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# The Allen Mouse Brain Common Coordinate Framework: A 3D Reference Atlas

Quanxin Wang<sup>1,2</sup>, Song-Lin Ding<sup>1,2</sup>, Yang Li<sup>1,2</sup>, Josh Royall<sup>1</sup>, David Feng<sup>1,4</sup>, Phil Lesnar<sup>1</sup>, Nile Graddis<sup>1</sup>, Maitham Naeemi<sup>1</sup>, Benjamin Facer<sup>1</sup>, Anh Ho<sup>1</sup>, Tim Dolbeare<sup>1</sup>, Brandon Blanchard<sup>1,5</sup>, Nick Dee<sup>1</sup>, Wayne Wakeman<sup>1</sup>, Karla E. Hirokawa<sup>1</sup>, Aaron Szafer<sup>1,6</sup>, Susan M. Sunkin<sup>1</sup>, Seung Wook Oh<sup>1,7</sup>, Amy Bernard<sup>1</sup>, John W. Phillips<sup>1</sup>, Michael Hawrylycz<sup>1</sup>, Christof Koch<sup>1</sup>, Hongkui Zeng<sup>1</sup>, Julie A. Harris<sup>1,\*,3</sup>, Lydia Ng<sup>1,3,8,\*</sup>

<sup>1</sup>Allen Institute for Brain Science, Seattle, WA 98109, USA

<sup>2</sup>These authors contributed equally

<sup>3</sup>Senior author

<sup>4</sup>Present address: Tableau Software, Seattle, WA 98103, USA

<sup>5</sup>Present address: 343 Industries, Redmond, WA 98052, USA

<sup>6</sup>Present address: Microsoft Corporation, Redmond, WA 98052, USA

<sup>7</sup>Present address: MDimune, Seoul 04790, Korea

<sup>8</sup>Lead Contact

# Summary

Recent large-scale international collaborations are generating major surveys of cell types and connections in the mouse brain, collecting large amounts of data across modalities, spatial scales, and brain areas. Successful integration of these data requires a standard 3D reference atlas. Here, we present the Allen Mouse Brain Common Coordinate Framework (CCFv3) as such a resource. We constructed an average template brain at 10 µm voxel resolution by interpolating high resolution in-plane serial two-photon tomography images with 100 µm z-sampling from 1,675 young adult C57BL/6J mice. Then, using multimodal reference data, we parcellated the entire

Author Contributions

Declaration of interests

Correspondence: julieha@alleninstitute.org (J.A.H.), lydian@alleninstitute.org (L.N.).

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David Feng is an employee Tableau Software.

Brandon Blanchard is an employee of 343 Industries.

Aaron Szafer is an employee of Microsoft Corporation.

Seung Wook Oh is an employee of MDimune Inc. (Korea).

brain directly in 3D, labeling every voxel with a brain structure spanning 43 isocortical areas and their layers, 329 subcortical gray matter structures, 81 fiber tracts, and 8 ventricular structures. CCFv3 can be used to analyze, visualize and integrate multimodal and multiscale datasets in 3D, and is openly accessible (https://atlas.brain-map.org).

# **Graphical Abstract**

# Allen Mouse Brain Common Coordinate Framework



The Allen Mouse Brain CCF is an openly accessible, cellular level resolution 3D reference atlas for analysis, visualization and integration of multimodal and multiscale datasets.

#### Keywords

mouse brain; atlas; 3D atlas; reference atlas; CCF; connectivity; transgenic mouse; cortex; fiber tract; 3D visualization

# Introduction

Modern advances in whole brain imaging techniques have made it essential that brain atlases keep pace with large-scale data collection. Digital three-dimensional (3D) atlases are in demand, having significant advantages over classic 2D plate-based atlases as anatomical frameworks for whole brain datasets. Both 2D and 3D reference atlases consist of two key separable and complementary components; (1) the reference brain and its image, and (2) the structural annotations that show how the brain is parcellated. A standard reference atlas should include additional critical features: a spatial coordinate system, ordered structure ontologies, and easy, interactive access to the atlas at multiple resolutions.

The current standard 2D atlas annotations were drawn on images of a single reference brain sectioned in one plane, stained, and imaged with cellular resolution light microscopy (e.g., Ding et al., 2016; Dong, 2008; Paxinos and Franklin, 2012; Swanson, 2004). Conventionally, parcellation is based on cellular architecture revealed with histological stains (e.g., Nissl, AChE) and/or myelin architecture (e.g., Gallyas silver stain, myelin basic protein). Brain parcellation efforts also utilize differential gene expression, connectivity patterns, or functional properties between brain areas. As each of these modalities may reveal unique characteristics of certain brain regions, when used together, they are expected to greatly improve structural delineations. However, no mammalian brain atlas has systematically combined modalities in a single integrated atlas. In the last decade, brain mapping projects have provided substantial new data revealing highly detailed cellular architecture, including gene expression (Lein et al., 2007; Ng et al., 2009), mesoscale connectivity (Oh et al., 2014; Zingg et al., 2014), and transgenic expression in Cre driver mice (Gong et al., 2007; Harris et al., 2014; Kim et al., 2017; Shima et al., 2016). To stay current, reference atlases should allow for modifications to parcellation schemes based on current knowledge.

Standard 2D mouse brain reference atlases, e.g., the Allen Reference Atlas (ARA, Dong, 2008) and the Mouse Brain in Stereotaxic Coordinates (MBSC, Paxinos and Franklin, 2001, 2012), continue to serve important roles, but a digital 3D reference atlas is preferred for informatics-based workflows, data visualization, and integration across brains, labs, and data types. The Allen Mouse Brain Common Coordinate Framework (CCF) is a 3D reference atlas that has already undergone several revisions. The first version, CCFv1, was created to support whole brain gene expression mapping and searches (Lein et al., 2007). We converted a subset (n=~200) of the Nissl-based ARA 2D structure annotations to 3D, in one hemisphere, at low resolution (200 µm voxels). CCFv2 was introduced to support mapping and visualization of brain-wide mesoscale connectivity (Oh et al., 2014). It included many more structure annotations (n = 860) converted from the ARA, both hemispheres, and higher resolution voxels (100  $\mu$ m). Despite these improvements, at least two major issues remained: (1) conversion of the coronally-annotated 2D structures to 3D volumes resulted in irregular, non-biological, borders and shapes when viewed in non-coronal planes, and (2) current large-scale data generation efforts, such as the BRAIN Initiative Cell Census Network (www.biccn.org), require a higher, cellular level resolution atlas (10-20 µm, Ecker et al., 2017).

To overcome these limitations, we created CCFv3. First, we generated a new 3D reference brain: a volumetric average template at 10 µm isotropic voxel resolution. Second, we comprehensively parcellated and annotated the entire average template brain directly in 3D space. To assist with accurate areal delineations, we compiled and curated multimodal reference datasets deformably registered to the average template brain. Reference data included histology stains, immunohistochemistry, transgene expression, *in situ* hybridization (ISH) and anterograde tracer connectivity experiments. CCFv3 is parcellated into 43 isocortical areas and their layers, 329 subcortical gray matter structures, 81 fiber tracts, and 8 ventricular structures (per hemisphere). Data and tools are accessible through our web portal (http://atlas.brain-map.org).

#### Results

#### The Average Template

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The CCFv3 reference brain is a 3D spatial template constructed as a population average of 1,675 young adult mouse brains imaged using serial two photon tomography (STPT) for the Allen Mouse Brain Connectivity Atlas (Kuan et al., 2015; Oh et al., 2014; Ragan et al., 2012). The average was created from tissue autofluorescence detected in the red channel. Different formulations of an "average brain" could exist depending on the feature being averaged. For future leverage and integration with human atlases, we followed methods developed for a human MRI-based population average template (Fonov et al., 2011). To maximize input data and create a symmetrical atlas, each hemisphere was reflected across the midline, for a total of 3,350 image series (=  $2 \times 1,675$  brains). STPT images were acquired at high resolution (x,  $y = 0.35 \mu m/pixel$ ) every 100  $\mu m$  through the anteriorposterior axis of the brain, then downsampled to 50, 25, and 10 µm in x-y axes. Slight offsets in the position where imaging starts for each brain provides sufficient coverage to allow interpolation along the z-axis to obtain isotropic voxel resolution to 10  $\mu$ m. Assuming uniform sampling along the z-axis, each 10 µm is spanned by data from 335 hemispheres, a number comparable to Fonov et al., 2011. We started with a previous template (Kuan et al., 2015; Oh et al., 2014), adding more registered brains to create the new CCFv3 initial template. An iterative process (1) deformably registered each specimen to the template and averaged all specimens, and (2) computed the average deformation field over all specimens, then inverted and applied it to the average image created in (1). This resulted in a volume with an average unbiased shape and intensity used as the template in the next iteration. The algorithm continued until the difference between the mean magnitude of the average deformation field between iterations fell below a certain threshold and stabilized. Figure 1A illustrates the convergence to a sharp average image with evident anatomical details. For computational efficiency, the method was first applied at 50 µm resolution until convergence was attained, followed by processing at 25 µm, then 10 µm for the final 3D volume (Figures 1B-1G). The average template was matched in size and anterior-posterior extent to the ARA Nissl-stained specimen to retain integrity with the original coordinates and dependent informatic tools. So, the most rostral part of the main olfactory bulb and the most caudal parts of the medulla and cerebellum are excluded. At 10 µm voxel resolution, the average template contains ~506 million voxels. Its dimensions are 1320 (anterior to posterior, 13.2 mm)  $\times$  1140 (left to right, 11.4 mm)  $\times$  800 voxels (dorsal to ventral, 8.0 mm).

The final template contains many distinguishable, detailed, anatomical features (Figures 1H– 1K). Intensity (contrast) levels appear to reflect differences in cell densities (see Methods for details), with white and gray matter appearing at opposite ends of the intensity scale (dark = fiber tracts, light = gray matter). The whisker barrel fields in layer 4 of the primary somatosensory cortex (SSp-bfd) are much more evident in the template compared to a single specimen (Figures 1H). In the medullary spinal nucleus of the trigeminal, interpolar part (SPVI), the first brain location targeted by axons carrying sensory information from each whisker, it is difficult to identify the whisker barrelette formations using only background fluorescence in a single STPT coronal image, but, this structure also becomes clearly visible in the average template (Figure 1I top vs bottom). Similarly, the related barreloids in the ventral posteromedial nucleus (VPM) of the thalamus (Figure 1J), cortical layers (Figure 1H and 1J), and other thalamic nuclei (Figure 1J and 1K) exemplify how the averaging process revealed anatomical structures. The average template provides resolution at cellular scale and is a suitable 3D reference brain for parcellation and annotation.

#### Structure Ontology

Two major rodent brain ontologies are used today; (1) Rat Brain in Stereotaxic Coordinates (Paxinos and Watson, 2013), also used in the *MBSC* (Paxinos and Franklin, 2001, 2012), and (2) Brain Maps: Structure of the Rat Brain (Swanson, 2004, 2018). While full structure names show major overlap between ontologies, abbreviations are quite different (e.g., primary visual cortex is "V1" in MBSC and "VISp" in the Swanson ontology). For CCFv3, we use the ARA ontology which followed *Brain Maps*, but adopt terms from the MBSC, or other publications, when structures were not present in the ARA ontology. Given these differences, users should carefully assess regions with respect to their own purposes (Table S1 compares ARA and MBSC terms). The ARA ontology is hierarchical (see also Figure S6A). At the top level ("root"), the brain is divided into gray matter (including cell groups and regions), fiber tracts (myelinated structures), and ventricular systems (spaces filled with brain fluid). Gray matter is sub-divided into 3 large regions ("cerebrum", "brain stem", and "cerebellum"), which are themselves organized into subregions with differing numbers of "leaves" in the hierarchical tree (Table S2). Similar structures are not always at the same hierarchical level. So, we also refer to 12 "major divisions" of the gray matter: isocortex, olfactory areas, hippocampal formation, cortical subplate, striatum, pallidum, thalamus, hypothalamus, midbrain, pons, medulla and cerebellum, and 316 "summary structures": non-overlapping, finer divisions, independent of their exact depth in the tree (Table S2).

