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Antibody-mediated Rejection Without Detectable Donor-specific Antibody Releases Donor-derived Cell-free DNA: Results From the Trifecta Study

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Background. Trifecta (ClinicalTrials.gov #NCT04239703) is a prospective trial defining relationships between donor-derived cell-free DNA (dd-cfDNA), donor-specific antibody (DSA), and molecular findings in kidney transplant biopsies. Previous analyses of double results showed dd-cfDNA was strongly associated with rejection-associated molecules in the biopsy. The present study analyzed the triple results in 280 biopsies, focusing on the question of dd-cfDNA levels in DSA-negative antibody-mediated rejection (AMR). **Methods.** Molecular Microscope Diagnostic System biopsy testing was performed at Alberta Transplant Applied Genomics Centre, dd-cfDNA testing at Natera, Inc, and central HLA antibody testing at One Lambda Inc. Local DSA and histologic diagnoses were assigned per center standard-of-care. **Results.** DSA was frequently negative in both molecular (56%) and histologic (51%) AMR. DSA-negative AMR had slightly less molecular AMR activity and histologic peritubular capillaritis than DSA-positive AMR. However, all AMRs—DSA-positive or -negative—showed elevated %dd-cfDNA. There was no association between dd-cfDNA and DSA in biopsies without rejection. In AMR, %dd-cfDNA ≥ 1.0 was more frequent (75%) than DSA positivity (44%). In logistic regression, dd-cfDNA percent (area under the curve [AUC] 0.85) or quantity (AUC 0.86) predicted molecular AMR better than DSA (AUC 0.66). However, the best predictions incorporated both dd-cfDNA and DSA, plus time posttransplant (AUC 0.88). **Conclusions.** DSA-negative AMR has moderately decreased mean molecular and histologic AMR-associated features compared with DSA-positive AMR, though similarly elevated dd-cfDNA levels. In predicting AMR at the time of indication biopsies in this population, dd-cfDNA is superior to DSA, reflecting the prevalence of DSA-negative AMR, but the optimal predictions incorporated both dd-cfDNA and DSA.

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Trifecta Study Clinical Trial Notation: ClinicalTrials.gov # NCT04239703.

INTRODUCTION

Plasma donor-derived cell-free DNA (dd-cfDNA) is elevated by the presence of rejection and injury in organ transplants,^{1–14} making it of interest as a noninvasive screening test for following transplant recipients. Dd-cfDNA is usually expressed as a fraction of the total cfDNA, but recent

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analyses indicate that using dd-cfDNA quantity also has value.^{15,16} Another test widely used to assess risk of rejection is the donor-specific HLA antibody (DSA) to predict antibody-mediated rejection (AMR), but this has been complicated by the recognition of DSA-negative AMR.¹⁷⁻²⁰

We recently launched the Trifecta study to determine the relationships among 3 independent assessments done centrally at the time of the indication biopsy: dd-cfDNA, DSA, and the molecular phenotype of the biopsy as assessed by the Molecular Microscope Diagnostic System (MMDx).²¹ The initial Trifecta report analyzed the relationship between %dd-cfDNA and molecular biopsy results in the first 300 consecutive biopsies with both measurements.²¹ The case mix was similar to previous indication biopsy studies: 60% no rejection, 30% AMR, and 10% T cell-mediated rejection (TCMR) or mixed rejection. Dd-cfDNA was strongly related to active molecular rejection in the biopsies. The top genes in the biopsy correlating with %dd-cfDNA had all been previously correlated with AMR activity, including natural killer (NK) cell-expressed genes (eg, *GNLY*, *CCL4*, *TRDC*, and *SIPR5*) and *IFNG*-inducible genes (eg, *PLA1A*, *IDO1*, *CXCL11*, and *WARS*).²²⁻²⁵ The %dd-cfDNA was also high in active TCMR and in early biopsies with acute kidney injury. Multivariate random forests and logistic regression both showed that %dd-cfDNA was more strongly associated with molecular rejection than histologic rejection, confirming a previous study.⁵

The present study is the first analysis of the Trifecta triple relationships: dd-cfDNA versus DSA versus molecular biopsy findings. We studied 280 biopsies selected from the cohort of 300 previously reported,²¹ excluding only the 20 biopsies for which central HLA antibody testing could not be assessed. We evaluated the relative ability of DSA and dd-cfDNA blood tests at the time of indication biopsy for predicting molecular AMR in the biopsy. Given that AMR can be DSA-negative,¹⁹ we were particularly interested in the frequency of DSA-negative AMR and whether the dd-cfDNA levels were elevated in both DSA-negative and DSA-positive AMR.

Abbreviations and their definitions are shown in Table S1 (SDC, <http://links.lww.com/TP/C545>).

