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Current and future role of MRI in the diagnosis and prognosis of multiple sclerosis



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Summary

In the majority of cases, multiple sclerosis (MS) is characterized by reversible episodes of neurological dysfunction, often followed by irreversible clinical disability. Accurate diagnostic criteria and prognostic markers are critical to enable early diagnosis and correctly identify patients with MS at increased risk of disease progression. The 2017 McDonald diagnostic criteria, which include magnetic resonance imaging (MRI) as a fundamental paraclinical tool, show high sensitivity and accuracy for the diagnosis of MS allowing early diagnosis and treatment. However, their inappropriate application, especially in the context of atypical clinical presentations, may increase the risk of misdiagnosis. To further improve the diagnostic process, novel imaging markers are emerging, but rigorous validation and standardization is still needed before they can be incorporated into clinical practice. This Series article discusses the current role of MRI in the diagnosis and prognosis of MS, while examining promising MRI markers, which could serve as reliable predictors of subsequent disease progression, helping to optimize the management of individual patients with MS. We also explore the potential of new technologies, such as artificial intelligence and automated quantification tools, to support clinicians in the management of patients. Yet, to ensure consistency and improvement in the use of MRI in MS diagnosis and patient follow-up, it is essential that standardized brain and spinal cord MRI protocols are applied, and that interpretation of results is performed by qualified (neuro)radiologists in all countries.

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Introduction

The diagnosis of multiple sclerosis (MS) requires evidence of a symptomatic demyelinating syndrome with objective neurologic signs, the evaluation of clinical and paraclinical findings to demonstrate a focal demyelinating pathology affecting at least two distinct central nervous system (CNS) areas (i.e., dissemination in space [DIS]) occurring at separate times (i.e., dissemination in

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Key messages

- Magnetic resonance imaging (MRI) is crucial for diagnosing multiple sclerosis (MS) due to its ability to detect specific pathological processes with high accuracy.
- The 2017 McDonald diagnostic criteria accurately predict a second MS attack in patients with typical clinically isolated syndromes, even in pediatric patients, enabling early diagnosis and treatment. However, they should be used cautiously after ruling out other potential diagnoses.
- Emerging imaging markers like optic nerve involvement, cortical lesions, lesions with the central vein sign, and chronic active lesions may improve the accuracy of diagnostic criteria.
- Primary progressive MS is characterized by gradual progression, with diagnostic emphasis on cerebrospinal-fluid-specific oligoclonal bands and spinal cord lesions.
- Late-onset MS after 45–50 years may pose diagnostic challenges due to comorbidities and a more severe course.
- The number and location of white matter lesions in the brainstem and spinal cord may predict long-term outcomes in early phases of MS. Advanced MRI techniques, including cortical lesions, chronic active lesions, atrophy and brain microstructural abnormalities can further predict disability progression during the disease course.
- The 2021 MAGNIMS–CMSC–NAIMS international consensus recommendations offer updated guidelines on the utilization of MRI for diagnosing, prognosticating, and monitoring treatment in MS patients.

time [DIT]),¹ and the exclusion of alternative diagnoses.^{2–4} Magnetic resonance imaging (MRI) was formally included in the diagnostic algorithm for patients presenting with a clinically isolated syndrome (CIS) suggestive of MS in the 2001 McDonald criteria.⁵ These criteria, revised several times in the years up to the most recent revision in 2017,¹ rely on the application of standardized MRI protocols⁶ to assess the number, size, and location of brain and spinal cord lesions typical

of MS,² thus allowing earlier MS diagnosis and to start treatment.

Recently, uncommon groups within the MS population, such as primary progressive (PP) phenotypes, pediatric or late-onset MS, and radiologically isolated syndrome (RIS), have gained increased attention. Furthermore, new potential MRI features for MS diagnosis and prognostication have been proposed, including the assessment of optic nerve involvement, and the detection of cortical lesions (CLs), central vein sign (CVS) and chronic active lesions.

In this Series paper, we outline the current role of MRI in MS diagnosis and prognosis, discussing the potential application of emerging MRI markers and tools.

Basic principles of MRI techniques

Clinical MRI relies on the resonance signal of hydrogen (¹H) spins of the intra- and extracellular tissue water. It offers different sequences and techniques to visualize changes in the microstructural environment of these water compartments (Table 1). In MS, most pathological features (i.e., inflammation, edema, demyelination, and axonal loss) are associated with an increase in T₂ relaxation time. A T₂-weighted spin echo sequence therefore is the most sensitive approach to depict MS lesions as hyperintense signal intensities.² Improved conspicuity of T₂ lesions can be achieved with a fluid-attenuated inversion recovery sequence (FLAIR),² especially with three-dimensional (3D) acquisitions.⁷ FLAIR sequences suppress the cerebrospinal fluid (CSF) by an inversion radio frequency pulse followed by a delay time that corresponds to zero-magnetization of the CSF during T₁ relaxation.

Contrast	Contrast mechanism	Sequence	Relevance for MS
T ₂ -weighted	T ₂ (spin-spin or “transverse”) relaxation	(fast) spin echo or FLAIR, 2D or 3D	Detection of white matter abnormalities
T ₁ -weighted	T ₁ (spin-lattice or “longitudinal”) relaxation	2D (fast) spin echo at lower field strength, 3D gradient echo at higher field strengths (≥3 T)	Detection of acute contrast enhancing lesions, assessment of more severe tissue damage (“black holes” and atrophy)
DIR	Two consecutive inversion radiofrequency pulses act as a T ₁ -filter	2D or 3D (fast) spin echo	Detection of cortical lesions
Susceptibility-based imaging	Paramagnetic shifts due to iron deposits and deoxygenized blood	T ₂ *-weighted gradient echo sequences, with different acquisition modalities, such as 3D spoiled gradient echo or 3D echo planar imaging (low flip angle, echo time 20–30 ms)	Detection of central vein in MS lesions and iron rims
Magnetization transfer	Proportion of macromolecular bound protons and rate of exchange with tissue water	3D spoiled gradient echo (low flip angle, short echo time) sequence needs to be performed with and without MT saturation pulse	Reduced MT ratio is considered as a marker for demyelination
Diffusion weighted	Restriction of water mobility and orientational effects	Spin echo sequence with diffusion sensitizing gradient and echo planar readout	Sensitive for microstructural damage, higher diffusion models offer more specific assessment

Abbreviations: 2D, two-dimensional; 3D, three-dimensional; DIR, double inversion recovery; FLAIR, fluid-attenuated inversion recovery; MRI, magnetic resonance imaging; MS, multiple sclerosis; MT, magnetization transfer.

Table 1: Conventional and optional sequences for MRI in MS patients.

T_1 contrast is considered a more sensitive marker for demyelination and axonal loss since these result in T_1 prolongation.⁸ T_1 contrast can be achieved with a short echo time spin echo sequence and a repetition time that corresponds to T_1 of white matter (WM). However, at higher field strengths, it is advantageous to use gradient echoes with shorter repetition times. This permits true 3D imaging with improved T_1 contrast and high signal-to-noise ratio. 3D T_1 -weighted sequences with isotropic resolution are also crucial when assessing brain volume and atrophy. T_1 -weighted sequences are still the only way to reliably identify active lesions after gadolinium (Gd)-based contrast administration, which produces a strong paramagnetic moment leading to significant T_1 shortening. Consequently, active lesions where the blood–brain-barrier becomes leaky appear bright on post-Gd T_1 -weighted images. Whilst inversion recovery (IR) can suppress tissue with a specific T_1 relaxation time, double inversion recovery (DIR) is used to highlight a specific tissue while suppressing all other magnetization. The DIR sequence provides excellent contrast for the cortex and therefore was introduced to detect cortical MS lesions with improved sensitivity. The DIR sequence is usually performed with fast spin echo readout and provides the best sensitivity when performed in 3D acquisition mode.⁹

Magnetic susceptibility reflects the ability of tissue to become magnetized when placed in magnetic field. Brain tissue is weakly diamagnetic (=non magnetizable) which corresponds to the magnetic properties of water as its main component. In contrast, iron can induce paramagnetic shifts and accentuate MS related features, including lesions with central veins¹⁰ and iron rims, and iron accumulation in the basal ganglia.¹¹ These features can be detected with susceptibility-based imaging, which is performed with T_2^* -weighted gradient echo sequences, with different possible acquisition modalities, such as 3D spoiled gradient echo or 3D echo planar imaging.¹² Because susceptibility is encoded within the phase image, susceptibility-based imaging combines magnitude with phase. High spatial resolution and good signal-to-noise ratio are best achieved in 3D acquisition mode and are essential for central vein and iron rim detection. Among susceptibility-based imaging, quantitative susceptibility mapping (QSM) includes imaging techniques that allow to quantify the absolute concentrations of specific elements including iron, calcium, and myelin.¹³ This is achieved by assessing their alterations in local magnetic susceptibility. QSM may offer a better contrast-to-noise ratio for specific tissues and structures when compared to T_2^* -weighted magnitude images.¹³