#### Annotation Workflow and Reference Datasets

Annotation of the average template brain was accomplished using a coordinated, iterative workflow (Figure 2). The first step for a given structure was review of previously published atlases and literature, visual analyses of the average template and the five types of multimodal reference datasets (Figure 2A and Figure S1). Reference data were selected based on existing knowledge and new analyses, for those which best revealed boundaries and layers of isocortical areas, subcortical structures, and fiber tracts. Data types included: (1) Transgenic mouse data imaged with STPT (Madisen et al., 2010; Daigle et al., 2018; Gerfen et al., 2013; Gong et al., 2007; Harris et al., 2014, 2019; Shima et al., 2016), (2) Axonal projection data from the Allen Mouse Connectivity Atlas (Harris et al., 2019; Martersteck et al., 2017; Oh et al., 2014), (3) Immunohistochemical and (4) Cytoarchitectural stains; including antibodies against NeuN, NF-160, SMI-32, Parvalbumin, SMI-99 and Calbindin, as well as stains for DAPI, Nissl, and AChE, and (5) In situ hybridization (ISH) data from the Allen Mouse Brain Atlas (Ng et al., 2009, 2010). Datasets curated for each structure revealed highly coincident shapes, sizes, and borders. Occasionally, we encountered conflicting evidence that suggested small differences in border locations for a given structure. To deal with this rare situation, we re-assessed the multimodal datasets for quality (including registration results) and consulted additional mouse and rat atlases and literature to best integrate all the information into our final annotation. In no case did we see data that suggested orthogonal or perpendicular borders

due to different datasets. Specific datasets used for the delineation of brain structures are listed in Table S3, which is searchable and contains links or file locations where images can be accessed and/or downloaded.

The exact criteria used for determining boundaries varied depending on the specific structure, so here we provide examples in the following sections to illustrate our approach. With the selected reference data registered and overlaid, structures were reconstructed directly in the average template using the 3D annotation software ITK-SNAP (www.itksnap.org, Yushkevich et al., 2006). Neuroanatomists delineated each structure across coronal, sagittal and horizontal planes at regular intervals, depending on the size and shape of the structure (Figure 2B). This "weaved' structure was filled in, refined and smoothed by illustration specialists (Figure 2C), and then validated by the neuroanatomists. Once a critical number of 3D reconstructions was reached, individual and local structure groups were merged. After merging, minor overlaps and gaps were fixed, so that all voxels were assigned to a single brain structure (Figure 2D). A final evaluation was then performed by the neuroanatomists. This procedure was followed for delineation of cortical layers, subcortical gray matter structures, white matter fiber tracts and ventricular structures, but not isocortical areas, which used a variant described next. We fully annotated the entire average template volume (*i.e.*, no voxel is left unlabeled).

#### Parcellation: Isocortex Areas

The isocortex is a 3D sheet organized into layers where connections between the layers are typically perpendicular to the surface, suggesting a hypothetical columnar organization. Even though the mouse cortex is lissencephalic, its curvature makes it difficult to visualize along this theoretical dimension, as one "column" cuts through a variable number of coronal planes. So, we developed a curved cortical coordinate system to approximate the "vertical" direction of the sheet based on the geometry of the cortex. These curved coordinates enable the integration and aggregation of information in a columnar manner across datasets, facilitating analyses and parcellation of the cortex.

The first step to create the curved coordinates was to draw the outside border of the entire isocortex. Although the boundaries between isocortex and its neighbors are mostly recognizable in the average template, manual delineation was facilitated by overlaying STPT images obtained from transgenic Cre driver mice, *e.g.*, Calb1-T2A-dgCre and Fezf2-CreER (Figures 3A–3C). Calb1-T2A-dgCre shows enriched gene expression in the superficial layers of the entire isocortex, except for the ventral part of the retrosplenial area. Fezf2-CreER shows complementary expression in deep layers. In a coronal view, the isocortex is separable ventrally and laterally from the piriform area (PIR), where expression of both transgenes is absent (Figure 3A). In a sagittal view, it is separable from the PIR (Figure 3B). Horizontally, isocortex can be separated anteriorly from the main and accessory olfactory bulb (MOB and AOB), and posteriorly from the lateral entorhinal cortex (ENTI), which contains strong Fezf2-CreER and weak Calb1-T2A-Cre expression (Figure 3C).

After delineating the entire isocortex in 3D, the outer surfaces of Layer (L) 6b (bordering white matter) and L1 (bordering pial surface) were designated. Laplace's equation was

solved between these surfaces, resulting in intermediate equidistance fields (Figure 3D). Steepest descent paths, called streamlines, were computed through the equidistance fields from the pial surface to the white matter (Figures 3E–3F, Jones et al., 2000; Lee et al., 2011; Lerch et al., 2008). Analyses of the streamlines provides data on cortical geometry, *e.g.*, radial orientation may reflect putative column orientation (Figure S2A) and variation in thickness can be mapped across the cortical sheet (Figure S2B).

We confirmed the streamlines reflect the true curvature of a vertical axis by comparing them with the topology of thick-tufted dendrites of L5 pyramidal neurons which extend to L1 (Figure S2E-V). L5 neurons were selectively labeled with Cre-dependent viral tracer injections into the Sim1-Cre KJ18 driver line (Harris et al., 2019). In the nose region of primary somatosensory cortex (SSp-n), L5 apical dendrites cross several coronal planes in the anterior direction from the labeled cell bodies (Figure S2E-S2K), and, similarly, streamlines are slightly tilted anteriorly (Figure S2L–N). In the rostrolateral visual cortex (VISrl) streamlines are closer to upright (see green star, Figure S2A), and L5 apical dendrites cross fewer coronal planes (Figure S2S inset). In more anterior locations where the isocortical sheet curves ventrally, such as the secondary motor cortex (MOs, see orange star, Figure S2C), streamlines become almost orthogonal to the coronal plane, looking very like the apical dendrites of Sim1-Cre+ neurons in MOs when sectioned coronally (Figure S2U inset). In fact, it can be hard to visualize L5 apical tufts in single coronal sections but reorienting these data by "unbending" the curved cortical sheet, so streamlines point up, reveals the stereotypical profile of the Sim1-Cre+ apical dendrites reaching to L1 (Figure S2O-V).

Using the computed streamlines, information at different cortical depths can be aggregated and projected to the pial surface. Various 2D views can then be created from 3D, and information can also be translated back to 3D. For example, streamlines enable visualization of the entire cortical sheet in 2D, *i.e.*, a virtual "flatmap" (Figure S2A–D, Fischl et al., 1999, Harris et al., 2019). We used multiple 2D surface views of the 3D average template overlaid with registered reference datasets for parcellation. Surface views were generated by projecting the highest intensity voxel along a streamline to its surface voxel counterpart. Given that various views can provide additional information across a rounded surface, we used seven angles (top, bottom, medial, side, rotated, front and back). Example datasets mapped onto the top and lateral views are shown in Figures 3G–3L and S3, as these two angles contain most isocortical areas in a single image, but all surface views generated for the transgenic and connectivity data used to delineate isocortex regions are available for download. We drew borders directly on these 2D views, integrating data as described next, then transformed the surface drawings into 3D volumes by extrapolating from the surface along the streamlines.

In the top view of the average template (Figure 3G), distinct bright domains are obvious, *e.g.*, barrel fields, which are unambiguously anatomical structures. Based on the location and shape of these structures, we putatively assigned them as primary visual, primary auditory, primary somatosensory and retrosplenial areas. Boundaries were confirmed by overlaying registered reference datasets on the average template. Rorb-IRES2-Cre, a marker of layer 4 neurons densest in primary sensory areas, affirmed the putative borders of the three primary

sensory regions (Figure 3H, red). Transgene expression in the Chrna2-Cre\_OE25 line is enriched in retrosplenial areas (Figure 3H, green), and the registered spatial pattern aligned well with the putative border drawn from the average template. Additional datasets helped finalize the borders and subdivisions within them (Figure S3). These four major cortical regions then served as landmarks for the remaining isocortex.

Unlike the intrinsically bright areas, regions between landmarks are not visible using only contrast in the average template. For higher order (secondary) visual areas, we generated visuotopic connectivity maps and a virtual callosal connectivity map (Figure 3I). By overlaying these on the average template, we identified nine higher visual areas based on their complete visual field maps and fixed spatial relationships with callosal labeling patterns (Wang and Burkhalter, 2007). Five of these areas (anterolateral, rostrolateral, anterior, anteromedial, and posteromedial), were also recognizable for having enriched expression in line Glt25d2-Cre\_NF107 (Figure S3C, in red) and axonal projections from the lateral dorsal nucleus of thalamus (Figure S3D, in green).

To parcellate the remaining isocortical areas, we continued to use both transgenic and connectivity datasets registered to the average template, as well as consulting histological reference stains, published atlases, and literature. In the top view, we further delineated dorsal (Figure S3D,E), agranular (Figures 3J and S3F), and ventral retrosplenial areas (Figures S3F,G), primary and secondary motor areas (Figures 3K), the dorsal part of the anterior cingulate area (Figure S3H, in green) and the prelimbic area (Figure S3F, in green). Like the top view, the lateral view of the template also showed the primary sensory areas as inherently brighter than surrounding structures (Figure S3I). Their shapes, sizes and locations were similarly confirmed through registration and visualization of transgenic expression data. In addition to reconstructing areas that were at least in part visible in the top view, the lateral view enabled additional areas to be parcellated (details and examples in the Figure S3 legend). We reconstructed 31 isocortical areas in the top view (Figure 3L) and 33 in the lateral view (Figure S3T). Using all surface views, the mouse isocortex was parcellated into 43 total areas.

#### Parcellation: Isocortex Layers

Next, we delineated the borders between isocortical layers primarily using differential contrast features in the average template itself and Cre driver lines with layer-selective reporter expression (Figure 3M–S, Gerfen et al., 2013; Harris et al., 2014, 2019), as well as consulting histology data and publications. In the average template (Figure 3M), Layer 1 (L1) is brighter at the cortical surface, getting darker near the transition to L2/3. L4 is generally brighter than L2/3 and L5, while L6 is generally darker than L5, but brighter than the fiber tracts beneath the isocortex. L6a and 6b are not readily distinguishable in the average template. L6b, located directly above the white matter, is very thin (~20–30  $\mu$ m, 2–3 voxels), so we relied on the Ctgf-2A-dgCre line with enriched expression in L6b neurons (Figure 3R). L1, 2/3, 5, 6a, and 6b were delineated for all isocortical areas using multiple Cre lines for each layer, registered and overlaid on the average template. L4 is not present (or very thin) in the prelimbic, infralimbic, orbital, agranular insular, motor, anterior

cingulate, retrosplenial, perirhinal and ectorhinal areas. Delineated layers were intersected with the 43 cortical areas, resulting in a total of 242 structure volumes (Figure 3S).

