

# 3D multimodal histological atlas and coordinate framework for the mouse brain and head

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# Abstract

Brain reference atlases are essential for neuroscience experiments and data integration. However, histological atlases of the mouse brain, crucial in biomedical research, have not kept pace. Autofluorescence-based volumetric brain atlases are increasingly used but lack microscopic histological contrast, cytoarchitectonic information, corresponding MRI datasets, and often have truncated brainstems. Here, we present a multimodal, multiscale atlas of the laboratory mouse brain and head. The new reference brains include the whole head with consecutive Nissl and myelin serial section histology in three planes of section with 0.46 µm in-plane resolution, including intact brainstem, cranial nerves, and associated sensors and musculature. We provide reassembled histological volumes with 20mu isotropic resolution in stereotactic coordinates, determined using co-registered *in vivo* MRI and CT. In addition to conventional MRI contrasts, we provide diffusion MRI-based in vivo and ex vivo microstructural information, adding a valuable co-registered contrast modality that bridges MRI with cell-resolution histological data. We shift emphasis from compartmental annotations to stereotactic coordinates in the reference brains, offering a basis for evolving annotations over time and resolving conflicting neuroanatomical judgments by different experts. This new reference atlas facilitates integration of molecular cell type data and regional connectivity, serves as a model for similar atlases in other species, and sets a precedent for preserving extra-cranial nervous system structures.

# Introduction

Neuroscientific research relies heavily on reference atlases, which provide a common framework for studying brain structure and function. However, traditional reference atlases have fundamental technical and conceptual limitations. These include presenting the brain in isolation rather than in the context of the surrounding head and its associated nervous system structures including cranial nerves, muscles and sensory organs, truncating the olfactory bulb and brainstem, lacking multimodality in imaging methods, using idiosyncratic rather than standardized coordinate spaces, and disagreements among expert neuroanatomists on regional boundaries and naming hierarchies. The lack of standardized outputs can impede the neuroscientific enterprise at a basic level, as researchers may be unable to accurately compare and interpret data across studies <sup>1,2</sup>.

To overcome these issues, we propose and implement a comprehensive approach. Instead of providing a traditional segmented reference atlas with paired nomenclature, we constructed a Reference Atlas Framework (RAF). This framework consists of a set of multimodal reference brains at multiple scales, all embedded within the same stereotaxic reference space. It includes versioned and editable segmentations overlaid on these brains and a set of computational tools that permit continuous refinement of annotations and nomenclatures. This paper presents the Brain Architecture Project (BAP) Mouse Head RAF, which includes a multimodal set of downloadable data volumes with multiple MRI and histological contrasts, presented in a stereotactic coordinate system derived from multiple *invivo* MRI and CT datasets. The brain is presented in the context of the whole head, allowing better preservation of the connecting points into the brain via the cranial nerves, as well as the sensors (sense organs) and

actuators (muscles) of the head. Interactive online viewers and annotation tools enable the atlas annotations to be refined and versioned over time, while the coordinate system itself remains fixed.

Even the best available histological atlases for model organisms such as mice (e.g., the Allen Reference Atlas) have major limitations. One significant drawback is the absence of *in vivo* MRI or other advanced imaging methodologies for comprehensive atlas purposes <sup>3</sup>. Furthermore, these atlases often exhibit truncation or incomplete representation of the brainstem. On the other hand, many existing MRI atlases (**Extended Data Table 3**) are outdated, featuring relatively limited MRI contrasts that can capture the fine anatomical details in the mouse brain for comparisons with histology. Consequently, there is a pressing need for newer and updated versions of these atlases to address these limitations and provide more accurate and comprehensive representations of the mouse brain.

To enhance current atlas methodologies, we have acquired a multimodal dataset, including CT scans, MRI (*in vivo, ex vivo*), and histology (Nissl, myelin) data from the same animal. We collected histological series using three sectioning planes (coronal, axial, sagittal) with 10um section thickness, preserving the skull to keep brainstem structures intact. This is an improvement over existing atlases, which typically use one sectioning plane (coronal) and 100um spacing. We have also included a rich set of MR contrasts, especially quantitative parameter maps from diffusion MRI data using advanced biophysical models<sup>4</sup>, designed to extract structural organization at the cellular level for comparison with histology. In addition to the full head datasets, we have collected three brain-only serial Nissl series in the three sectioning planes with better preservation of brainstem structures. In this paper, we cross-modally registered all datasets and used skull landmarks from *in vivo* MRI and CT to define the stereotactic coordinate system with origin at bregma. The resulting dataset is available for viewing through the Brain Architecture portal, and the multimodal data volumes are available for download.

In summary, there are currently two main categories of mouse brain atlases: those based on histology and those based on MRI. While histology-based atlases, such as the Paxinos and Franklin atlas <sup>5</sup>, have been widely used as reference volumes for the mouse brain with cellular-level information, MRI-based atlases provide a 3D anatomical framework undisrupted by sectioning and guide *in vivo* examination. We derived a new reference volume that combines the advantages of both techniques. Our atlas provides high-resolution histology, *in vivo* and *ex vivo* MRI, and *ex vivo* CT datasets. By incorporating both histology and MRI data, our reference volume offers a more comprehensive view of the mouse brain and has the potential to advance research in neuroscience. By providing a more flexible and adaptable reference atlas and improving upon existing datasets, researchers will be better equipped to accurately compare and interpret data across studies. This could lead to new insights and discoveries in neuroscience, ultimately leading to better treatments and therapies for neurological and psychiatric disorders.

