

BREAST IMAGING (H. OJEDA-FOURNIER, SECTION EDITOR)

# Magnetic Resonance Imaging: Advanced Applications in Breast **Cancer**

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Abstract Breast MRI is a highly sensitive imaging tool for breast cancer detection. In general clinical practice, breast MRI utilizes a limited dynamic contrast-enhanced (DCE) acquisition that provides morphologic and semiquantitative kinetic information to allow characterization of breast findings. This approach provides sensitivities approaching 100 % for breast cancer detection; however, its specificity remains moderate due to limited ability to differentiate benign pathologic processes that enhance from malignancies. Several advanced MRI techniques, such as high-temporal resolution DCE that allows robust quantitative pharmacokinetic analysis, diffusion-weighted imaging that allows microstructural characterization, and MR spectroscopy that reflects chemical composition, hold promise to improve standard breast MRI specificity and to serve as imaging biomarkers that can guide treatment decisions. In this review article, we review recent updates in advanced breast MRI applications, including their potential clinical uses and challenges to implementation.

Keywords Multiparametric breast MRI - Dynamic contrast-enhanced PK modeling - Diffusion-weighted imaging - Magnetic resonance spectroscopy - Breast cancer

This article is part of the Topical Collection on Breast Imaging.

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### Introduction

Despite advances in early detection and treatment, breast cancer remains the second leading cause of cancer death in US women [\[1](#page-8-0)]. As a result, there is a strong clinical need to develop advanced imaging techniques that can improve detection and characterization of breast cancer and thereby further decrease associated mortality and morbidity. Due to its excellent sensitivity for breast cancer detection, breast MRI has gained clinical acceptance as an imaging tool useful for a range of clinical scenarios, including supplemental screening for women at high risk of developing breast cancer, pre-operative evaluation of extent of newly diagnosed breast cancer, evaluation and management of indeterminate findings identified on standard imaging and/or clinical exam, and assessment of breast cancer response to neoadjuvant chemotherapy. However, standard contrast-enhanced MRI provides only modest specificity, therefore exposing many patients to unnecessary biopsies and limiting its clinical use and acceptance across institutions. In this review article, we review the current evidence for advanced breast MRI applications, including dynamic contrast-enhanced (DCE) pharmacokinetic (PK) modeling, diffusion-weighted imaging (DWI), and MR spectroscopy (MRS), to improve standard contrast-enhanced breast MRI performance and remove barriers to more widespread use.

# Current Clinical Indications for Clinical Breast MRI

The clinical indication for breast MRI based on the highest level of evidence is for supplemental screening (in addition to mammography) of asymptomatic women at elevated risk

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of developing breast cancer. Multiple single and multi-institution trials have found that breast MRI provides superior sensitivity for breast cancer detection when compared to mammographic and sonographic imaging in high-risk women [\[2–5](#page-8-0)]. Although more controversial [\[6](#page-8-0)], MRI also is commonly utilized to pre-operatively assess women newly diagnosed with breast cancer for the presence of additional breast cancers that are mammographically and clinically occult in both the ipsilateral [[7\]](#page-8-0) and contralateral breasts [\[3](#page-8-0)].

Other diagnostic uses of breast MRI include assessment of the effectiveness of neoadjuvant therapy and as a "problem solving" tool for further evaluation of equivocal imaging or clinical exam findings. Multiple studies have shown MRI to be a valuable tool to assess response to therapy, including prediction of pathologic complete response (pCR) [\[8–12](#page-8-0)]. However, its clinical impact for guiding chemotherapy regimens remains limited by high cost and modest overall performance in predicting meaningful clinical outcomes. Similarly, the practice to utilize MRI to evaluate equivocal findings in order to avoid unnecessary biopsies has not yet been proven to be costeffective [\[13](#page-8-0)]. Additionally, current practice guidelines based on the American College of Radiology Breast Imaging Reporting and Data System require a negative predictive value of  $\sim$ 98 % [[14\]](#page-8-0), which to date has not been shown to be achievable with standard contrast-enhanced breast MRI.

#### Advanced Breast MRI Techniques

A multiparametric approach to breast MRI (Fig. [1](#page-2-0)) incorporating advanced techniques, such as high-temporal resolution DCE-MRI with quantitative PK modeling, DWI, and MRS, have the potential to provide imaging assays of specific biological features such as abnormal vessel permeability, cellularity, and chemical composition, which may address some of the shortcomings of routine clinical breast MRI.