MATERIALS AND METHODS

Trifecta Study Population

Trifecta (ClinicalTrials.gov #NCT04239703) is a prospective multicenter study of consenting patients involving 41 investigators from 18 transplant institutions (Table S2, SDC, <http://links.lww.com/TP/C545>) under local institutional review board–approved protocols as previously described.²¹ Of the 300 biopsies already reported,²¹ 20 had to be excluded from the present report because DSA was not analyzable, leaving 280 with complete triple results. The study features are outlined in Figure 1. Central DSA/panel-reactive antibody (PRA) and dd-cfDNA (both quantity and percentage of total) were measured in blood drawn at time of biopsy per established protocols. Blood for dd-cfDNA was always taken before the biopsy to avoid detecting dd-cfDNA released by the procedure. MMDx results were immediately transmitted to the center. Central DSA and dd-cfDNA results were not made known to the

center until many months postbiopsy to avoid influencing the decision to biopsy or patient management, although the centers did have access to their standard-of-care (SOC) DSA test results at the time of local diagnosis assignment.

Biopsy Sample, Data Collection, and Histologic Diagnoses

A portion of 1 core of each biopsy (mean length 3 mm)²⁶ was immediately stabilized in RNAlater and shipped to the Alberta Transplant Applied Genomics Centre (<http://atagc.med.ualberta.ca>) at ambient temperature for RNA extraction and processing as previously described.²⁶ Gene expression was measured using Affymetrix PrimeView microarrays (N=49 495 probe sets). All molecular analyses and diagnoses were made without knowledge of the biopsy's corresponding histology, clinical data, HLA antibody status, or dd-cfDNA results. MMDx reports were sent to the participating centers, usually within 2 working days of receiving the biopsy.

Of the 280 biopsies, 265 had available local histologic diagnoses assigned by the center (9 missing, 6 with inadequate material for assessment). Histologic and clinical data and DSA testing were collected at each center per SOC as approved by institutional review boards and submitted to the study as available. Central histology review was not permitted because it was not SOC. The histology findings were based on the local SOC opinion, following Banff 2019 guidelines. As detailed in the earlier report, histology diagnoses were entered into a database, interpreted as “no rejection,” “AMR,” “possible AMR,” “TCMR,” “possible TCMR,” and “mixed rejection” (with no knowledge of MMDx results) to compare the molecular and histology results using the same categories.

The Molecular Microscope Diagnostic System

The Molecular Microscope Diagnostic System (MMDx) is a central biopsy-based diagnostic system that measures genome-wide mRNA expression to assign molecular diagnoses. New samples are normalized against and compared with results in a large reference set (N=1208). Automated output from machine-learning algorithms (classifiers) is used to make observer-independent archetype assignments.²⁷⁻²⁹ Archetypal analysis automatically assigns scores to each biopsy describing its relationship to each archetype group: no rejection, TCMR1 (active TCMR, often mixed), TCMR2 (less active TCMR), early stage AMR, fully developed AMR, and late-stage AMR, which is often relatively inactive.^{20,29} Archetypes recognize only the dominant phenotype and do not designate a separate mixed category.

In addition to automatic archetypes, the reports were given MMDx sign-outs by an expert reader based on the ensembles of molecular features without knowledge of DSA or dd-cfDNA: AMR, possible AMR, TCMR, possible TCMR, no rejection, and mixed rejection.

The %dd-cfDNA Assay

All blood samples for dd-cfDNA testing were collected immediately before the biopsy.³⁰ Blood samples were drawn in two 10-mL quantities in DNA Streck tubes using 20- to 21-gauge needles and shipped immediately per established protocols to Natera (Natera Inc., Austin, TX) for analysis using the Prospera test. The Prospera test amplifies DNA by massively multiplexed-PCR targeting 13 926 single nucleotide polymorphisms designed to maximize