Magnetization transfer (MT) imaging and diffusion weighted imaging (DWI) are optional sequences that provide quantitative measures of microstructural tissue changes. MT imaging is based on the magnetization exchange between ^1H spins bound to macromolecules

(including the myelin's proteins and lipids and also other macromolecules) and surrounding tissue water. When using a spoiled gradient echo sequence that is performed with and without an off-resonant radio-frequency pulse that can saturate (null) the longitudinal magnetization of the bound protons, a MT ratio (MTR) can be derived from these two measurements. The MTR is specific for myelin content,¹⁴ even though it correlates with other pathological substrates, such as axonal density.^{15,16} The mobility of intra- and extracellular tissue water, driven by Brownian motion, is restricted by cellular structures leading to anisotropic diffusion, particularly in the intracellular cytoplasm of the axons. DWI can pick up alterations in water mobility, and diffusion tensor imaging (DTI) is a fitting model that can assess orientational features such as fiber orientation and the degree of diffusion anisotropy. Complex diffusion models are also able to assess the diffusion properties for intra- and extra cellular water separately.¹⁷ DWI is based on spin echo sequences with diffusion sensitizing gradients and a segmented or “single shot” echo planar readout.¹⁷ This type of readout is necessary to limit the impact of physiological and unintentional motion for this highly motion sensitive sequence.

Diagnostic criteria of MS

In the 2017 revision of the McDonald MRI criteria,¹ DIS can be demonstrated by ≥ 1 T_2 -hyperintense lesions in ≥ 2 of 4 typical areas of the CNS (Table 2, Fig. 1). DIT can be demonstrated by a simultaneous presence of Gd-enhancing and non-enhancing lesions at any time or a new T_2 -hyperintense and/or Gd-enhancing lesion on follow-up MRI (Table 2, Fig. 1).¹ The modifications introduced in this last revision¹ included the removal of any distinction between symptomatic and asymptomatic lesions, and the combination of cortical lesions and juxtacortical lesions to expand the concept of juxtacortical involvement. Furthermore, in patients with a typical CIS suggestive of MS fulfilling clinical or radiological DIS, the presence of CSF-specific oligoclonal bands (OCBs) supports DIT (Table 2, Fig. 1).¹

The 2017 McDonald criteria exhibit higher sensitivity, lower specificity and similar accuracy compared with the previous 2010 revision of the criteria in predicting the second clinical attack (i.e., clinically definite [CD] MS) both in adults and pediatric CIS patients.^{18–23} Moreover, the 2017 McDonald criteria substantially shorten time to MS diagnosis, with more CIS patients being diagnosed with MS already at the time of the first clinical manifestation and with a single MRI scan.^{18–20,24} In 785 CIS patients, the 2017 McDonald criteria were found to reduce the median time to diagnose MS by 4.6 years in comparison to the clinical criterion alone (i.e., Poser criteria).²⁰ Additionally, they allowed to diagnose MS 10 months before than the 2010 McDonald criteria (3.2 vs 13.0 months).²⁰

Clinical presentation	Findings	Additional data needed for MS diagnosis
Relapse-onset (CIS)	≥2 clinical relapses and objective clinical evidence of ≥2 lesions; OR ≥2 clinical relapses and objective clinical evidence of 1 lesion and clear-cut historical evidence of a prior relapse involving a lesion in a distinct anatomic location OR ≥2 clinical relapses and objective clinical evidence of 1 lesion 1 clinical relapse and objective clinical evidence of 2 or more lesions 1 clinical relapse and objective clinical evidence of 1 lesion	None DIS, demonstrated by: A second clinical relapse implicating a different CNS site OR demonstration of DIS by MRI (Fig. 1) DIT, demonstrated by: A second clinical relapse OR demonstration of DIT by MRI (Fig. 1) Demonstration of CSF-specific OCBs^a DIS and DIT, demonstrated by: For DIS: A second clinical relapse implicating a different CNS site OR demonstration of DIS by MRI (Fig. 1) For DIT: A second clinical relapse OR Demonstration of DIT by MRI (Fig. 1) Demonstration of CSF-specific OCBs^a
Progressive-onset (PPMS)	One year of disability progression (retrospectively or prospectively determined) independent of clinical relapse	≥2 out of 3 of the following criteria: • ≥1 T₂-hyperintense lesions in ≥1 areas in the brain characteristic of MS (periventricular, cortical/juxtacortical or infratentorial) with no distinction between symptomatic or asymptomatic lesions • ≥2 T₂-hyperintense WM lesions in the spinal cord with no distinction between symptomatic or asymptomatic lesions • Presence of CSF-specific OCBs

Abbreviations: CIS, clinically isolated syndrome; CNS, central nervous system; DIS, dissemination in space; DIT, dissemination in time; MRI, magnetic resonance imaging; MS, multiple sclerosis; OCB, oligoclonal band; PPMS, primary progressive multiple sclerosis; WM, white matter. ^aIn patients with a typical CIS suggestive of MS fulfilling DIS criteria and with no better explanation for the clinical presentation, the demonstration of CSF-specific OCBs substitutes for the requirement of fulfilling DIT, thus allowing a diagnosis of MS, even if the clinical and MRI findings do not meet the criteria for DIT.

Table 2: The 2017 McDonald criteria for diagnosis of MS.

An early diagnosis allows starting earlier commencement of disease-modifying therapies (DMTs), limiting the accumulation of irreversible clinical disability. In 1174 CIS patients,²⁵ the median time from CIS to treatment initiation reduced by 82% from the Poser (i.e., clinical criterion alone)²⁶ to the 2017 McDonald criteria¹ periods and this was associated with a significantly lower risk of reaching an Expanded Disability Status Scale (EDSS) score ≥3.0 for patients diagnosed with the most recent diagnostic criteria.²⁵

However, the inappropriate application of MRI diagnostic criteria, especially in the context of atypical clinical presentations, may increase the risk of misdiagnosis.^{2,27–29} To minimize misdiagnosis, standardized MRI protocols,⁶ careful determination of which imaging patterns constitute ‘typical’ or ‘atypical’ MS features and guidelines for a proper interpretation of imaging findings⁷ are crucial.

Careful exclusion of other neurological disorders is essential in the MS diagnostic work-up since the range of diseases mimicking clinical manifestations and MRI features of MS is wide.^{2–4} A few MS mimicks, such as neuromyelitis optica spectrum disorder (NMOSD)³⁰ and myelin oligodendrocyte glycoprotein-associated disease

(MOGAD)³¹ have been more accurately characterized in recent years.^{2–4} Moreover, small-vessel disease (SVD), a condition associated with aging and frequently observed in smokers, and in patients with cerebrovascular risk factors (e.g., hypertension, diabetes, dyslipidemia, etc.), may represent the most common differential diagnosis for brain WM hyperintensities especially in older patients who tend to have a greater prevalence of underlying comorbidities.³²

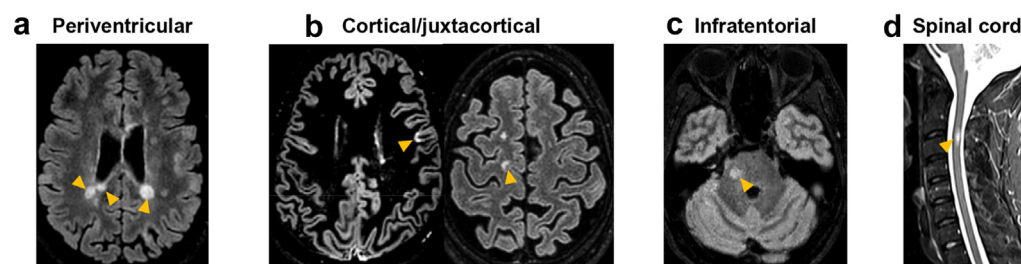
Promising MRI measures for MS diagnosis

Recently, more distinctive MRI features have been proposed to improve the specificity and accuracy of MS diagnostic work-up, including CLs, the CVS, and chronic active lesions.

