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Mapping Fetal Brain Development *in utero* **Using MRI: The Big Bang of Brain Mapping**

Colin Studholme

Biomedical Image Computing Group, Department of Radiology and Biomedical Imaging, University of California San Francisco, 505 Parnassus Ave, San Francisco, U.S.A.

Abstract

The development of tools to construct and investigate probabilistic maps of the adult human brain from MRI have led to advances in both basic neuroscience and clinical diagnosis. These tools are increasingly being applied to brain development in adolescence, childhood and even neonatal and premature neonatal imaging. Looking even earlier in development, parallel developments in clinical fetal Magnetic Resonance Imaging (MRI) have led to its growing use as a tool in challenging medical conditions. This has motivated new engineering developments that combine optimal fast MRI scans with techniques derived from computer vision that allow full 3D imaging of the moving fetal brain *in utero* without sedation. These promise to provide a new and unprecedented window into early human brain growth. This article will review the developments that have led us to this point, and examine the current state of the art in the fields of fast fetal imaging, motion correction and the tools to analyze dynamically changing fetal brain structure. New methods to deal with developmental tissue segmentation and the construction of spatiotemporal atlases will be examined, together with techniques to map fetal brain growth patterns.

Keywords

Motion Correction; Image Mosaic; Deformation Morphometry; Spatio-Temporal Atlas; Tissue Segmentation; Cortical Folding

1 Introduction

The combination of Magnetic Resonance Imaging (MRI) physics with mathematical and computational techniques that underpin modern brain image analysis has created a range of new tools for the neuroscientist and clinician. These allow the creation of maps quantifying both brain structure and function across human populations, and the examination of how clinical factors can influence the patterns of measurements. These developments have helped form the basis for the emergence of brain mapping $(1-3)$ as a key research topic in both basic neuroscience and clinically focused brain research. In particular, computational morphometric methods have provided new insights into the way brain structure changes over time and how this process is influenced by disease in populations ranging from adults with dementia (4–6), psychiatric conditions (7), brain injury in substance abuse (8), to changes in the brain due to infectious disease (9). More recently, focus has shifted to the study of the developing brain (10,11,11–13) and large scale projects are underway to understand and map the process of brain growth from birth to adult (14). These studies have focused on postnatal mapping of growth. However, recent developments in clinical MRI, as illustrated in figure 1 have raised the possibility of pushing these studies back further, to image the process of human brain growth *in utero*. For the neuroscientist, the ability to image earlier, simpler structural configurations provides insights into the fully developed anatomy. By mapping the brain in its early form, prior to the process of anatomical

individualization, and capturing its transformation into the individualized adult configuration, we hope to understand better how the adult brain itself is organized and functions. This article reviews the combination of engineering and clinical developments that are beginning to provide high quality and reproducible 3D images of early human brain growth, and examines some of the computational and algorithmic challenges in analyzing and modeling dynamically changing fetal neuroanatomy.

2 Background: The Emergence of Clinical Fetal MRI

2.1 Fetal MRI Safety

A key factor in the development of brain mapping has been the availability of reproducible high quality Magnetic Resonance Imaging (MRI), enabling 3D and 4D mapping of quantitative structural and functional measurement within the living brain. Unlike X Ray computed tomography or nuclear medicine imaging used in adult brain studies, and also experimentally explored for human fetal imaging (15), MRI does not involve ionizing radiation. However it remained out of the toolbox of the clinical radiologist because of safety concerns for the developing fetus. A significant literature exists examining the possibility of MRI induced damage from radio frequency field (RF) and electromagnetic field (EMF) exposure (16), in terms of both static and changing fields (17). This early work was refined (18–20) using more accurate anatomical models (21, 22) for adult imaging. When clinical MRI during pregnancy was being considered, this work was extended with fetal specific RF-EMF models (16, 23–26). Previous studies examined concerns regarding thermal effects arising from the lack of surface cooling available to the fetus (27) and the effects of noise levels (28) resulting from the use of faster (and noisier) MRI sequences. The potential for MRI induced genetic mutations (29), and the consequences of maternal stress related to the MRI exam have also been examined (30). This work has been complemented by experimental investigations using animal models (31) to look at longer term effects of exposure to fields (32) and examine the thermal effects (33) on the fetus. Follow up studies of children studied with fetal MRI have also been carried out (34–36), and no significant longer term adverse effects have been discovered. As a result, fetal MRI has begun to be accepted more widely as a tool for clinical diagnosis.

