visit takes place (bl is baseline or month 0, month 1, month 2, ..), SITE represents the site ID where the visit took place. Other columns are: EXAMDATE represents the date of the clinical exam, AGE is their age at baseline visit, PTEDUCAT represents their education.

The TADPOLE\_D1\_D2.csv spreadsheet contains many types of biomarkers (or measurements), some more important than others. To start by using only a small subset of the biomarkers which are most informative. Here is a list of biomarkers we suggest participants start with ADNI data to start with:

- The main measures to be predicted: DX, ADAS13, Ventricles
- Cognitive tests: CDRSB, ADAS11, MMSE, RAVLT\_immediate
- MRI measures: Hippocampus, WholeBrain, Entorhinal, MidTemp
- PET measures: FDG, AV45
- CSF measures: ABETA\_UPENNBBIOMK9\_04\_19\_17 (amyloid-beta level), TAU\_UPENNBBIOMK9\_04\_19\_17 (tau level), PTAU\_UPENNBBIOMK9\_04\_19\_17 (phosphorylated tau level)
- Risk factors: APOE4, AGE

Other important biomarkers that participants can consider are MRI, PET and DTI measures for the hippocampus, entorhinal, temporal and parietal lobe structures. Use the TADPOLE\_D1\_D2\_Dict.csv and search for keywords "hippocampus" or "hippocampal" to find the necessary columns. For example, column ST44CV\_UCSFFSL\_02\_01\_16\_UCSFFSL represents the volume of the left hippocampus. If desired, the left and right structures can be averaged together.

## Cognitive tests

Cognitive tests are neuropsychological tests administered by a clinical expert which assess several skills: general cognition, memory, language, vision, etc ... These cognitive tests give an overall sense of whether a person is aware of their symptoms, is aware of the surrounding environment (i.e. he/she knows where they are, know the date and time) and whether he/she can remember a short list of words, follow instructions and do simple calculations.

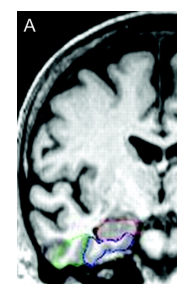
Cognitive tests are important in Alzheimer's disease because they measure cognitive decline in a direct and quantifiable manner. In the cascade of pathological events that lead to Alzheimer's disease, cognitive decline is one of the latest to become abnormal: the first abnormalities are first noticed on the microscope as the misfolding of a protein called Amyloid beta. These changes at larger scales: loss of the neurons' myelin sheath, visible atrophy in MRI scans and finally cognitive decline. (2010b)

These tests have several limitations: 1. they suffer from practice effects: patients who undertake the same test several times can learn how to do it, and thus score higher at a follow-up visit, reducing the usefulness of the test in assessing dementia 2. they have ceiling effects, which means that many subjects might score the maximum possible score and 3. they can be biased, as they are administered by a human expert who might be influenced by prior knowledge of the subject's cognitive abilities.

## MRI measures



Magnetic resonance imaging (MRI) is a technique used to image the anatomy and the physiological processes of the brain and other body parts. With MRI, atrophy can be quantified by measuring the volume of gray matter (GM) and white matter (WM) of the brain. The GM is the brain tissue that consists of nerve cells and the WM consists of fibres connecting these nerve cells. GM can be found in the cortex of the brain and in sub-cortical areas. As a structural MRI scan shows contrast (i.e. differences in pixel intensities) between these tissues, it can be used for volume measurement. Atrophy is indicated by the loss of volume in a particular brain region between two scans, one initial scan and one follow-up scan. Atrophy is a result of the death of neurons in regions affected.



*Left: MRI scan showing the onset of atrophy in the subject with AD, which is the deep gray matter (hippocampus = green). The technology of atrophy progression (AD). See*

TADPOLE datasets include three main types of structural MRI data: 1. ROI volumes 2. ROI cortical thicknesses 3. FreeSurfer maps. An ROI (region of interest) is a 3D sub-region of the inferior temporal lobe. Obtaining these structural MRI data from the images is a long and complicated process. This involves aligning the MRI images with each other and performing segmentation of the main brain structures using an atlas-based method. More information can be found on the FreeSurfer website: <https://surfer.nmr.mgh.harvard.edu/fswiki/LongitudinalProcessing>

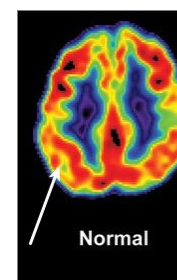
Quantification of atrophy with MRI is a very important and widely available and non-invasive. Also, it is a good indicator of the progression of MCI to dementia in an individual subject. Atrophy becomes abnormal in close temporal proximity to the onset of cognitive impairment (Jack et al., 2013, 2010b).