#### Dynamic Contrast-Enhanced (DCE) MRI

DCE-MRI approaches with high-temporal resolution can allow for more sophisticated contrast kinetic assessments through PK modeling versus the semi-quantitative measurements typical of routine clinical MRI. Such PK modeling assesses gadolinium contrast exchange between the intravascular and the interstitial spaces, and the model parameters can provide surrogate measurements of capillary permeability and tumor blood flow. Currently, the most common approach to PK modeling for breast MRI is

the two-compartment (Tofts) model, which measures the exchange of contrast between breast tissue and the plasma space [\[15](#page-9-0)]. Using such PK models, physiologic metrics can be derived such as the volume transfer constant,  $K^{\text{trans}}$ , which reflects the rate of transfer of gadolinium from plasma to the tissue, the transfer rate constant,  $k_{ep}$ , which reflects the reflux of contrast agent from the extravascular extracellular space to the plasma compartment, and the fractional volume of the extravascular extracellular space,  $v_e$ . An example of PK modeling and resulting  $K^{\text{trans}}$  map for a breast cancer is provided in Fig. [2.](#page-3-0)

Multiple single-institution studies have shown promise in applying these PK parameters, particularly  $K<sup>trans</sup>$ , to improve the positive predictive value of standard breast MRI and as a biomarker of disease subtypes  $[16–22]$  $[16–22]$ . Huang et al. demonstrated that in lesions found to be suspicious on standard clinical breast MRI, a  $K^{\text{trans}}$  "cutoff" value could be used such that lesions with lower  $K<sup>trans</sup>$ values could avoid biopsy and thereby decrease false positive MR examinations [[17\]](#page-9-0). More recently, Li and colleagues demonstrated that  $K<sup>trans</sup>$  and  $k<sub>ep</sub>$  values progressively increased when measuring normal glands, benign lesions, and malignant lesions, respectively; also noting that invasive ductal carcinomas and ductal carcinoma in situ lesions exhibited significantly higher  $K<sup>trans</sup>$ and  $k_{ep}$  values than ductal dysplasias [[18\]](#page-9-0). Their study also found that these parameter values were higher in malignancies with elevated expression of CD105, a marker of angiogenesis, suggesting that PK measurements have potential to serve as an in vivo biomarker of breast cancer biology. Table [1](#page-3-0) summarizes DCE-MRI  $K<sup>trans</sup>$  measures of benign and malignant lesions reported in several recent studies.

Beyond PK measures, other advanced metrics increasingly being explored in DCE-MRI are those related to texture and heterogeneity (e.g., energy, entropy, correlation, difference in variance) and shape and morphology (size, circularity, irregularity, margin sharpness, compactness, spiculation). Mahrooghy et al. found that breast cancer heterogeneity measures correlated with a multigene assay (Oncotype DX Score, Genomic Health) that has been validated to predict recurrence rates after treatment [\[23](#page-9-0)]. Also, Wang et al. demonstrated that the use of a computeraided evaluation software to extract advanced imaging phenotypes along with incorporating PK measurements  $(k_{en}$  and  $V_p$ ), textural and shape analyses (energy and entropy), and automated 3D morphological assessments could differentiate malignant and benign breast lesions on MRI with 91 % accuracy (sensitivity 91 %, specificity 92 %) [[22\]](#page-9-0).

Early work assessing the ability of advanced DCE-MRI to determine response to neoadjuvant therapy established the potential of PK measurements to assess the efficacy of

pre-operative therapies to achieve pCR. Specifically,  $K<sup>trans</sup>$ values were shown in a meta-analysis to be among the most promising MRI parameters for prediction of near pCR to neoadjuvant chemotherapy, outperforming standard tumor size measurements [\[24](#page-9-0)]. Moreover, recent work from Drisis et al. found that for triple-negative breast cancers, which can be more challenging to treat than other breast cancer subtypes due to limited therapeutic options,  $K<sup>trans</sup>$ levels measured at the pre-treatment timepoint provided the most accurate prediction of response to therapy, suggesting that DCE-MRI may play a role in improving treatment strategies for this tumor subtype [[25\]](#page-9-0).