# **Results and discussion**

A next generation, whole head adult mouse brain reference atlas

Current mouse brain atlas resources have both technical and conceptual limitations, which the presented reference space resource aims to address. State-of-the-art brain atlases typically focus on microscopy, such as the Paxinos & Franklin <sup>6</sup> and Allen Institute resources <sup>3,7,8</sup>, or radiology, like the Johns Hopkins resource <sup>9</sup> (**Table 1**). Additionally, current microscopy or histology-based atlases frequently lack 3D reconstructed volumes <sup>6</sup> or are not mapped to a meaningful coordinate grid, such as a stereotaxic reference space <sup>8</sup> (**Table 1**). Furthermore, there is no existing microscopy or histology-based atlases in all 3 sectioning planes (**Table 1**; **Extended Data Table 2**). Another key limitation of all current histological atlases is the exclusion of structures related to the rest of the nervous system in the head, and histological atlases often significantly truncate the brainstem and the olfactory bulb. We provide a brief review of existing histological mouse brain atlases in **Supplemental section S2** (histological atlases) and tabulate these atlases, along with literature references, in **Extended Data Table 3**.

The present multimodal set of reference brains, along with auxiliary data objects (BAP Mouse Head RAF), offers several technical advantages. These can be best understood by summarizing our approach in constructing this atlas (Fig. 1). We begin by acquiring in vivo T2-weighted (T2w) and diffusion MRI, followed by *ex vivo* scans of the same subjects with an extensive array of MRI contrasts, as well as *ex vivo* CT (**Fig. 1a**). Next, we decalcify the skull and section the entire cranium to produce whole head Nissl and myelin series (Fig. 1a). From the outset, we employ both radiological and histological, as well as in vivo and ex vivo imaging modalities, making the RAF truly multimodal. Since all imaging, including Nissl and myelin histology, is performed on the whole head, we also capture intact out-of-brain features, such as reconstructable peripheral nerves (**Fig. 1d**). We then use the CT data to fit bregma and the tangent plane, allowing us to impose a stereotaxic origin and orientation onto our averaged in vivo T2w template volume, with which all other series will be registered (Fig 1b). To address variability in cranial shape across individuals, we take a Fréchet mean of coordinate systems established from individual heads. We provide histological and up-sampled radiological volumes, reconstructed at 20 µm isotropic resolution, with the stereotaxic coordinate grid using bregma as the origin (Fig. 1c). In addition to the three wholehead datasets, we also collected brain-only Nissl serial sections (at 20µm section spacing and in-plane) resolution of  $0.46\mu$ m) in the three cardinal planes, with better preservation of brainstem structures as well as the olfactory bulb.

We further disseminate the RAF interactively via the Brain Architecture portal and associated highresolution 2D section viewer (https://www.brainarchitecture.org/bap-mouse-atlas/) and also provide isotropically resampled data volumes with multiple modalities and contrasts summarized in Table 2 (https://data.brainarchitectureproject.org/pages/mouse). In addition to displaying overlaid aligned adjacent Nissl and myelin sections, we have toggleable overlays for the curvilinear gridlines derived from the 3D stereotaxic reference space and region boundaries from the initial test segmentation <sup>8</sup>, as well as the ability to query and return 3D atlas coordinates from 2D sections by mouse click (**Fig. 1c**). By creating a truly multimodal reference resource embedded within an *in vivo* stereotaxic coordinate space, we fill gaps in the technical capabilities of current atlases (**Table 1**). Conceptually, the most widely used atlases, such as the Paxinos and Franklin<sup>6</sup> or Allen Institute<sup>3,7,8</sup> atlases, impose their particular version of region boundary segmentations onto their aligned histological and other microscopy sections, and in the case of the Allen Institute, their reconstructed volumes. These imposed image and volume segmentations derive from a pre-defined brain region ontological tree and label set. The BAP mouse head atlas eschews this top-down approach in favor of a flexible, evolvable and eventually user-defined set of compartment labels and region boundary segmentations. We have initiated a platform (**Fig. 1d**) that allows users to edit both compartment labels and region boundaries via a GUI built into the section viewer. We also link with a novel online image registration platform<sup>10</sup> to enable users to register their radiological volumes or 2D microscopy with the averaged T2w *in vivo* reference space embedded within stereotaxic coordinates (**Fig. 1d**; **Fig 4**). We demonstrate the utility of this setup by registering example datasets with our reference space and provide the underlying data and code along with usage instructions (https://data.brainarchitectureproject.org/pages/mouse).

The BAP mouse head RAF represents an important conceptual shift away from fixed annotation-centric atlases towards evolvable reference atlases focused on reference brains and coordinate systems rather than specific compartment names and segmentations. In the subsequent sections, we describe both the underlying datasets and disseminated and interactive resources in greater detail.

## A new whole-head neurohistology reference space

An important feature of the BAP mouse head atlas is the whole head serial section histology with associated high-resolution digital microscopic images. Alternating series of neurohistological stains for cell bodies (Nissl stain) and myelinated axons (Gallyas myelin stain) were performed on serial sections in three cardinal planes in the three reference heads presented in the manuscript. The three reference brain-only volumes have serial Nissl stain in the three cardinal planes of section. High-resolution histological images from the three whole-head datasets are shown in coronal (**Fig. 2a**), transverse (**Fig. 2b**) and sagittal (**Fig. 2c**) sectioning planes. The three whole-head datasets were sectioned every 10µm, with 20µm spacing between sections of the same series (Nissl or myelin), and images were acquired with an in-plane resolution of 0.46µm. The Nissl-only brain datasets were sectioned at 20µm and imaged with an in-plane resolution of 0.46µm.

We illustrate the histological stains in the head datasets by showing whole-section and cellular-level images (**Fig. 2a-c**), both within and outside the brain. We further demonstrate the advantages of sectioning the intact whole head in preserving peripheral nerves, including their entry/exit to/from the central brain and their extent within the head (**Fig 2d**). Additionally, cellular-level cytoarchitectonic definition is present across various structures in the head, such as muscles, retinal layers, and whisker barrels (**Fig. 2a-c**). Future segmentation of the whole-head histological datasets should permit quantitative delineation of such structures across the extent of the head with cellular resolution.