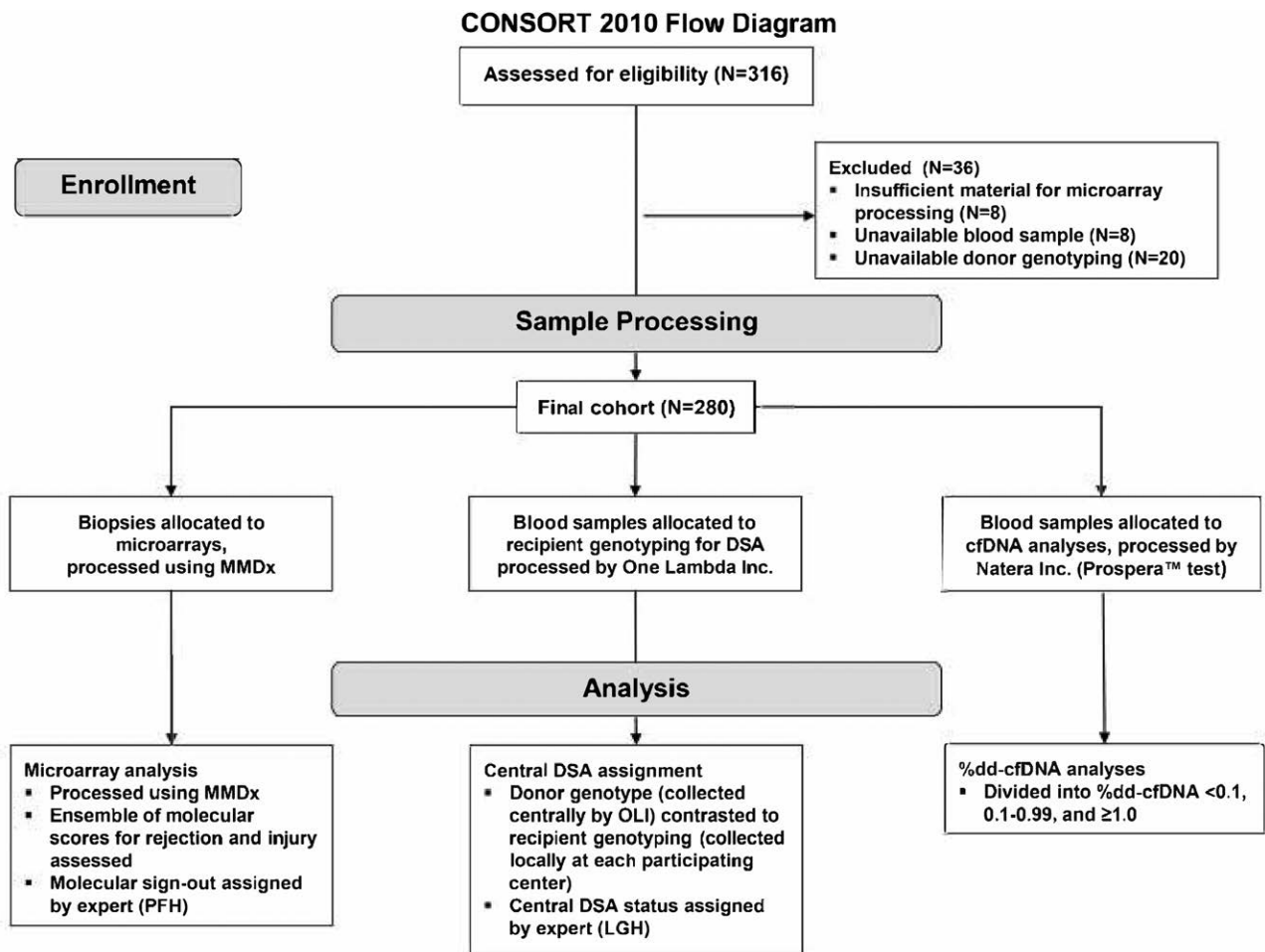


FIGURE 1. CONSORT flow diagram of the study design. CONSORT, Consolidated Standards Of Reporting Trials; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; OLI, One Lambda Inc.

the number of informative SNPs across ethnicities. This was followed by next-generation sequencing of the resultant amplicons on the Illumina NextSeq 500 on rapid run with an average of 8 million reads per sample.³¹ Samples were processed using standard operating procedures in the Clinical Laboratory Improvement Amendments–certified laboratory responsible for running the Prospera test.

For all samples, the dd-cfDNA fraction (analyzed as the percentage of total cfDNA, %dd-cfDNA) and quantity (genomic copies per milliliter; cp/mL) were measured. Most analyses in this study focused on the %dd-cfDNA, either as continuous numbers or using cutoffs (the historical diagnostic cutoff of ≥1%). However, because recent studies have suggested that actual dd-cfDNA quantity may also be diagnostically useful,^{15,32} in logistic regression, we assessed the predictive ability of the quantitative dd-cfDNA measurement (copies per mL), as well as %dd-cfDNA. All samples were analyzed, irrespective of time posttransplant and other potential confounders (eg, cancer), and thus the predictions are not intended to simulate the clinical results when a variety of exclusions are applied.

Central HLA Antibody Measurements and DSA Interpretation

Serum samples for HLA antibody testing by One Lambda Inc (OLI) were collected at the time of biopsy

and shipped per standard protocols to OLI for centralized testing. HLA antibodies were tested using Luminex single antigen beads (OLI, Canoga Park, CA) according to the manufacturer's recommendations. Donor and recipient HLA genotypes were provided by each center. HLA antibody test results were interpreted as DSA by a single expert (L.G.H.), blinded to other results.

HLA antibody specificities were interpreted as positive using a mean fluorescence intensity (MFI) threshold of 500. DSA was generally identified when the beads corresponding to the donor HLA type had ≥500 MFI. However, assignment of HLA antibody specificities did not depend solely on MFI cutoffs, rather they were assigned based on additional criteria, including patterns of epitope reactivity, avoidance of nonspecific bead reactivities, and assay background. Samples negative for all HLA antibodies were labeled PRA-negative (and by definition DSA-negative); samples positive for HLA antibodies but negative for DSA were labeled as DSA-negative-PRA-positive. Biopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRA–high risk (PRAHR) and were analyzed here as DSA-positive.