One drawback of PK measures is the considerable variability in parameters between centers, which in part results from methodological differences in the PK models used to calculate these features. As a result, some have sought to identify quantitative methods that are less dependent on modeling methodology to predict treatment response [\[12](#page-8-0), [26,](#page-9-0) [27](#page-9-0)]. Cho et al. recently reported that a parametric response map analysis based on voxelwise enhancement differences between pre-treatment and posttreatment DCE images has potential for predicting pCR

[\[28](#page-9-0)]. However, Huang et al. showed that although significant parameter variations are seen when shared DCE-MRI datasets are analyzed using various PK models, each model independently showed excellent performance for predicting breast cancer response, suggesting that these systemic variations may not impact clinical utility [[29](#page-9-0)•].

Nonetheless, consistency among different centers on how to best approach PK modeling remains a significant barrier to widespread implementation of advanced DCE parameters for clinical use. PK modeling requires measurement of both the pre-contrast T1 relaxation time of the tumor or tissue being imaged and the arterial input function (AIF), or the concentration of contrast agent as it changes over time within the arterial blood, which introduces unique challenges and potential for error. T1 mapping requires the acquisition of an additional series of images prior to DCE-MRI, most commonly using varying flip angle or inversion recovery approaches, which is time consuming and can be prone to inaccuracies due to B1 inhomogeneities and/or patient motion. Furthermore, many PK models require that the AIF be measured directly for each subject [[30\]](#page-9-0), which is challenging to perform



<span id="page-2-0"></span>Fig. 1 Multiparametric MRI examination in a 51-year-old woman with invasive ductal carcinoma (Grade 3,  $ER+/PR+/$  $HER2+)$  prior to therapy. a Post-contrast T1-weighted image from the DCE-MRI sequence. **b**  $K^{\text{trans}}$  map for tumor region. c Single-voxel <sup>1</sup>H-MRS tumor spectrum showing elevated choline at 3.2 ppm. d ADC map from DWI showing restricted diffusion (low ADC) in the tumor region

<span id="page-3-0"></span>Fig. 2 Dynamic contrastenhanced (DCE) MRI in a subject with invasive ductal carcinoma. a Representative post-contrast image from a high-temporal resolution DCE-MR scan using a dynamic 4D THRIVE (Philips Healthcare, Best, The Netherlands) acquisition (15 s scan;  $1 \times 1 \times 2$  mm resolution). b Percent enhancement curve over time shows contrast dynamics for a region of interest in the invasive tumor. c Twocompartment model used for pharmacokinetic analysis, where  $K<sup>trans</sup>$  reflects the rate contrast leaves the plasma space and  $K^{\text{trans}}/V_e = k_{ep}$  reflects the rate contrast returns to the plasma space. d Resulting color encoded  $K<sup>trans</sup>$  map from hightemporal resolution scan showing higher levels of capillary permeability in lesion



Table 1 Summary of recent dynamic contrast-enhanced MRI studies utilizing  $K<sup>trans</sup>$  to discriminate malignant from benign breast lesions



AIF arterial input function, NS not specified

<sup>a</sup> Median,  $\frac{b}{c}$  Mean (range),  $\frac{c}{c}$  Median (interquartile range)

routinely due to the very high temporal resolution required to accurately sample the rapidly changing signal that represents the AIF. An alternate approach that avoids the need for direct calculation of AIF for each subject is to use a population-based mean AIF determined from data where the injection site, dose, and rate were constant [[17\]](#page-9-0).

#### Diffusion-Weighted Imaging

Over the past decade, there has been increasing interest in the use of DWI as a non-contrast MRI technique for oncology applications. DWI measures the ability of water molecules to freely diffuse in tissue, which is impacted by biophysical characteristics such as cell density, membrane integrity, and microstructure. DWI is particularly appealing as an advanced breast MRI application due to its short acquisition time, its wide availability on most commercial MR scanners, and the lack of exogenous contrast agent needed. DWI is increasingly being incorporated into breast MRI protocols due to promising data from multiple singlecenter studies demonstrating value for the detection and characterization of breast cancer [\[31](#page-9-0)].