#### **Parcellation: Subcortical Gray Matter Structures**

We delineated an additional 329 gray matter structures outside the isocortex, covering the other 11 major brain divisions. For each structure, we curated a unique combination of experiments extracted from the complete set of histological, immunohistochemical, in situ hybridization, transgenic driver line, and connectivity datasets that were most consistent with each other to define putative borders (Table S3). Contrast features inherent in the average template were always used when present and informative. Each subcortical structure was concurrently delineated through coronal, sagittal and horizontal planes of the average template at 10 µm voxel resolution to create smooth 3D volumes. We present here only one example out of 329, the interpeduncular nucleus in the midbrain (IPN, Figure 4A). First, we comprehensively reviewed previous parcellations in other atlases and the literature on IPN anatomy. IPN was previously delineated into seven (Paxinos and Franklin, 2012) or eight (Quina et al., 2017) subdivisions based on cytoarchitecture, transgenic and connectivity data. It was not sub-divided in the ARA (Dong, 2008). We also delineated eight IPN subdivisions in CCFv3 (Figure 4B) using a combination of cytoarchitecture (Nissl, Figure 4C), antibody staining (Figure 4D–4F), transgene expression (Figures 4G–4H), axonal projections to IPN labeled via anterograde tracing (Figures 4I–4J), and the average template itself (Figures 4K– 4M). We reviewed all the high resolution 2D image data to assist in discovering and determining the locations, shapes, and contours of regions in coronal planes, and we overlaid the registered image data (downsampled to 10 µm) on the average template for viewing and drawing in the three orthogonal planes (Figures 4N-4S). Details are provided in the Figure 4 legend.

Each structure was pursued in this way, with data analyses, drawing, and merging of structure groups as described above (Figure 2). Most voxels in the average template volume were labeled after parcellating the 329 subcortical gray matter structures. However, some gaps in the gray matter (*i.e.*, unlabeled voxels) remained. Based on the specific location within the brain, these voxels were assigned to one of the 11 major brain regions (as part of a "parent" structure). For example, after delineating the more than 40 hypothalamic nuclei, there were gaps between regions that did not clearly belong to any of the neighboring annotations (*e.g.*, see light pink color around DMH, VMH, TU and LHA in Figure S7B). We labeled such voxels that were located between other regions with the appropriate parent structure (e.g., "Hypothalamus").

#### **Parcellation: Fiber Tracts**

We delineated white matter fiber tracts throughout the entire brain volume (Figure 5A,B) primarily using inherent contrast features in the average template supported by two types of reference data: anterograde tracing and antibody staining. Some white matter bundles are obviously distinguishable from surrounding gray matter structures, as the axons contained within them are highly fasciculated, traveling in the same direction at these locations. In these types of tracts, contours and trajectories were readily defined by comparing the average template with corresponding anterograde tracing data that directly labels the axons

making up these tracts. As an example, we show a set of three related tracts all originating from the medial mammillary nucleus (MM, Figure 5C,D); the principal mammillary tract (pm), most proximal to MM, which splits to form the mammillotegmental tract (mtg) and the mammillothalamic tract (mtt). Axonal tracing data from the Allen Mouse Connectivity Atlas shows the mtt travels anteriorly to innervate thalamic regions, e.g., anteroventral (AV) and anteromedial (AM) nuclei (Figure 5F,G), whereas the mtg travels posteriorly to innervate the midbrain ventral tegmental nucleus (VTN, Figure 5H,I). The location, shape, size and trajectories of these three tracts can thus be accurately delineated by comparing the STPT images of labeled axons originating from MM in the coronal plane with the average template (where the tracts are dark in appearance, Figures 5J-5O). Contours of these fiber tracts were drawn, then adjusted and smoothed iteratively on the average template in coronal, sagittal and horizontal planes to build coherent 3D volumes. Other examples of "simple" fiber tracts include the anterior commissure (ac), fornix (fx), and fasciculus retroflexus (fr, see labels in Figure 5N). Most fiber tracts were more complicated. More commonly, fiber tracts adjoin, merge, or intersect other bundles and/or portions of gray matter structures at different locations, leading to different intensities along their complete paths. For these structures, we used additional reference data to more accurately delineate boundaries and trajectories, e.g., antibody staining for parvalbumin (Pvalb) which reveals clear fiber orientation patterns for tracts such as the medial lemniscus, as described for rat (Celio, 1990; Endo et al., 1986), see also CCF technical documentation (http://atlas.brainmap.org/). Applying these methods and processes for simple and complicated white matter, we reconstructed 81 fiber tracts throughout the mouse brain in 3D (Table S2).

#### **Parcellation: Ventricular Structures**

The ventricular system includes the lateral ventricle, third ventricle, cerebral aqueduct, fourth ventricle and central canal of the lower medulla, as well as associated ventricular recesses and choroid plexuses. We delineated these structures in 3D based mainly on inherent contrast in the average template, paired with corresponding Nissl-stained sections (Figure S4). In the template, ventricles, like many white matter tracts, have a very dark appearance (Figures S4D–H). In Nissl-stained sections, however, the shape and size of ventricular structures and choroid plexuses are readily distinguishable from fiber tracts (Figures S4I–M). The contours of these structures were also delineated using specific transgenic lines that label the ependymal epithelia (*e.g.*, Slc17a8-IRES2-Cre, Figure S4N–9R) and/or choroid plexuses (*e.g.*, Foxp2IRES-Cre, not shown). One notable observation is that the cerebral aqueduct, at the level of the inferior colliculus, appears more ventricle- than aqueduct-like (Figure S4C). As described for fiber tracts and subcortical gray matter structures, the adjustment and smoothing of these structures were done iteratively in coronal, sagittal and horizontal planes to build a 3D volume. We reconstructed 8 ventricles and associated structures.

#### Structures added to CCFv3

While manually inspecting and curating the multimodal reference data, we found evidence to support the addition of 36 subcortical gray matter structures to the ARA/CCFv3 ontology. Most (n=27) already exist in the MBSC ontology and atlas, and we were able to identify enough reference data to support adding these delineations in CCFv3. However, several

structures are unique to CCFv3 over other reference atlases (Table S1), although all were previously described in the literature. For example, the IPRL subdivision of the IPN (Figure 4) described above is a new CCFv3 structure. We also further parcellated the dorsal part of the lateral geniculate complex (LGd) into three subdivisions not previously annotated in ARA or MBSC ontologies, based on anatomical features in the template, anterograde tracing data from retinal ganglion cell types, and previous publications; shell (LGd-sh), core (LGco), and ipsilateral zone (LG-ip, Figure S5; Grubb and Thompson, 2004; Huberman et al., 2009; Kay et al., 2011; Kerschensteiner and Guido, 2017; Kim et al., 2011; Martersteck et al., 2017; Rivlin-Etzion et al., 2011). Other newly delineated gray matter structures include the hippocampoamygdalar transition area, prosubiculum and area prostriata (Ding, 2013; Ding et al., 2019; Lu et al., 2020).

We also identified and added four fiber tracts not in the previous ARA and MBSC; the optic and auditory radiations, the body of the corpus callosum (ccb), and the supra-callosal cerebral white matter (scwm, Figure 6A-C). Cortical callosal projections make up a fiber bundle that is generally labeled as a single tract, the corpus callosum (cc, *e.g.*, Dong, 2008; Paxinos and Franklin, 2012). However, visual inspection of contralateral axonal projections labeled from a comprehensive set of cortical areas revealed that these cortical axons do not occupy the entire white matter region beneath the isocortex. Labeled callosal axons are instead concentrated in the mid-to-deep portion of the white matter, in both hemispheres, leaving a clear gap between this callosal bundle and the overlying isocortex (Figure 6D–6F). In contrast, we observed that thalamocortical axons appear to be layered above the callosal bundles, just beneath overlying isocortex (Figure 6G–6I). Based on this striking lamination in the white matter, *i.e.*, separate callosal and thalamocortical axon paths, we delineated these as two separate structures; the cc and scwm. Interestingly, corticothalamic projection fibers appear to first travel in the scwm and then penetrate the callosal bundle before they innervate subcortical targets (not shown). Therefore, the cc is mainly composed of the cortical commissural fibers that run between the two hemispheres and part of the corticosubcortical fibers. The scwm mostly consists of ipsilateral thalamocortical projection fibers, including the optic radiation (or) and cingulum bundle (cing, Figure 6B,C), as well as the auditory radiation and part of the cortico-subcortical fibers.

#### CCF applications and resources

We developed web applications for exploring CCFv3 in 2D and 3D (http://atlas.brainmap.org). Our interactive Atlas Viewer (http://atlas.brain-map.org/atlas?atlas=602630314) provides 2D visualization and linked browsing of coronal average template sections overlaid with corresponding structure annotations, like a conventional 2D reference atlas (Figure S6A–C). Notably, the Atlas Viewer can also be used to compare our anatomists' delineations of the average template side-by-side with most of the multimodal reference datasets. Exceptions include the Allen Brain Atlas (ABA) ISH data, as these datasets were not registered directly to CCFv3, and a few transgenic line experiments currently available only via download. Using Table S3, users can identify experiments of interest for a given structure and follow the links provided to navigate to these datasets individually. For example, clicking on the link for a connectivity experiment will open a Mouse Connectivity Atlas experiment page. There, one can open the high resolution image viewer (a box with

arrow icon) and click on the key icon to show the reference atlas. Turning on this functionality changes the display into a side-by-side split window with the atlas image on the left and the data image on the right. The two views can be aligned using the "sync" feature (Figure S6D). The Experiment Image Viewer also provides the ability to view and navigate multiple datasets in a single window to compare different expression or connectivity patterns from multiple experiments. For example, one can view the histological reference stains by selecting and viewing all experiments at this link (http:// connectivity.brain-map.org/static/referencedata), then adding and "syncing" with the 3D coronal atlas (Figure S6E–I). The Allen Brain Explorer (beta) application enables 3D visualization of CCFv3 structures (http://connectivity.brain-map.org/3d-viewer?v=1). It supports linked browsing and visualization of structures of interest in the CCFv3 ontology tree or loading of 3D models for different sets of structures (*e.g.*, "major divisions" or "fine divisions").

The Allen Brain Map portal hosts downloads through our web Application Programming Interface (API; http://help.brain-map.org/display/mouseconnectivity/API) and the Allen Software Development Kit (AllenSDK; https://allensdk.rtfd.io/en/latest/ reference\_space.html). The AllenSDK provides, in addition to data access and caching, a thoroughly documented and actively maintained open source library of tools for using CCFv3 annotations in concert with registered data. The API and AllenSDK together support cross-platform, public access to the CCFv3 ontology, template, and annotation volumes (at 10, 25, 50, and 100 µm isotropic resolution) along with the code and documentation required to use the CCFv3 in research projects.

