

A Meta-analysis of the Diagnostic Performance of Diffusion MRI for Breast Lesion Characterization

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Background: Various techniques are available to assess diffusion properties of breast lesions as a marker of malignancy at MRI. The diagnostic performance of these diffusion markers has not been comprehensively assessed.

Purpose: To compare by meta-analysis the diagnostic performance of parameters from diffusion-weighted imaging (DWI), diffusion-tensor imaging (DTI), and intravoxel incoherent motion (IVIM) in the differential diagnosis of malignant and benign breast lesions.

Materials and Methods: PubMed and Embase databases were searched from January to March 2018 for studies in English that assessed the diagnostic performance of DWI, DTI, and IVIM in the breast. Studies were reviewed according to eligibility and exclusion criteria. Publication bias and heterogeneity between studies were assessed. Pooled summary estimates for sensitivity, specificity, and area under the curve were obtained for each parameter by using a bivariate model. A subanalysis investigated the effect of MRI parameters on diagnostic performance by using a Student *t* test or a one-way analysis of variance.

Results: From 73 eligible studies, 6791 lesions (3930 malignant and 2861 benign) were included. Publication bias was evident for studies that evaluated apparent diffusion coefficient (ADC). Significant heterogeneity (P < .05) was present for all parameters except the perfusion fraction (f). The pooled sensitivity, specificity, and area under the curve for ADC was 89%, 82%, and 0.92, respectively. The highest performing parameter for DTI was the prime diffusion coefficient (λ_1), and pooled sensitivity, specificity, and area under the curve was 93%, 90%, and 0.94, respectively. The highest performing parameter for IVIM was tissue diffusivity (D), and the pooled sensitivity, specificity, and area under the curve was 88%, 79%, and 0.90. Choice of MRI parameters had no significant effect on diagnostic performance.

Conclusion: Diffusion-weighted imaging, diffusion-tensor imaging, and intravoxel incoherent motion have comparable diagnostic accuracy with high sensitivity and specificity. Intravoxel incoherent motion is comparable to apparent diffusion coefficient. Diffusion-tensor imaging is potentially promising but to date the number of studies is limited.

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MRI has high sensitivity but lower specificity (93% and 71%, respectively) (1) for the depiction of breast lesions. To improve specificity, the diffusion properties of breast lesions have been investigated. The apparent diffusion coefficient (ADC), measured by using diffusion-weighted imaging (DWI), is increasingly used as a marker in the detection and characterization of breast lesions. The ADC of a malignant lesion is lower than that of a benign lesion because of the restricted diffusion in regions of high cellular density, which is often the result of proliferation of glandular tissue. Multiple studies have set a threshold value for ADC and assessed the diagnostic utility in identifying malignant and benign lesions. Advanced diffusion models attempt to capture more complex aspects of the tumor microenvironment, including diffusion

anisotropy and deviation from the monoexponential model due to perfusion effects.

Diffusion-tensor imaging (DTI) is an extension of diffusion MRI that considers the anisotropy and directionality of diffusion because of the effects of restrictions imposed by cell membranes and walls of microstructures. DTI measures orthogonal eigenvectors of diffusion and their eigenvalues, $\lambda_1,\ \lambda_2,\$ and $\lambda_3,\$ from which the mean diffusivity, maximal anisotropy index $(\lambda_1-\lambda_3),\$ and fractional anisotropy can be calculated. DTI has been used in the differential diagnosis of glioblastoma (2), renal cell carcinoma (3), and prostate cancer (4), and in the breast to depict cancer and track the mammary ductal network (5).

Intravoxel incoherent motion (IVIM) was introduced by Le Bihan et al (6) as a method of separating the effects of diffusion and perfusion by fitting a biexponential

Abbreviations

 \mbox{ADC} = apparent diffusion coefficient, \mbox{DTI} = diffusion-tensor imaging, \mbox{DWI} = diffusion-weighted imaging, \mbox{IVIM} = intravoxel incoherent motion

Summary

Diffusion-weighted imaging, diffusion-tensor imaging, and intravoxel incoherent motion have comparable diagnostic performance for identification of breast malignancy at MRI.

