

## Specialty area: Emerging Brain Techniques

- Highlights:**
1. QSM quantifies magnetic properties of tissue.
  2. QSM can be acquired with gradient echo sequences;
  3. QSM is 3D and of high resolution;
  4. QSM quantifies myelination, iron deposition and calcification;
  5. STI images tissue microstructure and fiber orientation.

### CNS Quantitative Susceptibility Mapping (QSM)

<sup>1,2</sup> Chunlei Liu, PhD,

Email: [chunlei.liu@duke.edu](mailto:chunlei.liu@duke.edu)

<sup>1</sup> Brain Imaging and Analysis Center, <sup>2</sup> Department of Radiology, Duke University, Durham, NC

**Target audience:** physicists, neuroscientists and clinicians interested in learning the principles and applications of QSM.

#### PURPOSE

Phase and magnetic susceptibility maps derived from gradient-echo MRI provides a unique contrast among various cortical and sub-cortical gray and white matter tissues (1-9). The excellent tissue contrast has been largely attributed to the sensitivity of magnetic susceptibility to the spatial variations of molecular or cellular components, especially iron and myelin that are of different magnetic properties compared to bulk water (3,8,10-15). The objectives of the lecture are to understand the underlying concepts of QSM; to explain the basic acquisition and processing protocols of QSM; to recognize the benefits and pitfalls of QSM in CNS applications.

#### METHODS

##### Overview

Magnetic susceptibility is a physical property that reflects how a substance changes the magnetic field. Magnetic susceptibility of a material, noted by  $\chi$ , is equal to the ratio of the magnetization  $M$  within the material to the applied magnetic field strength  $H$ , i.e.  $\chi = M/H$ . This definition of susceptibility is in fact the volume susceptibility or bulk susceptibility. In MRI images, it is the volume susceptibility involving the magnetism (a dipole moment) per voxel. Magnetic materials are classically classified as diamagnetic, paramagnetic, or ferromagnetic on the basis of their susceptibilities. Biological tissues can be either diamagnetic or paramagnetic depending on its molecular contents and microstructure.

Susceptibility is usually measured with gradient-echo sequences. In GRE images, variations of tissue magnetic susceptibility result in signal cancellation in the magnitude and frequency shift in the phase. While magnitude images are routinely used in MRI, phase images are typically severely corrupted by phase wraps and overwhelmed by non-tissue-specific background phases. Quantifying tissue magnetic susceptibility from these phase images involves three basic steps (Fig. 1): 1. 3D phase unwrapping, 2. separating background and tissue phase, 3. solving an ill-posed deconvolution problem. These processes can be accomplished in freely available software such as STI Suite (16).

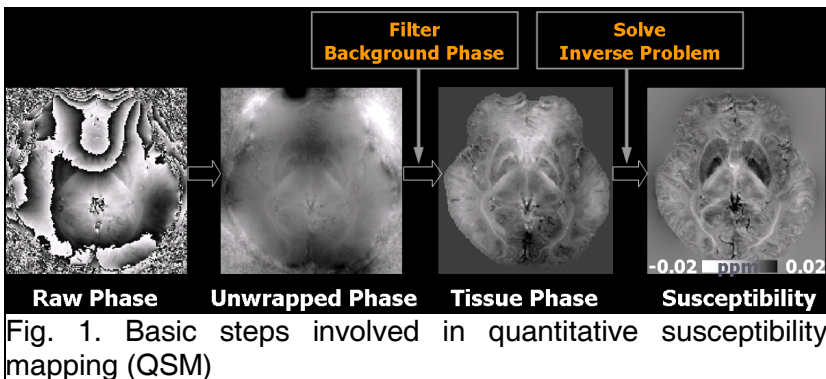


Fig. 1. Basic steps involved in quantitative susceptibility mapping (QSM)

### Sequences for acquiring phase images

The most commonly used sequence for measuring phase and susceptibility is the spoiled-gradient-recalled-echo (SPGR or GRE) sequence. The phase of GRE images gives a measure of local frequency offset which in turn can be used to calculate susceptibility quantitatively. The magnitude of a series of multi-echo GRE images is used to estimate the T2\* relaxation time using a single exponential or multi-exponential fitting. The flip angle, TE and TR can be optimized to improve SNR (17). Higher readout bandwidth can be used to reduce artifacts and T2\* decay induced blurring.