2.2 Early Fetal Magnetic Resonance Imaging

The use of MRI with pregnant patients has been driven by the clinical radiologist and perinatologist, looking for better ways to analyze fetal health. However, from the beginning, motion was the key challenge. The first clinically driven studies included early T1 weighted (T1W) lower magnetic field imaging (37, 38) and T2 weighted (T2W) imaging (39–44). These early attempts used slower techniques that were highly susceptible to motion of the fetus, and were therefore largely dependent on the luck of the radiographic technician in catching the fetus while not in motion, and often were performed with shallow maternal breathing. In France, fetal motion was reduced by injection of a sedative into the umbilical vein (45) or via maternal sedation that crossed the placenta (46). Such fetal sedation was not practical for more general screening, although remains feasible for life threatening disorders. As a result of the general lack of reproducibility of methods, these promising early approaches were of limited use for general clinical practice.

The development of faster imaging techniques, combined with improved imaging hardware was the key to making MRI more generally applicable in clinical fetal studies (47–49). These include echo planar imaging (EPI) developed in the 1970's (50), which was also used in early fetal studies (51, 52), providing a so called snap-shot image of the anatomy. Critically, this early work showed that a single slice could be acquired quickly enough to exclude most fetal motion and still produce an acceptable level of signal to noise to delineate

anatomical detail. It also however illustrated that averaging of slices to increase signal without consideration for motion was still not possible due to between slice fetal movements.

2.3 Approaches to Faster and 3D MR Imaging

An MRI data acquisition samples the spatial frequency spectrum of the underlying anatomical measurements (k-space) and a spatial image is reconstructed using a Fourier transform (53). A single MR signal recording typically samples one line of this k-space over a few milliseconds, and can be acquired in such a way to collect 2D slices or full 3D volumes by encoding space using different temporally varying patterns of RF and magnetic field gradients (54). Full 3D volume imaging is typically employed in studies of adults and cooperative children and adolescents, as imaging time is still of the order of minutes. Motion during this time can induce ghosting or blurring as signal phase or frequency is corrupted. As a result, multislice 2D imaging is generally acquired in studies where motion is expected to be a problem. These allow pseudo 3D studies of the brain for fetal diagnosis (55) for fetuses exhibiting limited motion. However, motion can still induce artifacts when it occurs between data acquisition and the following RF excitation, or by inducing spin phase errors as the object moves through the magnetic field between excitation and the following data sampling acquisition. So called motion robust sequences have also been developed such as projection-reconstruction (56) and spiral (57,58) MRI sequences. However, they have so far been unable to provide clinically useful images in a short enough time interval for 3D fetal imaging.

2.4 Motion Correction Techniques in MRI

Even with the many advances in MRI, full 3D acquisitions that are fast enough to reduce the chance and impact of motion artifacts to an acceptable level are still not feasible. In adult imaging, a range of motion correction schemes have been developed to allow imaging in the presence of motion. Prospective motion correction techniques make use of independent estimates of anatomical positioning to update the acquisition process as it proceeds, by modifying the phase or frequency encoding being used to define the scan geometry (59), or to exclude corrupted components of the signal acquired at known times of motion. A range of such techniques have been explored using optical (60, 61) or MRI marker (62) based tracking of patient anatomy. However, the requirement for some form of attached marker or visible surface precludes these approaches from use in fetal imaging.

Motion estimates can also be derived from additional MRI measurements using so called navigator echos (63) which are rapid, simplified signal acquisitions interspersed within MR sequences. These have been used for both retrospective (63) and prospective correction (64) of motion, and can employ a variety of k-space trajectory shapes to measure motion in different axes, including linear (65), circular (66), spherical (67) for full 3D motion tracking (68, 69). To correct larger head motion in children recent methods (70) have combined spiral navigator echos with Kalmen filtering based tracking. In fetal MRI, navigator echos have been used to detect and trigger fast snapshot slice imaging (71) to times when the fetus is stationary along a selected axis. However these can be difficult to localize for estimation of full 3D motion in fetal MRI. An alternative approach, derived from radar imaging, is to retrospectively 'refocus' the data in the k-space (Fourier) domain without separate motion estimates (72). However, because these algorithms operate on the k-space (Fourier) domain, it is difficult to adapt them to correct locally rigid motion, as required in 3D fetal imaging.

2.5 Current Multi-Slice Imaging and its Limitations

In place of earlier EPI methods, accelerated sequences such as fast spin echo (FSE) (73), the half Fourier single shot turbo spin echo (HASTE) (74) and single shot fast spin echo

(SSFSE) (75) have been developed to provide improved tissue contrast. These require a second or less for one slice, and provide the clinician with a reliable route to getting selected slice views through unsedated fetal anatomy, albeit without accurately known 3D spatial relationships between consecutive slices. Studies typically involve the acquisition of multiple stacks of slices planned with different orthogonal orientations to provide complementary views of the anatomy. These can make use of real time planning to manually adjust to fetal motion (75) or gating to remove the influence of maternal breathing.