CLs

Cortical involvement is an extremely specific hallmark of MS and is highly clinically relevant (Fig. 2a). CLs are present from the early phases of MS, and they accumulate over time.³³ Several studies confirmed their role in the diagnostic work-up,^{34,35} especially in differentiating MS from other MS mimics,^{2,36} and supported their

DIS



DIT

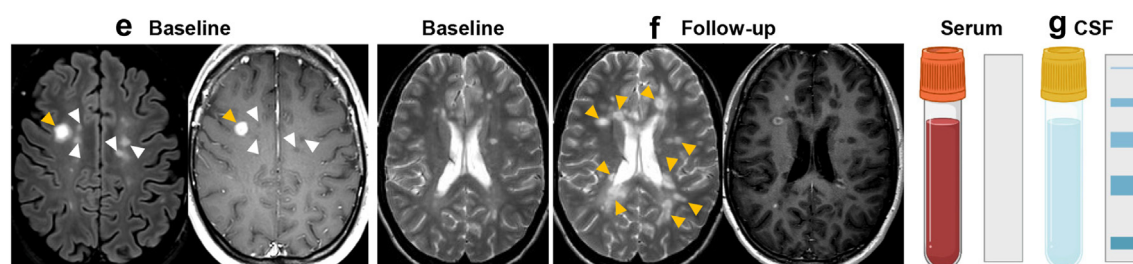


Fig. 1: 2017 McDonald criteria for demonstration of DIS and DIT in patients with a CIS suggestive of MS. Typical MRI examples (orange arrowheads) of (a) periventricular, (b) cortical/juxtacortical, (c) infratentorial and (d) spinal cord MS lesions. DIS can be demonstrated by ≥ 1 T₂-hyperintense lesions in ≥ 2 of 4 typical areas of the central nervous system (i.e., periventricular, cortical/juxtacortical, infratentorial or spinal cord). DIT can be demonstrated by (e) a simultaneous presence of Gd-enhancing (orange arrowhead) and non-enhancing (white arrowheads) lesions at any time; (f) a new T₂-hyperintense and/or Gd-enhancing lesion on follow-up MRI (orange arrowheads), with reference to a baseline scan, irrespective of the timing of the baseline MRI. For the definition of both DIS and DIT, the distinction between symptomatic and asymptomatic lesions has been removed in the 2017 revision of the McDonald criteria. (g) In patients with a typical CIS suggestive of MS fulfilling DIS criteria and with no better explanation for the clinical presentation, the demonstration of CSF-specific OCBs, i.e., not present in the serum but only in the CSF, substitutes for the requirement of fulfilling DIT, thus allowing a diagnosis of MS, even if the clinical and MRI findings do not meet the criteria for DIT. Abbreviations: CIS, clinically isolated syndrome; CSF, cerebrospinal fluid; DIS, dissemination in space; DIT, dissemination in time; Gd, gadolinium; MRI, magnetic resonance imaging; MS, multiple sclerosis.

inclusion in the recent revision of the diagnostic criteria.¹ Imaging of CLs, especially subpial lesions, is technically challenging, mainly because of their characteristics, size and location. Many CLs are still not detected by any MRI technique,³⁷ although 7.0 T MRI detects more CLs with respect to the best performing 3.0 T MRI,³⁸ and imaging protocols including DIR, phase-sensitive inversion recovery (PSIR), magnetization prepared rapid gradient echo (MPRAGE), magnetization prepared two rapid acquisition gradient echo (MP2RAGE) and fluid and white matter suppression (FLAWS) sequences may substantially improve their *in vivo* detection.^{33,39,40}

CVS

Perivascular demyelination is a distinctive pathological feature that is specific of demyelinating disorders of the CNS, especially MS.⁴¹ The association between brain WM venules and MS lesions (i.e., “CVS”) can be efficiently visualized in susceptibility-based MRI at varying MRI field strengths and across scanner manufacturers,

taking advantage of the T₂*-shortening effect of deoxy-hemoglobin,⁴² with improved detection after Gd-based contrast (Fig. 2b).^{43,44} The presence of the CVS may improve the accuracy of MS diagnosis and a threshold of WM lesions showing the CVS between 35% and 50% has been established as the best cutoff to separate MS and non-MS mimics, including SVD, migraine, NMOSD, MOGAD, and other inflammatory CNS disorders.^{36,43,45–47} To facilitate their assessment, a few studies proposed a threshold of 3 or 6 CVS-positive lesions, which has shown a high sensitivity and good specificity for MS diagnosis.^{47,48}

Paramagnetic rim lesions

Histopathologically, several MS lesions show a smouldering inflammatory profile which continues after the acute inflammatory phase. Chronic active lesions typically exhibit a combination of ongoing myelin breakdown, remyelination attempts, and infiltrating immune cells, such as lymphocytes and macrophages.⁴⁹ They can

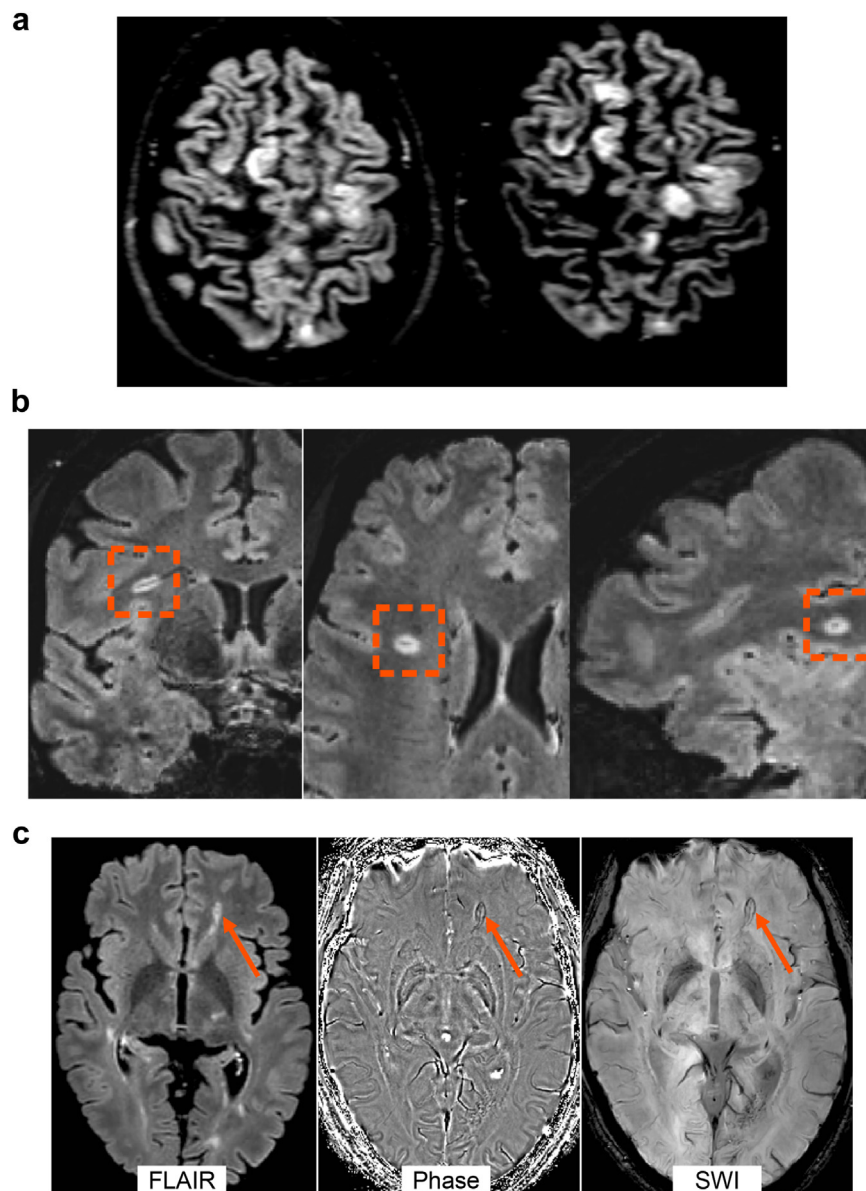


Fig. 2: Examples of cortical lesions, the central vein sign and chronic active lesions. (a) Several cortical lesions are visible in a multiple sclerosis patient on double inversion recovery sequence at 3.0 T. (b) A white matter lesion showing the central vein sign (orange dotted rectangle) on post-contrast T₂-FLAIR* sequence at 3.0 T. (c) Among the T₂-hyperintense white matter lesion visible on T₂-FLAIR, one lesion shows an hypointense rim on phase image and SWI sequence at 3.0 T (orange arrow). Abbreviations: FLAIR, fluid-attenuated inversion recovery; SWI, susceptibility-weighted imaging.

be visualized with susceptibility-based imaging as lesions showing an hypointense rim (i.e., paramagnetic rim lesions [PRLs]) since they are usually surrounded by activated microglia, which are rich in iron (Fig. 2c).⁴⁶ PRLs are specific to MS and their assessment can potentially improve the differentiation of MS from other conditions. They have been described in patients with CIS suggestive of MS,⁵⁰ but not in MS mimics, including NMOSD, Susac syndrome, and SVD.^{50–52}

The presence of at least one PRL was found the optimal cut-off to distinguish CIS/MS patients from MS mimickers and old healthy subjects with a high specificity (99.7%) but low sensitivity (24.0%) and area under the curve [AUC] = 0.71). Of note, the presence of at least one PRL or at least four lesions with CVS improved the sensitivity (57.9%) and AUC (0.83), preserving the specificity (90.6%).⁵² Among CIS patients, fulfilling the “CVS” criteria (≥ 3 lesions or 40% threshold of lesions

with the CVS) and/or having ≥ 1 chronic active lesions predicted MS conversion within three years with good sensitivity (up to 90.4%) and specificity (up to 85.7%).⁵⁰ Notably, none of the patients who remained with a CIS diagnosis after three years exhibited any chronic active lesion.⁵⁰ QSM has also been applied to identify PRLs. Recent studies showed that QSM may be superior to phase and susceptibility-weighted images in detecting PRLs,⁵³ with a prevalence of PRLs ranging from 4.2% to 10.6%.^{53–56}

Optic nerve involvement: contribution to diagnosis and prognosis

The diagnosis of optic neuritis is typically made after a thorough clinical history and examination. Optic nerve MRI (ON-MRI) can detect T₂-hyperintense lesions in the optic nerve of MS patients, even in the absence of optic neuritis history. A recent position paper suggests the need to establish the diagnosis of “definite” optic neuritis with paraclinical tests (including ON-MRI among others).⁵⁷ However, while ON-MRI will be of value to rule out other causes of optic neuropathy (e.g., a compressive lesion), the visualization of an optic nerve lesion might not be specific of an inflammatory aetiology of optic neuropathy.^{6,58–60} Thus ON-MRI should be evaluated together with brain and spinal cord MRI findings to help with the differential diagnosis.