To demonstrate potential uses of the CCF and Allen SDK, we developed two applications using image series already registered to the CCF: reverse mapping and volume estimation. Above, we described that data used to assist with parcellations were warped and downsampled to fit into the average template volume (Figure 7A–C). However, the reverse mapping, *i.e.*, visualizing atlas annotations in the original image space, is also possible. We used the AllenSDK to access CCFv3, our STPT image data, and original transform parameters following deformable registration to the CCF and applied the inverted deformation field output from the registration process to warp the CCF to the images (Figure 7D–J). Using the deformation fields also enabled us to compute brain structure volumes for the population of mice used to create the average template. Note that deformably mapping data to a template does not preserve distance relationships, and so measurements like distance and volume need to be done on the original specimen space. The population used to create the average template consists of 1,675 brains (n = 1,051 males: 621 females), with a mean age and SD of P77  $\pm$  10.7 days. First, to calculate whole brain volumes for each brain, we generated a voxel mask for the entire average template volume. Then, we applied a marching cubes algorithm to find the corresponding surface mesh of this mask. Deformation fields were again applied in reverse to map the whole brain surface mesh back to each individual brain's original shape and size (Figure 7K). Volumes ranged from 359–545 mm<sup>3</sup>, with a mean and SD of  $435 \pm 23.5$  mm<sup>3</sup> (Figure 7L). Thus, most individual whole brain volumes are within ~11% of the mean, with a coefficient of variation (CoV) = 5.4%. We did not observe a significant difference between males and females ( $434.24 \pm 22.94$  vs  $437.07 \pm$ 24.41 mm<sup>3</sup>, respectively). Note the mean volume is ~15% smaller than the CCFv3 average

template (435 vs 506 mm<sup>3</sup>). This is due to our first version template (Kuan et al., 2015) which intentionally matched the size and orientation of the ARA Nissl-stained brain specimen. Since this template initialized the CCFv3 average, the size and shape were also inherited. Notably, the unfixed fresh-frozen ARA specimen is closer in size to brains imaged *in vivo* (*e.g.*, 506.9  $\pm$  11.5 mm<sup>3</sup>, Ma et al., 2008) compared to the perfusion-fixed brains imaged by STPT. We also calculated structure volumes and descriptive statistics across the entire CCFv3 ontology using the approach described for the whole brain (Table S4). Major division volumes were not any more variable than the whole brain (CoVs=5.4% to 7%), whereas variation was larger (10.7%) for the finest divisions. The largest variations (87%) were noted in structures with very high surface area to volume ratios (*i.e.*, long thin structures like layer 6b). These measurements rely on the specimen deformation fields, so variability in the registration process.

# Discussion

The CCFv3 reference brain offers several improvements over previous volumetric templates. First, we averaged substantially more individuals than MRI-based templates (n=1,675 vs 4–40, Ali et al., 2005; Bock et al., 2006; Chen et al., 2006; Dorr et al., 2008; Kovacevi et al., 2005; Ma et al., 2005; Sharief et al., 2008). Acquiring whole brain high resolution images for so many specimens combined with iterations of registration and averaging resulted in very good signal-to-noise, revealing anatomical details not readily discernable in any single specimen. Second, CCFv3 has the highest spatial resolution of any available 3D reference brain (10 vs 17–50  $\mu$ m voxels or more) and is 1,000 times higher resolution than CCFv2 (100  $\mu$ m voxels). Of course, limitations still exist. For example, the reference brain is ~ 15% larger than the average of the individual STPT imaged brains used in its creation, and, the relationship of the template to fiducial landmarks of the skull (*e.g.*, Bregma) are unknown. So, at present, CCFv3 is not suitable for determining stereotaxic coordinates. This limitation could be overcome by registering the average template to brains imaged in the skull with high resolution MRI or X-ray microCT, or validating mapped coordinates following alignment of the CCFv3 to the MBSC atlas (Chon et al., 2019).

We labeled all the voxels in the average template to produce a fully annotated 3D reference atlas using an approach that differs notably from previous atlases (including CCFv2). Here, we delineated structures *directly in 3D* to build smooth volumes as opposed to drawing in only one imaging plane, which produced noticeable improvement in the "smoothness" of borders when viewed in all planes (Figure S7). This result is not just aesthetic. The isocortex is a thin sheet of gray matter which has a concave inner surface and a convex outer surface, so, it follows that areal borders that extend from the brain surface down to the white matter should be curved. However, in conventional 2D atlases, borders between cortical areas are always drawn as straight lines from the pial surface down to the white matter *in all planes* (coronal, horizontal, and sagittal, *e.g.*, Paxinos and Franklin, 2012). Straight border lines seem very unlikely to represent the true curvature of the isocortical sheet in 3D space.

Conventional 2D mouse brain atlases are drawn on reference brains stained with Nissl (Dong, 2008), or Nissl and AChE (Paxinos and Franklin, 2012). We also used Nissl staining

to corroborate and assist in drawing borders, but it was not the primary reference space (*i.e.*, the average template). Other reference data types commonly consulted for parcellating mouse brain structures include myeloarchitecture, chemoarchitecture, genoarchitecture, connectivity, and functional mapping (Bienkowski et al., 2018; G m nu et al., 2018; Garrett et al., 2014; Thompson et al., 2008; Wang and Burkhalter, 2007; Watson et al., 2012; Zhuang et al., 2017). Given that each data set reveals a unique labeling pattern for certain regions, combining data types should provide a tremendous methodological advantage for accurately defining brain structures. Our neuroanatomists carefully selected datasets across these modalities, and, like atlases drawn by other experts, subjectively integrated these data to draw borders (albeit this time in 3D). Incorporating additional structures and using these annotation methods likely enhanced the accuracy of areal delineations, but we did not *systematically* validate all the parcellations by mapping them back onto individual image series containing appropriately labeled data for validation.

We annotated 658 individual structures in total for CCFv3. It contains far more 3D reconstructions than any existing MRI-based atlas (Ali et al., 2005; Badea et al., 2007; Dorr et al., 2008; Ma et al., 2005; MacKenzie-Graham et al., 2004; Ullmann et al., 2013), but fewer annotated structures compared to standard 2D atlases, *i.e.*, MBSC (4<sup>th</sup> edition, n=946) and ARA (n=860). Reasons included a lack of available data from which borders could be confidently drawn, but, in large part came down to resources, as the process of manually annotating so many structures in 3D was time and labor intensive. Given major advances in machine learning approaches to image feature detection and leveraging large multimodal whole brain datasets, we expect future atlases will be built in more automated, unbiased, ways (Van Essen and Glasser, 2018). Several groups have already applied automatic delineation methods to mouse brain MRI, but so far extracted only major brain regions (Johnson et al., 2010; Ma et al., 2005, 2008) or focused on a small number of brain areas in reasonable detail (Chen et al., 2019). Supervised machine learning methods could be applied to learn image features predictive of known brain regions using manual parcellation results. Comparison of atlases built from unimodal and multimodal data types will undoubtedly shed new light on fundamentals of brain organization. To achieve this goal, it is important that data and delineations are in a common spatial coordinate framework.

Registration of image data into the CCF enables direct comparison and integration across multiple datasets in the same space. Specifically, registration enables a voxel-level description of features of interest in any given image series. As each 10 µm voxel is labeled with a structure from the ARA ontology, one can simply add up all the voxels with the same label to get descriptions at the brain region level, enabling multi-scale analyses ranging from single voxel (cellular resolution) to whole brain. Voxel-based data summaries are demonstrably useful for quantitative analyses (*e.g.*, Kim et al., 2017; Knox et al., 2019; Oh et al., 2014; Whitesell et al., 2019) and data visualizations across multiple resolutions (*i.e.*, voxels can be relabeled) and, the ability to ignore parcellation completely for purely spatial-based analyses.

Registration precision may always be best for image series collected using the same modality (*i.e.*, STPT), but other image types can also be registered to this template. We did

not develop registration software tools for users, but, since the CCF was made available online, many recent publications already describe registration solutions and informatics pipelines for different imaging modalities, including MRI, light sheet imaging of cleared brains, other high-resolution fluorescent whole-brain imaging platforms, and traditional histological-stained brain sections (Allan Johnson et al., 2019; Chon et al., 2019; Eastwood et al., 2019; Fürth et al., 2018; Han et al., 2018; Jin et al., 2019; Li et al., 2018; Ni et al., 2020; Pallast et al., 2019; Puchades et al., 2019; Renier et al., 2016; Salinas et al., 2018; Tappan et al., 2019; Tward and Miller, 2019; Winnubst et al., 2019; Xiong et al., 2018). CCFv3 has also been used to provide anatomical context for large-scale electrophysiology experiments distributed across the brain (Steinmetz et al., 2019) and for widefield calcium imaging maps in cortex of behaving mice (Musall et al., 2019). Alignment of neural activity data opens up the possibility of incorporating functional evidence into the mostly anatomical-based parcellation schemes used for the mouse brain.

CCFv3 is a fully annotated anatomical reference space provided as a digital open access interactive atlas. The average template, annotations, and reference datasets are available through our web portal (http://atlas.brain-map.org/). All CCF users are encouraged to contribute back to the resources, tools, and discussions through our community forum (https://community.brain-map.org/t/allen-mouse-ccf-accessingand-using-related-data-and-tools/359).

# STAR\*METHODS

Detailed methods are provided in the online version of this paper and include the following:

#### **RESOURCE AVAILABILITY**

**Lead Contact.**—Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Lydia Ng (lydian@alleninstitute.org).

Materials Availability.—This study did not generate new unique reagents.

**Data and Code Availability.**—The Allen Brain Map is an open access resource with publicly available data at http://portal.brain-map.org/. CCFv3, as well as older versions of the reference atlas, are available at the Allen Brain Reference Atlases portal (http:// atlas.brain-map.org/). Individual average template and associated annotation images can be manually downloaded using the Atlas Viewer, while images can be downloaded en masse using the AllenSDK (https://allensdk.readthedocs.io/en/latest/\_static/examples/nb/ image\_download.html).

The AllenSDK is hosted on Github (https://github.com/alleninstitute/allensdk) and its documentation on Read The Docs (https://allensdk.rtfd.io). Registration code is available at (https://github.com/AllenInstitute/stpt\_registration); see critical documentation at (https://github.com/AllenInstitute/stpt\_registration/blob/master/README.md). Code for estimating structure volumes (https://github.com/AllenInstitute/CCFv3\_Volumetric\_Analysis/) and mapping the atlas annotations onto a specimen's image space are available as described above (https://github.com/AllenInstitute/3D-atlas-reverse-mapping/).

Our web API is documented at http://help.brain-map.org/ and http://help.brain-map.org/ display/mouseconnectivity/API#API-DownloadAtlas3-DReferenceModels.

Other data files, including the transgenic lines registered and downsampled to 25 m resolution, 2D cortical surface maps, and the average deformation field derived from the 1,675 specimens used to create the average template are here: http:// download.alleninstitute.org/publications/ allen mouse brain common coordinate framework/.

#### EXPERIMENTAL MODEL AND SUBJECT DETAILS

**Animal care and use.**—All experimental procedures were approved by the Allen Institute Institutional Animal Care and Use Committee (IACUC) and conform to NIH guidelines. Both male and female wild-type (C57BL/6J) and transgenic mice P56 were used in these studies. All animals were housed 3–5 per cage, under constant temperature, humidity, and light conditions (12 hr light/dark cycles) and given food and water ad libitum.

#### **METHOD DETAILS**

**Overall strategy for anatomical delineations in the CCF.**—Unlike the 2D ARA atlas drawn on a single Nissl-stained specimen (Dong, 2008), or Nissl- and AchE-stained specimen (Paxinos and Franklin, 2012), the mouse brain atlas built in this study was manually drawn in 3D space on the average template using multimodal reference datasets (described below). In the average template, we identified many structures with distinct inherent contrast features that directly guided border delineations (e.g., primary sensory cortices and dentate gyrus). However, the borders of many other structures, such as higher visual cortical areas, are not visible in the template alone. These "invisible" (as well as the "visible") structures were delineated with the aid of multimodal reference data: transgenic and connectivity datasets, cytoarchitecture, chemoarchitecture, and *in situ* hybridization data. We additionally consulted the MBSC and ARA atlases and relevant literature for each brain structure. When conflicts between these two atlases occurred, or when delineation schemes did not exist in either atlas, additional literature was consulted prior to determining borders using our own reference data in the average template.