To date, the greatest evidence for the use of DWI as an advanced MRI application is as an adjunct sequence that can reduce false positives prompted by standard contrastenhanced breast MRIs and thereby reduce the number of unnecessary biopsies performed. This has been the most widely explored application of DWI for breast imaging, and numerous groups have demonstrated significant differences in DWI apparent diffusion coefficient (ADC) values between benign and malignant lesions [\[32–35](#page-9-0)], Fig. [3](#page-5-0). A recent meta-analysis of 13 individual studies on DWI diagnostic performance demonstrated pooled sensitivity of 84 % (95 % confidence interval [CI]: 82, 87 %) and specificity of 79 % (95 % CI: 75, 82 %) in discriminating malignant from benign lesions (964 breast lesions total, 615 malignant and 349 benign) [\[36](#page-9-0)]. Table [2](#page-6-0) summarizes ADC measures reported for benign and malignant breast lesions in several recent studies. Further, multiple studies across a variety of field strengths have found that ADC measures are complementary to DCE-MRI parameters for discriminating benign and malignant breast lesions and can increase the accuracy of conventional breast MRI assessment [\[37–40\]](#page-9-0). More recently, Bickelhaupt et al. reported that DWI may also be useful as a fast and noninvasive approach to assess the likelihood of malignancy for suspicious lesions detected on screening X-ray mammograms and reduce unnecessary biopsies [[41\]](#page-9-0)

Others have explored DWI as a way to improve conventional MRI's ability to assess response to neoadjuvant chemotherapy. Considering that the cytotoxic effects of chemotherapy can lead to a less restrictive environment for

water to freely diffuse, it has been proposed that an increase in ADC values may be highly predictive of favorable treatment response. Indeed, several preliminary clinical studies have shown changes in tumor ADC due to neoadjuvant treatments may provide valuable early indication of treatment efficacy [\[42](#page-9-0), [43\]](#page-10-0). Furthermore, it has been proposed that ADC values on pre-treatment MRIs can be used to identify patients who will best respond to neoadjuvant treatments. In a recent study of 118 women undergoing neoadjuvant chemotherapy for locally advanced breast cancer, Richard et al. found that lower pretreatment tumor ADC values were predictive of pathological response, particularly for triple-negative tumors [[44\]](#page-10-0).

Finally, DWI has shown promise to serve as a noncontrast screening tool that is supplemental to mammography. Prior studies have shown that many mammographically and clinically occult breast cancers are visible on DWI with corresponding low ADC values [\[45](#page-10-0)]. Yabuuchi et al. demonstrated that using a non-contrast MRI approach with DWI can achieve a higher accuracy for breast cancer detection than mammography [[46\]](#page-10-0). To date, there are limited studies exploring the potential role of DWI as a non-contrast alternative for breast MR screening, but promising preliminary data warrant further investigation  $[46, 47, 48 \cdot \cdot]$  $[46, 47, 48 \cdot \cdot]$ .

Although widespread clinical implementation of DWI for breast imaging applications has been limited in part by technical issues inherent to echo planar imaging technique (e.g., low spatial resolution, spatial distortions, and detrimental artifacts due to suboptimal fat suppression and susceptibility effects at air–tissue interfaces), a number of compelling advancements in DWI acquisition strategies are under development to overcome these technical challenges [\[49–53](#page-10-0)].

In addition, while data from early DWI trials are encouraging for improving the performance of conventional breast MRI, several advanced DWI approaches are also being investigated to extract additional biological information from breast DWI scans. These include intravoxel incoherent motion (IVIM) modeling, which provides tissue perfusion characterization (evident at low b-values  $\langle 200 \text{ s/mm}^2 \rangle$  [[54–57\]](#page-10-0); diffusion kurtosis modeling, which describes tissue complexity and physical barriers to diffusion (evident at high b-values >  $1500$  s/mm<sup>2</sup>) [\[58](#page-10-0)••, [59](#page-10-0), [60](#page-10-0)]; and diffusion tensor imaging, which assesses water diffusion directionality to probe glandular organization (ducts, lobules) and microarchitecture [[61–63\]](#page-10-0). Iima et al. recently demonstrated in a pilot study using a novel DWI approach, incorporating a 16 b-value acquisition and combined IVIM and kurtosis modeling, that the perfusion fraction  $[f]$  and kurtosis  $[K]$  measures obtained were significantly higher in malignant breast lesions than in benign lesions, providing additional parameters that could be used