Clinical applications of faster multi-slice imaging rapidly expanded, particularly for neuroimaging (76), where ultrasound studies are limited by reverberations resulting from the bony structure of the fetal skull. Here MRI can provide valuable contrast between different tissue layers in the developing fetal brain which are invisible to ultrasound, such as the germinal matrix and sub-plate, as well as providing high resolution information about the folding of the cortical plate. MRI has found a key role in providing valuable complementary information in specific clinical conditions, particularly involving brain development (77). It has been shown to be extremely useful in evaluating causes of ventriculomegaly (78, 79), identifying cerebral malformations (80, 81), identifying infections (82), and identifying other fetal brain injuries (83, 84).

In addition to radiographic diagnosis, fetal Brain MRI has begun to be used in quantitative studies of brain growth in different clinical populations (79, 85–88).

For more quantitative studies of brain anatomy these types of imaging acquisition suffer from a number of important limitations. As well as the problem of the unknown anatomical relationships between successive slices, they also employ relatively thick slices to provide adequate in-plane resolution and signal to noise for radiological inspection, but hindering true 3D analysis. In addition, gating to the maternal breathing, although reducing the chance of within-slice motion, can also significantly extend the scan time, with little improvement in cases of significant fetal motion.

3 A Hybrid Solution to 3D Fetal MRI: Computer Vision Meets MR Physics

The current direction of research toward full 3D MR imaging of moving fetal anatomy has taken a hybrid approach of combining MR physics with computer vision techniques. This was motivated by the observation that clinical studies of the fetal brain commonly make use of multiple multi-slice acquisitions in different axes which are also often repeated because of fetal motion during a stack.

In computer vision, the field of image mosaicing (89) seeks to merge sub-images into a single image. This can provide either an enlarged field of view (90) by increasing the spatial extent of the data, or an improved resolution (91) by increasing the spatial frequency extent of the data. Mosaicing can be divided into the steps of transformation estimation and image fusion. It has been used in MRI using a context similar to that of many computer vision applications (92) to extend the field of view of an image, and in confocal microscopy, an elegant Lie group framework has been proposed for collective transformation estimation (93). In the context of fetal MRI, we need to combine regions of images containing a moving object (94) surrounded by confounding moving structure. As illustrated in figure 2, given a set of N2D slice images $I_n(\mathbf{x}_n)$, $n \in \{1 \dots N\}$, in order to make use of the partial data provided by each slice we need to estimate the full rigid 3D transformation $\mathbf{y} = T_n(\mathbf{x}_n)$ that maps from points \mathbf{x}_n in the brain in each 2D slice, to a consistent 3D anatomical coordinate frame \bf{y} , in which a true 3D image $V(\bf{y})$ is to be formed. Conventional 2D to 2D photographic mosaicing approaches can explicitly consider shared structure in overlapping images to refine alignment. However, here we have a 2D to 3D matching problem involving

the collective alignment of slices within a volume space. Unlike previous work on slice to volume matching in medical imaging, where individual slices from an interventional MRI study (95), postmortem study (96), anatomical atlas (97), or functional MRI study (98) are matched to a full 3D volume acquired separately, here we do not have a reference 3D volume.

3.1 Reconstruction Based Slice Motion Estimation

The first practical approach to 3D fetal brain imaging (99, 100), proposed a two step process, by combining ideas from slice to volume matching and image mosaicing. The iterative approach involves the formation of a putative 3D volume image from the scattered slice data using a working estimate of individual slice transformations. Slice alignment to this volume is then refined and used to form an improved 3D volume for the following iteration. A 3D image can be formed from slice images and a given set of slice transformations, using adaptations of conventional scattered data interpolation schemes (101–103) to re-sample values from sets of arbitrarily orientated slices onto a regular voxel lattice. Refinement of alignment is achieved by defining an image similarity measure $\mathscr{S}_{I_n}(\cdot)$, V_I ()) between the slice image intensities $I_n(\mathbf{x})$ and the reconstructed volume image intensities $V_f(\mathbf{y})$ at iteration *i*. A gradient ascent scheme is used to maximize $\mathscr{S}I_n(0, V_f(0))$ with respect to $T_n(\mathbf{x})$, for each slice.

The problem of estimating full rigid transformations (three rotations and three translations) for each individual slice is highly under determined and requires constraints to provide a tractable route to a solution. Image matching schemes often make use of an hierarchical multi resolution approach to avoid local optima, by first estimating coarse misalignment from lower resolution images. In a similar way, methods to estimate slice alignment can estimate bulk motion of all slices first, and then refine the estimate to smaller and smaller groups of slices (100) to recover fine scale structure in the motion trajectory. However, the slice acquisitions within a multislice fetal MRI study are commonly interleaved to avoid slice to slice crosstalk by acquiring all odd and then all evenly spatially indexed slices. Thus, hierarchical estimation of fetal trajectory from the slice stack must also account for temporal ordering of the slice acquisitions.