As SOC, HLA antibody studies were also performed in each center and recorded. These results were available in the local centers at the time of the histology diagnoses.

Statistics

All analyses used version 4.1.0 of R.³³ Logistic regression was used to predict AMR/mixed, with DSA (\pm), time of biopsy posttransplant, %dd-cfDNA, and donor cfDNA quantity as predictors. The latter 3 had skewed distributions and were therefore log-transformed for all analyses. Likelihood ratio tests were used to compare nested models. Akaike's information criterion (AIC) is an estimate of model fit and is used to compare the relative quality of various predictive models. AICs were used to compare nonnested models (lower values are better, and differences of >2 are significant).

RESULTS

Demographics

Demographics of the 280 biopsies (Table S3, SDC, <http://links.lww.com/TP/C545>) were similar to those published for the published 300 biopsy cohort from which they were selected.²¹

Central DSA-negative Assessments Agree With Local DSA-negative Assessments

For 170 biopsies, DSA was tested locally as SOC. Agreement between central and local DSA-negativity calls was strong (Table 1): of 116 called DSA-negative locally, 113 of 116 (97%) were called DSA-negative centrally. Thus, the DSA-negative status was robust in 2 independent assessments.

From this point on, "DSA" and "PRA" refer only to central test results.

Approximately Half of All AMR Is DSA-negative

There were 220 DSA-negative and 60 DSA-positive patients at the time of biopsy. Table 2 categorizes the biopsies by diagnosis. By MMDx sign-outs, automatically-assigned archetype groups, and histology diagnoses, DSA was increased in AMR compared with no rejection. However, 56% of MMDx sign-out AMRs, 63% of AMR-related archetypes, and 51% of histology AMRs were DSA-negative. Therefore, at least half of all AMRs in this prospective study were DSA-negative.

DSA-negative AMR Has Lower AMR Activity Than DSA-positive

Table 3 shows the molecular scores for gene sets and classifiers in DSA-negative and DSA-positive AMR, as well as no rejection.

All AMR-related gene sets and classifier scores were high in both DSA-positive and DSA-negative AMR compared with no rejection. However, despite being high in both, all AMR-related scores were slightly but significantly lower in DSA-negative AMR than in DSA-positive AMR. Scores related to TCMR, macrophages, recent injury, normal parenchyma, and atrophy-fibrosis were low in AMR and not different between DSA-negative and DSA-positive AMR. Additionally, DSA-negative AMR had lower histologic AMR activity, as represented by less peritubular capillaritis (lower ptc-score; Table S4, SDC, <http://links.lww.com/TP/C545>). These findings are similar to the findings in the INTERCOMEX study in a different population.²⁰

DSA Positivity Is Associated With Higher %dd-cfDNA in the Whole Population

Positive DSA was associated with higher %dd-cfDNA levels across the whole 280-biopsy population: geometric mean of 0.45% in DSA-negative versus 1.28% in DSA-positive ($P = 3.7 \times 10^{-7}$).

dd-cfDNA Is High in Both DSA-negative AMR and DSA-positive AMR

Table 4 shows the %dd-cfDNA in DSA-negative versus DSA-positive biopsies, broken down by diagnosis (MMDx sign-outs, archetype group assignments, or histology diagnoses). Regardless of the diagnostic method, %dd-cfDNA was increased in both DSA-negative and DSA-positive AMR. The %dd-cfDNA was numerically higher in DSA-positive AMR than DSA-negative AMR (difference not significant).

The %dd-cfDNA was increased in TCMR as previously reported.²¹ In biopsies with TCMR but no detectable AMR, DSA-positive TCMR did not have significantly higher %dd-cfDNA than DSA-negative TCMR, although there was a numerical trend. However, the relatively small number of TCMR biopsies limits the conclusions.

In biopsies with no rejection, DSA positivity was not associated with significantly increased mean %dd-cfDNA.

Details of Relationships Between DSA and dd-cfDNA

In Table 5, the rows stratify %dd-cfDNA at 1.0 and 0.1, and the columns show the DSA and PRA details. Dd-cfDNA percent ≥ 1.0 was more common in DSA-positive biopsies overall. Most instances of DSA positivity were anti-class II. High %dd-cfDNA ($\geq 1.0\%$) was found in 29 of 44 DSA-positive and 8 of 16 DSA-negative

TABLE 1. Comparing local and central DSA and PRA in the 280-biopsy cohort

Local DSA assessments		Central DSA assessments								
Central DSA assessments	DSA	Class I	Class I/II	Class II	Positive/class not designated	Negative	Total recorded	Not done/missing	Total	
	Class I	4	1	1	0	0	6	3	9	
	Class I/II	0	0	5	0	0	5	1	6	
	Class II	0	5	14	1	3	23	6	29	
	Negative	3	2	13	2	108	128	92	220	
	PRAHR ^a	0	1	2	0	5	8	8	16	
	Total	7	9	35	3	116	170	110	280	

Shading indicates row and column totals.