#### **Reference Datasets**

The average template.: The average template was generated from autofluorescence background signal in the red channel acquired during STPT imaging from 1,675 mouse brains with a final voxel resolution of 10  $\mu$ m. This volume was annotated to assign every voxel to an anatomical structure. The average template has lower x-y spatial resolution compared to the ARA Nissl-stained specimen images, where one can see size, shape, and density of cells more clearly. Notably, the original STPT images do have high (0.35  $\mu$ m) x-y resolution, and, in these images, cell nuclei appear darker than the cytoplasm. Thus, in the average template, "dark" and "light" areas often reflect cell density, but not necessarily shape or size as in Nissl-stained specimens. Specifically, we see that structures with relatively densely packed cells are light, such as layer 4 of the primary sensory cortical areas. By contrast, structures with sparse cells are relatively dark, such as fiber tracts which are even darker than gray matter structures (Figure 1A, 1E–1K). There are a few notable

exceptions, including the pyramidal layer of the hippocampus. The pyramidal layer is composed of very densely packed cells. Since individual cell nuclei are dark, the many dark nuclei merge together in the averaging and downsampling in x-y to 10  $\mu$ m voxels, and so form the dark band-like appearance of the pyramidal layer. Also, since cell cytoplasm appears "light" in the STPT autofluorescence background, and the gray matter contains more cell bodies than fiber tracts, the gray matter itself is lighter than fiber tracts (which are very dark) in the average template.

*Transgenic Mice.:* Transgenic lines were generated at the Allen Institute (Madisen et al., 2010) or imported from external sources including the GENSAT project (Gerfen et al., 2013; Gong et al., 2007) and are listed in the Key Resources Table. Cre driver lines were crossed with the Cre-dependent tdTomato expressing reporter line Ai14, Ai110 or Ai140 (Madisen et al., 2010; Daigle et al., 2018). Regulatable Cre lines were induced with TAM or TMP 1–2 weeks before perfusion. Brains were perfused at an average age of P56 (min – max: P50 – P131), imaged by STPT, and registered to the 3D average template brain. Experiments were curated for those with (1) enriched gene expression in the structures that we wanted to delineate and (2) successful registration to the average template determined by visual inspection of alignment results. High resolution images are available through links in Table S3. Registered grid files, cortical surface views, and instructions for using ITK-SNAP to view them are also available here: (http://download.alleninstitute.org/publications/ allen\_mouse\_brain\_common\_coordinate\_framework/).

*Mouse Connectivity Atlas Data.:* All anterograde viral tracing experiments were performed with our standardized imaging and informatics pipeline (Harris et al., 2012, 2019; Martersteck et al., 2017; Oh et al., 2014). Viruses are listed in the Key Resources Table. Brains were perfused and collected 3 weeks post-injection at P56 (or post-TAM or TMP induction for regulatable lines). Experiments were curated for those that provided useful information on regions or their borders. In brief, we chose datasets which (1) contained strong (dense) projections to target structure(s) that we wanted to delineate. (2) injections were mostly restricted to a single brain region (little secondary infection in neighboring structures), and (3) registration precision to the average template was considered good following expert visual inspection. We did not use a specific quantitative threshold for injection size as the appropriate volume varies by brain structure volume, but we selected those that came closest to filling up a single region, because this shows the largest innervated territories in the target structure. Data can be found in the Allen Mouse Brain Connectivity Atlas database (http://connectivity.brain-map.org) using experiment IDs or links provided in Table S3.

#### Histology and immunohistochemistry.: Histological staining (Nissl and

Acetylcholinesterase) and fluorescent double-immunohistochemistry were described previously (Wang et al., 2014). Antibodies used are listed in the Key Resources Table. Perfused P56 C57BL/6J brains were cryostat sectioned at 25  $\mu$ m with a final sampling density of 50  $\mu$ m. Colorometric stained slides were imaged with a 10× objective on a ScanScope (Aperio Technologies). Fluorescent immunohistochemistry slides were imaged on a VS series multichannel fluorescence microscope (Olympus) with a 10× objective.

Image series were registered to the 3D average template brain. Data can be found in the Allen Reference Data database (http://connectivity.brain-map.org/static/referencedata).

In Situ Hybridization.: All in situ hybridization (ISH) was performed via a standardized production platform that was previously described (Lein et al., 2007). Fresh frozen brains from male P56 C57BL/6J mice were cryostat sectioned at 25  $\mu$ m with a final sampling density of 200  $\mu$ m. The colorometric stained slides were imaged with a 10× objective on a ScanScope (Aperio Technologies). Due to the sampling density, images were not registered to the 3D average template brain, but plane matched sections were analyzed side-by-side. Data were selected using AGEA, Fine Structure Search, Gene Search and Differential Search tools in the Allen Mouse Brain Atlas database (http://mouse.brain-map.org), and the specific data selected can be viewed using experiment IDs or links provided in Table S3.

Administration of tamoxifen or trimethoprim.—Some Cre driver lines contain regulatable versions of Cre recombinase. Induction of CreERT2 driver lines was done by administration of 0.2 mg/g body weight of tamoxifen (TAM) solution (50 mg/ml in corn oil) via oral gavage once per day for 5 consecutive days. Induction of DHFR-domain containing (dCre or dgCre) driver lines was done by administration of 0.3 mg/g body weight of trimethoprim (TMP) solution (20mg/ml in DMSO/methylcellulose) via oral gavage once per days.

**Serial two-photon tomography (STPT) imaging.**—STPT imaging of mouse brains was performed via a standardized production platform using the TissueCyte 1000 system (TissueVision) coupled with a Mai Tai HP DeepSee laser (Spectra Physics) that was previously described (Oh et al., 2014; Ragan et al., 2012). Single optical plane images 75  $\mu$ m below the tissue surface were acquired using 925 nm wavelength light through a Zeiss 320 water immersion objective (NA=1.0), with 250 mW light power at objective. To scan a full tissue section, individual tile images were acquired at a resolution of 2080×2080 pixels, and the entire stage was moved between each tile. Following scanning of a full tissue section, a 100  $\mu$ m section was cut by vibratome and the imaging process repeated. A total of 140 coronal sections covering the rostral-to-caudal extent of the brain, are scanned in red, green, and blue channels using a 20× objective, at an x,y resolution of 0.35  $\mu$ m per pixel.

Average template construction and image registration.—The CCFv3 spatial template is constructed as a population average of 1,675 young adult mouse brains imaged using STPT as part of the Allen Mouse Brain Connectivity Atlas pipeline, following procedures described in detail previously (Kuan et al., 2015). For hemispheric symmetry and to maximize input data used in the averaging process, each hemisphere was reflected across the midline, resulting in a total of 3,350 image series ( $= 2 \times 1,675$  brains). Each image series were first globally registered to the template created for the Allen Mouse Brain Connectivity Atlas data processing pipeline (Kuan et al., 2015; Oh et al., 2014). The process for global registration consists of three steps: (1) coarse registration initialized by matching the image moments of the specimen and the template brain; (2) subsequent rigid (in terms of rotation and translation) registration; and (3) a 12-parameter affine (linear) registration. Each registration step aims to maximize and normalize mutual information of the intensity

between the specimen and the template. A multi-resolution scheme was used to first register on smoothed and downsampled versions of the images in order to smooth out details to drive the algorithm to match large-scale shape features. The results from one resolution initializes the next resolution and so on allowing finer details to be matched. After global alignment, the specimens were averaged to create the first iteration of the CCFv3 template which effectively provide initial orientation and scale. An iterative process then (1) registers each specimen deformably to the template and subsequently averages all specimens, (2) computes the average deformation field over all specimens and subtracts this result from the average image created in step (1). This shape and intensity normalized average is then used as the anatomical template in the next iteration. This algorithm continued until the mean magnitude of the average deformation field fell below a certain threshold and stabilized.

Deformable registration can easily become trapped in a local minimum especially when there is specimen damage and hence a coarse-to-fine approach is essential. In this process, deformations between specimen and template was parameterized as 3D B-splines (order of 3) where the knots are placed on a regularly spaced 3D grid. A coarse grid implicitly only allows smooth/stiff deformations while a finer grid allows more elastic transformations allowing local neighborhoods to be more accurately matched in later stages. The optimization problem (optimal position of the knots) was formulated and solved as a graph labeling problem (Glocker et al., 2008; Tang and Chung, 2007). Instead of considering all the possible continuous moves of each knot, the searching space is discretized into a number of grids represented by labels. This implementation has higher probability to find the global minimum as compared to gradient-based methods. Like in Avants et al. (2008), the registration was performed in both directions and then composed to form the final transform, resulting in a symmetric and invertible deformation field. Cross-correlation is used as the image similarity metric and to speed up computation; it was only evaluated on a small portion of randomly selected voxels.

All datasets, except for ISH data, were registered and mapped to the 3D average template through global and local alignment as previously described (Kuan et al., 2015; Oh et al., 2014).

Generation of the curved cortical coordinate system with Laplace's Equation.

—To delineate isocortical areas, we first drew the outside borders of the isocortex, then marked its inner and outer surface. We applied Laplace's Equation to the isocortex volume to generate the equidistance fields. The steepest lines perpendicular to the equidistance fields are called streamlines. Streamlines can be used to project data at various locations through the cortical depth, e.g., the maximum density of the average template, transgenic lines or connectivity data labeling, to counterparts on the isocortical surface. The curved cortical coordinate system based on these streamlines was used to delineate isocortical areas.

**Generation of visuotopic map and virtual callosal labeling.**—Visuotopic maps and callosal labeling patterns have been used to define visual cortical areas in mammalian brains. We utilized projection data from the Allen Mouse Brain Connectivity Atlas to generate a visuotopic map and virtual callosal labeling. First, we selected viral tracer injections covering different visual fields in VISp (n = 26, experiment IDs in Table S3). 3D volumes of

registered and downsampled projection densities from each experiment were combined to create a color-coded, weighted, source location map. This visuotopic map was used for delineation of higher visual areas in surface views. Second, because callosal labeling has a unique spatial relationship with the higher visual areas (Wang and Burkhalter, 2007), a virtual callosal projection pattern was generated with a set of injections in the isocortex in one hemisphere (n = 107, experiment IDs in Table S3). A projection density map was created by finding, at each voxel, the maximum density value over all injections. A surface view was then generated by considering only signal within 0.1 to 0.5 mm normalized cortical depths and projecting the largest maximum value to the surface. The virtual callosal labeling pattern further restricts boundaries of the higher visual areas, although to a lesser extent than in previous studies likely due to the density of injections (Wang and Burkhalter, 2007; Wang et al., 2012).

Annotation of brain structures in 3D.—Brain structures were reconstructed on the average template (at 10 µm isotropic voxel resolution) using the multi-plane and 3D viewers in the annotation software ITK-SNAP (www.itksnap.org, Yushkevich et al., 2006). As multiple structures were reconstructed, custom macros for merging and splitting individual files were utilized to facilitate group delineations and adjustments at local and global levels. In the last step, right hemisphere 3D reconstructions were mirrored to the left hemisphere to render a symmetrically complete 3D brain atlas. Additional detailed information on the process implemented for 3D reconstruction of brain structures can be found at the Allen Mouse Brain Connectivity Atlas documentation page (http://help.brain-map.org/display/mouseconnectivity/Documentation, Mouse CCF, Reference Atlas, Version 3 (2017)) and in Wang et al., (2017).

