### **Supplementary Movies**



### Movie 1.

### Cranium morph including size

Cranium morph between the mean WT and Dp1Tyb shapes, where size has not been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.



### Movie 2.

### Mandible morph including size

Mandible morph between the mean WT and Dp1Tyb shapes, where size has not been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.



### Movie 3.

### Cranial morph displacement heatmap

Cranial morph between the mean WT and Dp1Tyb shapes, where size has been regressed out. Red colour change indicates the magnitude of displacement in mm. Derived from landmark-free analysis.



### Movie 4.

### Mandible morph displacement heatmap

Mandible morph between the mean WT and Dp1Tyb shapes, where size has been regressed out. Red colour change indicates the magnitude of displacement in mm. Derived from landmark-free analysis.



#### Movie 5.

### **Exaggerated Mandible Morph**

Mandible morph between the mean WT and Dp1Tyb shapes, where size has been regressed out and the magnitude of the deformation has been exaggerated by a factor of 3 and so is not colour-coded. Derived from landmark-free analysis.



Movie 6.

#### Cranial Interior morph including size stretch heatmap

Cranial morph, showing the interior of the skull, between the mean WT and Dp1Tyb shapes, where size has not been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.



### Movie 7.

### Cranial Interior morph stretch heatmap

Cranial morph, showing the interior of the skull, between the mean WT and Dp1Tyb shapes, where size has been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.



### Movie 8.

### Cranial mesh points stretch heatmap

Landmark-free-derived heatmap of cranium local stretch with no scaling. The mesh is represented here as all the points of the mesh rather than a rendered surface. Red and Blue colour change indicate expansion and contraction respectively. Downloading and viewing in a paused video by moving the slider is recommended.



#### Movie 9.

### Mandible morph stretch heatmap

Mandible morph between the mean WT and Dp1Tyb shapes, where size has been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.



### Movie 10.

### Cranial morph stretch heatmap

Cranial morph between the mean WT and Dp1Tyb shapes, where size has been regressed out. Red and Blue colour change indicate expansion and contraction respectively as a percentage. Derived from landmark-free analysis.

## **Supplementary Figures**



## Figure S1.

**Location of landmarks used in landmark-based morphometric analysis.** A-E Anatomic locations of landmarks shown on a 3D digitized image of a  $\mu$ CT scan as previously defined <sup>1,2</sup>. 68 cranial landmarks are shown on lateral (A), superior (B), and inferior (C) views of the cranium. 17 mandibular landmarks are shown on lingual (D) or buccal (E) views of the mandible.



В



#### Figure S2.

**Planar view of mouse head captured by \muCT. A Image pre-processing. B Image post**processing. Yellow arrow indicates cartilaginous element (nasal turbinate).



### Figure S3.

**Tests for overfitting show normally distributed data. A.** Density plot and **B.** Q-Q plot show normally distributed data. Tests for normality conducted: Shapiro-Wilk (p = 0.1587) and Lilliefors (Kolmogorov-Smirnov) (p = 0.258).



Figure S4. Landmark-free displacement heat map with no scaling. Without scaling, displacement changes are localised to the extremities.



# A. Quantification of sex-related shape variation by method

## B. Morphs and heatmaps for sex-related shape differences for each method



**Figure S5.** Validation of landmark-free morphometry in a sample of Diversity Outcross Mice by quantification of sexual dimorphism. **A.** Canonical Variance Analysis by sex;

i) distributions of CV scores by method (unlike the DO group, these specimens are wellseparated into two distinct groups); ii) Bland-Altman plot for CV scores for sexual dimorphism. Here, the deviations of each method from the manual landmarking-based estimated is plotted against the manual landmarking estimate; iii) variance components for sexual dimorphism and correlations among the CV scores across methods. **B**. 3D Morphs and heatmaps showing the shape variation associated with sexual dimorphism as estimated by each method. i) GM = manual landmark-based geometric morphometics; ii) GP OPT = automated landmark-based geometric morphometics; iii) LF 2808 and iv) LF 560 = landmark-free method with 2808 or 560 control points respectively. "Min x2" and "Max x2" label the deformations corresponding to the lower and higher ends of the heat map colour scales, exaggerated two-fold to more easily visualise the shape differences.