The recommended optic nerve protocol includes axial and coronal fat-suppressed T₂-weighted or short tau inversion recovery (STIR), and fat-suppressed contrast-enhanced T₁-weighted sequences.⁶ Although higher rates of optic nerve lesion detection have been reported with 3D DIR sequences, especially in asymptomatic eyes,⁶¹ this superiority has only been

evaluated in 3.0 T scans. Studies focusing on acute optic neuritis patients report rates of optic nerve enhancement on contrast-enhanced T₁-weighted sequences from 34% to 78% (Fig. 3), depending on time elapsed since the onset of optic neuritis, and corticosteroid use. Importantly, in the acute phase, lesion length (but not Gd-enhancement characteristics) was associated with poorer visual recovery 12 months after visual symptom onset.^{62,63} Moreover, optic nerve lesion length at onset was associated with the degree of retinal damage, as measured by optical coherence tomography (OCT) parameters.⁶³

Despite its relevance, the optic nerve has never been considered in the McDonald criteria for MS diagnosis which means that the threshold for MS diagnosis is different for patients presenting with optic neuritis than for patients experiencing other classical CIS symptoms. ON-MRI has been found to detect optic nerve lesions in a high proportion of CIS patients (40.2%–52.3%), especially if they present with an ON (72.7%–100%).^{64,65} Since the publication of the last revision of the diagnostic criteria,¹ different studies have evaluated the diagnostic performance of adding the optic nerve as a new region to fulfil DIS criteria.^{65–68} Optic nerve assessment was defined either by clinical grounds, visual evoked potentials (VEP), OCT, and/or ON-MRI. All these studies demonstrated that fulfilment of modified DIS criteria (including optic nerve information and using a cut-off of 2 out of 5 typical regions) slightly improved the diagnostic performance of current 2017 DIS criteria by increasing sensitivity (especially in patients with optic neuritis) with different degrees of impact on specificity (either no impact or a small drop in specificity that improves when combining modified DIS criteria with DIT).

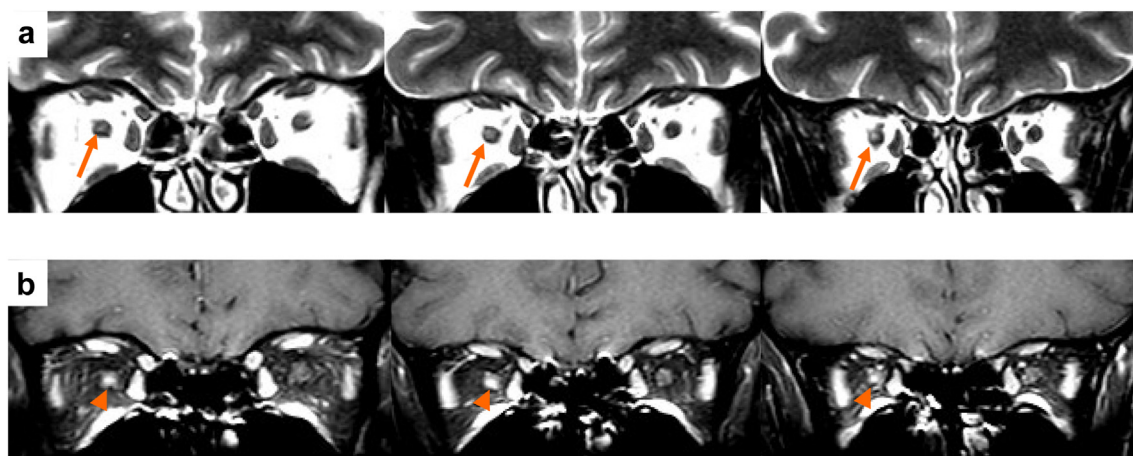


Fig. 3: Example of lesions of the optic nerve in multiple sclerosis. (a) On coronal fat-suppressed T₂-weighted sequence, the posterior endo-orbital portion of the right optic nerve is enlarged and shows a hyperintensity (orange arrows), with (b) a focal gadolinium enhancement (orange arrowhead) on post-contrast T₁-weighted sequence.

Spinal cord involvement: contribution to diagnosis and prognosis

Imaging of the spinal cord in suspected MS patients is important for diagnostic and prognostic purposes as cord lesions are highly specific for MS and finding multiple cord lesions unfavorably affects the disease course. Cord imaging, however, comes with technical challenges due to its small diameter, elongated course and artefacts from CSF pulsation and breathing.⁶⁹ Dedicated surface coils, pre-saturation pulses and dual-contrast pulse-sequences (including proton-density, STIR) can address these challenges.

Short segment cord lesions are typical of MS, thus spinal cord involvement has been included as one of the 4 topographies for assessment of DIS. Spinal cord lesions tend to involve the peripheral WM in the axial plane, though additional grey matter (GM) involvement is not uncommon. However, isolated GM involvement should prompt consideration of NMOSD or MOGAD. New/active lesions may enhance following Gd administration and be associated with some surrounding edema and swelling.

Finding multiple (new) cord lesions not only increases the chances of developing further relapses (and CDMS) but is also an unfavorable prognostic marker and strongly increases the likelihood of developing disability⁷⁰ and secondary progressive (SP) MS.⁷¹ When there are multiple lesions, they can become confluent and be associated with cord atrophy. Cord atrophy may also develop independent of (visible) cord lesions and especially GM cord atrophy is prognostically unfavorable.⁷²

Conversely, there is less evidence that serial cord imaging is helpful to monitor treatment and disease evolution. This is in part due to the technical challenges of cord imaging (which often does not include whole-cord axial slices) making it challenging to detect new lesions with a high degree of certainty. The significant time-investment needed for good-quality cord imaging is offset by the fact that brain imaging is faster and more robust, while being much more likely to reveal new lesions. Accordingly, at present, it is not recommended to routinely perform spinal cord imaging to monitor MS treatment.⁶

Special situations: PPMS, age extremes and RIS

MS can be diagnosed in certain uncommon situations, with their own challenges, which merit discussion.

PPMS

About 10–15% of MS cases exhibit gradual clinical progression from onset and are labelled as PPMS. Interestingly, a Swedish cohort study reported a declining rate of PPMS diagnosis as a proportion of MS diagnosis over the decades (from 19% in the 1980s to 2% in the last decade).⁷³ PPMS diagnostic confirmation

differs slightly from relapsing-remitting (RR) MS with emphasis on the presence of CSF-specific OCBs and ≥ 2 spinal cord lesions (Table 2).¹ However, a recent study with 117 PPMS patients showed that sensitivity (89% vs 85%), specificity (100% vs 100%) and accuracy (91% vs 87%) of the 2017 and 2010 McDonald criteria for progressive- and relapse-onset MS were similar, suggesting that a single set of MRI criteria for all MS patients may be applied in the future.⁷⁴

These considerations arose as there is felt to be a greater risk of misdiagnosing PPMS than RRMS, given the relative non-specificity of its clinical onset. PPMS may represent one extreme of a pathophysiological spectrum in MS that is characterized by a more limited blood–brain barrier permeability and acute inflammatory activity and dominated by neurodegenerative processes secondary to a compartmentalized chronic inflammation, mitochondrial dysfunction, and oxidative stress.^{75,76} Other factors may also influence pathophysiology, e.g., metabolic and microstructural abnormalities without extensive atrophy have been observed in the normal-appearing spinal cord.⁷⁷ The spine is also a sensitive site of pathological change whose atrophy can predict disability progression⁷⁸ and is faster than RRMS.⁷⁹ Other features associated with higher rates of disability progression include higher early GM diffusivity, higher early disability change, new T₁-hypointense lesions, relapses (although rare), higher age, female sex.^{80,81} Lesion location at presentation, particularly with spinal cord or brainstem involvement also predicts greater disability progression.⁸² Median time to reach EDSS 6.0 occurs around 8–10 years after onset.^{81,83} The disability progression rate is similar to SPMS after EDSS 4.0 is reached.⁸⁴