^aIncludes PRAHR. Biopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRAHR in this study. DSA, donor-specific antibody; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high risk.

TABLE 2.**Diagnoses in 280 biopsies grouped by DSA status**

Biopsy groups	Number of biopsies		
	DSA-negative (N=220)	DSA-positive ^a (N=60)	Total
MMDx diagnoses			
No rejection	147	17	164
Possible TCMR	6	0	6
TCMR	15	5	20
Possible AMR	7	3	10
AMR	36	25	61
Mixed (AMR + TCMR)	9	10	19
<i>All AMR (including mixed) (% of row total)</i>	<i>45</i>	<i>35</i>	<i>80</i>
Automated rejection (K1208) archetype			
No rejection	150	19	169
TCMR1 (many mixed)	4	5	9
TCMR2	15	6	21
Early AMR	21	8	29
Full AMR	16	20	36
Late AMR	14	2	16
<i>All AMR</i>	<i>51</i>	<i>30</i>	<i>81</i>
Histology diagnoses			
No rejection	112	8	120
Possible TCMR	28	1	29
TCMR	22	7	29
Possible AMR	16	12	28
AMR	23	21	44
Mixed (AMR + TCMR)	7	8	15
<i>All AMR (including mixed)</i>	<i>30</i>	<i>29</i>	<i>59</i>
Missing	12	3	15

Bolding indicates rows with AMR, mixed. Bolding and italics indicate All AMR.

^aIncludes PRAHR. Biopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRAHR in this study and were analyzed as DSA-positive.

AMR, antibody-mediated rejection; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high-risk biopsy, TCMR, T cell–mediated rejection.

PRAHR (total 37/60 or 62%) versus 67 of 220 (30%) DSA-negative biopsies. Among the 220 DSA-negative biopsies, the fraction of %dd-cfDNA positive was not significantly different in PRA-positive (45/127, 35%) versus PRA-negative (22/93, 24%). Very low %dd-cfDNA was uncommon in DSA-positive—2 of 60 (3%)—compared with DSA-negative—33 of 220 (16%).

Visualizing Triple Relationships %dd-cfDNA in DSA-negative AMR

Biopsies are plotted in Figure 2A by their %dd-cfDNA (y-axis) and DSA class/status (x-axis). The %dd-cfDNA ≥ 1.0 cutoff is shown by the dashed red line, and biopsies called molecular AMR or mixed (by MMDx sign-outs) are represented as blue symbols.

Of 80 MMDx AMR/mixed biopsies, 60 (75%) had %dd-cfDNA ≥ 1.0 , and 35 (44%) were DSA-positive (including PRAHR as DSA-positive).

Many DSA-negative and DSA-positive AMR/mixed biopsies had high dd-cfDNA. Of 45 DSA-negative AMR/mixed, 33 (73%) had %dd-cfDNA ≥ 1.0 . Of 35 DSA-positive AMR, 27 (77%) had %dd-cfDNA ≥ 1.0 .

DSA-negative AMR patients were usually sensitized: 30 of 45 (67%) were PRA-positive (Figure 2B). However, among DSA-negative AMRs, PRA positivity was not associated with higher dd-cfDNA: 11 of 15 (73%) PRA-negative versus 22 of 30 (73%) PRA-positive had %dd-cfDNA

≥ 1.0 . Table 6 shows that, in DSA-negative AMR/mixed biopsies, the mean %dd-cfDNA level was similar in PRA-positive and PRA-negative biopsies.

Figure 2C shows details of the overlaps between the biopsies with MMDx AMR and TCMR, DSA positivity, and %dd-cfDNA ≥ 1.0 .

AMR Was More Frequently dd-cfDNA-Positive Than DSA-positive

Table 7 compares the number (%) DSA-positive to the %dd-cfDNA-positive (≥ 1.0) biopsies in the 280-biopsy population. As stated above, within AMR/mixed, 44% were DSA-positive, and 75% were %dd-cfDNA-positive. There were more %dd-cfDNA-positive than DSA-positive biopsies in most categories, including in no rejection (18% versus 10%) and in TCMR (60% versus 25%), as expected because the 2 tests reflect different processes.

dd-cfDNA Is Better Than DSA for Predicting Molecular AMR

The DSA and %dd-cfDNA tests are used differently as predictors: DSA is used to assess the probability of AMR, and %dd-cfDNA is used to assess the probability of any active rejection, including TCMR (though it is also affected by AKI²⁰). To compare dd-cfDNA and DSA directly, we used logistic regression to assess their relative ability to predict the same molecular process, namely,