Key Points

- Diffusion-weighted MRI for depicting malignant breast lesions has good sensitivity and specificity (89% and 82%, respectively), which is similar to that of dynamic contrast agent—enhanced MRI (93% and 71%, respectively).
- Intravoxel incoherent motion MRI has high sensitivity and specificity (88% and 79%, respectively) to identify malignant versus benign breast lesions; diffusion-tensor imaging has slightly better diagnostic accuracy (sensitivity and specificity, 93% and 90%, respectively).
- There is no evidence to suggest that choice of minimum *b* value improves diagnostic performance (ie, 0 or 50 sec/mm²).

model to the decay of signal by b value. In the IVIM model, tissue diffusivity is described by parameter D, pseudodiffusion or perfusion is the parameter D^* , and the perfusion fraction is the parameter f. This approach has been used in the brain (7), head and neck (8), and prostate (9). It was first used in the breast by Sigmund et al (10) to measure the differences in contribution of the microvasculature between malignant lesions and normal fibroglandular tissue.

Whereas previous meta-analyses have assessed the performance of the ADC model in differentiating between benign and malignant lesions (11–13), more advanced diffusion techniques aim to improve on the results of quantitative DWI. Our meta-analysis compares the diagnostic performance of these advanced diffusion techniques, including DWI, DTI, and IVIM to assess whether they achieve an improvement in diagnostic performance that justifies their higher computational complexity and longer imaging time, which are needed to acquire the range of b values or diffusion directions. Because of the lack of standardization in diffusion imaging, a subanalysis investigates how acquisition sequence variations affect diagnostic performance.

Materials and Methods

Literature Search

A search of PubMed and Embase was performed for studies that involved women older than 18 years between January 2000 and March 2018 by one of the authors (G.C.B., with 1 year of experience). The search terms for ADC studies included breast, diffusion, apparent diffusion coefficient, ADC, and monoexponential. The search terms for DTI studies included breast, diffusion tensor imaging, and DTI. The search terms for IVIM studies included breast, diffusion, intravoxel incoherent motion, IVIM, biexponential, and non-mono-exponential. A search of the lists of references from included studies was also performed.

Study Selection

Studies were included if they met the following eligibility criteria: published in a peer-reviewed journal (abstracts and conference proceedings excluded); in English; data obtained by using a 1.5-T or 3.0-T MRI machine with MRI acquisition information reported; DWI performed and ADC, DTI, or IVIM parameters calculated; the purpose of the study was to investigate the diagnostic performance of ADC, DTI, or IVIM with criteria for classifying benign and malignant lesions clearly stated (ie, threshold value used for a parameter and a computational method used); and sufficient information was reported to extract the number of true-positive, false-negative, false-positive, and true-negative findings classified by using the diagnostic criteria (if the values reported could not be reproduced, the study was excluded); and no limit was defined for age or sample size.

Data Extraction

A data extraction spreadsheet was developed. Data extraction was performed by one author (G.C.B.) and confirmed by a second reviewer (A.J.P., with 12 years of experience). The number of true-positive, false-negative, false-positive, and true-negative findings by using parameters ADC, mean diffusivity, prime diffusion coefficient (λ_1), maximal anisotropy index (λ_1 – λ_3), fractional anisotropy, D, f, and D^* were extracted. For studies that reported multiple sensitivities and specificities, we extracted the method that achieved the highest number of correctly classified lesions (true-positive findings + true-negative findings) to avoid overrepresentation of a sample. For studies that used both a training set and a test set, we extracted the test set values. We extracted reader 1 when studies had multiple readers. For authors with multiple studies published in the same year, we extracted values from only one of the studies.

Other information extracted included the following: mean age and age range or standard deviation (whichever reported), study design, MRI machine and vendor, breast coil used, b values (sec/mm²), repetition time, echo time, matrix size, section thickness, field of view, parallel acceleration (generalized autocalibrating parallel acceleration and sensitivity encoding, and acceleration factor), and fat suppression method. We contacted corresponding authors for missing information.