## Supplementary Table

		Mean (±SEM) Normalised Centroid Size (mm)		Difference				
		wт	Dp1Tyb	Absolute	Percentage			
Landmark-based	Cranium	6.387±0.061	5.939±0.061	0.448	7.01%			
	Mandible	4.502±0.038	4.204±0.038	0.298	6.62%			
Landmark free	Cranium	6.987±0.063	6.514±0.063	0.473	6.77%			
Landmark-free	Mandible	4.025±0.041	3.768±0.041	0.257	6.39%			

### Table S1.

Comparison of normalised centroid sizes of crania and mandibles from WT and Dp1Tyb mice determined using landmark-based or landmark-free methods.

### **Supplementary References**

- Hallgrímsson, B., Lieberman, D. E., Liu, W., Ford-Hutchinson, A. F. & Jirik, F. R. Epigenetic interactions and the structure of phenotypic variation in the cranium. *Evol. Dev.* 9, 76–91 (2007).
- Hallgrímsson, B., Dorval, C. J., Zelditch, M. L. & German, R. Z. Craniofacial variability and morphological integration in mice susceptible to cleft lip and palate. *J. Anat.* 205, 501–517 (2004).

## Supplementary Materials and Methods

### Landmark-free Morphometrics Pipeline Description

This Appendix is intended as an overview of the landmark-free pipeline for a relative nonspecialist. Detailed dcoumentation is embedded with the pipeline code published on GitLab at <u>https://gitlab.com/ntoussaint/landmark-free-morphometry</u>. This Appendix is organised into five sections as follows:

- A. Pipeline Dependencies
- B.  $\mu CT$  Pre-processing
- C. Mesh Alignment
- D. Atlas Construction

Seaborn

E. Shape Statistics

### A. Pipeline dependencies and notes on initialisation

All packages and software listed below are required. The pipeline is written in Python and C++ and requires a suitable environment to run both. We used the browser-based Jupyter environment (<u>https://jupyter.org/</u>). Specific requirements for each segment of the pipeline are listed at the appropriate page within the pipeline code but the complete list is as follows:

Absolutely required:

FSL - https://fsl.fmrib.ox.ac.uk/fsl/fslwiki (Image analysis tools) Deformetrica - http://www.deformetrica.org/ (Atlasing tools) Git - https://git-scm.com/ (Code version-control system) ITK - https://itk.org/ (Code version-control system) ITK - https://itk.org/ (Segmentation and registration tools) VTK - https://vtk.org/ (Visualisation tools) CMake - https://cmake.org/ (For compiling ITK and VTK) Python packages: Matplotlib Numpy SimpleITK Vtk Pandas

Software we used but for which there may be similar alternatives: Meshlab - <u>http://www.meshlab.net/</u> (Mesh decimation) Itksnap - <u>http://www.itksnap.org/pmwiki/pmwiki.php</u> (Image manipulation tool) Paraview - <u>https://www.paraview.org/</u> (Image visualisation tools) Mitk - <u>http://mitk.org/wiki/The\_Medical\_Imaging\_Interaction\_Toolkit\_(MITK)</u> (Landmarking tool for coarse alignment)

The pipeline code is downloaded as landmark-free-morphometry-master.zip or ~.tar. After decompressing the package and moving to its directory within the Terminal app (Apple, Linux or equivalent in Windows). Jupyter is started using the command **ipython notebook** which opens the pipeline in the default system Web browser. The pipeline is presented as a series of virtual "pages" which contain "cells" (sections) of two types. One type defines a function, the other applies those functions to the data. Cells can be run individually or as an automatic sequence (see Jupyter documentation for details). An example of a function-defining cell is below:

#### Mesh extraction

mesh extraction from a binary image using Marching cubes and VTK

	<pre>def extract mesh(parcellation file, output mesh file, smooth NIter=20, smooth relaxation=0.6):</pre>
Short	''' Extract a mesh from a binary image using vtk
description of	The method uses Marching Cubes in order to extract a mesh outlining a binary segmentation image
what the	The mesh is then smoothed in order to avoid the pixelization effect
narticular coll	<pre>@arg parcellation_file: input binary image file @arg systems much file: systems with much file</pre>
	earg output_mesh_file: output vtk mesh file @arg smooth_NIter: number of iterations for the smoothing filter
does and the	@arg smooth_relaxation: Relaxation factor for the smoothing filter
inputs,	<pre>@ret: output_mesh_file</pre>
outputs and	
adjustable	import vtk
parameters.	## read the input hipary image
•••••	reader = vtk.vtkMetaTmageReader()
	reader.SetFileName(parcellation_file)
	##de:logace/
Black text is	<pre>mc = vtk.vtkImageMarchingCubes() mc SetInputConnection (reader CotOutputPort())</pre>
code and	mc.SetInfuccionalsoff()
tool toxt is a	mc.ComputeGradientsOff()
	mc.Computescalarson() mc.SetValue(0, 0)
comment on	## smooth the output mesh
what the	<pre>smoother = vtk.vtkSmoothPolyDataFilter() smoother.SetInputConnection(mc.GetOutputPort())</pre>
code does.	smoother.SetNumberOfIterations(smooth_NIter)
	<pre>smoother.SetRelaxationFactor(smooth_relaxation) smoother.FeatureEdgeSmoothingOff()</pre>
	<pre>smoother.BoundarySmoothingOn()</pre>
	<pre>## write the output to file writer = vtk.vtkPolyDataWriter()</pre>
	writer.SetFileName(output_mesh_file)
	<pre>writer.SetInputConnection(smoother.GetOutputPort()) writer_Write()</pre>
	MITCET: WIICE()
	return output mesh file

### B. <u>µCT Pre-processing</u>

This section describes the code used to extract and produce a mesh from an initial  $\mu$ CT image. The following cells can be run with default values to define the required functions:

### **Binary Segmentation**

- Defines functions used in the object extraction

#### Parcellation

- Defines functions required for parcellation of binary image

#### **Mesh Extraction**

- Defines function used in generating a mesh from a binary image

#### **Mirror mesh file**

- Defines function used to mirror the mesh file

### **Display help functions**

- Defines functions used to display images within the notebook

#### Generic Imports

- Imports Numpy

Using ITK-Snap save µCT images in the NIFTI (.nii.gz) format.

The following five **cells** need to be edited to change parameters and filenames before running (N.B. annotations describe the sections that can or need to be changed, along with a brief description of inputs, outputs and function/s of the cell).

## Load data

Loads in the image file to be processed.



### **Object extraction**

The cell uses the functions defined in **object\_extraction** to extract the object of interest from the input image and apply morphological functions to remove any noise and close unwanted holes.



# Parcellation

This cell uses the functions defined in **parcellation** to 'parcellate' the image into various regions according to the density of the bone. This allows the separation of mandible (densest bone) from the rest of the skull. If no region separation is required skip this step and move to the **Mesh extraction** step:

The output is a binary image with regions ordered by bone density. Use **ITK-Snap** to visualise these labels. The example on the right shows these regions, here label one is the red region. Note the label/s for region of interest (ROI).



## **Object selection**

Input the labels of relevance to separate the ROI from the rest of the subject.



Check the output in **ITK-snap** opening it as a **segmentation file.** Any noise or irrelevant regions can be removed using the paint brush tool.

### Extract mesh

This step uses functions defined in **Mesh Extraction** to extract a surface mesh from the region of interest selected prior. The meshes generated are in the **.vtk** format.