Pediatric-onset MS (POMS)

POMS (MS onset before 18 years of age) constitutes 3–5% of the MS population^{85,86} and is rare with an estimated global incidence of 0.87 per 100,000 per year in a recent meta-analysis.⁸⁵ Diagnostic criteria, developed and validated in adults with MS, can be used to diagnose POMS, although caution is advised for acute disseminated encephalomyelitis (ADEM)-like presentations and children under 11 years of age.^{1,86} This is due to the higher prevalence of MOGAD and monophasic acquired demyelinating syndromes (ADS) in these groups. The 2017 McDonald revision performed very well when applied to a pediatric cohort, with periventricular and T₁-hypointense lesions helping to distinguish between monophasic ADS and POMS.²¹ POMS exhibits a RR course (98%)⁸⁷ with higher relapse rate and brain lesion accumulation observed early on, than adults with MS.⁸⁸ POMS took longer than adult MS to reach disability milestones (adjusted-hazard ratio [HR] = 0.77) after onset but did so at an earlier age (adjusted-HR = 4–5).⁸⁹ Overall median time to reach EDSS 4.0 is around 30 years

after onset and to reach EDSS 6.0 is about 40 years,^{89,90} but this is influenced by high-efficacy DMTs which delay progression⁹⁰ and show comparable efficacy to adults.⁹¹

Late-onset MS (LOMS)

Approximately 3–5% of MS patients present their initial symptoms after the age of 50 years, referred to as LOMS.^{92–94} The majority of these patients show a monosymptomatic disease onset, especially with motor or cerebellar impairment.^{92–97} Compared to MS patients with a clinical onset at younger age, LOMS is characterized by a lower frequency of clinical relapses and MRI inflammatory activity,⁹⁵ a higher proportion of progressive MS forms (up to 50%), a more severe disease course and a faster disease progression, with a significantly shorter time to reach clinically relevant milestones of disability (EDSS = 3.0 and EDSS = 6.0).^{92–97} These unusual clinical features may be due to brain aging effects (e.g., lower neuroplasticity, greater oxidative stress, reduced repair/remyelination, vascular comorbidities) and immunosenescence phenomena with a lower role for the adaptive relative to the innate immune system in driving MS pathology.⁹⁸

Since MS-related clinical features in LOMS can be potentially confused with symptoms of other diseases more frequently occurring at older age (e.g., SVD), the differential diagnosis in this patient population may be particularly challenging, with high risk of wrong management plans and late treatment.^{92–95} Accordingly, although the 2017 McDonald criteria can be applied in this population, careful attention to alternative diagnoses and particularly comorbidities is necessary and further studies are needed to validate these criteria in LOMS.¹

Of note, LOMS is not as responsive to DMTs as adult MS or POMS.⁹⁹ Despite this, DMT withdrawal can still result in faster disability worsening in LOMS, indicating the need for further research in this area.¹⁰⁰

RIS

With increasing availability and use of MRI, incidental T₂-hyperintense WM lesions are increasingly identified on brain and spinal cord imaging.^{1,101} The term RIS refers to individuals who have no history of clinical symptoms typical of MS but have CNS WM lesions that are highly suggestive of inflammatory demyelination based on their size, number, shape, and location, possibly reflecting individuals with subclinical and prodromal stages of MS.¹⁰¹ Incidence of RIS is uncommon (0.8 cases of RIS per 100,000 person-years in Sweden), but approximately 51% of individuals will develop clinical symptoms of MS within 10 years after being deemed RIS, most often with a RR course.¹⁰¹

Younger age (<35 years) at the time of RIS identification, male sex, CSF-restricted OCBs or elevated CSF

immunoglobulin G (IgG) index, abnormal visual evoked potentials, higher serum neurofilament light chain levels, as well as infratentorial, spinal cord or Gd-enhancing lesions on the index MRI were predictors of a first clinical event at 5 and 10 years, especially in the presence of two or more risk factors,^{101–105} whereas the presence of a higher number of spinal cord lesions is associated with a higher risk of a PPMS course.^{104,106}

Diagnostic criteria for RIS were first proposed in 2009 and were defined by the presence of T₂-hyperintense, ovoid, 3 mm in length or more, well-defined asymptomatic CNS WM lesions that must fulfill at least three of the four following features: ≥ 1 Gd-enhancing lesion or ≥ 9 T₂-hyperintense lesions; ≥ 1 infratentorial lesion; ≥ 1 juxtacortical lesion; and ≥ 3 periventricular lesions) and should not be related to other diseases.¹⁰⁷ In 2017, it was suggested that the 2017 McDonald criteria for DIS and DIT in MS could be used in RIS.^{1,108} More recently, a validation study suggested that when the 2009 RIS criteria are not fulfilled, an individual could be classed as having RIS if they have one or two DIS locations associated with two of the three following features: ≥ 1 spinal cord lesions, presence of CSF-specific OCBs, or DIT (i.e., new T₂-hyperintense or Gd-enhancing lesions) on the follow-up MRI.¹⁰⁹

Early predictors of long-term outcome

Conventional MRI measures

Conventional MRI measures including T₂-hyperintense WM lesion number, location and activity are helpful in establishing long-term prognosis (Fig. 4). A higher number of brain T₂-hyperintense WM lesions in patients with CIS/early relapsing MS increases the risk of later physical disability and SP disease course, although the relationship is only modest.^{110,111} Lesion location may offer greater prognostic information. A higher number of infratentorial lesions in patients with CIS/early relapsing MS predicts long-term disability worsening.^{112–114} At disease onset, spinal cord MRI can add significant additional prognostic information to brain MRI findings since the evidence of spinal cord lesions has consistently been found to increase the risk of long-term physical disability.^{71,115,116} Lesion activity, either the number of Gd-enhancing lesions or short-term changes in T₂-hyperintense WM lesion number and load during the first 1–5 years of the disease, also predicts long-term physical disability,^{71,110} and possibly cognitive performance.^{71,117–119} Considering all available conventional MRI measures together may improve patients' prognosis and treatment decisions. One prospective study found that among CIS patients with no Gd-enhancing lesions and no spinal cord lesions at presentation the estimated risk of SPMS 15 years later was ~5%, compared with ~45% in those with at least one spinal cord lesion and ≥ 2 Gd-enhancing lesions.⁷¹