TABLE 3.
Molecular activity scores in 35 DSA-positive vs 45 DSA-negative MMDx AMR/mixed biopsies

Transcript sets and classifiers		MMDx mixed and AMR (N = 80)			
		MMDx no rejection (N = 164)	DSA-negative (N = 45)	DSA-positive ^a (N = 35)	DSA-positive vs DSA-negative AMR/mixed (Wilcoxon test <i>P</i>)
AMR-related	AMR (AMR _{Prob}) classifier	0.06	0.53	0.64	0.05
	Glomerular double contours (cg > 0 _{Prob}) classifier	0.13	0.44	0.57	0.05
	Glomerulitis (g > 0 _{Prob}) classifier	0.14	0.58	0.66	0.06
	Peritubular capillaritis (ptc > 0 _{Prob}) classifier	0.13	0.66	0.78	0.004
	DSA probability (DSA _{Prob}) classifier	0.29	0.60	0.68	0.03
All rejection	Rejection (Rej _{Prob}) classifier	0.07	0.66	0.80	0.005
TCMR-related	TCMR (TCMR _{Prob}) classifier	0.02	0.09	0.15	0.37
	Interstitial infiltrate (i > 1 _{Prob}) classifier	0.05	0.24	0.27	0.38
	Tubulitis (t > 1 _{Prob}) classifier	0.05	0.17	0.24	0.60
Macrophage-related	Constitutive macrophage-associated transcripts (QCMAT)	0.32	0.74	0.76	0.67
	Alternative macrophage activation transcripts 1 (AMAT1)	0.43	0.97	1.07	0.16
Recent injury	Injury/repair associated transcripts (human kidney) (IRRAT30)	0.32	0.68	0.60	0.67
	Injury-repair induced transcripts, d 3 (IRITD3)	0.04	0.16	0.13	0.95
Normal parenchymal	Kidney transcripts – set 1 (KT1)	–0.28	–0.47	–0.48	0.67
Atrophy fibrosis	Interstitial fibrosis (ci > 1 _{Prob})	0.35	0.53	0.61	0.18
	Tubular atrophy (ct > 1 _{Prob})	0.29	0.45	0.52	0.31

Bold indicates $P < 0.05$; bold and underline indicates $P < 0.01$.

Shading indicates rows with AMR-related variables.

^aIncludes PRAHR biopsies. Biopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRAHR in this study and were analyzed as DSA-positive. AMR, antibody-mediated rejection; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high risk; TCMR, T cell–mediated rejection.

MMDx sign-outs of AMR including mixed rejection. (Histologic AMR that cannot be used for DSA is used as the target of the comparison part because the Banff guidelines for AMR use DSA as part of the diagnostic criteria for AMR.) We also included the dd-cfDNA quantity and time of biopsy posttransplant (TxBx) as predictor variables. No additional variables were used for this analysis because the goal was to compare the relative predictive ability of the 4 variables.

Logistic regression models are shown in Table 8. The areas under the curve for the 4 single variables in descending order were dd-cfDNA quantity (0.85), %dd-cfDNA (0.84), DSA status (0.66), and TxBx (0.61). Using AICs to compare models with single predictors, %dd-cfDNA predicted AMR/mixed better than DSA status (AIC 248.2 versus 308.4; smaller AICs are better, and differences >2 are usually considered to be significant). Dd-cfDNA quantity was slightly better than %dd-cfDNA but not significantly so (AICs 246.4 versus 248.2).

Considering models with 2 predictors, %dd-cfDNA added significantly to a model using DSA alone ($P < 1 \times 10^{-16}$). Adding dd-cfDNA quantity to %dd-cfDNA was better than either alone: quantity added more significantly to percent than vice versa ($P = 0.007$ versus $P = 0.01$, respectively). Quantity of dd-cfDNA or %dd-cfDNA each added greatly to DSA alone ($P < 1 \times 10^{-16}$ for each). DSA added slightly to %dd-cfDNA alone ($P = 0.001$). In each of these analyses, increased risk of AMR is associated with higher values of dd-cfDNA (quantity or %), longer time posttransplant, and DSA positivity.

Quantity dd-cfDNA adds slightly but significantly to %dd-cfDNA + DSA. Adding TxBx to quantity dd-cfDNA + %dd-cfDNA + DSA gave the best predictive model.

In summary, in predicting molecular AMR/mixed at the time of indication biopsy, dd-cfDNA (percent, quantity, or both) was superior to DSA alone. DSA added a small but significant predictive value to dd-cfDNA, and the best predictive model used dd-cfDNA quantity and percent, DSA, and time of the biopsy posttransplant.