Mesh files produced are large in size and increase computational time of the **Atlasing** step to unrealistic durations. To overcome this, meshes were decimated using **meshlab**. Save meshes in the **.stl** (stereolithography) format using paraview. Open the mesh in meshlab and apply **quadric edge collapse decimation** fi and enter the percentage reduction desired (authors used 0.15).



Once meshes for all subjects are generated move to the next step, Mesh Alignment.

Use paraview again to save the newly decimated mesh as a .vtk file and ensure it is saved in ASCII format

#### C. Mesh Alignment

This section describes the process of aligning the meshes produced in the previous section. Initial coarse alignment is required to allow the Atlasing process (below) to work. This first requires manually placing a small number of landmarks using **Mitk-Workbench**, minimally three (e.g. for a hemi-mandible) or more usually three symmetrically placed pairs. Landmark file names should be identical to the mesh file name e.g. Mandible\_1.vtk, with its landmark file, Mandible 1.mps.

Below is shows landmarks used to align the mandible.



Once complete move landmark files (.mps) and mesh files (.vtk) into Alignment folder. The following are run with default values:

#### **Read landmarks**

- Defines functions used to import landmark files

#### Numpy – vtk help functions

- Define functions used convert landmark files so they can be used to align meshes
- Functions used to extract centroid and centroid size

#### **Procrustes alignment**

- Defines functions used in alignment
  - Rigid rigid body alignment
    - Similarity rigid body plus scaling alignment

#### Load data

Loads meshes and associated landmark files ready for alignment,

## **Mesh Alignment**

Uses functions defined in **Procrustes alignment** to align meshes. Two modes can be selected, **Similarity** or **Rigid body**. "Similarity" aligns meshes whilst regressing out the size. "Rigid body" aligns meshes but maintains size differences:



Mesh alignment fidelity should be checked in **Paraview**.

### D. Atlas Construction

This section describes the application of the shape averaging and comparison (atlasing) processes.

Within the **atlasing** folder (included in the pipeline package) there are three files adjustable files:



**Optimization\_parameters.xml** describes parameters that drive the minimization procedure:

• • •

max-iterations: Stop criterion for iterations, usually ~150

 number-of-threads: Number of threads to use, usually equal to the number of subjects (should not exceed the number of threads available on the system)

**Data\_set.xml** defines the files to be atlased and should be structured as follows:

From the alignment folder transfer aligned meshes (files with suffix **\_r**) and initialtemplate.vtk into the atlas folder.



器 < > 
 optimization\_parameters.xml ) No Selection

optimization\_parameters.xml

#### Deformetrica

The first cell loads the **Deformetrica** software. If the software is not found an error is returned.



#### **Launch Simulation**

Launches the atlasing software using the files and parameters defined by model.xml, optimisation\_parameters.xml and data\_set.xml.

**Deformetrica.log**, within the output folder, contains information on the progress of the atlas, including the number of control points and the current iteration.

#### []: import os

```
working_directory = os.path.join(os.getcwd(), 'data', 'atlasing')
script_filename = os.path.join(working_directory, 'deformetrica.sh')
os.system('bash {}'.format(script_filename))
```

### E. Shape statistics

This section describes the statistical analysis of the outputs from the atlas.

Atlasing generates several output files of which the following three are used for statistical analysis:

- Atlas\_controlpoints.txt
  - o Control points of the atlas
- Atlas\_momenta.txt
  - o Momentum vectors of the atlas
- Atlas\_initial\_template.txt
  - Average mesh of the population

These files are must be moved into the **shape statistics** folder. In the same folder, a userpopulated file **data.csv** defines the names and types of the subjects.

#### data.csv example file

In this example in GroupId, 1 refers to a mutant and -1 to WT, and in Gender, 1 Male and -1 female.