<span id="page-5-0"></span>

Fig. 3 Diffusion-weighted MRI (DWI) for characterization of suspicious lesions found on dynamic contrast-enhanced (DCE) MRI. (Top) Malignant invasive ductal carcinoma in a 46-year-old woman. The lesion brightly enhanced on T1w DCE-MRI and exhibited restricted

to improve the positive predictive value of MRI [[58](#page-10-0)••]. Bokacheva et al. also showed that IVIM parameters of increased  $f$  and decreased pseudodiffusion  $[D]$  are useful for discriminating malignancy from benign or normal breast tissue [\[54](#page-10-0)]. Further, Sun et al. recently reported that diffusion kurtosis measures can increase diagnostic accuracy over conventional ADC measures for assessing breast lesions and are significantly associated with histologic grade and proliferative activity (Ki-67 expression) in invasive tumors [\[60](#page-10-0)].

#### Magnetic Resonance Spectroscopy

Another advanced MR technique actively investigated for breast cancer detection and characterization is magnetic resonance spectroscopy (MRS). MRS provides spatially localized spectra representing the structure and concentration of different chemical compounds in that region. Proton MRS  $(^1H$  MRS) studies of the breast have shown the metabolite choline to be highly elevated in malignant lesions compared with benign lesions and normal breast

diffusion on DWI with low apparent diffusion coefficient (ADC) of  $0.92 \times 10^{-3}$  mm/s<sup>2</sup>. (*Bottom*) Benign fibroadenoma in a 51-year-old woman. The lesion brightly enhanced on T1w DCE-MRI but did not exhibit restricted diffusion on DWI, with ADC of  $1.91 \times 10^{-3}$  mm/s<sup>2</sup>

tissue [[64–67\]](#page-10-0). Choline is known to be involved in cell membrane turnover (phospholipid synthesis and degradation) and is therefore generally considered a marker of cell proliferation.

Most breast MRS studies to date have utilized a singlevoxel acquisition approach, which produces a single spectrum representing the average signal from a 3-dimensional voxel. Alternative approaches of chemical-shift imaging or MR spectroscopic imaging (MRSI) produce a spatially resolved grid of spectra for a larger volume of tissue. A variety of analysis approaches have been used to characterize the total choline (tCho) signal in breast MRS spectra, including qualitative assessment of the presence or absence of a tCho peak, semi-quantitative measurement of tCho signal-to-noise ratio (SNR), peak height or peak integral, and absolute quantification of tCho concentration (using internal water referencing or external phantom referencing techniques) [[68\]](#page-10-0).

MRS has demonstrated potential for both improving diagnostic accuracy of breast MRI and for providing prognostic biomarkers. <sup>1</sup>H-MRS measures of choline levels in suspicious breast lesions have distinguished benign from

Study	No. of malignant lesions	No. of benign lesions	Field strength	b-value schema $(s/mm^2)$	ADC $(\times 10^{-3}$ mm <sup>2</sup> /s) <sup>a</sup>	
					Malignant lesions	Benign lesions
Guo et al. $[32]$	31	24	1.5T	0, 250, 500, 750, 1000	$0.97 \pm 0.20$	$1.57 \pm 0.23$
Woodhams et al. [35]	167	24	1.5T	0.750	$1.22 \pm 0.31$	$1.67 \pm 0.54$
Rubesova et al. [33]	65	22	1.5T	0, 200, 400, 600, 1000	$0.95 \pm 0.03$	$1.51 \pm 0.07$
Bogner et al. $[93]$	24	17	3.0T	50, 850	$0.99 \pm 0.18$	$1.47 \pm 0.21$
Partridge et al. [38]	31	52	1.5T	0,600	$1.30 \pm 0.27$	$1.70 \pm 0.44$
El Khouli et al. [37]	68	31	3.0T	0.600	$1.12 \pm 0.37$	$1.98 \pm 0.70$
Spick et al. [94]	20	84	1.5T	50, 400, 800	$1.06 \pm 0.27$	$1.53 \pm 0.38$
Min et al. $[95]$	29	20	1.5T	0, 400, 600, 800	$1.11 \pm 0.19$	$1.66 \pm 0.46$
Arponent et al. [96]	114	23	3.0T	0, 200, 400, 600, 800	$0.61 \pm 0.20$	$1.10 \pm 0.22$
Nogueira et al. [97]	35	23	3.0T	50, 200, 400, 600, 800, 1000	$1.08 \pm 0.25$	$1.74 \pm 0.35$