This two step reconstruction and motion estimation scheme essentially acts to sharpen the next reconstructed 3D volume, as slice alignment with the current volume is refined to remove inconsistent contributions from slices that can be explained by their spatial transformation parameters. This process can be related to retrospective k-space focusing methods of (72), but acting entirely within the spatial domain to allow localization of the motion correction to the anatomy of interest (here the fetal head).

This iterative "reconstruction based" approach, making use of an intermediate volume, was emulated by later methods (104, 105), using different approaches to volume reconstruction. In (104), by implicitly assuming that through plane motions are unlikely to occur, the data acquisition requirement was simplified to a single plane orientation repeated over time.

3.2 Intersection Based Slice Motion Estimation

The reconstruction based motion estimation approaches make use of an iterative scheme alternating between reconstruction of a 3D image and matching slices to that image. Although this has been experimentally found to be effective, it suffers from a lack of proven convergence properties. Problems can occur where slice sample density falls during slice motion estimation, inducing local blurring in the putative volume reconstruction which then impacts the resulting slice alignment step. A more recent approach avoids these issues by removing the need for a volume reconstruction step (106, 107) for motion estimation. This

approach, in effect, extends 2D image mosaicing to the extreme case of considering overlap at the intersection of any pairs of slices that have been acquired in approximately orthogonal orientations. As illustrated in Figure 3, for a single pair of intersecting slices, the image structure along this intersection must match when they are consistently mapped into the 3D space. This match provides partial geometric constraints on the relative location of the two slices (for example limiting the sliding along an intersection, but still allowing rotation as a hinge around the intersection). By considering all intersecting slice pairs, as illustrated in Figure 3, we can seek slice transformations that collectively resolves all relative mismatches in the acquired data. Using a sum of squared difference in image intensity as a matching criteria for the MR slices, it is possible to formulate the collective alignment in a least squares framework that is accessible to efficient optimization. This has the computational advantage of not requiring a volume 3D reconstruction at each step and potentially provides improved accuracy due to avoidance of the blurring which can occur in the 3D reconstruction process. It is interesting to relate the slice intersection approach to that of using an additional linear navigator echo to acquire motion information. Each intersection of a slice pair provides an equivalent one dimensional source of information about the object motion.

3.3 Anatomical Localization of Motion Estimates

In addition to the rigidly moving fetal head, fetal MRI slices generally include a large fraction of maternal anatomy and fluid, deforming or flowing around the fetal head which must be excluded from the motion estimation process. This can be achieved by approximate cropping of the data (100) around the fetal head, combined by the use of a robust image matching criteria. Later work (104) used a careful manual delineation of the fetal brain in each acquired slice to achieve local matching. More recently methods (107) have incorporated an explicit spatial windowing in the motion estimation process, which is aligned with the data during motion estimation.

3.4 Improving Volume Reconstruction

In the first approaches (100) to combining motion scattered multi-slice fetal brain slices, a Gaussian distance weighted interpolation was used to re-grid the scattered slice data onto a regular voxel lattice. This was motivated by the known slice profile and was robust to missing regions of data. Later work (104) used an alternative B-Spline scattered interpolation to provide a sharper rendition of structures from the combined slice data when many slice stacks were available. In (107), the general approach of kernel based interpolation was further refined using an edge weighted interpolation scheme. This acts to enhance the contributions of structure acquired in different slice orientations. In new work (105, 108, 109), the scattered data interpolation was extended further to incorporate concepts from super resolution image reconstruction to enhance the fidelity of the reconstructed image where the anatomy is significantly oversampled by many repeated acquisitions.

A second aspect of the volume reconstruction problem is that of changing MRI intensity inhomogeneity or 'bias' across the field of view (110). This is particularly a problem in abdominal imaging where the anatomy of interest can be far from the phased array surface coils used in image formation. In fetal imaging, when the fetus moves with respect to the coils, the spatial relationship changes and therefore the in-slice distortions of the same anatomical region can be changed. When these images are combined to form a single volume, these differences induce artefactual structures that can obscure subtle underlying tissue boundaries present in the fetal anatomy such as the sub-plate (111), making them difficult to quantify. Rather than directly applying correction methods (112) to the final volume, we must consider the individual relative slice distortions contributing to volume reconstruction errors. To address this a relative slice bias correction scheme was

incorporated into the final reconstruction (100). This assumed that one 3D stack contained limited fetal motion and could therefore be used as a reference for relative intensity correction of all remaining slices. This has then been developed further using a slice intersection framework (107) to provide a direct relative bias estimation for each slice. Here all individual slice bias fields are brought into agreement based on discrepancies along all slice pair intersections (113), removing the need to assume a minimal motion reference stack is present in the study.