# Whole-head, combined in vivo and ex vivo multi-contrast MRI and CT

Most existing MRI-based atlases, with a few exceptions<sup>9,11</sup>, rely on high-resolution *ex vivo* mouse brain data to capture fine anatomical structures (e.g., <sup>12–14</sup>, see **Supplementary Table 3** for a referenced list of existing MRI-based atlases together with key metadata). However, this approach limits the available tissue contrasts that are critical for understanding the diverse microstructural organization of the mouse brain. Our comprehensive MRI protocol addresses this limitation by including both *in vivo* and *ex vivo* T<sub>2</sub>- weighted scans for gross anatomical assessment, along with quantitative diffusion MRI parameter maps that indirectly measure tissue microstructural organization and integrity through empirical models of tissue water diffusion (**Fig. 3A**). We also incorporated advanced biophysical model parameters that reflect tissue microgeometry <sup>4</sup> (**Supplemental Section S3**: MRI Microgeometry Parameter Maps). The *ex vivo* dataset includes quantitative MR parameters sensitive to myelin and iron content<sup>15</sup>, such as longitudinal and transverse relaxation rates (R<sub>1</sub> and R<sub>2</sub>\*) and magnetization transfer saturation ratio (MT<sub>sat</sub>) (**Fig. 3B**). This dataset provides high-resolution 3D MRI data (0.1 mm isotropic resolution, interpolated to 0.05 mm isotropic) to facilitate precise alignment with histological sections.

We are able to quantify the differences between the *in vivo* and *ex vivo* MRI datasets. Compared to *in vivo* MRI, which preserves the brain's natural morphology critical for stereotaxic operations, *ex vivo* MRI data show postmortem alterations in brain morphology<sup>9</sup> (e.g., reductions in ventricular size) and in estimated MR parameters, which reflect alterations in tissue microenvironments due to death, chemical fixation and temperature differences<sup>16</sup>. Our voxel-wise comparisons between *in vivo* and *ex vivo* MR parameters provide more comprehensive knowledge of these change than previous reports based on manually defined regions of interest<sup>17</sup>. These comparisons show reduced mean diffusivity (MD), slightly reduced fractional anisotropy (FA), increased mean kurtosis (MK) (**Fig. 3C-E**), and related parameters **(Extended data Fig. 3)**. These changes likely reflect cell swelling as a result of the influx of water and sodium into the intracellular space after death. Parameters from the biophysical model (**Extended data Fig. 4**) revealed previously unreported subtle changes in tissue microstructure, including decreased axonal volume fraction (*f*) along with increased dispersion (p<sub>2</sub>), and an increase in the fraction of the 'dot-compartment' (*f<sub>iso</sub>*) <sup>18</sup>, potentially corresponding to cell bodies.

## Mapping microscopy and radiology datasets to the BAP mouse head RAF

We provide a data and code example via GitHub to demonstrate how users can register their collected microscopy and radiology datasets with our new reference volumes

(https://data.brainarchitectureproject.org/pages/mouse). This tool will allow users of the BAP mouse atlas to place their datasets within a stereotaxic coordinate space with bregma as the origin. It also enables users to embed brain-only datasets within our reference spaces, allowing data collected without the whole head to be placed within that context. The linked registration tool for BAP mouse atlas users preloads the same reconstructed downloadable reference volumes cited in Fig. 1 (histological and radiological). To use the resource, users will need to input their collected microscopy or radiological datasets (**Fig. 4a**). They can also optionally change the default values of several parameters, such as the desired resolution for volumetric reconstruction and the optional co-registration of image stacks of serially histologically sections to create 3D input data. Once parameters are chosen, users can trigger the registration tool, Generative Diffeomorphic Mapping (GDM), whose algorithm is summarized in **Fig. 4b** and in recent work <sup>10</sup>. Our approach to reference volume reconstruction is a generative probabilistic model, where a synthetic stack of 2D microscopy images is formed as a sequence of transforms of a 3D image, plus a noise model describing variability. Transforms include diffeomorphic spatial warping and contrast changes. Mapping to common coordinates is a maximum posterior estimation and enables the reconstruction of 3D and 2D datasets. We quantify tissue distortion with the derivative of spatial maps (morphometry) and account for scale changes when quantifying cell density. We support *in vivo* and *ex vivo* MRI, atlas annotations and multiple stained sections. This framework enabled us to jointly analyze multiple MRI contrasts and histology data, providing ground truth data for the evaluation of MR models.

Output file types will be consistent with those available with the BAP mouse head atlas datasets in **Fig. 1**. Each input dataset will be volumetrically reconstructed, registered and aligned as a stack of 2D sections at a user-defined resolution (**Fig. 4c**). Displacement fields, rotation matrices and Jacobian factors will also be saved per section, allowing users to retransform their data at different resolutions using the obtained registration outputs (**Fig. 4c**). Methodological information on how to use the registration outputs for transformation at arbitrary resolutions is detailed in the recent work <sup>10</sup> introducing the algorithm and package. Region boundary overlays from the user input set of ontological labels and segmented volume, and curvilinear coordinate gridlines from the BAP resource stereotaxic reference space, will also be returned as .json files (**Fig. 4c**).

By including a registration tool with the BAP atlas resource, we aim to facilitate community use of our unique multimodal resource. Allowing users to place their datasets in a stereotaxic coordinate grid, embedded within the context of the whole head, should enable new analyses and experiment planning, particularly for surgeries such as stereotaxic injections or electrode placement for electrophysiology.