DISCUSSION

Trifecta is a prospective multicenter study aimed at defining the relationship between blood tests performed at the time of indication biopsy and the findings in the biopsy, with all cases having the same independent, objective, and centrally performed tests. The present analysis addresses the triple relationship, DSA, dd-cfDNA, and molecular AMR in the biopsy, building on the double relationship between %dd-cfDNA and molecular AMR previously established.²¹ We were particularly interested in the frequency of DSA-negative AMR, its rejection activity relative to DSA-positive AMR, and its dd-cfDNA levels. DSA-negative status was robust in central and local assessment, with central testing confirming 97% of local SOC DSA-negative calls. In 280 biopsies with triple results from the published 300 biopsy cohort,²¹ about half of AMR was DSA-negative, whether molecular or histologic. AMR activity was slightly lower in DSA-negative than DSA-positive

TABLE 4.**Mean %dd-cfDNA in 280 biopsies grouped by DSA status**

Biopsy groups	Geometric mean %dd-cfDNA			
	DSA-negative (N = 220)	DSA-positive ^a (N = 60)	All (N = 280)	P DSA-negative vs DSA-positive ^b
(AMR and mixed are bold)				
MMDx diagnoses				
No rejection	0.31	0.40	0.32	0.40
Possible TCMR	0.20	–	0.20	–
TCMR	0.36	3.78	0.65	0.0004 (only 5 DSA-positive TCMR)
Possible AMR	0.45	0.76	0.53	0.60
AMR	1.77	2.11	1.90	0.55
Mixed (AMR + TCMR)	1.77	1.88	1.83	0.90
All AMR (including mixed)	1.77	2.04	1.88	0.56
Automated rejection (K1208) archetype				
No rejection	0.31	0.49	0.33	0.18
TCMR1 (many mixed)	2.28	2.71	2.51	0.83
TCMR2	0.39	2.46	0.66	0.005
Early AMR	1.57	1.84	1.64	0.74
Full AMR	2.29	2.08	2.17	0.79
Late AMR	0.34	0.52	0.36	0.33
All AMR (including mixed)	1.22	1.94	1.46	0.08
Histology				
No rejection	0.29	0.28	0.29	0.93
Possible TCMR	0.33	1.63	0.35	Only 1 DSA-positive pTCMR
TCMR	0.76	1.23	0.85	0.34
Possible AMR ^c	0.82	1.97	1.19	0.11
AMR	1.11	1.41	1.24	0.49
Mixed (AMR + TCMR)	1.82	3.00	2.38	0.41
All AMR (including mixed)	1.25	1.74	1.47	0.27
Inadequate	1.08	–	1.08	–
Missing	0.38	0.77	0.48	0.59

Bolding indicates rows with AMR and Mixed rejection, bolding and underlining indicate rows with all AMR.

^aIncludes panel-reactive antibody–high risk (PRAHR) biopsies. Biopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRAHR in this study and were analyzed as DSA-positive.

^bTwo-tailed Welch *t* tests on logged %dd-cfDNA values.

^cTransplant glomerulopathy was included in possible AMR.

AMR, antibody-mediated rejection; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; PRA, panel-reactive antibody; TCMR, T cell-mediated rejection.

AMR, confirming previous results.²⁰ DSA-negative AMR had high mean %dd-cfDNA, like DSA-positive AMR. The mean %dd-cfDNA was numerically slightly lower than in DSA-positive AMR (not significant), perhaps reflecting the lower AMR activity. In biopsies with AMR, %dd-cfDNA ≥ 1.0 was more frequently positive than DSA (75% versus 44%). In logistic regression, %dd-cfDNA or dd-cfDNA quantity both predicted AMR better than DSA, but DSA added modestly to predictions by dd-cfDNA alone. These findings are of particular interest given the rigorous trial design: a prospective, consented study with independent central assessments of HLA antibody, dd-cfDNA, and the molecular AMR diagnosis in all cases with no exclusions.

Across the population, dd-cfDNA was higher in DSA-positive cases, but this was because of the association of both with AMR. DSA positivity was not associated with higher dd-cfDNA in biopsies with no rejection.

The fact that elevated dd-cfDNA is a robust feature of DSA-negative, as well as DSA-positive, AMR adds to our understanding that DSA-negative AMR is essentially identical but slightly less active than DSA-positive AMR, as shown in previous studies.^{19,20,34} This impacts our discussion of the potential mechanisms operating in DSA-negative AMR. Possible explanations for DSA-negative

AMR are usually considered to be anti-HLA DSA not detected by the current platforms, failed recognition of DSA in PRA-positive patients due to incomplete donor genotyping, DSA against non-HLA alloantigens, autoantibody, and NK recognition of missing self (discussed below). The explanations may differ in individual cases. Patients with DSA-negative AMR were usually sensitized (30/45 or 67% PRA-positive in the present study), but the PRA status did not affect the dd-cfDNA results, arguing against a major role for failed DSA assignments in PRA-positive patients as an explanation for DSA-negative AMR. Moreover, we offset this risk when genotyping was incomplete by analyzing DSA-negative PRA-positive high-risk biopsies as presumed DSA-positive. We believe that most DSA-negative AMR cases are truly negative for circulating HLA DSA as defined currently, not simply artifacts of incomplete genotyping.