Data Quality Assessment

The Quality Assessment of Diagnostic Accuracy Studies—2 was performed to assess the quality of studies and likelihood of bias (14). We assessed risk of bias in four domains: patient selection, method of the index test (parameter measurement and use of appropriate threshold to classify lesions), use of histologic analysis as a reference standard, and flow and timing. We constructed funnel plots to visually examine publication bias. An asymmetric or skewed funnel plot suggested the presence of a publication bias. Asymmetry was quantified by using the Egger test (15), and a P value of less than .05 indicated publication bias. The degree of heterogeneity between studies was measured by Cochran Q test and Higgins P test (16) by using Meta-Disc version 1.4 (Clinical Biostatistics Unit, Hospital Ramon Y Cajal, Ma-

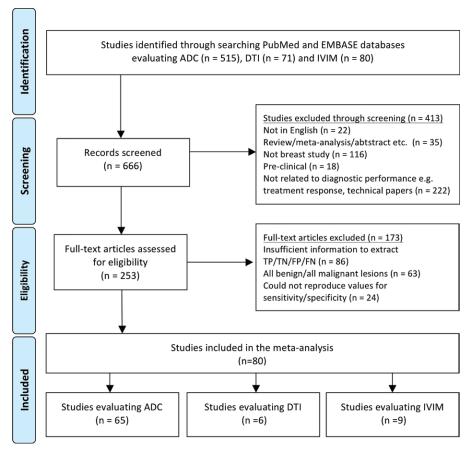


Figure 1: Flowchart for selection and exclusion of studies. ADC = apparent diffusion coefficient, DTI = diffusion-tensor imaging, FN = false negative, FP = false positive, IVIM = intravoxel incoherent motion, TN = true negative, TP = true positive.

Table 1: Combined Approaches by Using DTI and IVIM Parameters								
Author	Sensitivity (%)	Specificity (%)	Method					
Jiang et al (90)	80.6	74.3	Combined thresholds D^* , f					
Iima et al (91)	94.7	75.0	Combined thresholds f, ADC, K					
Jiang et al (27)	85.3	90.9	Combined thresholds FA and $\lambda_1 - \lambda_3$					
Dijkstra et al (22)	92.2	52.2	Combined thresholds D, D^*, f					
Bokacheva et al (53)	85.0	86.0	Linear discriminant analysis D, f					

Note.— λ_1 – λ_3 = maximal anisotropy index, ADC = apparent diffusion coefficient, D = tissue diffusivity coefficient, D^* = pseudodiffusion coefficient, f = perfusion fraction coefficient, FA = fractional anisotropy, K = diffusion kurtosis coefficient.

drid, Spain, http://www.hrc.es/investigacion/metadisc_en.htm). A P value less than .05 for Cochran Q test or an I² value of greater than 50% indicated statistically significant heterogeneity.

Statistical Analysis

For each of the parameters (ADC; mean diffusivity; λ_1 ; λ_1 – λ_3 ; fractional anisotropy; and D, f, and D^*), we constructed forest plots for sensitivity and specificity. We used the bivariate model by Reitsma et al (17) to estimate pooled sensitivities, specificities, and areas under the curve for all parameters and construct summary receiver operating characteristic curves. Analysis was performed by using statistical software (R version 3.1.3; R Foundation for Statistical Computing, Vienna, Austria) by using the mada package.

The effect of b value (minimum, maximum, and number used) and other MRI parameters such as field strength, vendor, use of partial field of view, section thickness, and resolution on diagnostic performance (sensitivity, specificity, and area under the receiver operating characteristic curve) was compared by using a Student t test, Mann-Whitney U test, or a one-way analysis of variance. Method of regionof-interest delineation (use of the whole lesion, a small region of interest, or a single section) was also compared with diagnostic performance by using an analysis of variance. A P value less than .05 indicated a statistically significant difference. The data were analyzed in R (R Foundation for Statistical Computing).

Results

Study Selection and Data Extraction

By using the key words, a search of the PubMed and Embase databases returned 515 ADC studies, and 65 of those met the eligibility criteria. A search for DTI returned 71 studies, and six of those met the eligibility criteria. A search for IVIM returned 80 studies, and nine of those met the eligibility criteria. We excluded 413 studies after a review of the titles and abstracts. We reviewed the full text of the remaining 253 studies and excluded 173 that did not meet the eligibility criteria. A total of 80 studies were included in the meta-analysis (5,18-89). Six studies evaluated both ADC and IVIM and one study evaluated both ADC and DTI for all patients included in the study. Figure 1