## An evolvable Reference Atlas Framework (RAF)

As noted in the first section of **Results** and **Fig. 1d**, a key conceptual advance of the BAP mouse atlas is its evolvability, allowing for user input and edits to nomenclature and segmentation. Instead of providing a traditional reference atlas, we constructed an evolvable Reference Atlas Framework, consisting of (i) a set of multimodal reference brains, (ii) versioned and editable segmentations overlayed on these brains, and (iii) online tools that enable a community-based effort to continuously refine the annotations and nomenclatures (**Fig. 1d**).

## Mapping single cell spatial transcriptomic data in BAP reference coordinates

To enhance the utility of our RAF for the neuroscience community, we have included spatial coordinates for each cell in the recently published Allen Brain Cell Atlas spatial single cell transcriptome <sup>19</sup>. Using our

registration algorithm, we computed a transformation between our reference space and the Allen Mouse CCF and applied this transformation to cell data accessed from the ABC atlas' Python API. Cell IDs with coordinates in our reference space are available for download

(https://data.brainarchitectureproject.org/pages/mouse) and can be used in conjunction with other cellspecific information provided in the ABC atlas. The spatial distribution of six cell types is shown in our RAF in **Fig. 5** and the spatial distribution of 35 cell types are shown in **Extended Data Figure 6**. The ability to superpose the spatial transcriptomics data with the three sectioning planes of light microscopic histological data in the BAP mouse atlas will help connect classical histological atlases to the new information available from the ongoing molecularly based cell-atlas efforts for the mouse.

## Nissl reference series for the mouse brain with better brainstem preservation

Existing histological reference atlases, including the one from the Allen Institute, do not have good preservation of the brainstem structures, resulting in less detailed annotations. To address this, our RAF includes three Nissl-only consecutive series of 20um thickness in the three cardinal planes of section (**Fig. 6**) with intact brainstem as well as olfactory bulb. The preservation of brainstem structures, with continuity into the cervical sections of the spinal cord, is demonstrated in Fig. 5, showing good preservation of cytoarchitectural features. We provide the corresponding reconstructed volumes together with our RAF resource, and offer the corresponding high-resolution series for online viewing and annotation (https://www.brainarchitecture.org/bap-mouse-atlas/). We believe that this will be a valuable dataset for studies involving non-coronally sectioned mouse brains.

## Segmented volume ID Reassignment and Integer Precision Remapping

The brain region segmented volumes used in the BAP mouse head RAF are derived from version 3 of the AIBS mouse atlas. Although there are only approximately 700 unique region IDs in the AIBS mouse atlas, the integer ID numerical values span a wide range, necessitating a high bit precision. Additionally, the original atlas did not separate homologous regions in the left and right hemispheres. To generate unique region IDs for the right hemisphere and avoid conflicts with existing IDs, higher values were used, requiring even greater bit precision. This approach results in large file sizes for annotated volumes and compatibility issues with standard volume viewing software. To address these issues, we regenerated all region IDs for the left hemisphere to range from 1 to 700 and adjusted the IDs for homologous regions in the right hemisphere by adding a fixed value. This allowed us to significantly reduce file sizes and ensure compatibility with standard volume viewing packages by using a lower bit precision format (see **Supplementary Section 5** for further details).

## Segmented Volume "Bubble Correction"

The brain region segmented volumes used in the BAP mouse head RAF are derived from version 3 of the AIBS mouse atlas. Due to registration and interpolation artifacts, these volumes contain bubbles, or isolated voxels with region IDs that do not match their neighbors. In the BAP mouse head RAF, we corrected these bubbles to eliminate these artifacts. First, we defined continuity of region IDs as voxels

with the same ID assignment having touching faces. We set a threshold of five or fewer continuous voxels with the same ID assignment to constitute a bubble. We then identified all bubbles for each region ID and reassigned each voxel in each bubble to the same ID as the majority vote of its neighboring voxels, following a principle similar to nearest neighbor interpolation. This process was repeated until all voxels within bubbles were reassigned. Any remaining bubbles missed by the heuristic algorithm were manually corrected using Blender3D. This algorithm corrected approximately 99.5% of all voxels within bubbles and reduced the number of bubbles from almost 28,000 to just over 150, a reduction of over two orders of magnitude.

A Matlab package for generating these outputs, and the bubble-corrected, ID remapped reference volumes are provided in (https://data.brainarchitectureproject.org/pages/mouse). Further details are provided in **Supplementary Section 5 and Extended Data Fig. 5**.

# Discussion

In this paper we have attempted to advance the state of the art in mouse neuroscience by introducing the BAP mouse head Reference Atlas Framework, consisting of a multimodal, multiscale co-registered set of data spanning in vivo and ex vivo MRI with multiple contrasts, ex vivo CT, as well as dense serial section histology of the whole mouse head with high resolution images of alternating Nissl and myelin-stained sections in Sagittal, Coronal and Transverse planes. In addition, we provide a set of brain-only serial section Nissl-stained data sets also in the three cardinal planes with better preservation of brainstem and olfactory bulb structures than is present in the literature.

We switch emphasis from a fixed set of atlas annotations to high information content underlying reference brains, together with an editable layer of annotations supplemented by online tools. To provide a starting point of the annotations, we provide an initial annotation volume which rectifies multiple issues with the current compartmental annotations available from the Allen mouse brain atlas including a very large number of isolated voxels. We provide data and code to enable users to register their own brain data sets to our new RAF.

To connect the RAF to ongoing spatial transcriptomics-based mouse brain atlases, we mapped the spatial coordinates of transcriptomically-typed single cells from the ABC atlas into our reference atlas framework. This will help bridge the new spatial transcriptomics-based atlases with the more established histological atlases which show cytoarchitectonic contrast that neuroanatomists have considered gold standards for atlas mapping of experimental data sets.