Use of registration deformation fields to estimate structure volumes and to map CCFv3 annotations on individual brains.-The AllenSDK can be used to implement analyses and visualizations not available through the interactive atlas viewer web application. We described two examples of the kinds of tools that one can develop using the CCFv3 and the AllenSDK. First, we provide an example to map and visualize CCFv3 annotations onto the original image space from an individual specimen. This example is demonstrated in a Jupyter Notebook provided at: https://github.com/AllenInstitute/3Datlasreverse-mapping. In brief, using the registration parameters obtained for any Allen Mouse Brain Connectivity Atlas specimen through the AllenSDK, a mask of the whole brain in the reference space is mapped back to a specimen's image space. This is used to identify the sections of the coronal atlas that map to the original coronal imaged section of interest. Next, these sections of the atlas and their corresponding deformation vectors are used to map each annotated voxel from the atlas onto the corresponding imaged section. The atlas and deformation fields have a resolution of  $25 \times 25 \times 25$  microns, while the imaged sections have a resolution of  $0.35 \times 0.35 \times 100$  microns. Thus, it is also necessary to convert the scales so that voxels map to the correct pixels in the imaged sections. Since the value of each voxel corresponds to a structure ID in our ontology, individual structures present in the imaged section can be analyzed and visualized. Second, we provide the scripts used to estimate structure volumes in individual brain specimens at: https://github.com/AllenInstitute/ CCFv3\_Volumetric\_Analysis/. The script "find\_structure\_surface\_mesh.py" uses the

marching cubes algorithm to produce vertices and faces of a structure's surface mesh, given its CCFv3 ID. These vertices and faces have already been calculated and stored under the "/ data/" directory in the linked repository. Next, the scripts "find\_structure\_volume.py" and "find\_structure\_surface\_area.py" take a structure ID and experiment ID and generate the respective volume or surface area. This is achieved by loading the deformation field for an individual experiment from the AllenSDK and applying it to a given structure's surface area is calculated.

#### QUANTIFICATION AND STATISTICAL ANALYSIS

The CCFv3 average template was constructed from the brains of n=1,675 mice. Using the Python NumPy package, we calculated descriptive statistics for the estimates of brain and structure volumes across this population, including: mean, standard deviation, and coefficient of variation, as well as mean, median, and lower and upper bounds of the interquartile range relative to the average template volume. Values are provided in Table S4. Most multimodal imaging experiments were n=1 animal per transgenic line, viral tracer injection into a given source, histology stain or ISH gene probe. All individual animal IDs are provided in Table S3.

#### ADDITIONAL RESOURCES

Detailed protocol descriptions for all procedures can be found at the Allen Mouse Brain Connectivity Atlas documentation page (http://help.brain-map.org//display/ mouseconnectivity/Documentation). Additional protocol descriptions for ISH procedures can be found at the Allen Mouse Brain Atlas documentation page (http://help.brain-map.org/ display/mousebrain/Documentation).

#### KEY RESOURCES TABLE

For Antibodies, Bacterial and Virus Strains, Chemicals, Peptides, and Recombinant Proteins, Experimental Models: Organisms/Strains, Software and Algorithms, and Other, please see Key Resources Table.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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# Highlights

- 1. Created a 3D average template brain from 1,675 mice at 10 µm voxel resolution
- 2. Delineated 43 isocortical areas from multiple surface views using curved coordinates
- **3.** Delineated 329 subcortical areas, 8 ventricle structures, and 81 fiber tracts in 3D
- 4. The Allen CCF is open access and available with related tools at https:// atlas.brain-map.org



#### Figure 1. The 3D average mouse brain template.

(A) Evolution of the average template in a coronal plane in the building process. From left to right are the results from the 1<sup>st</sup>, 3<sup>rd</sup>, 5<sup>th</sup>, and 7<sup>th</sup> iteration respectively. (B–D) Volume rendering (max intensity projection) of the average template in horizontal, coronal, and sagittal views. Dotted red lines show the position of the virtual section views below in E–G. (E–G) One virtual section of the average template volume in 3 planes. (H–K) Zoom-in views of the boxed areas area in A, E–G respectively. Top panels are examples from a single STPT imaged specimen. Bottom panels show the average template. Many anatomical features are more salient in the average template than in any individual specimen. Scale bars: 1 mm in A–G, 0.4 mm in H, 0.3 mm in I, 0.8 mm in J and 0.6 mm in K.



#### Figure 2. Annotation workflow for building 3D structures.

(A) For every brain structure, anatomists started by reviewing relevant data from multiple sources (see Table S3). Structures visible in the average template were drawn first. Dashed arrow indicates that the ISH data from the Allen Brain Atlas were consulted side by side with the template, unlike the other datasets which were registered and could be viewed as direct overlays of the average template for annotation. (B) Using a curated set of reference data, neuroanatomists labeled voxels that they determined belonged to each brain structure in coronal, sagittal and horizontal plates at regularly spaced intervals, according to the size of the structure, directly on the average template using ITK-SNAP. Two neighboring structures are shown in magenta and green. (C) At the end of step (B), a 3D "weave" was produced (right) which was not yet smooth or filled in across all planes (sagittal view, middle). Structures were completed in 3D by skilled illustrators to produce a smooth final 3D volume (left). (D) As more individual structures were completed, the next step was to

"fit" them together, so as not to have unlabeled voxels ("gaps") or voxels with multiple labels ("overlaps"). This was done by manual proof-reading. It was sometimes necessary to go back and review reference datasets to resolve discrepancies. (E) The voxel labels were finalized in one hemisphere and flipped to generate the symmetric CCFv3.

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#### Figure 3. Delineating the isocortex.

(A–C) The isocortex was defined in part by overlaying registered STPT images from the transgenic lines Calb1-T2A-dgCre (red) and Fezf2-CreER (false-colored green). (D) Equidistance fields solved with Laplace's equation are shown in jet colormap. (E) Subsampled and randomly colored streamlines descend from the cortical surface to layer 6 in a single coronal section. (F) A 3D projection shows the curved cortical streamlines in a dorsolateral view. (G) A (top) cortical surface view of the average template constructed using the maximum intensity projection of voxels along the streamlines to the surface. (H) Top surface view showing reporter expression from transgenic lines Rorb-IRES2-Cre (red) and Chrna2-Cre\_OE25 (false-colored green) overlaid on the average template. These lines reveal the shape and size of primary sensory and retrosplenial areas, marked with solid white lines. (I) Higher visual areas were delineated by overlaying visuotopic projection maps (colors cyan, pink and blue representing nasal, temporal and lower visual fields,

respectively) and virtual callosal labeling (green) to the average template. (J) Transgenic line data (Slc17a8-IRES-Cre, red) and cortical projections from the thalamic nucleus AM (green) assisted delineation of RSPagl. (K) Transgenic line data (Grp-Cre\_KH288, red) and cortical projections from the thalamic nucleus VAL (green) assisted delineation of MOp and MOs. (L) 31 isocortical areas are visible and were delineated in the top surface view. Solid white lines represent areal borders. (M) Contrast features inherent to the average template were useful for identifying individual cortical layers. A single coronal plane is shown at the level of SSp-bfd. (N–R) STPT images of Ai14 reporter expression in layer-selective transgenic mouse lines; Calb1-T2A-dgCre for L2/3, Nr5a1-Cre for L4, Rbp4-Cre\_KL100 for L5, Ntsr1-Cre\_GN220 for L6a, and Ctgf-2A-dgCre for L6b. (S) Dorsolateral 3D view of the parcellated isocortex intersected with the cortical layers (white solid lines in cut-away). Structure abbreviations in Table S2. A, anterior; P, posterior; M, medial; L, lateral; D, dorsal; V, ventral. Scale bars: 1 mm in A–E and G–L, 200 µm in M–R.



**Figure 4. Delineating a subcortical gray matter structure, the interpeduncular nucleus (IPN).** (A) A parasagittal view of the whole parcellated CCFv3 shows the location of IPN in the midbrain. Visible major divisions are labeled. (B) The final smooth 3D volume shows eight IPN subdivisions (R: rostral, C: caudal, A: apical, L: lateral, I: intermediate, DM: dorsomedial, DL: dorsolateral, RL: rostrolateral). (C) Coronal section image from a Nissl-stained brain at the approximate center of the IPN. Nissl reveals putative IPN subdivisions as regions containing neurons of different sizes and densities. (D–F) Coronal section images of the IPN from three brains immunohistochemically stained with a pair of antibodies as indicated. (D) Antibody labeling for calbindin D28K (Calb1, green) reveals very dense terminal fibers in IPL. Myelin basic protein is labeled with the SMI-99 antibody (red). There are relatively more myelinated axons visible in IPC and IPI, compared to the other subdivisions. (E) Antibody labeling for parvalbumin (Pvalb, green) shows spatial restriction of Pvalb+ neurons to putative IPL and IPR (not shown). Neurofilament-H is labeled with the

SMI-32 antibody (red) and is notably strongest in IPL. (F) Antibody labeling for NeuN (in red) also reveals sub-regional differences in neuronal densities; dense nuclei in IPA, IPDM, and IPR (not shown), moderate in IPC and IPL, sparse in IPI and IPDL. (G-H) Coronal STPT images of tdTomato reporter expression in two Cre driver transgenic lines. Slc7a8iCre (G) is expressed at high levels in putative IPL and IPC. Kcng4-Cre (H) is similarly expressed at high levels in IPL. (I-J) Coronal STPT images of axonal projections labeled following tracer injections into afferent source areas to the IPN. (I) Projections from the superior central nucleus of the raphe (CS) terminate most densely in IPC and IPI. (J) Projections from the medial habenula (MH) to the IPN terminate with high density in putative IPL and moderate density in IPA, IPDL and IPDM. (K-M) Virtual single plane sections (coronal, sagittal, horizontal) of the average template through the IPN. Differential contrast features also reveal many putative IPN subdivisions. White matter and cell sparse regions appear dark and the gray matter bright. IPC is visible in all panels as a very bright region ventral to IPA and IPR, and just dorsal to the pontine gray (PG). IPR is also visible as a bright distinctive shape anterior to IPA (see sagittal section in L). IPA is clearly separated from IPC by a darker, cell sparse, region (\* in L). IPL is also a relatively brighter shape, located lateral to IPI (K,M) and ventral to IPDL (K). IPI is a thin bright strip between IPC and IPL, separated from these two subdivisions via darker regions (\* in K and M). IPDM (seen in K, L) is dorsal and medial to IPDL, dorsal and lateral to IPA and posterior to IPR. IPDL (seen in K, M) is also lateral to IPA and IPR and above IPI and IPC. (N-P) Coronal STPT image series from the transgenic Cre line experiments in G and H registered to and overlaid on the average template provided critical assistance in border delineations in virtual slicing planes. (Q-S) Coronal STPT image series from the two anterograde tracer datasets registered to and visualized in the average template volume. (T-V) Integrating the information from the above multimodal reference data, the IPN was divided into eight subregions, shown here in coronal, sagittal and horizontal planes. Structure abbreviations in Table S2. Scale Bar: 200 µm from C–V.