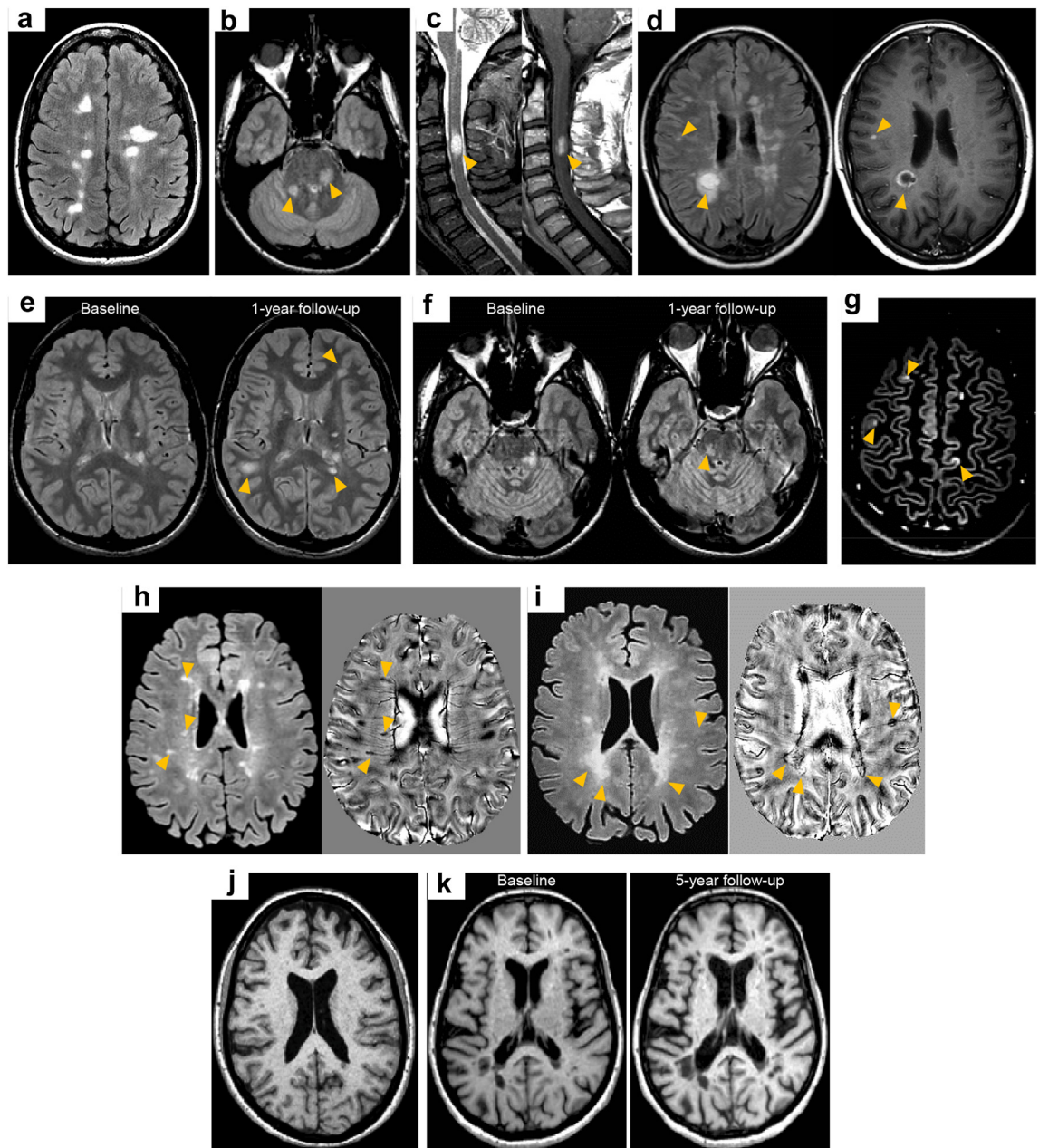


Fig. 4: Summary of early MRI predictors of subsequent worse disease disability progression and evolution to secondary progressive multiple sclerosis at disease onset. (a) The number and volume of brain T₂-hyperintense white matter lesions; (b) ≥ 1 infratentorial lesion (orange arrowheads); (c) ≥ 1 spinal cord lesion at baseline (orange arrowheads); (d) ≥ 1 gadolinium-enhancing lesions at baseline (orange arrowheads); (e) increase of T₂-hyperintense brain white matter lesion number and volume (especially of deep white matter) during the first 1–5 years; (f) ≥ 1 infratentorial T₂-hyperintense white matter lesions within 1–3 years (orange arrowheads); (g) ≥ 1 cortical lesion at baseline (orange arrowheads) on double inversion recovery sequence. Further promising early MRI markers are h) the presence of lesions with the “central vein sign” on susceptibility-based MRI (orange arrowheads); (i) the presence of paramagnetic rim lesions on susceptibility-based MRI (orange arrowheads) (j) presence of substantial brain volume loss at disease onset and/or (k) a faster rate of brain atrophy in the first years of the disease.

Although brain T₂-hyperintense WM lesion volume progressively increases in untreated MS patients by 5–10% per year,¹²⁰ the correlations between total and new brain T₂-hyperintense lesions and disability

worsening are limited in MS patients with long-standing disease. Limited data regarding the association between new spinal cord lesions and disability progression are also currently available. However, recent studies showed

that the presence of new T₂-hyperintense lesions both in the brain and spinal cord was significantly associated with an increased risk of disability worsening when compared to the absence of new lesions and/or presence of new brain T₂-hyperintense WM lesions alone (HR = 2.31 and 1.4).^{121,122}

Advanced MRI techniques

Advanced MRI techniques may further contribute in predicting long-term outcome in the earliest MS phases. CLs have been suggested as one of the primary neuropathological substrates of disease progression, including progression of both cognitive impairment and physical disability.^{118,123,124} The number of CLs at disease onset may predict disability progression and conversion to SPMS after 7 years,¹²³ as well as cognitive impairment after 20 years.¹¹⁸ While no MS patients without CLs at baseline developed SPMS and only a few (1.8%) reached an EDSS score ≥ 4.0 at last follow-up, the risk of SPMS conversion was progressively higher with an increased number of baseline CLs (HR = 2.16, 4.79, and 12.3 for 2, 5, and 7 CLs, respectively), and time to progression was earlier (median time = 6.5 years in MS patients with ≥ 7 CLs, on average 4 years earlier than those with 1–3 CLs).¹²³ Moreover, the presence of at least 3 CLs at baseline was associated with a higher risk of cognitive impairment at 20 years (odds ratio = 3.7, AUC = 0.67, specificity = 75%, sensitivity = 55%).¹¹⁸ On the other hand, after 15 years of the disease, patients who still demonstrated a moderate disability without cognitive impairment showed a remarkably lower CL number and volume increase compared to early RRMS.^{123,125} CLs have a prognostic role also in MS patients with longer disease duration since their number and volume predict disease worsening¹²⁶ and their accumulation are associated with disability progression in both relapse-onset and PPMS patients.^{126–129}

PRLs are not only relevant during the diagnostic process but also serve as markers of smouldering activity being associated with more severe clinical disability, progression of brain atrophy and disability.^{51,130} MS patients with ≥ 4 PRLs had more severe disability, a faster disease progression, with an earlier development of motor and cognitive impairment, and a more severe brain volume loss, thus suggesting a more aggressive disease course.^{51,130} Moreover, PRL volume was one of the most relevant predictors of EDSS worsening after 3 years.¹³¹ Accordingly, monitoring these lesions over time can provide valuable information on disease progression, with the potential to guide treatment decisions and help assess response to treatment.^{130–132}

Chronic active lesions slowly increase in size over time (i.e., slowly-expanding lesions [SEL]), thus they have been identified among those WM lesions showing a linear and progressive expansion over long-enough periods of time on conventional T₁- and T₂-weighted sequences.^{75,133–135} The prevalence of SELs seems similar

in PPMS (69.0%–73.2%)^{75,133} and relapse-onset MS patients (59.6%–98.6%).^{133,136–138} Microstructural tissue damage, as quantified by lower MTR, lower normalized T₁ intensity and higher radial diffusivity, is greater in SELs than in T₂-hyperintense lesions not expanding over time.^{75,133,135,136,138} Moreover, SEL number and volume and their intrinsic microstructural tissue abnormalities have been shown to predict disability progression in relapse-onset MS and PPMS.^{75,134,136,137,139} However, at present, the relevance of SELs in the diagnostic work-up of MS as well as their prognostic role at disease onset have not been explored yet.

Interestingly, SELs and PRLs overlap, but only partially, suggesting that these lesions may represent distinct stages of MS pathology within chronic active lesions.¹⁴⁰

More severe brain microstructural abnormalities and volume loss at disease onset and a faster rate of brain atrophy in the first years of the disease may also predict long-term MS evolution and cognitive decline in relapse-onset MS. Change within the first 5 years of disease in medullary width significantly predicted disability worsening, SPMS conversion or MS-related death after 30 years, whereas third ventricular width significantly predicted disability progression.¹⁴¹ Baseline normal-appearing brain tissue MTR and brain parenchymal fraction and 2-year change in ventricular fraction significantly predicted changes in memory functions after 7 years,¹¹⁷ whereas a faster rate of brain atrophy in the first year predicted cognitive performance after 5 years.¹¹⁹ Brain and spinal cord volume and atrophy are also useful prognostic markers in more advanced phases of the disease.¹⁴² In particular, cerebral GM volume loss is an important predictor of long-term prognosis.¹⁴² In relapse-onset MS, baseline GM volume predicted EDSS worsening after 13 years,¹⁴³ whereas a model including GM mean diffusivity and GM atrophy predicted 15-year disability in PPMS patients.⁸⁰ Spinal cord volume loss progresses at a faster rate in MS patients experiencing disability worsening than those who do not,¹⁴² and it predicts disability worsening.⁷⁰

MRI to select treatment and predict treatment response

Treatment selection for each MS patient is typically influenced by many factors, including demographic features (i.e., sex and age), clinical characteristics (severity of clinical relapses, higher relapse rate, brain-stem or spinal cord onset, higher disability or a progressive disease course, comorbidities, etc.), and the presence of negative MRI prognostic factors that have been previously discussed.¹⁴⁴ Accordingly, high efficacy disease-modifying therapies may represent the appropriate therapeutic approach in the presence from the earliest phases of MS of negative prognostic factors associated with long-term disease progression.^{144,145}

MRI represents also a fundamental paraclinical tool to monitor and predict treatment response. MRI is highly sensitive to occurrence of Gd-enhancing lesions or new T₂-hyperintense lesions forming over time that represent a valid surrogate marker of clinical relapses.¹⁴⁶ Moreover, MRI can quantify the amount of neurodegeneration (demonstrated by atrophy of the brain and spinal cord) that represents a surrogate marker of irreversible disability progression.¹⁴⁷