We carefully established a stereotactic coordinate system using same-animal CT scans, based on skull landmarks that are used in experimental neuroscience to place electrodes or injections in vivo. We present serial-section histology of the whole mouse head, to the best of our knowledge never presented previously, and which we hope will set a standard of preserving nervous system related structures outside of the central brain and permit better contextualization and understanding of central brain circuitry which has so far been analyzed largely in isolation from these closely related structures in the head.

# Material & Methods

<u>Subject Demographics & Colony Facilities</u>. Mouse brains were collected at two institutions: Cold Spring Harbor Laboratory and New York University (NYU). Sectioning was performed in three planes: coronal, sagittal and transverse. All samples underwent histological processing, with serial section Nissl stain or alternating section Nissl and myelin stain. The head samples underwent skull decalcification. The list of brains used in this study and associated metadata are shown in **Extended Data Table 1**.

All C5BL/6J mice were sacrificed at P56 and radiologically imaged, if applicable. All experimental procedures were approved by the Animal Use and Care Committees at Cold Spring Harbor Laboratory and the New York University Grossman School of Medicine. See **Supplementary Section S4: Methods** for details.

<u>MRI/CT Image Series Acquisition Process</u>. The same animals were scanned using computed tomography (CT) and magnetic resonance imaging (MRI), both *in vivo* and *ex vivo*, as listed in Supplementary Table 1.

*In vivo* MRI: Animals were anesthetized using isoflurane and imaged on a horizontal 7T MR scanner (Bruker Biospin, Billerica, MA, USA) using a 72-mm conventional circularly polarized birdcage radiofrequency resonator for homogeneous transmission and a four-channel receive-only phased array CryoProbe (CRP) for high sensitivity. Multi-slice T<sub>2</sub>-weighted images were acquired with an echo time (TE)/repetition time (TR) of 30/3000 ms, 4 signal averages, echo train length (ETL) of 8, an in-plane resolution of 0.125x0.125 mm<sup>2</sup>, and 33 axial slices with 0.5 mm thickness. Co-registered diffusionweighted MR imaging (dMRI) was performed using a 4-segment echo planar imaging sequence with a diffusion gradient duration ( $\delta$ )/diffusion time ( $\Delta$ ) of 5/15 ms, 30 directions, and diffusion-weightings of 1000, 3000 and 5000 s/mm<sup>2</sup>. The total imaging time was less than 30 minutes for each mouse.

*Ex vivo* MRI: After perfusion fixation with 4% PFA, mouse brains were prepared as described in<sup>20</sup>. Multislice T2-weighted MRI of the entire mouse head was acquired first. For the brain, multi-slice T<sub>2</sub>-weighted and dMRI data were acquired using the same protocols as the *in vivo* MRI, with diffusion-weightings extended to 9000 s/mm<sup>2</sup> due to approximately 50% reduction in tissue water diffusivity in *ex vivo* specimens compared to live mouse brains. High-resolution 3D *ex vivo* diffusion MRI datasets were acquired using a modified 3D diffusion-weighted gradient-and-spin-echo (DW-GRASE) sequence<sup>21</sup> with a spatial resolution of 0.1x0.1x0.1 mm<sup>3</sup>,  $\delta/\Delta$ =5/15 ms, 60 directions, and diffusion-weightings of 5000 s/mm<sup>2</sup>. Additionally, quantitative magnetization transfer data were acquired using a 3D gradient echo sequence with the following parameters: TE/TR=2.1/45 ms, 12 echos with echo time spacing of 2.34 ms, 4 signal averages, offset frequency of 5 kHz, and a spatial resolution of 0.1x0.1x0.1 mm<sup>3</sup>. dMRI images were pre-processed using the Designer<sup>22</sup> toolbox (https://github.com/NYU-DiffusionMRI/DESIGNER-v2), including denoising<sup>23</sup>, Gibbs-ringing removal<sup>24</sup>, registration<sup>25</sup>, and Rician bias correction<sup>26</sup>. Using the *cumulant expansion*<sup>27</sup> representation, we estimated<sup>28</sup> the diffusion (D) and kurtosis (K) tensors that account for the Gaussian and non-Gaussian components of the diffusion process in the tissue. From D and K, several parameter maps were computed, such as principal diffusion direction, fractional anisotropy, axial, radial and mean diffusivities, and axial, radial and mean kurtosis.

*Ex vivo* CT: CT images were acquired using X-CUBE (Molecubes Inc.). The X-ray source was a tungsten anode with a focal spot size of 50  $\mu$ m, filtered by a 0.8 mm aluminum filter. CT images were acquired using the following parameters: 360-degree rotation, 720 exposures, binning: 1x1; axial FOV: 37.4 mm, 4 averages, time per projection/gap time: 167 ms. The resolution of the reconstructed images was 0.05 mm isotropic.

Additional CT and MRI data, including 2D and 3D FLASH images, were acquired at NIH. Details for these acquisitions are described in the Supplementary information.

*Perfusion, Extraction, Cryoprotection, & Cryosectioning*. Animals were perfused with 4% paraformaldehyde (PFA) through the heart, following a 50 mL saline pre-flush to remove the blood. After perfusion, the animals were decapitated posterior to the first cervical vertebrae. The heads were placed into a recirculation chamber and washed for 72 hours with 20% EDTA, followed by 5 hours in deionized water, and 1 hour in 1x PBS. The skulls were then cryoprotected in 4% PFA with 10% sucrose for 24 hours, 20% sucrose for 24 hours, and 30% sucrose for 24 hours.

The skulls were embedded in a freezing agent inside a custom negative cast mold of the block profile for each skull. The apparatus was submerged in an optimal cutting temperature compound to expedite the freezing process.