	А	В	С	
1	id	GroupId	Gender	
2	33.4a	-1	-1	
3	33.4b	-1	-1	
4	35.1c	-1	-1	
5	37.1c	1	1	
6	38.1c	-1	1	
7	29.3d	-1	1	
8	29.3g	-1	1	
9	30.3b	-1	-1	
10	30.3d	1	-1	

The following cells are the run with default values: Imports

- Loads relevant packages required for this section of the pipeline **Deformetrica** 

- Loads deformetrica ready to be used (required for creation of morphs) Load data

- Loads output files stated previously to be analysed

#### **Define population's groups**

- Loads data.csv

#### Subgroup definitions

- Assigns names to groups of specimens defined by one or more parameters in data.csv.

[Default groups are: WTf (Wildtype female, defined by: group ID = -1, gender = -1, CRf is defined by: group id = 1, gender =-1), WTm (Wildtype Male), CRf (Carrier female) and CRm (Carrier Male)]

However, the user should change the names and definitions of subgroups to suit their needs.

In [48]:	<pre>g1 = df['GroupId'].values &lt; 0 g2 = df['GroupId'].values &gt; 0</pre>	
	<pre>WTf = list(df.loc[(df['GroupId']</pre>	< 0) & < 0)].index) < 0) & > 0)].index) > 0) & < 0)].index) > 0) & > 0)].index)

#### Kernel Principal Component Anaylsis (kPCA)

This cell runs a principal component analysis (PCA) and produces a classification score (as a percent) and a p value for said score. As well as defining group IDs (by default group one > 0 and group two < 0 using values set in **data.csv**) and calculating the mean Principal Component score.



#### **Eigenvalues/Eigenvectors**

Produces Eigenvalues and eigen vectors. Providing data on how much variability each principle component describes.

#### Write PCA points on disk

Produces an excel file, kpca.csv containing the PC values which can exported to produce PCA graphs.

#### **Momenta projection**

Produces momenta that describes project between the mean of the whole population to the means of the previously defined populations.

#### Shoot mean shape between groups

Uses the momenta projection to 'shoot' the shape towards the means of the two groups.

#### Shooting outputs

Saves the shot meshes produced in the previous step in two locations:

- data/shapestatistics/shooting/forward
- data/shapestatistics/shooting/backward

They correspond to the mean shape (**Atlas\_initial\_template.vtk**) displaced towards the mean of group one (backward) and the mean of group two (forward). Each file now contains several meshes. The first mesh in the folder is the average shape of the whole population and the last mesh the mean shape of the subgroup. Each mesh in-between represents a step of deformation moving from one to the other.

#### Animation of deformations between subgroups

Reorders the mesh files produced in **Shooting outputs** to generate an animation of cyclic shape change starting with the mean of group one to the mean of group two and back again. The files for the cyclic deformation animation are saved in: data/shapestatistics/shooting/combined. Files should be opened in **Paraview** to visualise the meshes.

The deformation is viewed as a cycling animation by pressing the repeat and play buttons.



#### "Stretch" map (Local volume change map) between groups

This step integrates data on displacement and stretch into the cyclic deformation produced in the previous step. Removing the # from in front of **compute\_point\_displacements** calculates displacement.



Removing the # from in front of compute\_cell\_surfaces\_difference, calculates stretch.



Heat maps are viewed by importing the mesh files from the combined folder into **Paraview**. Select displacements or Absolute Volume from the colouring drop down menu and the morph was played as before to visualise the heat maps. Colour scale (look-up table) may need to be adjusted to visualise differences properly. This can be found by clicking the edit button found underneath the dropdown menu.

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• Displacements (in	mm) ᅌ			\$
🔛 Edit				

#### **Generating videos**

To save these morphs as videos (either with heat map colours or not). Go to file and save animation.



This will open up a file save window. Here the format of the video (.avi as default) and the name of the video can be chosen. This will bring up a second window in which a number of parameters for the video such as resolution and frames per second maybe adjusted.

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Once happy with the parameters hit okay and the video will be produced. The video will capture everything in the rendering window including colours scale bars. To edit the appearance of the scale bar, click the edit colour bar icon.



This will bring up a menu in which various settings of the colour scale bar may be changed.

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To remove the scale bar entirely hit the colour bar icon.

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