shows our flowchart of article exclusion. Details of included studies are provided in Table E1 (online). We included 6791 lesions (3930 malignant and 2861 benign) from 73 eligible studies. There was a large range of reported mean ADC values of malignant (0.66–1.50 \times 10⁻³ mm²/sec) and benign lesions (0.87–2.00 \times 10⁻³ mm²/sec). Reported diagnostic threshold ADC values ranged from 0.87 \times 10⁻³ mm²/sec to 2 \times 10⁻³ mm²/sec. A number of studies with DTI and IVIM used a combined-thresholds approach. The sensitivities and specificities of these studies are in Table 1. Jiang et al (90) reported a sensitivity and specificity for D^* and f combined, whereas Bokacheva et al (53) reported a combination of D and f by using linear discriminant analysis. Dijkstra et al (22) used all three

IVIM parameters and Iima et al (91) reported a combination of *f*, ADC, and diffusion kurtosis coefficient *K*. Jiang et al (27) also reported a combination of fractional anisotropy and the maximal anisotropy index.

FLOW AND □Low □High □Unclear TIMING QUADAS-2 Domain REFERENCE STANDARD INDEX TEST PATIENT SELECTION 100% 80% 20% 40% 60% 80% 100% 0% Proportion of studies with low, high or unclear Proportion of studies with low, high, or unclear **CONCERNS regarding APPLICABILITY**

Figure 2: Results of quality assessment for risk of bias and concerns regarding applicability of included studies. Quality assessment of diagnostic accuracy studies (QUADAS-2) scores for each category are expressed by percentages of studies that have a low, high, or unclear risk of bias.

Data Quality Assessment

Figure 2 shows the distribution of Quality Assessment of Diagnostic Accuracy Studies–2 scores for risk of bias. The majority of studies had a low risk of bias. Some studies

were marked as unclear concerning patient selection because of missing inclusion or exclusion criteria. Common weaknesses included the lack of justification for diagnostic threshold (n = 19), where receiver operating characteristic curves or other analyses were not used, or the lack of consistent use of histologic analysis as the reference standard for all patients (n = 11).

Figure 3 is a funnel plot of ADC studies and it has a funnel-shaped distribution; the lack of studies in the bottom left quadrant indicates publication bias. We measured significant asymmetry by using Egger test (P < .001). Because of the low number of

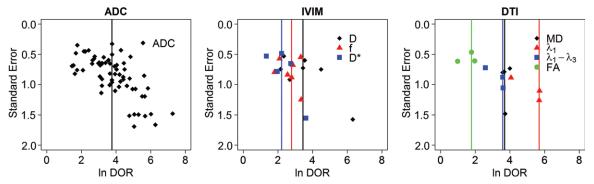
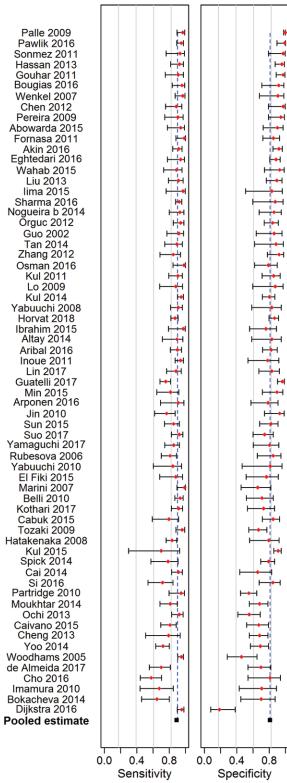


Figure 3: Funnel plots for apparent diffusion coefficient (ADC), intravoxel incoherent motion (IVIM), and diffusion-tensor imaging (DTI) parameters. Log of diagnostic odds ratio (DOR) is plotted against standard error. The vertical line represents the median. IVIM parameters include tissue diffusivity (D), perfusion fraction (f), and pseudodiffusion (D^*). DTI parameters include mean diffusivity (MD), the prime diffusion coefficient (λ_1), the maximal anisotropy index (λ_1 - λ_2), and the fractional anisotropy (FA).