<span id="page-6-0"></span>Table 2 Summary of recent diffusion-weighted MRI studies assessing apparent diffusion coefficients (ADCs) to discriminate between benign and malignant breast lesions

ADC apparent diffusion coefficient

<sup>a</sup> Data are reported as mean  $\pm$  standard deviation

Table 3 Summary of recent studies Quantitative <sup>1</sup>H-MR spectroscopy studies of benign and malignant breast lesions

Study	No. of malignant lesions	No. of benign lesions	Field strength	Single or multivoxel approach	Reference method	Optimal [Cho] cutoff value <sup>a</sup> (mmol/kg)	[Cho] $(mmol/kg)^b$	
							Malignant lesions	Benign lesions
Meisamy et al. $[70]$	41	27	4.0T	SV	Internal	1.05	$2.2(0-8.5)$	$0.21(0-1.1)$
Thakur et al. $[98]$	57	31	1.5T	SV	Internal	0.1	$5.8 \pm 8.1$	$0.1 \pm 0.3$
Dorrius et al. $[74]$	14	11	1.5T	MV	Internal	1.5	$3.10 \pm 2.21$	$0.84 \pm 0.32$
Sah et al. [99]	$151^{\circ}$	$38^{\circ}$	1.5T	SV	Internal	2.54	$4.2 \pm 2.3$	$1.6 \pm 0.9$
Baek et al. $\lceil 100 \rceil$	99	13	1.5T	SV	Internal	0.0	2.7 $(0.08 - 9.99)$	0.05 $(0-0.66)$
Mizukoshi et al. $[101]$	169	39	1.5T	SV	External	0.61	$1.13 \pm 0.92$	$0.43 \pm 0.42$
Sun et al. [60]	183	75	1.5T	<b>SV</b>	External	1.76	$3.17 \pm 2.03$	$0.86 \pm 0.83$

SV single voxel, MV multivoxel, Cho choline

<sup>a</sup> Diagnostic [Cho] cutoff values defined to maximize both sensitivity and specificity in differentiating lesions

 $<sup>b</sup>$  Data are reported as mean  $\pm$  standard deviation or mean (range)</sup>

 $\frac{c}{17/151}$  malignant lesions and 12/38 benign lesions with  $[Cho] = 0$  were excluded from quantitative analyses

malignant lesions with high specificity [[69–](#page-10-0)[71\]](#page-11-0). In a recent meta-analysis of 19 breast MRS studies, Baltzer and Dietzel found a pooled sensitivity of 73 % (95 % CI: 85, 91 %) and specificity of 88 % (95 % CI: 64, 82 %) for diagnosis of a total of 1198 lesions (773 malignant, 452 benign) [[72](#page-11-0)•]. Table 3 summarizes absolute choline measures for benign and malignant lesions reported in several breast MRS studies evaluating suspicious breast lesions. Dorrius et al. showed that a quantitative MRSI approach could differentiate benign and malignant lesions and improve diagnostic accuracy of conventional contrast-enhanced MRI in the assessment of breast lesions  $\geq 1$  cm, Fig. [4](#page-7-0). Their findings suggested that implementing a maximum lesion tCho concentration threshold of  $>1.5$  mM to indicate malignancy could avoid biopsy of benign lesions while not missing any cancers [[73,](#page-11-0) [74\]](#page-11-0).

Breast MRS measures may also help distinguish disease subtypes based on metabolic differences. Evaluation of 184

<span id="page-7-0"></span>Fig. 4 MR spectroscopic imaging in a 53-year-old patient with adenocarcinoma in the left breast. a Volume of interest (36 voxels of  $0.25 \text{ cm}^3$  each) centered on the lesion.

b Unsuppressed spectral map showing water and fat peaks in the lesion and surrounding tissue. c After application of water and fat suppression, an intense Cho peak is seen on the summed tumor spectra, where the fit for choline is shown in red (range 2–4.5 ppm). d The choline map shows heterogeneity of choline concentration throughout the tumor with highest choline levels shown in red. Adapted from Sijens PE, Dorrius MD, Kappert P, Baron P, Pijnappel RM, Oudkerk M. Quantitative multivoxel proton chemical shift imaging of the breast. Magn Reson Imaging. 2010 Apr;28(3):314–9; with permission (Color figure online)



breast cancer patients using single-voxel <sup>1</sup>H-MRS at 1.5T, Shin et al. found that tumor tCho measures were higher in invasive versus in situ cancers, and correlated with several prognostic factors including nuclear grade, histologic grade, and estrogen receptor (ER) status [\[75](#page-11-0)].