The evidence of ongoing inflammatory activity detected with MRI may predict subsequent disease evolution. Post-hoc analyses of randomized clinical trials and observational studies have shown that the occurrence of MRI activity in the first 6–12 months after treatment start is associated with higher risks of clinical relapses or disability worsening over the short or medium-term period, thus suggesting for a possible treatment change.¹⁴⁸ Recently, composite outcome measures have been proposed to incorporate both clinical (relapses and disability worsening) and MRI measures (new T₂-hyperintense and Gd-enhancing lesions) to better predict treatment response and disease evolution.^{148,149} These include the Rio score,¹⁵⁰ the modified Rio score,¹⁵¹ the MAGNIMS score,¹⁵² and no evidence of disease activity 3¹⁵³ (NEDA-3). A subsequent iteration of NEDA-3 (i.e., NEDA-4) requires also the absence of brain atrophy, defined according to an annual brain volume loss threshold of 0.4%.¹⁵⁴ Thanks to the combination of clinically-relevant markers, these composite scores may be more stringent regarding acceptable levels of disease activity while on treatment and may predict medium- and long-term disease evolution with better accuracy compared to single clinical and MRI criteria.¹⁴⁸ However, since they have been evaluated with specific drugs, their generalizability to other treatments still need to be explored.¹⁴⁸

MRI protocol and report in MS diagnosis

The 2021 MAGNIMS–CMSC–NAIMS international consensus recommendations offer revised guidelines on the use of MRI in MS patients that encompass the appropriate methods and timing for employing MRI in the diagnosis of MS, placing particular emphasis on implementing standardized MRI protocols and reports (Table 3, Panel 1).⁶

Even though 3.0 T MRI scanners are preferred since they improve brain lesion detection and may reduce acquisition times, those with 1.5 T are still sufficient for lesion detection, given good quality scans with proper signal-to-noise ratio and high spatial resolution (Table 3, Panel 1). For diagnosis, recommended brain sequences include T₂-weighted 3D-FLAIR, axial T₂-weighted, and post-Gd T₁-weighted (Table 3, Panel 1). In particular, sagittal T₂-weighted 3D-FLAIR sequence is considered to be the core sequence for MS diagnosis due to its high sensitivity to WM lesions. 3D acquisitions are preferred to two-dimensional (2D) acquisition since they improve

lesion detection and allow the reconstruction on different planes. In case of unavailability of 3D T₂-weighted FLAIR sequence, high quality 2D pulse-sequences can be acceptable alternatives. Although some safety concerns were recently raised regarding the use of Gd-based contrast agents, post-contrast sequences are recommended in the diagnostic work-up of MS to show DIT and to exclude alternative diagnoses. To detect enhancing lesions, the recommended dose of Gd-based contrast agents is 0.1 mmol/kg body weight and the time delay between contrast administration and T₁-weighted acquisition should not be shorter than 5 min.

Unlike brain MRI, there is no evidence that using higher field strengths (e.g., 3.0 T) results in a greater detection of spinal cord lesions than lower field strengths. The standardized spinal cord MRI protocol must include at least two of the following three sagittal sequences: T₂-weighted, proton density-weighted, or STIR (Table 3, Panel 1). A combined acquisition increases the sensitivity of lesion identification but also limits the risk of artefacts and false positive findings. Sagittal MRI scans should ideally cover the whole spinal cord since lesions can be detected in all cord levels, including the conus. Even though Gd-enhancing spinal cord lesions are less common than in the brain, sagittal Gd-enhanced T₁-weighted spin echo sequence should be also acquired in the diagnostic work-up of MS. Although axial images of the spinal cord are optional, axial T₂-weighted spin echo sequences can further improve diagnostic certainty, ameliorating the accuracy of lesion detection and differentiating MS from mimics (e.g., NMOSD, MOGAD) on the basis of lesion extension and topography.

Additional brain MRI sequences, including DWI, pre-contrast 3D T₁-weighted for volumetric measurements, DIR or PSIR to identify CLs, and susceptibility-based imaging to identify CVS and chronic active lesions are currently optional. Similarly, dedicated optic nerve MRI is not recommended except for differential diagnosis with NMOSD, MOGAD and in patients with atypical clinical features (Table 3, Panel 1).

The interpretation of MRI findings should be performed by (neuro)radiologists, with expertise in the identification of neuroimaging features typical and atypical for MS² (Panel 1). Moreover, a standardized radiological report is recommended. It should accurately report standard measures, such as lesion count, size and, topography of T₂-hyperintense WM lesions, Gd-enhancing lesion count, fulfillment of diagnostic criteria as well as possible incidental findings (Panel 1).⁶

Novel technologies: contribution to diagnosis and prognosis

Artificial intelligence

Recent improvements in technologies and the availability of large amount of data have promoted the

	Brain	Spinal cord	Optic nerve
Suggested MRI parameters			
Field strength	≥1.5 T (preferably 3.0 T)	≥1.5 T (3.0 T has no added value compared with 1.5 T)	≥1.5 T
Slice thickness	For 3D imaging: 1 mm isotropic is preferred but, if over contiguous (through plane and in plane), not >1.5 mm, with 0.75 mm overlap For 2D imaging: ≤3 mm with no gap (except for diffusion-weighted imaging, for which the slice thickness should be ≤ 5 mm with a 10–30% gap)	Sagittal slices should be ≤ 3 mm with no gap; axial slices should be ≤ 5 mm with no gap	≤2–3 mm with no gap
In-plane resolution	≤1 mm × 1 mm	≤1 mm × 1 mm	≤1 mm × 1 mm
Coverage	Whole brain (include as much of cervical cord as possible)	Cervical and thoraco-lumbar spinal cord, to include conus	Optic nerve and optic chiasm
Axial scan orientation	Subcallosal plane to prescribe (i.e., for 2D imaging) or reformat (i.e., for 3D imaging) axial oblique slices	Perpendicular to the sagittal axis of the spinal cord	Aligned to the orientation of the optic nerve and optic chiasm
MRI sequence			
Recommended	Axial T ₂ -weighted (TSE or FSE) sequences ^a Sagittal T ₂ -weighted FLAIR (preferably 3D; fat suppression is optional) Axial T ₂ -weighted FLAIR (unnecessary if a sagittal 3D FLAIR with multiplanar reconstruction is obtained; fat suppression is optional) Axial (or 3D sagittal) T ₁ -weighted sequences after contrast ^b	At least two of: sagittal T ₂ -weighted sequences (TSE or FSE), PD-weighted sequences (TSE or FSE), or STIR Sagittal T ₁ -weighted sequences (TSE or FSE) after contrast ^b	
Optional	Diffusion-weighted imaging DIR or PSIR for detecting cortical or juxtacortical lesions High-resolution T ₁ -weighted sequences (isotropic 3D acquisition; for quantitative assessment of brain volume)	Sagittal 3D heavily T ₁ -weighted sequences (PSIR or magnetisation-prepared rapid acquisition of gradient echoes ^c) only for the cervical segment Axial T ₂ -weighted (TSE or FSE) or gradient-recalled echo ^e Sagittal T ₁ -weighted sequences (TSE or FSE) before contrast Axial T ₁ -weighted sequences (TSE or FSE) after contrast ^b	Axial and coronal fat-suppressed T ₂ -weighted sequences or STIR of optic nerve ^d Axial and coronal fat-suppressed T ₁ -weighted sequences post contrast of optic nerve ^d
Abbreviations: 2D, two-dimensional; 3D, three-dimensional; DIR, double inversion recovery; FLAIR, fluid-attenuated inversion recovery; FSE, fast spin echo; PD, proton density; PSIR, phase-sensitive inversion recovery; TSE, turbo spin echo; STIR, short tau inversion recovery. ^a A dual echo (proton density-weighted and T ₂ -weighted) sequence can be considered as an alternative to a single echo T ₂ -weighted sequence. ^b Standard doses of 0.1 mmol/kg bodyweight, macrocyclic gadolinium chelates only, with a minimum delay of 5–10 min. ^c One of these sequences could replace T ₂ -weighted sequences, proton density-weighted sequences, or short tau inversion recovery. ^d The acquisition of this sequence can be considered in some clinical situations; 2D or 3D acquisition. ^e To corroborate, characterize, and confirm lesions detected on sagittal images or to detect lesions in spinal cord segments with high clinical suspicions of involvement. ⁶			
Table 3: Recommended standardized brain, optic nerve, and spinal MRI protocols for MS diagnosis.			

application of artificial intelligence (AI) algorithms for the identification and segmentation of lesions, the diagnostic-work up of MS, and the characterization of disease course and prognosis.¹⁵⁵

Numerous segmentation methods employing various approaches have been proposed for quantifying WM lesions.^{155–158} Among them, image segmentation using deep learning (DL) approaches (typically convolutional neural networks [CNNs]) have been extensively used.¹⁵⁶ These methods have been demonstrated to be accurate, allowing also to obtain lesion volumes in a more reproducible way and with more limited time-consuming compared to manual quantifications.