#### Figure 5. Delineating mammillary-related fiber tracts.

(A) Dorsal and (B) sagittal views of all white matter tracts reconstructed in 3D. Some major tracts visible in these views are labeled (onl: olfactory nerve layer, lotg: lateral olfactory tract, cc: corpus callosum, cing: cingulum bundle, scwm: supracallosal cerebral white matter, arb: arbor vitae, opt: optic tract, mcp: middle cerebellar peduncle, icp: inferior cerebellar peduncle, cst: corticospinal tract). (C) The final 3D structure of three mammillary related fiber tracts near the midline are shown after removing overlying structures (pm: principal mammillary tract, mtt: mammillothalamic tract, mtg: mammillotegmental tract).
(D) Sagittal view of the maximum intensity projection of fluorescently labeled MM axons. Dashed lines indicate level of the coronal STPT sections shown in E–I. (J–L) Virtual coronal and (M–O) sagittal sections of the average template. Coronal sections are matched to STPT images on the left. Differential contrast features reveal other putative fiber tracts (dark), e.g., the anterior commissure (ac), fornix (fx), and fasciculus retroflexus (fr), indicated in N. Integration of these data enabled the 3D reconstruction of tracts directly on the template volume. Scale Bar: 800 µm from D–O.



#### Figure 6. Delineating the supracallosal white matter (scwm).

(A,B) Angled lateral views of the reconstructed white matter tracts located just below the isocortex. (A) The corpus callosum (cc) consists of six substructures (ccg: genu, ccb: body, ccs: splenium, fa: anterior forceps, ee: extreme capsule, fp: posterior forceps). (B) White matter tracts layered above the cc, but below the isocortex, are colored (scwm, cing: cingulum bundle). (C) A virtual coronal section of the average template (at the approximate anterior-posterior midpoint of the white matter shown in B). (D–F) Coronal STPT images at three locations along the anterior-posterior axis show axonal projections labeled following tracer injections into three cortical areas (SSp-n: primary somatosensory area, nose; SSp-bfd: primary somatosensory area, barrel field; VISp: primary visual area). Callosal projection fibers are identified as those in the white matter below isocortex traveling toward the midline. (G–I) Coronal STPT images at three locations along the anterior-posterior axis show axonal projections along the anterior-posterior axis show axonal projections are identified as those in the white matter below isocortex traveling toward the midline. (G–I) Coronal STPT images at three locations along the anterior-posterior axis show axonal projections labeled following tracer injections labeled following tracer injections along the anterior-posterior axis show axonal projection fibers are identified as those in the white matter below isocortex traveling toward the midline. (G–I) Coronal STPT images at three locations along the anterior-posterior axis show axonal projections labeled following tracer injections into three thalamic source areas

(AM: anteromedial nucleus, AV: anteroventral nucleus, LD: laterodorsal nucleus). Thalamocortical projection fibers are localized above the callosal fibers, in the gap between cc and isocortex. (D'–I') Enlarged view of the areas within the dashed line boxes (D–I). The white dashed lines in D'–I' indicate white matter borders. Scale bars: 500  $\mu$ m from D–I, 50  $\mu$ m from D'–I'.



#### Figure 7. Registration to CCFv3 enables downstream applications.

(A–C) For many data analyses and visualizations, individual image series are registered to the CCF. Imaged brain sections (A) are registered to the average template (B), resulting in a field of deformation vectors ("deformation field") (D) that map points from the raw image space to our reference space (C). For other analyses, the reverse mapping (CCF annotations pushed onto individual brains) may be appropriate (E–G). Here, using the deformation fields (D), annotations from our atlas (E) can be mapped back to the raw image space (F) to produce annotated image sections in the original image space (G). (H–J) An example of the reverse mapping is shown for a viral tracing experiment from the Allen Mouse Brain Connectivity Atlas acquired using STPT imaging. The original image section (H) is annotated by warping the atlas onto the image (I) using the deformation field output from registration. In this image (I), all structure annotations are overlaid onto the STPT image. However, individual structure boundaries can also be selectively viewed/mapped on the images using code we developed (J). (K) 3D renderings of the CCFv3 average template and two individual brains after applying their deformation fields in reverse to a whole brain

surface mask. CCFv3 is shown on the left; two examples of individual brains are shown on the right, without (top) and with (bottom) cortical area parcellations. (L) Whole brain volumes were measured using the individual deformation fields for each of the 1,675 mice (gray line) used to create the average template, shown in the frequency histogram. The volume of the CCFv3 average template is indicated with the black line (511 mm<sup>3</sup>).

#### KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Rabbit polyclonal anti-Calbindin D-28k (Calb1)	Swant	Cat#CB38; RRID: AB_2721225
Mouse monoclonal anti-NeuN	Millipore Sigma	Cat#MAB377; RRID: AB_2298772
Rabbit polyclonal anti-Neurofilament, Medium, 160 kD (NF-160)	Abeam	Cat#AB9034; RRID: AB_306956
Rabbit polyclonal anti-Parvalbumin	Swant	Cat#PV 25; RRID: AB_10000344
Mouse monoclonal anti-Neurofilament H (SMI-32)	Covance	Cat#SMI-32R-100; RRID: AB_509997
Mouse monoclonal anti-Myelin Basic Protein (SMI-99)	Covance	Cat#SMI-99P; RRID: AB_2564742
Alexa Fluor 488 goat anti-rabbit	Thermo Fisher Scientific	Cat#A-11008; RRID: AB_10563748
Alexa Fluor 594 goat anti-mouse	Thermo Fisher Scientific	Cat#A-11005; RRID: AB_2534073
Bacterial and Virus Strains		
AAV2/1.hSynapsin.EGFP.WPRE.bGH	UPenn Vector Core	Addgene AAV1; 105539; RRID:Addgene_105539
AAV2/1.CAG.FLEX.EGFP.WPRE.bGH	UPenn Vector Core	Addgene AAV1; 51502; RRID: Addgene_51502
Chemicals, Peptides, and Recombinant Proteins		
Trimethoprim (TMP)	Sigma-Aldrich	T7883–5G
Tamoxifen (TAM)	Sigma-Aldrich	T5648–5G
Experimental Models: Organisms/Strains		
Mouse: C57BL/6J	The Jackson Laboratory	JAX: 000664
Mouse: B6.Cg-Tg(A930038C07Rik-cre) 1Aibs/J, A930038C07Rik-Tg1-Cre	The Jackson Laboratory	JAX: 017346
Mouse: Adcyap1–2A-Cre	Allen Institute for Brain Science	N/A
Mouse: B6;129S-Calb1tm2.1(cre)Hze/J,Calb1-IRES2-Cre	The Jackson Laboratory	JAX: 028532
Mouse: B6.Cg-Calb1tm1.1(folA/EGFP/cre)Hze/J,Calb1-T2A-dgCre	The Jackson Laboratory	JAX: 023531
Mouse: B6(Cg)-Calb2 <sup>tm1(cre)Zjh</sup> /J,Calb2-IRES-Cre	The Jackson Laboratory	JAX: 010774
Mouse: B6;129S-Cartpt <sup>tm1.1(cre)Hze</sup> /J, Cart-IRES2-Cre	The Jackson Laboratory	JAX: 028533
Mouse: STOCK Tg(Cartpt-cre)1Aibs/J, Cart-Tg1-Cre	The Jackson Laboratory	JAX: 009615
Mouse: B6(Cg)-Ccktm2.1(cre/ERT2)Zjh/J, Cck-IRES-Cre	The Jackson Laboratory	JAX: 012706
Mouse: B6;129S6-Chattm1(cre)Low1/j,Chat-IRES-Cre-neo	The Jackson Laboratory	JAX: 006410
Mouse: STOCK Tg(Chma2-cre)OE25Gsat/Mmucd, Chma2-Cre_OE25	MMRRC	MMRRC: 036502
Mouse: STOCK Tg(Cnnm2-cre)KD18Gsat/Mmucd, Cnnm2-Cre_KD18	MMRRC	MMRRC: 030951
Mouse: Crh-IRES-Cre_BL	Bradford Lowell	N/A
Mouse: B6(Cg)-Crth <sup>tm1(cre)Zjh</sup> /J, Crh-IRES-Cre_ZJH	The Jackson Laboratory	JAX: 012704
Mouse: B6.Cg- <i>Ctgf<sup>tm1.1(folA/cre)Hze</sup></i> /J, Ctgf-2A-dgCre	The Jackson Laboratory	JAX: 028535
Mouse: B6(Cg)-Cux2tm3.1(cre/ERT2)Mull/Mmmh, Cux2-CreERT2	MMRRC	MMRRC: 032779
Mouse: B6(Cg)-Cux2tm1.1(cre)Mull/Mmmh. Cux2-IRES-Cre	MMRRC	MMRRC: 031778

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Mouse: STOCK Tg(Dbh-cre)KH212Gsat/Mmcd, Dbh-Cre_KH212	MMRRC	MMRRC: 032081
Mouse: STOCK Tg(Dlg3-cre)KG118Gsat/Mmucd, Dlg3-Cre_KG118	MMRRC	MMRRC: 032809
Mouse: Drd1a-Cre	Richard Palmiter	N/A
Mouse: STOCK Tg(Drd3-cre)KI196Gsat, Drd3-Cre_KI196	MMRRC	MMRRC: 034610
Mouse: STOCK Tg(Drd3-cre)KI198Gsat/Mmucd, Drd3-Cre_KI198	MMRRC	MMRRC: 031741
Mouse: STOCK Tg(Efr3a-cre)NO108Gsat/Mmucd, Efr3a-Cre_NO108	MMRRC	MMRRC: 036660
Mouse: B6.129S2-Emx1tm1(cre)Krj/J, Emx1-IRES-Cre	The Jackson Laboratory	JAX: 005628
Mouse: B6.Cg-Erbb4tm1.1(cre/ERT2)Albs/j, Erbb4-2A-CreERT2	The Jackson Laboratory	JAX: 012360
Mouse: Esr1–2A-Cre	David Anderson	N/A
Mouse: B6;129S-Esr2tm1.1(cre)Hze/J, Esr2-IRES2-Cre	The Jackson Laboratory	JAX: 030158
Mouse: B6(Cg)-Etv1 <sup>tm1.1(cre/ERT2)Zjh</sup> /J, Etv1-CreERT2	The Jackson Laboratory	JAX: 013048
Mouse: B6;129S-Fezf1tm1.1(cre/folA)Hze/J, Fezf1-2A-dCre	The Jackson Laboratory	JAX: 013048
Mouse: Fezf2-CreER	Z. Josh Huang	N/A
Mouse: B6.Cg-Foxp2 <sup>tm1.1(cre/GFP)Rpa</sup> /J, Foxp2-IRES-Cre	The Jackson Laboratory	JAX: 030541
Mouse: STOCK Gad2tm2(cre)Zjh/J, Gad2-IRES-Cre	The Jackson Laboratory	JAX: 010802
Mouse: STOCK Tg(Gal-cre)KI87Gsat/Mmcd, Gal-Cre_KI87	MMRRC	MMRRC: 031060
Mouse: STOCK Tg(Colgalt2-cre) NF107Gsat/Mmucd, Glt25d2- Cre_NF107	MMRRC	MMRRC: 036504
Mouse: B6.Cg-Gnb4tm1.1(cre)Hze/J, Gnb4-IRES2-Cre	The Jackson Laboratory	JAX: 029587
Mouse: B6.Cg-Gnb4 <sup>tm1.1(cre/ERT2)Hze</sup> /J, Gnb4-IRES2-CreERT2	The Jackson Laboratory	JAX: 030159
Mouse: STOCK Tg(Gpr26-cre)KO250Gsat/Mmucd, Gpr26-Cre_K0250	MMRRC	MMRRC: 033032
Mouse: C57BL/6-Tg(Grik4-cre)G32-4Stl/J, Grik4-Cre	The Jackson Laboratory	JAX: 006474
Mouse: STOCK Tg(Grm2-cre)MR90Gsat/Mmcd, Grm2-Cre_MR90	MMRRC	MMRRC: 034611
Mouse: STOCK Tg(Grp-cre)KH288Gsat/Mmucd, Grp-Cre_KH288	MMRRC	MMRRC: 031183
Mouse: B6;129S-Htr1atm1.1(cre)Hze/J, Htr1a-IRES2-Cre	The Jackson Laboratory	JAX: 030160
Mouse: STOCK Tg(Htr2a-cre)KM207Gsat/Mmucd, Htr2a-Cre_KM207	MMRRC	MMRRC: 031150
Mouse: STOCK Tg(Htr3a-cre)NO152Gsat/Mmucd, Htr3a-Cre_NO152	MMRRC	MMRRC: 036680
Mouse: STOCK Jam2tm1.1(cre)Jrs/J, Jam2-Cre	The Jackson Laboratory	JAX: 031612
Mouse: STOCK Tg(Kcnc2-Cre)K128Stl/LetJ, Kcnc2-Cre	The Jackson Laboratory	JAX: 008582
Mouse: B6.129(SJL)-Kcng4tm1.1(Cre)Jrs/J, Kcng4-Cre	The Jackson Laboratory	JAX: 029414
Mouse: B6129-Leprtm2(cre)Rck/J, Lepr-IRES-Cre	The Jackson Laboratory	JAX: 008320
Mouse: Lypd6-Cre_KL156	Nathaniel Heintz and Charles Gerfen	N/A
Mouse: B6.Cg-Ndnf <sup>tm1.1(tolA/cre)Hze</sup> /J, Ndnf-IRES2-dgCre	The Jackson Laboratory	JAX: 028536
Mouse: B6;129S-Nos1tm1.1(cre/ERT2)Zjh/J, Nos1-CreERT2	The Jackson Laboratory	JAX: 014541
Mouse: FVB-Tg(Nr5a1-cre)2Lowl/J, Nr5a1-Cre	The Jackson Laboratory	JAX: 006364
Mouse: B6.Cg-Ntng2 <sup>tm1.1(cre)Hze</sup> /J, Ntng2-IRES2-Cre	The Jackson Laboratory	JAX: 029588
Mouse: B6;129S4-Ntrk1tm1(cre)Ltr/Mmucd, Ntrk1-IRES-Cre	MMRRC	MMRRC: 015500
Mouse: B6.FVB(Cg)-Tg(Ntsr1-cre) GN220Gsat/Mmucd, Ntsr1- Cre_GN220	MMRRC	MMRRC: 030648