These measures are computed with an image analysis

Freesurfer using two pipelines: cross-sectional (each independent) or longitudinal (uses information from a subject). The longitudinal measures are ?more robust?, but that there are more missing values in our TADPOLE spreadsheet. Biomarkers in TADPOLE can be found in the columns corresponding to cross-sectional (cross-sectional) and UCSFFSL (longitudinal).

## PET measures

Positron Emission Tomography (PET) detects pairs of gamma rays emitted by a radioactive tracer, which is introduced into the body of a biologically active molecule. Three-dimensional images of tracer concentration within the body are then constructed by computer analysis. Before a PET scan, the patient is injected with a contrast agent (containing the tracer) which spreads throughout the brain and binds to abnormal proteins (amyloid and tau). This enables researchers to track the concentration of these proteins. PET scans can be of several types, depending on the cellular and molecular processes that are being measured:



*Fluorodeoxyglucose (FDG) PET images for a subject (left) and a cognitively normal subject (right). Alzheimer's disease measures cerebral glucose metabolism, which is known to decrease in the temporal region. Alzheimer's disease is cognitively normal. Courtesy of William J. Jagust.*

- cell metabolism using Fluorodeoxyglucose (FDG) PET: Neuronal metabolism refers to the activity going on inside neuronal processing of food and elimination of waste. Neurons that are show reduced metabolism, so FDG PET is an indicator of neuronal metabolism. PET can be used to measure cell metabolism.
- levels of abnormal proteins such as amyloid-beta through amyloid-beta misfolding (i.e. errors in the construction of its 3D structure) is one of the causes of Alzheimer's disease. High levels of misfolded



in the brain are thought to eventually lead to future neurodegeneration and cognitive decline. AV45 PET can be used to measure the levels of abnormal tau proteins in the brain.

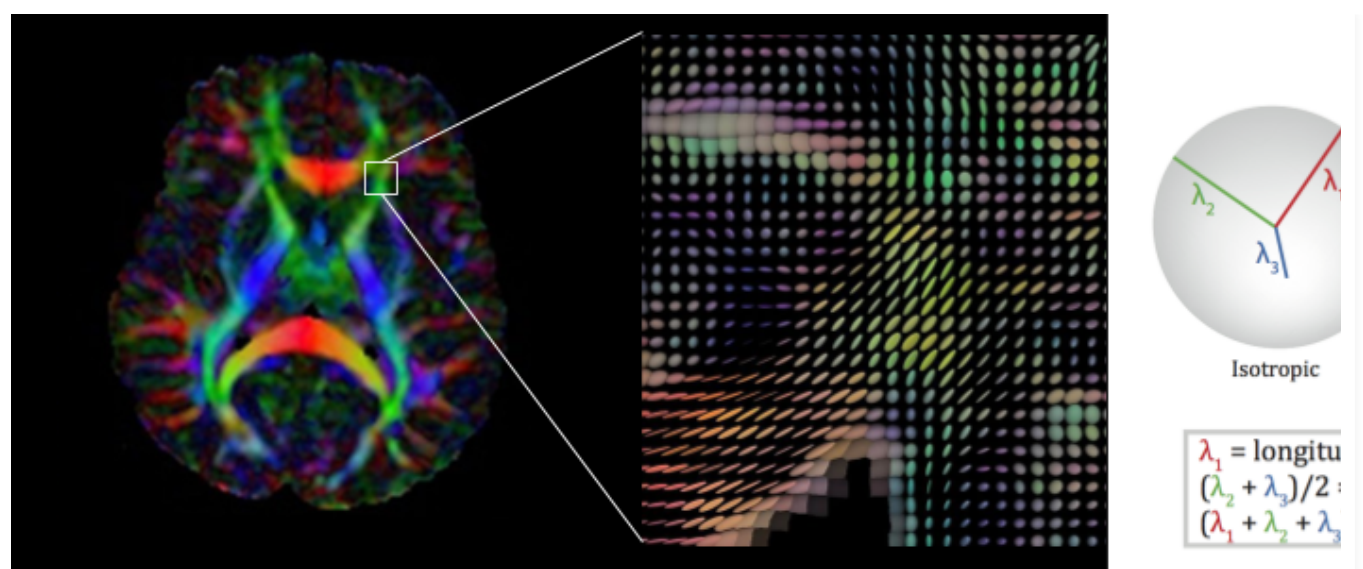
- levels of abnormal tau proteins through AV1451 PET: Abnormal levels of phosphorylated tau (i.e. tau protein + a phosphorus group) that is in an insoluble form eventually causes damage to the neuron's transport system, causing the neuron's transport system to collapse and thus to die.