Recent application of AI for MRI analysis in MS included also the automated assessment of specific lesion types, such as cortical lesions,¹⁵⁹ enhancing lesions,¹⁶⁰ as well as of lesional features, including the presence of the CVS in WM lesions,^{161,162} and PRLs.^{163,164}

Using DL or machine learning (ML) approaches, recent studies were able to discriminate between MS patients and HC with an accuracy between 70.2% and 98.8% from structural or resting state functional MRI sequences.^{165–171}

Algorithms based on AI may also play a crucial role in distinguishing MS from other conditions. A random forest algorithm, using brain GM imaging measures, achieved 74% accuracy in discriminating NMOSD from MS.¹⁷² Multiparametric approaches, incorporating data from FLAIR, brain GM, DTI, resting state functional MRI plus clinical and neuropsychological information improved up to 88%.^{172,173} ML and DL algorithms applied to brain FLAIR and T₁-weighted sequences and clinical information showed high accuracy in differentiating MS from NMOSD, migraine, CNS vasculitis, and non-inflammatory WM disorders.^{174–177}

ML algorithms also demonstrated high accuracy in distinguishing MS from non-inflammatory disorders

Panel 1: Recommendations for MRI application in the MS diagnostic work-up.**Standardized brain MRI protocol**

- At least 1.5 T; 3.0 T if available.
- Core sequences are: T2-weighted 3D-FLAIR, axial T2-weighted, and T1-weighted with Gd (Table 3).
- Pre-contrast T1-weighted sequences are not required.

Recommended use of brain MRI sequences

- To establish the diagnosis according to 2017 McDonald criteria: detection of symptomatic or asymptomatic brain lesions in typical CNS regions to show DIS and DIT.
- To predict future disease activity and disease progression.

Standardized spinal cord MRI protocol

- 1.5 T or 3.0 T.
- Details on pulse sequences can be found in Table 3.

Recommended use of spinal cord MRI sequences

- To establish MS diagnosis according to 2017 McDonald criteria
 - *Relapse-onset (CIS)*
 - Detection of symptomatic or asymptomatic spinal cord lesions to show DIS and DIT.
 - Differential diagnosis in case of inconclusive brain MRI findings: presence of typical demyelinating spinal cord lesions and exclusion of alternative diagnosis (e.g., NMOSD and MOGAD).
 - *Progressive-onset (PPMS)*
 - Detection of typical demyelinating spinal cord lesions to show DIT.
 - Detection of diffuse lesions.
 - Exclusion of alternative diagnosis.
- To predict future disease activity and disease progression.

Recommended use of Gd-based contrast agents

- To show dissemination in time on the baseline MRI scan.
- To contribute to differential diagnosis (i.e., on the basis of the pattern of enhancement).
- To predict future disease activity and disease progression.
- For phenotyping patients with progressive disease (i.e., active or inactive), if a recent (i.e., within 1 year) MRI is not available, and if this information affects treatment decisions.

MRI in pediatric MS population

- The same standardized brain and spinal cord MRI protocols as for adults should be acquired.
- Gd-enhanced images are valuable to exclude non-MS diagnosis at onset.
- Full spinal cord MRI should be acquired for diagnosis of children with spinal cord symptoms or signs or with inconclusive brain MRI findings.
- Spinal cord MRI could be obtained to provide a baseline MRI for all pediatric MS patients.
- Dedicated optic nerve MRI is not recommended, except for differential diagnosis with MOGAD or NMOSD and if clinical features are atypical.

Additional or advanced MRI

- Diffusion-weighted imaging cannot replace Gd as a marker for active inflammation.
- Dedicated optic nerve MRI is not recommended except for differential diagnosis with NMOSD, MOGAD and in patients with atypical clinical features.
- There is insufficient current evidence to recommend routine use of quantitative MRI techniques and brain volumetric measurements, DIR or PSIR for CLs, and CVS and chronic active lesions as diagnostic markers.

Image interpretation and report

- Standardized image interpretation and reporting is recommended.
- Knowledge about definition of lesion types is crucial and warning signs against a diagnosis of MS should be recognized.
- Standard measures, such as T₂-hyperintense WM lesion count, size and topography and Gd-enhancing lesion count if Gd was administered, are recommended.

Separate identification of cortical lesions (together with juxtacortical lesions) based on standard images (e.g., FLAIR; DIR or PSIR sequences are optional) is recommended.

Abbreviations: CIS, clinically isolated syndrome; CL, cortical lesion; CNS, central nervous system; CVS, central vein sign; DIR, double inversion recovery; DIS, dissemination in space; DIT, dissemination in time; FLAIR, fluid-attenuated inversion recovery; Gd, gadolinium; MOGAD, myelin oligodendrocyte glycoprotein-associated disease; MRI, magnetic resonance imaging; MS, multiple sclerosis; NMOSD, neuromyelitis optica spectrum disorder; PP, primary progressive; PSIR, phase-sensitive inversion recovery; WM, white matter.⁶

and predicting conversion from CIS to clinically definite MS with an accuracy between 67.6% and 92.9%.^{178–181}

By integrating clinical and MRI data, several studies demonstrated that ML and DL algorithms can accurately predict disability worsening in the different clinical phenotypes and after variable follow-up durations, ranging from six months to fifteen years.^{80,143,182–185} Notably, while lesion measures appear crucial for short-term prediction of disease progression, at long-term follow-up, GM damage becomes a more substantial and significant contributor.

Automated quantification tools

Manual quantification of brain lesions and volumes is a time-consuming process that is susceptible to errors and high variability. The availability of commercially accessible automated quantification and reporting tools has grown in recent years.¹⁸⁶ They have the potential to improve the sensitivity, precision and consistency of MRI analysis, possibly reducing time for data analysis. These automatic tools may potentially facilitate the cross-sectional and longitudinal evaluation of volumetric data of each patient against a reference population. This may be beneficial for clinicians in various aspects such as diagnostic work-up, predicting disease progression, monitoring disease evolution and treatment responses. Numerous automated quantification and reporting tools designed for MS have been created for clinical use, and many of these tools have received regulatory approval (see¹⁸⁶ for a comprehensive and up-to-date review). However, to broaden their application in the clinical setting, standardization and validation using diverse input data remain essential. Moreover, these tools should be intended to provide support and should not replace the direct evaluation performed by clinicians.

Conclusions

Accurate criteria in the diagnostic work-up of MS are pivotal to facilitate early diagnosis and minimize the risk of misdiagnosis. The 2017 McDonald criteria exhibit high sensitivity and accuracy in predicting the occurrence of a second clinical attack (i.e., clinically-definite MS). They enable timelier MS diagnosis and treatment, but they should be applied only after alternative diagnoses have been carefully ruled out.

To enhance the diagnostic process further, emerging imaging markers (e.g., optic nerve involvement, CLs, CVS, and chronic active lesions) have been proposed. These aim to augment the specificity and accuracy of MS diagnostic criteria. However, before their incorporation into clinical practice, rigorous validation and standardization are still necessary. Moreover, there is a relative lack in knowledge for PPMS, POMS and LOMS which represent rarer presentations. Future research focusing on these areas in large or multi-center settings is necessary.

Search strategy and selection criteria

References for this Series paper were identified through searches of PubMed (<https://www.ncbi.nlm.nih.gov/pubmed>) with the search terms “Automated quantification tools”, “Artificial intelligence”, “Brain”, “Chronic active lesions”, “Clinically isolated syndrome”, “Cortex”, “Cortical lesions”, “Diagnosis”, “Diagnostic Criteria”, “Differential Diagnosis”, “Grey Matter”, “Guidelines”, “Iron Rim Lesions”, “Lesion/s”, “MRI”, “McDonald criteria”, “Multiple Sclerosis”, “Optic nerve”, “Paramagnetic Rim Lesions”, “Prognosis”, “Primary Progressive”, “Progressive”, “MRI protocol”, “Secondary Progressive”, “Slowly-expanding lesions”, “Spinal Cord”, “Treatment response”, “White Matter”, from 1st January 1979 until 15th January 2024. Only papers published in English were reviewed. The final reference list was generated with the consensus of all co-Authors of this Series article on the basis of originality and relevance to the broad scope of this Series paper, with a focus on articles published during the past five years.

Several MRI markers, encompassing the number, size, and distribution of focal WM lesions, along with more specific advanced MRI features, serve as early and reliable predictors of subsequent disease progression. Thus, their thorough assessment can potentially identify MS patients at elevated risk of disease progression, necessitating prompt use of highly effective therapies.

To ensure consistency and improvement in MRI use in the diagnostic work-up of MS, it is essential to implement standardized brain and spinal cord MRI protocols. Additionally, accurate interpretation by specialized (neuro)radiologists with expertise in MS neuroimaging features is crucial for achieving a consistent and accurate use of MRI in the context of MS.

Contributors

Concept and design of the Series paper: M.A. Rocca, M. Di Filippo. Interpretation of data and drafting of the Series paper: M.A. Rocca, P. Preziosa, W. Brownlee, F. Barkhof, M. Calabrese, N. De Stefano, C. Granziera, S. Ropele, A.T. Toosy, A. Vidal-Jordana, M. Filippi, M. Di Filippo. Critical revision of the manuscript for important intellectual content: M.A. Rocca, P. Preziosa, W. Brownlee, F. Barkhof, M. Calabrese, N. De Stefano, C. Granziera, S. Ropele, A.T. Toosy, A. Vidal-Jordana, M. Filippi, M. Di Filippo.

Declaration of interests

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