3.5 Advantages of Retrospectively Combining Clinical Images

An example of the ability of retrospective multi-slice motion correction techniques to recover extreme motion in a study of a younger fetal brain is shown in Figure 4 (b). Critically, this step allows the clinician and neuroscientist to study normal fetal anatomy without biasing studies to those without motion artifact or who undergo sedation. The process of combining multiple clinical studies into a single coordinate system provides two key advantages in addition to 3D image formation, as illustrated by Figure 4 (a). Firstly, it allows signal averaging across multiple data acquisitions through the same anatomy, to improve contrast to noise and help delineation of subtle tissue boundaries such as those of the sub-plate (111). In addition, the original clinical slice data suffers from highly anisotropic resolution (i.e. fine in-plane resolution, but considerably greater slice thickness). This induces partial volume artifacts and poses considerable challenges when attempting to visualize and quantify cortical folding. By combining complementary structure delineated in slices with high in-plane resolution, but different orientation, improved isotropic resolution is possible (107). The need to re-plan a scan or manually 'chase' a fetal head during a typical clinical study to ensure slices are in a specific orientation for radiological inspection is reduced by the post-hoc creation of a true 3D volume image, and this can significantly reduce study time for the mother and fetus. Finally, by making use of retrospective correction of scans, the clinical 2D slice are still available for radiological inspection where needed.

4 Quantifying and Mapping Brain Growth *in utero*

4.1 Automated Fetal MRI Brain Tissue Segmentation

The first step in quantifying human brain anatomy from MRI scans is often to take the MRI scan and assign the voxels (or pixels) with labels indicating the most likely type of tissue at that location. Such MRI segmentation techniques, developed initially to automatically partition the adult human brain into tissue classes, have been extensively developed over the past 20 years (114). However, the challenges posed by the study of developing fetal brain anatomy have necessitated new directions in brain image segmentation methods. Many of the most accurate and robust approaches to adult brain tissue segmentation make use of parametric statistical models of the image contrast and noise (115, 116). These employ Gaussian mixture models (117), which capture the piecewise uniform nature of the tissue regions in the brain. The most widely used approaches also use atlas based priors on the probability of tissues over the brain to initialize and constrain a libeling of new MRI scans (118, 119) and provide spatial context to the labeling. These prior maps are estimated in a common canonical coordinate frame (120) and deformed into the space of a new unlabeled MRI scan using a non-rigid deformable image registration. Labeling is then adapted to the new brain MRI by combining the prior with a likelihood for the data conditioned on the labels and applying Maximum a posteriori (MAP) or maximum likelihood (ML) methods (121, 122).

In the most commonly used T1 weighted MRI of the adult and child, visible tissue classes commonly consist of gray matter and white matter and cerebrospinal fluid. However, in fetal

brain imaging, T2 weighted (T2W) is typically used. At the time of initial clinical MR imaging (around 20–25 weeks), the fetal brain *in utero* consists of a layered structure of up to 7 different tissue zones (123), some of which are visible in clinical imaging at different stages of development. These zones, illustrated in Figure 5, include the germinal matrix, cortical plate (which will become cortical Grey matter), the sub-plate and the intermediate zone (which will become the White Matter). In early work on automated fetal tissue segmentation, approaches were first explored that extended atlases to contain priors on these developing tissues at a given developmental stage (124). These were built from carefully manually delineated MRI scans to provide an accurate statistical reference for a given age of development.

The use of subject or age specific templates, in both children (125,126), neonates (127–129), and even in adults (130), has been shown to significantly improve the tissue Labeling process. However, unlike clinical studies of adults or children, fetuses cannot easily be studied at a precise developmental stage. This is because the speed of changes in the developing brain occur on the order of weeks or days, combined with the uncertainty of the age of a fetus (131). Thus, the focus of research has been to develop continuous or computational atlases of the fetus, capable of modeling any given age. This parametrically models changes in shape, size, MRI contrast and tissue probability at every point in the fetal brain (132), as illustrated in figure 5. This enables the synthesis, for any given gestational age, of a specialized MRI template with representative tissue contrast and tissue probabilities. Given the difficulty and ethical considerations of carrying out repeat imaging on the same expectant mother, this atlas cannot be directly constructed from repeated longitudinal imaging as in adult analysis (1), but is naturally constructed from many different fetuses, each scanned at different ages. This allows the atlas to form a mean growth trajectory which is representative of a population and also encodes the natural variation of development together with uncertainties of estimation of fetal age (131). Further methodological research has also explored the development of fetal specific geometric priors in segmentation, which are aimed at improving tissue Labeling using the layered structure of the zones of tissues in the fetal brain. By making use of the fact that inner and outer boundaries of the brain may be delineated most easily from clinical scans, the more subtle tissue boundaries between them can be assumed to occur in a defined order from inside (germinal matrix) to outside (cortical plate). A statistical model of the occurrence of the tissues zones at different relative depths in the brain can then be used as an additional spatial prior to further improve the segmentation by helping resolve ambiguities in the labeling process (133). Such developmentally specific geometric models may provide routes to further improving many steps in fetal brain image analysis.