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Mouse: B6.Cg-Nxph4tm1.1(cre/ERT2)Hze/J, Nxph4-2A-CreERT2	The Jackson Laboratory	JAX: 022861
Mouse: STOCK Tg(Oxtr-cre)ON66Gsat/Mmucd, Oxtr-Cre_ON66	MMRRC	MMRRC: 036545
Mouse: PB-mCitrine P038	Shima et al., 2016	N/A
Mouse: PB-mCitrine P170	Shima et al., 2016	N/A
Mouse: B6.Cg-Tg(Pcp2-cre)GN135Gsat/Mmucd, Pcp2-Cre_GN135	MMRRC	MMRRC: 030868
Mouse: B6;129S-Pdyntm1.1(cre/ERT2)Hze/J, Pdyn-T2A-CreERT2	The Jackson Laboratory	JAX: 030197
Mouse: STOCK Tg(Pdzk1ip1-cre) KD31Gsat/Mmucd, Pdzk1ip1- Cre_KD31	MMRRC	MMRRC: 030851
Mouse: B6;129S-Penk <sup>Im2(cre)Hze</sup> /J, Penk-IRES2-Cre	The Jackson Laboratory	JAX: 025112
Mouse: STOCK Tg(Plxnd1-cre)OG1Gsat/Mmucd, Plxnd1-Cre_OG1	MMRRC	MMRRC: 036631
Mouse: Plxnd1-CreER	Z. Josh Huang	N/A
Mouse: STOCK Tg(Pomc1-cre)16Lowl/J, Pomc-Cre_BL	The Jackson Laboratory	JAX: 005965
Mouse: STOCK Tg(Ppp1r17-cre) NL146Gsat/Mmucd, Ppp1r17- Cre_NL146	MMRRC	MMRRC: 036205
Mouse: STOCK Tg(Prkcd-glc-1/CFP,-cre) EH124Gsat/Mmucd, Prkcd-GluCla-CFP-IRES-Cre_EH124	MMRRC	MMRRC: 011559
Mouse: B6;129P2-Pvalb <sup>Im1(cre)Arbr</sup> /J, Pvalb-IRES-Cre	The Jackson Laboratory	JAX: 008069
Mouse: B6;129S-Rasgrf2 <sup>tm1.1(cre/fola)Hze/J</sup> , Rasgrf2-T2A-dCre	The Jackson Laboratory	JAX: 022864
Mouse: STOCK Tg(Rbp4-cre)KL100Gsat/Mmucd, Rbp4-Cre_KL100	MMRRC	MMRRC: 031125
Mouse: Rorb-IRES2-Cre-neo	Allen Institute for Brain Science	N/A
Mouse: B6;129S-Rorb <sup>tm1.1(cre)Hze</sup> /J, Rorb-IRES2-Cre	The Jackson Laboratory	JAX: 023526
Mouse: B6;C3-Tg(Scnn1a-cre)2Aibs/J, Scnn1a-Tg2-Cre	The Jackson Laboratory	JAX: 009112
Mouse: B6;C3-Tg(Scnn1a-cre)3Aibs/J, Scnn1a-Tg3-Cre	The Jackson Laboratory	JAX: 009613
Mouse: Sdk2-CreER	Joshua Sanes	N/A
Mouse: STOCK Tg(Sim1-cre)KJ18Gsat/Mmucd, Sim1-Cre_KJ18	MMRRC	MMRRC: 031742
Mouse: STOCK Slc17ad <sup>m2(cre)Lowl</sup> /J, Slc17a6-IRES-Cre	The Jackson Laboratory	JAX: 016963
Mouse: B6;129S-Slc17a7m1.1(cre)Hze/J, Slc17a7-IRES2-Cre	The Jackson Laboratory	JAX: 023527
Mouse: Tg(Slc17a8-icre)1Edw/SealJ, Slc17a8-iCre	The Jackson Laboratory	JAX: 018147
Mouse: B6;129S-Slc17a8 <sup>tm1.1(cre)Hze</sup> /J, Slc17a8-IRES2-Cre	The Jackson Laboratory	JAX: 028534
Mouse: STOCK Tg(Slc18a2-cre)OZ14Gsat/Mmcd, Slc18a2-Cre_OZ14	MMRRC	MMRRC: 034814
Mouse: STOCK Slc32a1tm2(cre)Lowl/J, Slc32a1-IRES-Cre	The Jackson Laboratory	JAX: 016962
Mouse: STOCK Slc6a3 <sup>tm1(cre)X2/J</sup> , Slc6a3-Cre	The Jackson Laboratory	JAX: 020080
Mouse: B6.Cg-Tg(Slc6a4-cre)ET33Gsat/Mmcd, Slc6a4-Cre_ET33	MMRRC	MMRRC: 031028
Mouse: STOCK Tg(Slc6a4-cre/ERT2) EZ13Gsat/Mmcd, Slc6a4- CreERT2_EZ13	MMRRC	MMRRC: 030071
Mouse: STOCK Tg(Slc6a5-cre)KF109Gsat/Mmucd, Slc6a5-Cre_KF109	MMRRC	MMRRC: 030730
Mouse: STOCK Sst <sup>tm2.1(cre)Zjh</sup> /J, Sst-IRES-Cre	The Jackson Laboratory	JAX: 013044
Mouse: STOCK Tg(Syt17-cre)NO14Gsat/Mmucd, Syt17-Cre_NO14	MMRRC	MMRRC: 034355
Mouse: STOCK Tg(Syt6-cre)KI148Gsat/Mmucd, Syt6-Cre_KI148	MMRRC	MMRRC: 032012
Mouse: B6;129S-Tac 1tm1.1(cre)Hze/J, Tac1-IRES2-Cre	The Jackson Laboratory	JAX: 021877

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Mouse: B6;129S-Tac2tm1.1(cre)Hze/J, Tac2-IRES2-Cre	The Jackson Laboratory	JAX: 021878
Mouse: Tacr1-T2A-Cre	Daigle et al., 2018	N/A
Mouse: B6;129S-Tac2 <sup>tm1.1(cre)Hze</sup> /J, Tac2-IRES2-Cre	The Jackson Laboratory	JAX: 021878
Mouse: B6.FVB(Cg)-Tg(Th-cre)FI172Gsat/Mmucd, Th-Cre_FI172	MMRRC	MMRRC: 031029
Mouse: FVB/N-Tg(Thy1-cre)1Vln/J, Thy1-Cre	The Jackson Laboratory	JAX: 006143
Mouse: STOCK Tg(Tlx3-cre)PL56Gsat/Mmucd, Tlx3-Cre_PL56	MMRRC	MMRRC: 041158
Mouse: B6.Cg-Trib2tm1.1(cre/ERT2)Hze/J, Trib2-F2A-CreERT2	The Jackson Laboratory	JAX: 022865
Mouse: STOCK Vip <sup>tm1(cre)Zjh</sup> /J, Vip-IRES-Cre	The Jackson Laboratory	JAX: 010908
Mouse: STOCK Tg(Vipr2-cre)KE2Gsat/Mmucd, Vipr2-Cre_KE2	MMRRC	MMRRC: 034281
Mouse: STOCK Tg(Vipr2-cre)KE2Gsat/Mmucd, Vipr2-IRES2-Cre	The Jackson Laboratory	JAX: 031332
Mouse: Vipr2-IRES2-Cre-neo	Allen Institute for Brain Science	N/A
Mouse: B6.Cg-Gt(ROSA)26Sortm14(CAG-tdTomato)Hze/J, Ai14(RCL-tdT)	The Jackson Laboratory	JAX: 007914
Mouse: B6.Cg- <i>lgs7<sup>tm140.1(tetO-EGFP,CAG-tTA2)Hze/</sup></i> J, Ai140(TIT2L-GFP-ICL-tTA2)	The Jackson Laboratory	JAX: 030220
Software and Algorithms		
ITK-SNAP (http://itksnap.org)	Penn Image Computing and Science Laboratory (PICSL), Scientific Computing and Imaging Institute (SCI)	RRID:SCR_002010
Insight Toolkit (ITK), SimpleITK (itk.org)	Kitware	RRID:SCR_001149
Python 3.x (python.org)	Python Software Foundation	RRID:SCR_008394
Anaconda	Anaconda	https://www.anaconda.com/
NumPy (http://numpy.org)	NumPy Developers	RRID:SCR_008633
pynrrd	Maarten H. Everts and contributors	https://github.com/mhe/pynrrd
pandas	NumFOCUS	https://pandas.pydata.org/
h5py	The HDF Group (THG)	http://www.h5py.org/
SciPy (http://scipy.org)	SciPy developers	RRID:SCR_008058
pg8000	Mathieu Fenniak	https://github.com/tlocke/pg8000
Kakadu	Kakadu Software Pty Ltd	https://kakadusoftware.com/
tinyXML	Lee Thomason	http://grinninglizard.com/tinyxml/
Other		
Allen Brain Reference Atlases	This paper	http://atlas.brain-map.org/
Allen Mouse Brain Atlas	Lein et al., 2007	http://mouse.brain-map.org
Allen Mouse Brain Connectivity Atlas	Oh et al., 2014; Harris et al., 2019	http://connectivity.brain-map.org
Anatomic Reference Data	Allen Institute for Brain Science	http://connectivity.brain-map.org/ static/referencedata