Cryosectioning of the frozen brain blocks was performed using the Microm HM550 and CryoStar NX-50 in a temperature range of -16 to -20 C and between 20% and 60% humidity. The brains were cryosectioned at 10 or 20 um using the tape transfer method<sup>29</sup>. Each section was placed onto a 1"x 3" slide coated in Solution B adhesive. Slides were then exposed to UV light for 8 seconds, curing the tissue onto the slide. See **Supplementary Materials: Methods** for details.

<u>Histological Staining</u>. Staining was performed in alternating Nissl-Myelin or Nissl-Myelin-H&E patterns. High-throughput Nissl tissue staining was performed in an automated stainer using 1.88 g thionin in 750 mL deionized water (DiH2O), 9 mL of glacial acetic acid, and 1.08 g sodium hydroxide pellets for slide incubation. Slides then underwent three DiH2O washes and dehydration in increasing concentrations of ethanol and finally xylene before automated coverslipping.

The myelin staining technique was performed using a modified silver stain developed by Gallyas<sup>30</sup>. Slides were incubated in a mix of pyridine and acetic anhydride for 35 minutes, followed by a series of washes with DiH2O, EtOH, and increasing concentrations of acetic acid. The slides were immersed in a

silver nitrate solution for 35 minutes, followed by the wash with 0.5% acetic acid. The slides were then developed in a mix of Developer A, Developer B and Developer C solutions. Next, the slides were washed three times with 0.5% acetic acid. Slides dried for 24 hours and were dehydrated with graded ethanol solutions before automated coverslipping.

<u>Microscopy image series acquisition & QC</u>. All slides were scanned by a Nanozoomer 2.0 HT with a 20x objective (0.46 µm/pixel in plane) and saved in an uncompressed RAW format. Image cropping, conversion and compression to per section .jp2 files were performed. An online QC portal displaying high-resolution section images was used to flag damaged sections to avoid unnecessary post-processing and identify the need to repeat specific processing stages.

Multimodal Registration Algorithms. For registration and atlas mapping, the GDM (Generative Diffeomorphic Mapping) registration algorithm is employed <sup>10,31</sup>. Briefly, tissue processing procedures such as extraction and fixation cause brain tissue deformation in addition to natural biological variability, and unguided reconstruction of serial sections leads to accumulated long-range distortions <sup>32</sup>. Diffeomorphic (smooth and invertible) mapping emerged to overcome these challenges. Our approach to atlas mapping and registration is a generative probabilistic model, where a synthetic stack of 2D microscopy images is formed as a sequence of transforms of a 3D image, plus a noise model describing variability. Transforms include diffeomorphic spatial warping, rigid slice positioning and contrast changes. Under this model, mapping to common coordinates is maximum a posteriori estimation, enabling the reconstruction of 3D and 2D datasets. Diffeomorphisms are estimated by gradient descent in the LDDMM framework <sup>33</sup>, and linear transforms (3D affine and 2D rigid on each slice) are estimated jointly by Riemannian gradient descent as described in <sup>34</sup>. We guantify tissue distortion with the derivative of spatial maps (morphometry), enabling us to account for scale changes when guantifying cell density. This tool supports multimodal registration between *in vivo* and *ex vivo* MRI, atlas annotations including independently derived segmentation, and multiple stained sections. This framework enables us to jointly analyze multiple MRI contrasts and histology data, providing ground truth data for the evaluation of MR models. In other work, we have demonstrated that MRI-constrained reconstruction shows improved accuracy over the baseline method and reduced deformable metric cost <sup>32</sup>. The local scale change between postmortem MRI volumes and reassembled 3D histological volumes from the tape-transfer method is small (~2% median absolute scale change), less than the pre-mortem to postmortem change (~4%, measured using the Jacobian determinant of metric tensor relating the corresponding spaces)<sup>10</sup>.

<u>Creation of Atlas Volumes</u>. To create an appropriate coordinate system defined by landmarks external to the brain, a nonlinear population average was computed from *in vivo* T2 weighted MRI, including the skull, bias corrected using the N4 algorithm <sup>35</sup>. This was done using a group of six female specimens. Using a Frechet mean approach similar to the MNI152 nonlinear average <sup>36</sup> or the Allen CCF <sup>37</sup>, we iteratively estimated a new average image (step 1), followed by diffeomorphic mapping from this image to each member of the population (step 2). The average image is computed by deforming each *in vivo* 

MRI back to common coordinates using the map computed in step 2 and performing a Jacobiandeterminant weighted average at each pixel. Due to different fields of view in different samples (an issue not pertinent to the Allen CCF or the MNI space template), per-pixel weights were set to 0 for pixels outside the field of view for a given sample. Furthermore, weights were multiplied by the posterior probability that a given pixel did not correspond to an artifact or missing tissue, as described in<sup>10</sup>. This weighting corresponds to a maximum likelihood reconstruction. The mappings are updated using our deformable image registration tool described in the previous section. An average shape is created by minimizing the sum of square distance, in the space of diffeomorphic shape changes, from the atlas volume to each dataset<sup>38</sup>. A Frechet mean procedure was again used to align *ex vivo* MRI and dMRI parameter maps into the same coordinate system and to each other.

After construction of our population average image, a standard coordinate system was identified. Each of the six subjects' MRI images was rigidly registered to a corresponding CT image. Using the CT image, the bregma point was located by creating an isosurface of the skull in the Paraview software and manually identifying a point closest to the intersection the coronal suture and sagittal suture. A symmetry plane based on the skull was identified by aligning points in the isosurface to their reflection, minimizing a measure matching loss function <sup>39</sup> over a center point and normal vector that define the symmetry plane. Once identified, the bregma point was projected onto this plane to account for any asymmetry in the sutures. Our initial estimates were found to be a root mean square distance of 0.189 mm from the symmetry plane. Points within a 2.5 mm radius sphere of this bregma position were extracted, and a normal vector to the skull was estimated by applying PCA and choosing the direction corresponding to the smallest eigenvalue of the covariance. This estimate was projected into the symmetry plane. The root mean square angle between normal vectors and before and after projection into the symmetry plane was found to be 1.87 degrees, suggesting this method is accurate but that averaging across samples is appropriate to reduce variability. The center point, the normal vector to the symmetry plane, and the normal vector to the skull together define a coordinate system for each CT scan.