### Processing phase images

Two key steps are typically required in order to visualize tissue susceptibility contrast and for susceptibility quantification: phase unwrapping and background phase removal. Several methods have become readily available and have so far served the need for susceptibility mapping. These methods include, for example, path-based method and Laplacian based method (1). Once the phase is unwrapped, underlying tissue contrast is usually covered by large background phases that are generated from sources outside the brain. These large background phases can be removed with several methods, e.g, the spherical-mean-value based filtering (SHARP) (18), dipole field fitting (PDF) (19) and integrated HARPERELLA (16).

### Susceptibility quantification

Quantitative susceptibility values can be calculated from background-phase removed frequency shift maps by solving a linear equation. The relationship between frequency shift  $f(r)$  and the spatially distributed susceptibility  $\chi(r)$  is expressed in a Fourier transform as

$$\Delta f = FT^{-1} \left[ \frac{1}{3} \chi(\mathbf{k}) - \frac{k_z^2 \chi(\mathbf{k})}{k^2} \right] \gamma \mu_0 H_0 \quad [1]$$

Here  $\chi(k)$  is the 3D Fourier transform of  $\chi(r)$  and  $k$  is the spatial frequency vector. The equation can be inverted in the  $k$ -space. However, when  $3k_z^2 = k^2$ , the coefficient is zero prohibiting a direct inversion. Several viable solutions have been proposed. A simple strategy makes a threshold of the coefficients by replacing them with a small number whenever they are below that value. Other strategies utilize, e.g., regularization (6-7), multiple angle acquisition (4), LSQR algorithm (1) and compressed sensing (20).

## **RESULTS**

Magnetic susceptibility of tissue has recently been shown to reflect organ's molecular composition, structure, function and disease state. For example, phase contrast has revealed unprecedented spatial details of brain anatomy *in vivo* (2-3,21). QSM is enabling noninvasive and *in vivo* measurements of oxygen saturation and iron deposition in stroke, multiple sclerosis, Parkinson's and Alzheimer's diseases, and other neurological disorders and diseases (18,21-46). Further, QSM offers a new contrast mechanism for studying properties of nerve bundles including myelination and fiber tract orientation (15,39,47-56).

### Quantification of iron concentration

Gradient echo signal phase was increasingly applied to assess iron contents in deep brain nuclei. QSM showed great promise for assessment of deep brain nuclei, e.g. it can reliably differentiate subthalamic nuclei from the adjacent substantia nigra (57). Recently, emerging evidence suggests susceptibility is also linearly correlated with iron content in the basal ganglia nuclei (58-60). Both R2\* and susceptibility are related to microscopic magnetic field perturbation. While R2\* reflects the spectral width of field inhomogeneity, susceptibility is derived from the mean field shift. The good linearity between susceptibility and R2\* and the similar temporal

parameters suggest that magnetic susceptibility may be potentially used as a biomarker of brain iron deposits in gray matter. With standard multi-echo gradient-echo sequences,  $R2^*$  and susceptibility can be measured simultaneously without scan time penalty.

#### Quantification of demyelination and dysmyelination

Recent studies have established that magnetic susceptibility of brain white matter is closely related to myelin content. Liu et al reported that the loss of myelin sheath around axons in a transgenic dysmyelinating shiverer mice led to almost complete loss of phase and susceptibility contrasts between gray and white matter (15). These results suggest that myelin is the predominant source of susceptibility difference between deep gray and white matter. Lee et al also showed that frequency contrast are substantially reduced in mice with significant myelin loss induced by a cuprizone diet (52). Together, these studies indicated the potential value of QSM for the study of myelination in the white matter.