4.2 Mapping Regional and Local Patterns of Tissue Volume Increase

There have been a number of important studies of whole fetal brain tissue volume growth derived both from postmortem studies and in utero imaging. Manual segmentations of cerebral mantle tissue zones on MRI describe the different growth trajectories for the overall cerebral brain, germinal matrix, and ventricular volumes (134–136). Additionally, manual 2D measurements of laminar thickness suggest regionally varying thickness in cortex and sub-plate (137). The recent use of motion correction techniques to build 3D images has provided true volumetric estimates of whole brain (138) and subplate (111) in utero. Most recently, the development of automated tissue segmentation has begun to allow larger scale volumetric studies of tissue zones from motion corrected *in utero* imaging (124). While adult studies can parcellate the brain into regions (eg lobes) based on cortical landmarks, to study local volume changes, these landmarks are often absent or inconsistent in the smooth fetal brain, and therefore alternative and often more simple anatomical divisions must be used.

At a very local level, the growth of a sulcated neonatal brain from a smooth fetal brain requires a complex series of local tissue volume changes to form the individuals cortical folding pattern. Tensor based morphometry (139) (TBM) uses accurate spatial normalization of brain anatomy into a common coordinate frame to study patterns of size differences in local anatomy. Statistical analysis of properties of the Jacobian map of the non-rigid deformations required to bring each anatomy into the common coordinate system allows local tissue volume to be related to age and clinical variables. Such an approach requires modification to be used in the developing brain because of the dramatic changes in tissue contrast occurring over short time scales. Direct deformable registration of fetal MRI scans can induce artefactual deformations as image warping attempts to account for inconsistent tissue contrasts when mapping from one fetal age to another. By first employing automated tissue segmentation to extract age consistent tissue boundaries, recent work has shown it is possible to apply TBM successfully to map anatomical changes (140). Figure 6 illustrates the use of TBM to detect the locally varying pattern of expansion of tissue (regions that grow faster or slower than the overall brain), indicating where additional cortical complexity is being added.

4.3 Quantifying and Mapping Cortical Folding

Postmortem studies have shown that the primary and secondary sulci form in a consistent spatial and temporal order during normal gestation, allowing the originally smooth fetal brain to dramatically increase cortical surface area. The timing of this has been considered an accurate marker of brain development (141) in clinical radiological inspection of MRI slices, with perturbations to this pattern providing potential stable biomarkers for abnormal functional development. Quantitative analysis of fetal brain folding from postmortem studies has shown the promise of full 3D surface curvature analysis (142). In particular, the two invariants of maximum and minimum curvature at each point on a surface give rise to a range of shape measures such as mean and Gaussian curvature (143) and shape index (144). These provide valuable quantitative ways of tracking folding that have been used in preterm brain studies (145). By creating surface based representations of the human fetal cortex from motion corrected *in utero* MRI, these methods have begun to be applied to the earliest stages of cortical folding. Using surface tessellation and quadric modeling of surface shape, the curvature of the fetal surface can be accurately quantified and mapped, forming a population based statistical model of the normal progression of brain surface curvature. Results show (146) that it is possible to use this approach to detect the subtle early stages of folding at the start of sulcal formation as illustrated in Figure 7 for normally developing fetuses at different developmental ages.