The PET measures are important because they give insight into the molecular processes that happen in the brain. These processes can become abnormal in the cascade of events that lead to Alzheimer's disease, and are therefore important early markers of the disease that is about to unfold. In TADPOLE, these PET measures might help predict whether a healthy control will eventually progress to mild cognitive impairment (MCI) status or not.

While PET scans are non-invasive, they have some limitations. One limitation is that the patient is exposed to ionizing radiation, which limits the number of scans they can take in a specific time interval. Another limitation is that PET also has a much lower spatial resolution compared to MRI. Another caveat with AV1451 PET (tau imaging) is that it is a relatively new technology and still under research, and very few subject datasets have undertaken these images. PET measures are stored in columns containing "BAIPETNMRC" (FDG PET), "UCBERK" (FDG PET) and "UCBERKELEYAV1451" (AV1451).

## DTI measures

While structural MRI measures brain atrophy, MRI can also measure other markers of neurodegeneration that provide additional information for dementia diagnosis. One such marker is diffusion tensor imaging (DTI). DTI can measure the degeneration of white matter (connections between neurons) in the brain. This is done by measuring the diffusion of water molecules along the neuron fibers.



(Left) Diffusion tensor image of a brain showing white matter fibre connections. The colors represent the direction of the connection (red for left-right, blue for superior-inferior, green for anterior-posterior). (Middle) Zoomed image into the small region highlighted in the left image, showing the diffusion tensor ellipses. Each ellipse indicates the direction of water molecule diffusion (i.e. moved). (Right) Diagram showing the difference between isotropic diffusion (i.e. equal in all directions) versus anisotropic diffusion, along with the measures that can be computed. Image sources: [1], [2]

Molecular diffusion in tissues is not free, but reflects many obstacles, such as macromolecules, fibers, and membranes. As fiber connection degrades, the diffusion becomes more isotropic (i.e. equal in every direction), which can be quantified using a measure called fractional anisotropy.

DTI is important for analysing the progression of Alzheimer's disease. It has been shown that dementia affects white matter bundles (Burgmans et al., 2013). DTI has also shown great potential for aiding in the diagnosis of dementia (Bozzali et al., 2002; Lu et al., 2014; Zhang et al., 2015).

DTI measures have some limitations. In ADNI, it is a secondary imaging modality, and thus many subjects will not have DTI data. Another common problem with diffusion tensor imaging is the partial volume effect, which means that measurements (3D pixel) are biased due to averaging across many different fiber orientations contained in that voxel. In the TADPOLE spreadsheet, DTI data is found in columns containing "DTIROI".

## CSF measures

The cerebrospinal fluid (CSF) is a clear, colourless body fluid found in the brain and spinal cord. It acts as a cushion or buffer for the brain, providing basic mechanical and immunological protection to the brain inside the skull. A sample of the CSF can be taken from patients invasively, by inserting a needle in the spinal cord, a procedure called lumbar puncture.

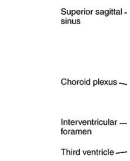


Diagram showing diff to lifestyle and the ass Source: [Baum](#)

Measures of CSF are very important for dementia research concentration of abnormal proteins such as amyloid- $\beta$  strong indicator of AD. Abnormal levels of concentrations are some of the earliest signs of Alzheimer's disease abnormalities many years before symptom onset.

The CSF measures have some limitations. One key limit lumbar puncture is highly invasive and thus not per studies, although a fair amount of ADNI subjects agree procedure. The CSF measures are also not specific to any the brain.

## Risk factors

There are several important risk factors that are known to cause dementia. The alipoprotein E4 variant (APOE E4) is a gene that is the largest known risk factor for AD. Subjects with APOE E4 have a risk 10 to 30 times higher of developing AD compared to non-carriers (i.e. subjects without the gene). The exact mechanism through which the presence of APOE E4 leads to AD is not known. The pre:

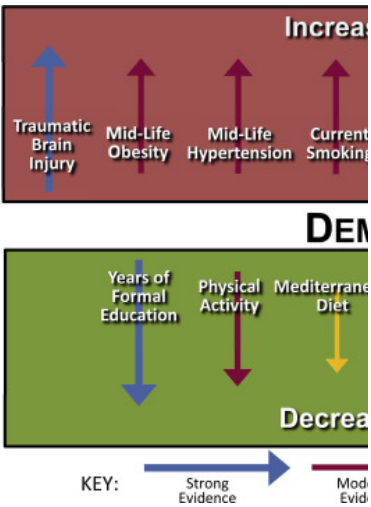


Diagram showing diff to lifestyle and the ass Source: [Baum](#)

in a particular subject is denoted by a 1 in the ,  
TADPOLE\_D1\_D2.csv

Another known and important risk factor for AD is age – are the more likely they are to develop AD. Above the age of 65, the risk of developing dementia doubles every 5 years. Gender is another risk factor, where women seem more likely to develop AD. The reasons for this are still unclear.