No. of Parameter Studies				Heterogeneity		Specificity (%)	Heterogeneity		
	No. of Lesions*	Sensitivity (%)	Cochran Q P Value	I ² (%)	Cochran Q P Value		I ² (%)	AUC	
ADC	65	6408 (5892)	89 (87, 91)	<.001	71	82 (78, 85)	<.001	86	0.92 (0.91, 0.93)
D	7	536 (486)	88 (79, 92)	.001	72	79 (64, 89)	<.001	81	0.90 (0.85, 0.96)
f	7	397 (366)	81 (74, 86)	.34	12	76 (64, 85)	.06	50	0.85 (0.81, 0.90)
D^*	5	334 (309)	82 (67, 91)	<.001	87	61 (37, 80)	<.001	85	0.80 (0.74, 0.87)
λ_1	3	201 (181)	93 (80, 98)	.10	56	90 (81, 95)	.59	0	0.94 (0.91, 0.96)
MD	4	262 (247)	90 (79, 96)	.03	66	78 (51, 92)	.001	86	0.92 (0.90, 0.97)
$\lambda_1 - \lambda_3$	3	201 (181)	73 (36, 93)	<.001	92	89 (62, 97)	.004	82	0.89 (0.77, 1.00)
FA	3	219 (200)	64 (42, 81)	.003	83	74 (62, 84)	.61	0	0.76 (0.68, 0.87)

Note.—Unless otherwise indicated, data in parentheses are 95% confidence intervals. λ_1 = prime diffusion coefficient, λ_1 - λ_3 = maximal anisotropy index, ADC = apparent diffusion coefficient, AUC = area under the receiver operating characteristic curve, D = tissue diffusivity, D^* = pseudodiffusion coefficient, f = perfusion fraction, FA = fractional anisotropy, f = Higgin f test, MD = mean diffusivity.

^{*} Data in parentheses are number of patients.



studies for each of the other parameters, funnel asymmetry and Egger test were not assessed.

Statistical Analysis

a.

Table 2 shows the results of the pooled analysis of ADC, DTI, and IVIM parameters. High heterogeneity between studies was

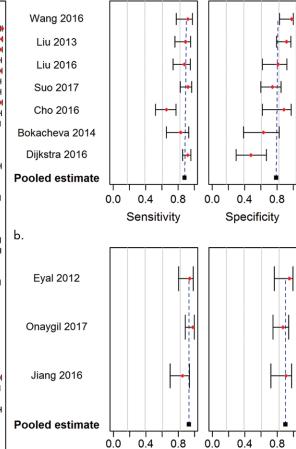


Figure 4: Forest plots of sensitivity and specificity with 95% confidence intervals per study by using **(a)** apparent diffusion coefficient, **(b)** tissue diffusivity, and **(c)** prime diffusion coefficient. Vertical lines denote pooled summary estimates of sensitivity and specificity.

Specificity

Sensitivity

measured for most parameters except f. f values of 0% were measured for the specificities of λ_1 and fractional anisotropy, however, the low number of studies included in the analysis (three studies for both) resulted in an undefined f value versus significant lack of heterogeneity because Cochran f values were .59 and .61, respectively. The pooled area under the curve of the ADC was 0.92. The highest performing parameter for DTI was λ_1 , with a pooled area under the curve of 0.94. The highest performing parameter for IVIM was f0, with a pooled area under the curve of 0.90. Forest plots for sensitivity and specificity for all three parameters are in Figure 4. Summary receiver operating characteristic curves are in Figure 5. Examples of studies that used DTI and IVIM are shown in Figures 6 and 7, respectively.

Table 3 shows the results of the subanalysis. For studies that used ADC, choice of minimum b value of 0 sec/mm² (n = 56) or 50 sec/mm² (n = 9) had no significant effect on sensitivity or specificity (P = .82 and P = .52, respectively). We found no significant differences (P > .05) in sensitivity and specificity for maximum b value, number of b values, field strength, vendor, partial field of view, section thickness,

spatial resolution, or method of region of interest delineation.