5 Future Directions

5.1 Imaging Developing Tissue Microstructure: Diffusion MRI

Imaging of tissue microstructural properties and connectivity of white matter tracts has emerged as a powerful structural modality both in adult brain studies and in childhood and adolescence. Diffusion weighted imaging (DWI), together with Diffusion tensor imaging (DTI) are MRI techniques (147, 148) that provide measures of microstructural tissue integrity (149, 150). These use fast MRI acquisitions to provide directionally sensitive measures of water diffusion within tissue. Research from clinical imaging has shown that DWI is feasible in some fetal brain studies (151–153) where there is limited motion, and that it can provide significant additional information in cases of suspected abnormalities (154, 155). However, studies have often been limited to a small number of slices and have limited anatomical coverage. DTI studies often involve the acquisition of larger numbers of directional measurement images to provide a more complete profile of water diffusion at each point in the brain, but are therefore even more sensitive to motion. In postmortem fetal

imaging (156) it has shown great promise in studying the development of white matter tracts. Fetal DTI studies in utero, though requiring a longer imaging time, has also been successful (157) in providing insights into the formation of connections within the brain. However, much of this *in utero* research has been limited to studies of older fetuses or cases where the fetal head is engaged in the maternal pelvis, where fetal motion was constrained, and is still therefore not yet feasible for general clinical imaging or larger scale neuroscience studies.

Most recently, slice motion correction techniques for diffusion tensor imaging have been proposed (158) and adapted (159, 160). Since each directional diffusion measurement is with respect to a specific coordinate frame, motion of the fetal head between the acquisition of the images not only modifies the intended anatomical location but also the anatomical orientation of the diffusion measurement. By repeatedly acquiring multiple sets of each directionally weighted diffusion image, missing directions and locations in the scattered data can be filled in (158), at the expense of additional imaging time. Within slice motions cannot be easily be recovered since they corrupt the actual diffusion measurement, however the number of these are limited by the shorter slice acquisition time of EPI data, and they can be excluded as outliers in the fitting process. For the remaining data, different slice motion estimation methods have been proposed making use of slice to volume matching. One of the key challenges in this problem is the low signal to noise of the diffusion weighted imaging, which can impact the ability to accurately recover slice positioning. Approaches simplify the process by either first constructing a reference non-diffusion weighted image and estimating remaining slice motion relative to that (158), or by constructing a reference tissue map from conventional MRI and estimating motion using a maximum likelihood framework (159) which additionally allows the estimation of geometric slice distortion present in the DTI slices. The final reconstruction involves a more complex process which must combine spatially and directionally scattered diffusion measurements made during fetal motion into a single diffusion tensor field on a regular voxel lattice. This scattered data fitting process can be formulated in a least squares framework (158) with constraints to preserve the positive definite properties in the final diffusion tensors. However, given the scattered nature of the fetal diffusion measurements, it is natural to consider more general higher order diffusion models which can take into account the larger spread of diffusion measurements induced by fetal motion, and provide a route to resolving ambiguities in areas of crossing fibers. This approach has been shown to improve on FA measurements for fetal data (160). Once a regularly sampled set of diffusion profiles has been estimated, it can be analyzed using techniques such as DTI tractography to reconstruct the developing white matter tracts within the fetal brain.

5.2 Imaging Developing Brain Function: Functional MRI

A second area of key interest in brain development is the measurement of brain function. Functional MRI (fMRI) is used to provide a window into short term blood oxygen level changes in the brain (161) in adults and children that are related to underlying tissue function. These have been used to map both responses to external stimuli (eg visual or auditory) or to map so called resting state brain activations (162). Such capabilities are of significant interest in fetal imaging to provide an understanding of developing brain function. Work on resting state activations (without stimuli) have shown great promise in mapping the development of the so-called 'default mode' in infants (163) and children (164,165), and extending this work to show earlier stages of this process is of significant interest. Early work on fetuses has shown that it is possible to apply stimulus driven methods, in cases of limited fetal motion, to study response to auditory stimuli (166), and visual stimuli (167, 168). All fMRI methods however rely on the detection of subtle temporal variations in signal at each location in the brain across many repeated scans, and as

such are highly sensitive to motion. In adults even small motions need to be corrected for using techniques available in standard software tools to ensure no stimulus correlated motions remain. For the techniques to be generally applicable for use in fetuses, either clinically or for realistically sized and unbiased neuroscience studies, it is essential that large scale fetal head motion correction of the data be possible. Techniques developed for structural image motion correction should, in theory, contribute in this area, although adaptation of the scanning protocol (to include, for example, more repeated acquisitions to ensure full spatial-temporal coverage) may be required. An important additional factor is also that of possible changes in geometric distortions that can occur in echo planar imaging data. Finally, more work is also needed in the post-hoc functional data analysis, to address the possibility of missing or scattered spatio-temporal data.