Finally, there exist many other risk factors related to medical conditions and lifestyle. Medical conditions such as type 2 diabetes, high blood pressure, high cholesterol, obesity or depression can increase the risk of developing dementia. Lifestyle factors that can increase the risk of developing dementia include poor diet, smoking, unhealthy diet, excessive alcohol or head injuries.

While some of these risk factors (APOE, age and gender) are included in the TADPOLE\_D1\_D2.csv spreadsheet, the other factors are not. However, this information does however exist in the ADNI database (open access). You can find it under Study Data-> Medical History -> Medical History [ADNI]. TADPOLE participants are welcome to use the information from the ADNI spreadsheets if desired.

## TADPOLE standard data sets

The TADPOLE standard data sets can be downloaded from the TADPOLE website. After logging in, go to Download -> Study Data -> Test [ADNI] Challenges and download "Tadpole Challenge Data".

Here is a description of the TADPOLE standard data sets.

## D1. TADPOLE Standard training set

The Standard training set (D1) was created from a spreadsheet, to which we added regional MRI (volumes, surface area), PET (FDG, AV45 and AV1451), DTI (regional standard indices) and CSF measurements.

The MRI measurements included are FreeSurfer processed cortical thicknesses, and cortical surface areas from the longitudinal pipeline) and UCSFFSX (cross-sectional). Explicitly, the spreadsheets used are UCSFFSL51ALL\_08\_01\_16.csv, UCSFFSL51ALL\_11\_02\_15.csv, UCSFFSX51\_08\_01\_16.csv, UCSFFSX51\_11\_02\_15.csv. Duplicate rows were removed, with the row with the most recent RUNDATE and IMAGEUID.

The PET measurements included are ROI SUVR values for AV1451. The spreadsheets used were: BAIPETNM\_08\_01\_16.csv, UCSFFSL51ALL\_08\_01\_16.csv, UCSFFSL51ALL\_11\_02\_15.csv, UCSFFSX51\_08\_01\_16.csv, UCSFFSX51\_11\_02\_15.csv, UCBERKELEYAV45\_10\_17\_16.csv, and UCBERKELEYAV1451\_10\_17\_16.csv.

The DTI biomarkers included are ROI summary measures from the spreadsheet DTIROI\_04\_30\_14.csv. For example mean diagonal axial diffusivity AD.

We also included three CSF biomarkers: Amyloid-beta, Tau, and CDRF. These values were taken from the Elecsys analysis, which is included in the UPENNBBIOMK9\_04\_19\_17.csv spreadsheet.

In all cases, we matched rows between ADNI and UCSF spreadsheets using the subject ID and visit code. Duplicates were removed, with the most recent preferred. For each row included the ID of the image that was used to derive the measures.



## D2. TADPOLE Standard prediction

The set of D2 entries contains all currently available longitudinal prospective ADNI-3 subjects that are rollovers from earlier studies. Such subjects are active (PTSTATUS==‘1’), with baseline diagnosis (Phase==‘ADNI2’), and screening was performed (RGSTATUS==‘1’). Subjects were identified as follows:

1. REGISTRY\_ADNI2 = select all from REGISTRY, where Phase==‘ADNI2’ and RGSTATUS==‘1’
2. DXARM = inner-join of DXSUM and ARM on {RID,Phase}  
Note: ARM is required for baseline diagnosis. Can also be used to define subgroups such as PET+1.5T; 3T+1.5T; etc. (see p23 of [ADNI data training slides part2.pdf](#))
3. DXARMREG = left-outer-join DXARM and REGISTRY\_ADNI2 on {RID,Phase,VISCODE}
4. D2\_RID = select RID from DXARMREG, where DXCHANGE is not missing and Phase is not missing and PTSTATUS==‘1’
5. D2 = historical ADNI data for D2\_RID individuals

## D3. TADPOLE Cross-sectional prediction

D3 uses the same set of participants as D2, but includes only a limited number of data columns. The aim is to mimic a clinical trial in which the available information is typically limited to demographics, cognitive test scores, and structural MRI volumes).

## D4. TADPOLE Test set



The test set will contain ADNI-3 data from rollover and after the challenge submission deadline, and used for forecasts according to the [challenge metrics](#).

## Further Details

The TADPOLE standard data sets are downloadable as seen on the ADNI website. For anyone interested in the data, spreadsheets were generated, we have made our scripts available on [GitHub](#). Our repository also contains scripts for leaderboard datasets, and sanity checking and evaluation file.

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