A rigid transform of these coordinate systems into our *in vivo* atlas was computed by minimizing the sum of square error between voxel locations mapped by our deformable transform, and voxel locations mapped by an optimal rigid transform in the neighborhood of the bregma point, achieved with a Procrustes algorithm. Rigidly transformed coordinate systems were averaged across all six mice. The average of six bregma points was used for the origin, and the Fréchet mean <sup>40</sup> was computed for the orientations, modelling each coordinate system as a rotation matrix. The result leads to our conventions for the origin (bregma point on the skull), x axis (normal to the skull, pointing superior), y axis (left-right axis, pointing left), and z axis (anterior-posterior axis, pointing posterior). This procedure is illustrated in **Fig. 1.b**.

To produce a multimodality atlas of the brain in head, including high resolution histology (0.46 um in plane resolution) that has not been interpolated out of the sectioning plane, three representative specimens were selected for sectioning in the coronal, sagittal and transverse planes. For these

individuals, deformable mappings were created from our *in vivo* average image to their Nissl series, and rigidly from the Nissl series to an interleaved myelin series using the above-described methods. The results of automatic registration were improved by manual annotations. For the Nissl series, a set of four landmark points were identified on each Nissl slice, its neighbor and its corresponding MRI section. Rigid transforms for each slice were updated by minimizing a weighted sum of square loss between Nissl and MRI, and Nissl to neighbor (encouraging smoothness). For the myelin series, a rigid transformation to the closest Nissl slice was updated using a manual procedure when the quality of the alignment was poor. We chose an additional set of three brain-only histology stacks, densely sectioned with Nissl (no interleaving myelin), in three orientations to complement the above. They were aligned using the same procedure. A lower resolution (20 um isotropic) summary dataset was also deformed backward into the same shape as our population average.

To produce initial annotations and compare to existing datasets, we also mapped our population average image to the Allen CCF<sup>37</sup> and deformed their labels into our new coordinate system. We also collect cells from the Allen Brain Cell atlas <sup>19</sup> and produce xyz coordinates for each cell in our new coordinate system.

# Declarations

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## Author contributions.

C.M. initiated manuscript drafting with PPM's guidance, created initial versions of figures and text, and was primarily responsible for correcting the annotations on the Allen reference atlas.

S.S. collected histological data for the manuscript together with P.F., M.R., B.L. J.O'R. P.F. and S.S. developed the skull decalcification protocol. S.S., P.F., M.R., B.L. and J.O'R. carried out QC, proofreading, and segmentation of the histological data.

S.B., S.Balani, K.A, contributed to the online viewer, data analysis and the portal.

R.C-L. processed MRI datasets and wrote corresponding parts of the manuscript together with J.Z.

J.Z. conducted all radiological scans for core atlas datasets, supervised R.C-L and wrote the MR components of the manuscripts.

D.T. developed algorithms for multimodal registration and average coordinate system estimation, carried out the associated tasks, and wrote the associated parts of the manuscript.

P.P.M. conceptualized and initiated the project, oversaw all project components, including experimental, computational and informatics parts, and wrote the manuscript together with the other authors.

#### Competing interests.

The authors have no competing interests to declare.

#### Materials & Correspondence.

Materials and correspondence requests should be directed to mitra@cshl.edu. Materials made available include downloadable datasets, web-viewable outputs posted onto the Brain Architecture website, and analytic and other code repositories. Please see the **Data Availability** and **Code Availability** sections for details.

#### Data Availability

Full resolution input microscopy series (Nissl and myelin) are available for viewing on the web at the Brain Architecture web portal (https://brainarchitecture.org/bap-mouse-atlas/). Reference space and analytics outputs mapped onto these microscopy series (reference space curvilinear coordinate grid and coordinate retrieval, segmentation region boundaries, Nissl cell detections, myelin segmentations) are also available as overlays on the same web viewer at the Brain Architecture web portal.

The Reference Atlas Framework is composed of a number of co-registered data volumes in the common reference space determined from skull features on the CT images co-registered with the *in vivo* MRI. These data volumes, uniformly reconstructed at 20µm isotropic resolution are all provided for download from http://data.brainarchitecture.org/. The downloadable objects are listed in Table 2 of the paper under downloadable objects.

## Code Availability

Code used to generate several main text figures, and to register individual per brain datasets with the reference space volume are made available at the following Github links:

- 1. https://github.com/twardlab/emlddmm.git
- 2. https://data.brainarchitectureproject.org/pages/mouse

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# **Tables**

Tables 1 and 2 are available in the Supplementary Files section.