#### QSM of brain development and aging

Myelination and iron deposition in the brain evolve spatially and temporally. This evolution reflects an important characteristic of normal brain development and ageing. Li et al assessed the changes of regional susceptibility in the human brain *in vivo* by examining the developmental and ageing process from 1 to 83 years of age (61). The evolution of magnetic susceptibility over the lifespan was found to display differential trajectories between the gray and the white matter. In both cortical and subcortical white matter, an initial decrease followed by a subsequent increase of magnetic susceptibility was observed, which could be fitted by a Poisson curve. In the gray matter, including the cortical gray matter and the iron-rich deep nuclei, magnetic susceptibility displays a monotonic increase, which can be described with an exponential growth. The rate of change varies according to functional and anatomical regions of the brain. In another study, Argyridis et al assessed QSM and susceptibility anisotropy changes in mouse brains (62).

#### Imaging white matter microstructure and connectivity

Magnetic susceptibility of white matter is also anisotropic (8,63). To measure the anisotropy of magnetic susceptibility, the method of susceptibility tensor imaging (STI) has been used (8). A recent study also explored the capability of STI for tracking neuronal fibers in 3D in the mouse brain *ex vivo* (64). In large fiber bundles, the orientation determined by STI was found to be comparable to that by diffusion tensor imaging (DTI) of diffusion anisotropy. A recent study suggested that the susceptibility anisotropy in brain tissue mainly originates from myelin, and the cylindrically aligned lipid molecules in myelin are likely the main source of the MRI-determined susceptibility anisotropy (65).

However, this experimental procedure of STI requires rotating the object or the magnetic field. A p-space method was recently developed to measure higher-order frequency variations based on a single image acquisition without rotating the object or the magnet (48). This method utilized a multipole analysis of the MRI signal in a sub-voxel Fourier spectral space termed "p-space" for short. By sampling the p-space with pulsed field gradients or by shifted image reconstruction, a set of dipole and quadrupole susceptibility tensors can be measured. This p-space approach may provide a powerful method for studying tissue microstructure and brain connectivity *in vivo* and non-invasively.

## **DISCUSSION**

QSM is a deconvolution tool for analyzing MRI phase allowing the study of tissue magnetic susceptibilities (66-67) and their relations with organ structures, functions and diseases. QSM has shown a wide range of scientific and clinical applications (1,4,8-9,15,17,46,68-82). QSM is enabling quantitative functional connectivity and biophysical studies in neuroimaging, providing

an important tool for neuroscience and neuroengineering. Understanding, diagnosing, and treating neurological disorders can benefit from QSM measurements of white matter tracts and iron deposition. In the clinics, QSM can be applied for risk assessment and therapy monitoring by measuring iron deposition, demyelination, and connectivity disruption in neurodegenerative diseases, including Alzheimer's disease, Parkinson's disease, and multiple sclerosis; measuring oxygen level in ischemic stroke patients; measuring microbleeds in traumatic brain injury and in patients at risk of hemorrhages; differentiating calcification from iron deposition; and characterizing atherosclerotic plaque.

While QSM has shown to be valuable in a wide range of applications, it will benefit from further technical refinement. Existing methods need to be evaluated systematically under a variety of experimental conditions and quantitative susceptibility values need to achieve high degrees of consistency. The lack of an absolute measure of susceptibility may be a fundamental shortfall of these techniques that may ultimately limit the utility of susceptibility mapping if not addressed properly.

Quantifying magnetic susceptibility is also complicated by the existence of multiple sources to the frequency contrast. Some sources may not even be related to susceptibility. For example, both chemical shift and proton exchange affect the measured frequency. Partial volume effect and tissue compartmentalization may also render Eq. [1] inaccurate and incorrect. These confounding factors may make it difficult to interpret the physical and biological meanings of the "quantitative" susceptibility maps.

**CONCLUSION:** QSM has been quickly established as a high-resolution and quantitative imaging technique for the CNS. Image acquisition for QSM is relatively simple and is compatible with all modern MRI scanners. QSM algorithms are becoming increasingly mature. QSM is poised to become an important tool for studying the CNS.

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