Discussion

Whereas other metaanalyses assessed the diagnostic performance of the apparent diffusion coefficient (ADC) model (11–13), to our knowledge, ours is the first study to systematically compare all relevant advanced non-Gaussian diffusion techniques with

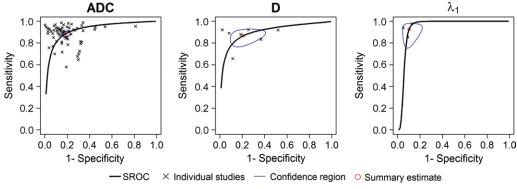


Figure 5: Summary receiver operating characteristics (SROC) curves by using the bivariate model with 95% confidence regions. The pooled area under the curve was 0.92 for the apparent diffusion coefficient (ADC), 0.90 for tissue diffusivity (D) and 0.94 for the prime diffusion coefficient $\{\lambda_1\}$.

standard diffusion-weighted imaging (DWI) for quantitatively distinguishing benign and malignant lesions. The pooled estimates of sensitivity, specificity, and area under the receiver operating characteristic curve were found to be comparable for ADC, intravoxel incoherent motion (IVIM), and diffusion-tensor imaging (DTI). However, because of the small number of studies included and the large confidence intervals, this meta-analysis lacks the statistical power to conclude that they are diagnostically equivalent.

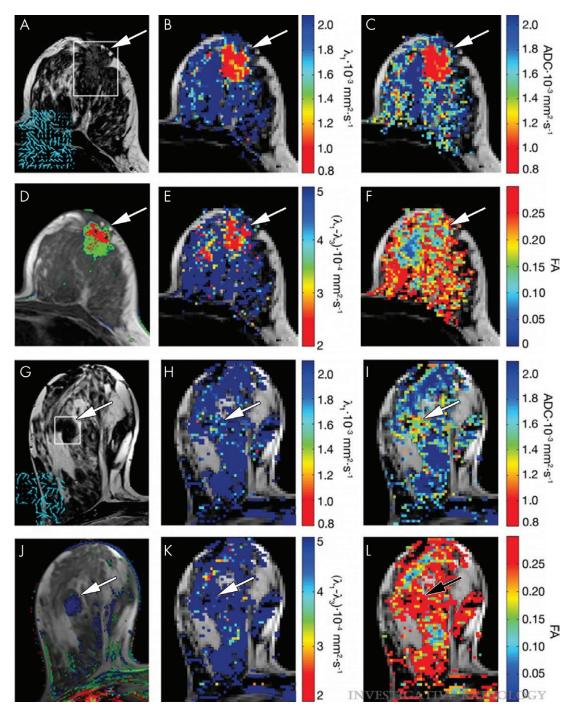
The pooled sensitivities and specificities of DWI, IVIM, and DTI in our meta-analysis were comparable to the pooled sensitivity and specificity of dynamic contrast agent—enhanced MRI (93% and 71%, respectively) (1). Other non-Gaussian diffusion models have been proposed, such as diffusion kurtosis and the stretched exponential model, though these were not investigated because there have been few publications to date. A study by Suo et al (73) showed that kurtosis and stretched exponential achieved a better goodness-of-fit, although the areas under the receiver operating characteristic curve for nonmonoexponential models were comparable to the ADC, which was in accordance with our findings.

DTI lacks standardization in method and reporting of parameters. The prime diffusion direction (λ_1) and the mean diffusivity achieved a diagnostic accuracy equal to or greater than the ADC; however, the number of eligible studies included is low. Whereas it is suggested that reduced structuring in malignant breast lesions should be reflected by a reduced diffusion anisotropy (66), anisotropy measures achieved a mixed diagnostic utility; some studies find no significant difference in fractional anisotropy between malignant and benign lesions (40,57). The number of diffusion directions used ranged from six to 64, though use of the b value pair 0 and 1000 sec/mm² was the most common (27,40,57,66).

Whereas the increasingly used technique of IVIM in the breast achieves a high diagnostic accuracy, there is also still a lack of consistent methods. There is a large variation in the number and range of b values used and in the choice of parameters reported, and studies often use a combined-thresholds approach. Variations in MRI technique prevent determination of generalized threshold values because ADC