Beyond lesion characterization, breast MRS may also provide an early predictive marker of treatment response. Treatment-induced reductions in cell proliferation may be reflected by alterations in tumor choline levels on MRS before any detectable changes in tumor size. Compelling results from Meisamy and colleagues [[76,](#page-11-0) [77\]](#page-11-0) using a 4T scanner showed that acute decreases in tumor tCho concentration levels were measurable within 24 to 48 h after the first dose of chemotherapy and correlated with final post-treatment changes in tumor size. Numerous other groups have investigated MRS for monitoring neoadjuvant therapy and many have also reported significant associations between tumor tCho levels and response to therapy, with early tCho decreases generally predictive of better pathologic and/or clinical response [\[78–81](#page-11-0)]. However, in a recent review of 15 single-center breast MRS studies, Leong et al. found that study designs and approaches for MRS acquisition, choline quantitation, and response

determination varied widely, making comparisons of the findings across studies difficult [\[82](#page-11-0)].

Despite the valuable metabolic information that can be obtained, there are both logistical and technical challenges that limit routine clinical use of MRS of the breast. Breast MRS data quality is very susceptible to B0 inhomogeneities, which reduce SNR and ability to separate different spectral peaks and also negatively impact the performance of chemically selective fat and water suppression. Inadequate fat suppression is also a common issue in breast imaging that results in lipid contamination obscuring the choline signal. [\[68](#page-10-0)] While most prior studies have been performed on 1.5T MR scanners, increases in SNR and spectral resolution at higher field strengths may overcome some of the current clinical limitations of breast MRS by improving choline detectability, decreasing measurement errors, and enabling the assessment of smaller lesions [[76\]](#page-11-0).

Multivoxel MRS approaches, such as that shown in Fig. [3](#page-5-0), also hold strong advantages over single-voxel MRS for improving the clinical utility of breast MRS. Perhaps most importantly, MRSI provides wider coverage and thus reduces the need for a priori knowledge of lesion location

<span id="page-8-0"></span>and real-time expertise for voxel placement during the MR scan. MRSI further provides the ability to spatially map tCho distributions, enabling assessment of multiple lesions simultaneously, characterization of tumor heterogeneity, and assessment of the extent of disease infiltration into surrounding tissue [\[83](#page-11-0)]. However, longer scan time requirements and greater technical challenges with regard to shimming and fat suppression versus single-voxel MRS have impeded widespread implementation of MRSI. Advancements in MRI hardware and software may facilitate expanded the use of this approach in clinical and research settings [[73,](#page-11-0) [81,](#page-11-0) [84–87](#page-11-0)].

31-Phosphorus MRS  $(^{31}P$  MRS) also holds promise as an alternative approach to overcome some of the current challenges of breast MRS. <sup>31</sup>P MRS enables direct measurement of phosphocholine and avoids issues of lipid contamination commonly present in breast <sup>1</sup>H MRS signal. Due to the low abundance of phosphorus in the body,  $3^{1}P$ MRS becomes more feasible at high field strengths, as recently demonstrated in two breast studies performed at 7T [[88,](#page-11-0) [89](#page-11-0)•] .

## Conclusion

Advanced applications of breast MRI, including DCE with PK modeling, DWI, and MRS, continue to show potential to improve the specificity and positive predictive value of breast MRI and to expand its clinical use in both the screening and diagnostic setting. To date, several centers have demonstrated that advanced MRI applications can be implemented into their routine clinical protocol to improve characterization of breast lesions, and thereby to improve the accuracy of conventional breast MRI [[90\]](#page-11-0), to predict and monitor response to medical therapies [\[79](#page-11-0), [91](#page-11-0), [92](#page-11-0)], and to discriminate biological subtypes of cancer [\[89](#page-11-0)•]. While promising, these advanced applications continue to require multi-center validation, effort to address persistent technical challenges, and standardization of imaging technique and measurement parameters before they can be implemented broadly in clinical practice.

#### Compliance with Ethics Guidelines

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Human and Animal Rights and Informed Consent This article does not contain any studies with human or animal subjects performed by any of the authors.

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