6 Conclusion

This paper has reviewed the background to the development of MRI as a tool to image the human fetal brain *in utero* in 3D without sedation. These developments are beginning to open a new window into early human brain growth that has so far been inaccessible to the neuroscientist and clinician. The availability of true, high resolution 3D imaging of growing brain tissues will allow us to examine the key changes in the brain that form the basis for adult brain structure and function. These measurements include the precise spatial and temporal pattern of cortical folding and the process by which a unique folding pattern emerges in individuals. Such data may contribute to further refining and validating theories of brain folding (169–171). Measurements made in utero complement histological studies that provide a cellular level understanding of tissues which are unable to examine change and growth over time or to study 3D structural variability across large populations. An important new direction of future work will be to build stronger bridges between in utero measurements and histology. In terms of imaging methodology, two key directions for new work are on the development of fetal brain functional imaging and the imaging of the formation of white matter tracts from diffusion imaging. Together, these imaging methods will be particularly important in understanding the process of initiating normal brain function: i.e. understanding the processing of 'software booting' of brain function that must occur when the underlying hardware has developed. Understanding the time-line of functional development and how it relates to structural changes in humans will be an interesting new area of research which may bring new understanding of adult brain function and its variation. Another interesting direction is that of linking genetic information to accurate growth maps in order to understand in detail how genes modulate the pattern and order of local growth on a macroscopic scale. Better knowledge of the spatial and temporal variability of these events in healthy fetal brain growth may allow the construction of biomarkers for abnormal cortical development, which may have important applications in poorly understood conditions such as ventriculomegaly (78, 79). In terms of direct clinical intervention, the increased interest in fetal surgery (172) driven by newer minimally invasive techniques (173) will depend on the availability of high quality imaging both for diagnosis, planning and guidance (174). In conclusion, the combination of MRI physics with computer vision and biomedical image analysis techniques promises to dramatically expand our understanding of the human brain and provide a range of powerful new diagnostic tools.

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Figure 1.

Example slice from a clinical fast (SSFSE) T2W MRI image of a human fetus showing a mid-line sagittal view of the fetal brain.

Figure 2.

The motion scattered multislice to volume matching problem: Combining fast multislice MRI acquisitions by retrospective fusion to a 3D volume: Each individual slice n making up the volume must be accurately located and orientated within the final 3D anatomical space by a full 3D rigid transformation $T_n(\mathbf{x}_n)$ consisting of 3 rotations and 3 translations. Once these are estimated a final volume image can be reconstructed on a regular voxel lattice using scattered data interpolation techniques.

Figure 3.

An illustration of intersection based slice motion estimation: Any intersecting pairs of slices through the moving fetal head must match along their intersection when mapped correctly together into the 3D anatomical space. The square difference in intensity along an intersection is related to corresponding changes in the spatial transformation applied to each slice. By considering all slice pairs acquired in a multislice study consisting of many stacks of slices, a numerical optimization scheme can be formulated to minimize discrepancies, using the covariance matrix of all matches with respect to the slice transformation parameters. This collectively adjusts the 3 translations and 3 rotations of each slice to bring them into mutual alignment.

Studholme **Page 24**

Figure 4.

(a) Example motion estimation (107), relative intensity bias correction (113) and reconstruction into a single 3D volume (orthogonal slices in left column) of individual sagittal, axial and coronal slice stacks (right three columns) acquired from a clinical fetal brain study using fast multi-slice imaging (note the original slices are shown in acquired coordinates before motion estimation and therefore are not precisely aligned). These illustrate the valuable increase (left column) in the isotropic resolution and contrast to noise resulting from the accurate fusion of multiple fast multi-slice imaging studies of the moving fetus. (b) Motion correction and fusion of MRI scans of a younger fetal brain with extreme motion shown: reconstructed with individual slice motion estimation (left) and without (center), together one of the original slice stacks (right).

Figure 5.

An illustration of automated atlas based tissue segmentation of a 3D T2W fetal brain MRI using an age specific prior map of tissue probability, MRI contrast and brain shape and size. Labels assigned to each voxel dividing the brain into Cortical Plate, Intermediate Zone and Sub-Plate, Deep Grey Matter, Germinal Matrix and Ventricular CSF, are adapted from the atlas prior to fit the subject MRI scan using an iterative Expectation Maximization algorithm (132).

Studholme **Page 26**

Figure 6.

Example Tensor Based Morphometry of the pattern of tissue growth between 20 and 28 gestational weeks: Statistical significance maps show points where the rate of volume increase is greater or lesser than the rate of growth of the brain as a whole. The lower row shows slices within the brain volume, while the top row shows differences across the cortical plate only. These local variations in tissue growth rate create structural complexity as the primary sulci form.

Studholme **Page 27**

Figure 7.

Example maps of surface mean curvature of the boundary between the cortical plate and the sup-plate (equivalent to the gray matter/white matter interface in adults), evaluated on surface mesh representations automatically constructed from in utero MRI scans of fetuses with different gestational ages. These illustrate surface folding progression in terms of mean curvature increases (convexity) and decreases (concavity) as the early primary sulci common to all adults form. These include the sylvian fissure, the pre and post central sulci and the calcarine sulcus.