Parameter	Sensitivity P Value	Specificity <i>P</i> Value
Minimum b value (0 or 50 sec/mm²)	.82	.52
Maximum b value	.08	.71
No. of <i>b</i> values	.84	.94
Field strength (1.5 T or 3.0 T)	.14	.64
Vendor	.93	.78
Partial field of view	.79	.43
Section thickness	.60	.72
Spatial resolution	.90	.65
Method of region-of-interest delineation	.66	.57

quantification depends on the choice of b values (92). A number of single-center studies have reported their optimal b value combination. Bogner et al (93) reported optimal ADC determination and DWI quality at b values of 50 and 850 sec/mm². Dorrius et al (94) indicated that b values of 0 and 1000 sec/mm² were optimum, and they found that this bvalue combination achieved the highest percentage difference in ADC of benign and malignant lesions. The b values 0 and 1000 sec/mm² were the most commonly used in our metaanalysis (n = 29). It has been suggested that the use of more bvalues achieves a better separation of diffusion and perfusion (95), particularly at low b values where the contribution of perfusion to signal decay is strongest (6). Whereas this may suggest avoiding low b values, the precise b value threshold for minimizing perfusion effects has not been standardized and choice of minimum b value showed no significant difference in diagnostic performance in studies in our meta-analysis, though this may be because of the lack of statistical power. Also, the diagnostic accuracy of *D*, corresponding to an ADC measurement with effects of perfusion excluded, was comparable to standard DWI. Whereas to our knowledge there is no consensus on whether excluding b value of 0 sec/mm2 or avoiding low b values constitutes excluding perfusion effects, both approaches have been shown to have limited effect on diagnostic performance. Choice of fat suppression technique



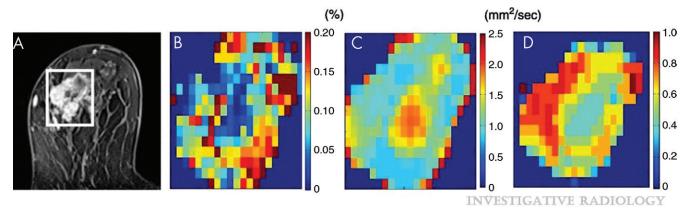


Figure 7: Invasive ductal carcinoma in a 61-year-old woman. *A*, Anatomic contrast-enhanced image. *B*, *f* intravoxel incoherent motion (IVIM) map. *C*, apparent diffusion coefficient (ADC) map. *D*, K map. The white rectangle in *A* shows the area covered by the parametric maps. The high *f* IVIM fraction area at the periphery of the tumor in *B* matches the contrast-enhanced lesion in *A*. The lesion center has low perfusion, which suggests necrosis. An area on the left part of the tumor exhibits a low ADC₀ with high *K* value, which suggests high cellularity (ie, viable malignant component), whereas the central part has a high ADC and low K, suggesting lower cellularity (ie, possible necrosis). Reprinted, with permission, from reference 39.

such as short-T inversion recovery or spectral adiabatic inversion recovery has been shown to influence image quality and ADC quantification, although diagnostic performance was comparable (96). These discrepancies highlight the importance of choosing similar protocols and methods of data analysis to compare studies across multiple centers.

Our meta-analysis had limitations. First, the low number of studies contributing to the pooled estimates resulted in large confidence intervals, which limited the conclusions that could be drawn from the comparable areas under the curve. Second, overrepresentation of a sample may be a limitation of our pooled estimates because we included multiple studies from the same author that may have used the same patient population. Third, for studies that did not report true-positive, false-negative, false-positive, and true-negative findings, we calculated these outcomes from sensitivity, specificity, and number of malignant and benign lesions. However, many studies were excluded (n = 24) because they resulted in a noninteger number of lesions. Finally, because of the small numbers of publications, we did not include other nonmonoexponential models.

In conclusion, diffusion-weighted imaging, diffusion-tensor imaging (DTI), and intravoxel incoherent motion (IVIM) were able to discriminate between malignant and benign lesions with a high sensitivity and specificity. IVIM was diagnostically comparable to apparent diffusion coefficient (ADC), although the exclusion of perfusion effects that used the tissue diffusion coefficient (D) did not improve on the results of the ADC model. DTI achieved a higher accuracy than did ADC, although the number of studies to date is limited. Both IVIM and DTI lack standardization in the reported methods and parameters.

Author contributions: Guarantors of integrity of entire study, G.C.B., F.J.G., A.J.P.; study concepts/study design or data acquisition or data analysis/interpretation, all authors; manuscript drafting or manuscript revision for important intellectual content, all authors; approval of final version of submitted manuscript, all authors; agrees to ensure any questions related to the work are appropriately resolved, all authors; literature research, G.C.B., F.J.G., A.J.P.; statistical analysis, G.C.B., A.J.P.; and manuscript editing, all authors

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