# **Figures**



Summary of the pipeline for generating the next generation mouse common coordinate framework (CCFs) resource. Column 1: Whole-head *in vivo* and *ex vivo* MRI, CT and alternating Nissl and myelin histological series are acquired in the same animals. Column 2: A template volume is created by averaging *in vivo* MRI from 12 mice. The bregma location and tangent plane are determined by identifying the bregma location, skull normal vector, and symmetry plane from CT, which are then registered with the averaged template. Together, the averaged template from *in vivo* MRI and the averaged bregma location and tangent plane from CT form the basis of the atlas framework: reference volumes embedded within an *invivo* stereotactic coordinate system. Reconstructed volumes in reference space include *ex vivo* MRI series from three mice used for whole head histology, whole head Nissl and myelin histological series sectioned in coronal, transverse and sagittal planes, and an additional three brain-only serially sectioned Nissl datasets. Additionally, we provide corrected Allen Mouse Brain Atlas annotations registered with our reference space. Column 3: The atlas mappings of these datasets are available on the Brain Architecture web portal. This includes the averaged reference volume in

stereotactic coordinate space, aligned 0.46 µm in-plane resolution histological sections with overlaid curvilinear coordinate grids and Allen region boundaries, and 20µm isotropic *ex vivo* MRI and histological volumes reconstructed in reference space. **Column 4**: We provide the starting point for an evolvable set of atlas annotations that we expect will be refined over time to include cranial nerves, sense organs and muscles in the mouse head, in addition to compartment annotations of the central brain.



Figure 2

**Example neurohistology (Nissl and myelin stain) data for the mouse head**. We show example Nissl and myelin stain microscopy images of the mouse head in coronal (A-B), transverse (C-D) and sagittal (E-F) planes, captured at 0.46µm in-plane resolution. Each image includes zoomed-in cutouts demonstrating anatomical features both within and outside the brain. **A** Motor neurons (within brain) and muscle fibers (outside brain). **B** Fasciculated axons within the brain and a cross-section of a bundle of cranial nerves within the head below the brain. **C** Granule and Purkinje cell layers from the cerebellum within the brain, and optic features such as the retina and cornea outside the brain. **D** A frontal olfactory-related axon bundle within the brain, and parts of the optic nerve outside the brain. **E** Striatal medium spiny neurons and interneurons within the brain, and a cross-section of a whisker root outside the brain. **F** Cerebellar fiber bundles within the brain, and a section of the trigeminal nerve branching before innervation of the whisker field outside the brain.

![](_page_21_Figure_1.jpeg)

## Figure 3

**Representative** *in vivo* and *ex vivo* modalities for the population-averaged female mouse brain. A Comparisons of *in vivo* and *ex vivo* T2-weighted (T2w) and diffusion MRI-derived maps, including fractional anisotropy (FA), mean diffusivity (MD) and mean kurtosis (MK). **B** Representative *ex vivo* maps of  $R_1$ ,  $R_2^*$  and  $MT_{sat}$ , which are sensitive to myelinated white matter structures. **C-E** Voxel-wise comparisons between *in vivo* and *ex vivo* values, shown in scatter plots with Pearson correlation coefficient ( $\rho$ ) and 95% confidence interval (CI), characterizing differences in estimated MR parameters between the *in vivo* and *ex vivo* brain.

![](_page_22_Picture_0.jpeg)

GDM registration algorithm for atlas mapping of radiological and histological data to the stereotactic mouse RAF. The GDM registration workflow is schematically shown in (a). Observed (input) datasets can include image series or volumes from the following modalities: ex vivo or in vivo MRI, histological brightfield or fluorescence microscopy, CT, and any volumetric data format. The reference brain volume, and optionally a segmented volume to obtain regional boundaries, can also be included. The algorithm estimates several unknown functions to synthesize the target dataset as a transformation of the reference volume. Outputs of the GDM registration pipeline include invertible transformations for computing high-resolution image transformations in any direction, high-resolution 2D microscopy and/or upsampled radiological image series, curvilinear gridlines representing the reference volume stereotactic coordinate system on 2D images, region boundary overlays for 2D images, and volumetric reconstructions of the input microscopy and/or radiological image series (outputs are shown in Fig. 1). (b) The procedure for identifying our coordinate system is described. b.1 On each CT dataset, the bregma point is identified on the skull. b.2-b.4. A symmetry plane and normal vector are estimated and mapped to a common space across six subjects, with an average bregma location estimated. b.5 An iterative Fréchet mean algorithm computes an average coordinate frame. The location of bregma was considerably variable along the AP axis of the skull (s.d.1.24mm), corresponding to individual biological variations of the Y-shaped bregma suture intersection. The Fréchet mean provides an average location and orientation suitable for our RAF. Note that our registration procedure for sample brains utilizes Nisslbased reference brain volumes on which this average coordinate system is superposed.

![](_page_23_Figure_0.jpeg)

Spatial distributions of 6 selected cell types (see plot titles) from the ABC dataset, with coordinates mapped into our coordinate system. A 3D reconstructed Nissl reference brain dataset is shown in our coordinate system. Coronal and sagittal sections are chosen such that that 90% of cells appear in front of the slices. The visualization illustrates the intact brainstem present in the Nissl reference volume. Spatial distributions of a larger set of cell types are shown in **Extended Data Figure 6**.

![](_page_24_Picture_0.jpeg)

Nissl-only reference series for the mouse brain with no skull included but preserving brainstem structures with continuity into cervical spinal cord segments are provided in (a) sagittal, (b) coronal and (c) transverse planes. Serial 20um thick sections were Nissl (Thionin) stained and imaged at 0.46µm inplane resolution. Zoomed-in cutouts show cellular resolution, allowing for the distinction of morphological types. Shown are (a) examples of medial and lateral sagittal sections and deep brainstem neurons, (b) example forebrain, brainstem and spinal cord coronal sections, as well as of neurons in layer 3 of the primary motor area, and (c) examples of medial and inferior transverse sections, as well as Purkinje and granular cells in the cerebellum.

# **Supplementary Files**

This is a list of supplementary files associated with this preprint. Click to download.

- S1DataObjectsDescription.docx
- S2PreviousMouseAtlases.docx
- S3MRIMicrogeometryParameterMaps.docx
- S4SupplementalMethods.docx
- S5AtlasAnnotationBubbleCorrection.docx
- ExtendedDataFigures.docx
- ExtendedDataTables.docx
- Table12.docx