The fact that most DSA-negative AMR patients were allo-sensitized (PRA-positive), and the high association of HLA antibody with risk of AMR in the transplant population, supports the argument that all AMRs—DSA-negative or -positive—reflect an adaptive alloimmune response increased by previous sensitization, that is, probably an alloantibody. The rarity of AMR in HLA

TABLE 5.**%dd-cfDNA by DSA/PRA status in N=280 biopsies**

Biopsies group by %dd-cfDNA	DSA-negative (N=220)			DSA-positive or PRAHR ^a (N=60)				
	PRA-negative (N=93)	PRA-positive DSA-negative (N=127)	All DSA-negative (N=220)	I (N=9)	II (N=29)	I/II (N=6)	PRAHR (N=16)	All DSA-positive or PRAHR (N=60)
%dd-cfDNA ≥1% (N=104)	22	45	67	5	21	3	8	37
%dd-cfDNA 0.10–0.99 (N=138)	57	60	117	3	8	3	7	21
%dd-cfDNA <0.1% (N=38)	14	22	36	1	0	0	1	2

Bolding indicates all DSA-negative or all DSA-positive/PRAHR.

^aBiopsies from PRA-positive patients with missing/unavailable donor phenotyping to assign DSA status were called PRAHR in this study.

dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high risk.

TABLE 6.**Relationship of PRA status to %dd-cfDNA in AMR biopsies (including mixed)**

MMDx diagnoses	N	Arithmetic mean %dd-cfDNA	Geometric mean %dd-cfDNA
No rejection	164	0.63	0.32
All AMR (including mixed)	80	3.07	1.88
DSA-negative AMR (including mixed) ^{a,b}	45	2.96	1.76
PRA-negative DSA-negative AMR/mixed	15	3.78	2.00
PRA-positive DSA-negative AMR/mixed	30	2.54	1.67
DSA-positive AMR/mixed (including PRAHR)	35	3.22	2.04

Shading indicates rows with PRA-negative DSA-negative AMR/mixed or PRA-positive DSA-negative AMR/mixed.

Bolding indicates rows with PRA-negative DSA-negative AMR/mixed or PRA-positive DSA-negative AMR/mixed.

^aWithin 45 biopsies called DSA-negative AMR (including mixed), %dd-cfDNA was not significantly different between PRA-positive and PRA-negative biopsies ($P=0.32$).

^b%dd-cfDNA in DSA-negative (2.96) vs DSA-positive (3.22) in 80 MMDx AMR/mixed biopsies is not significantly different ($P=0.70$).

AMR, antibody-mediated rejection; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high risk.

TABLE 7.**Number (% of 280) of DSA-positive and %dd-cfDNA positive biopsies by MMDx diagnoses**

MMDx diagnoses	Number	Number DSA-positive (% of row)	Number with %dd-cfDNA ≥1 (% of row)
No rejection	164	17 (10%)	29 (18%)
Possible TCMR	6	0 (0%)	1 (17%)
TCMR	20	5 (25%)	12 (60%)
Possible AMR	10	3 (30%)	2 (20%)
Pure AMR	61	25 (41%)	46 (75%)
Mixed (AMR + TCMR)	19	10 (53%)	14 (74%)
All AMR including mixed	80	35 (44%)	60 (75%)
All AMR/mixed/TCMR	100	40 (40%)	72 (72%)

Bolding indicates rows with pure AMR or Mixed rejection, bolding and italicization indicates rows with all AMR.

AMR, antibody-mediated rejection; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; MMDx, Molecular Microscope Diagnostic System; TCMR, T cell-mediated rejection.

identical transplants argues that the antibody is directed against HLA-related polymorphisms. Strong data supporting a role for recognition of “missing self” by NK cells in AMR have been presented,^{23,35,36} but the present analysis and other available data suggest that DSA-positive and DSA-negative AMRs are molecularly nearly identical.^{19,20} Missing self-recognition by NK cells probably plays a similar role in DSA-negative and DSA-positive AMR, not selective for DSA-negative AMR. As a working hypothesis to generate concepts for ongoing testing, we propose that most DSA-negative AMR is mediated by an HLA alloantibody not detected by the current platforms, augmented by

missing self-recognition, and mechanistically identical in DSA-negative and DSA-positive AMR.

It follows that a key opportunity for improving the performance of DSA as a predictor of AMR is to find predictive antibodies in samples currently considered negative by existing cutoffs. DSA interpretation can differ between local laboratories and experts, with no central “gold standard,”^{37,38} but the agreement of central with local DSA-negative calls shows that interlaboratory variation cannot explain DSA-negative AMR. It is also possible that classifying the DSA-positive results in terms of de novo, complement binding, titer, immunoglobulin G subclass, and so on

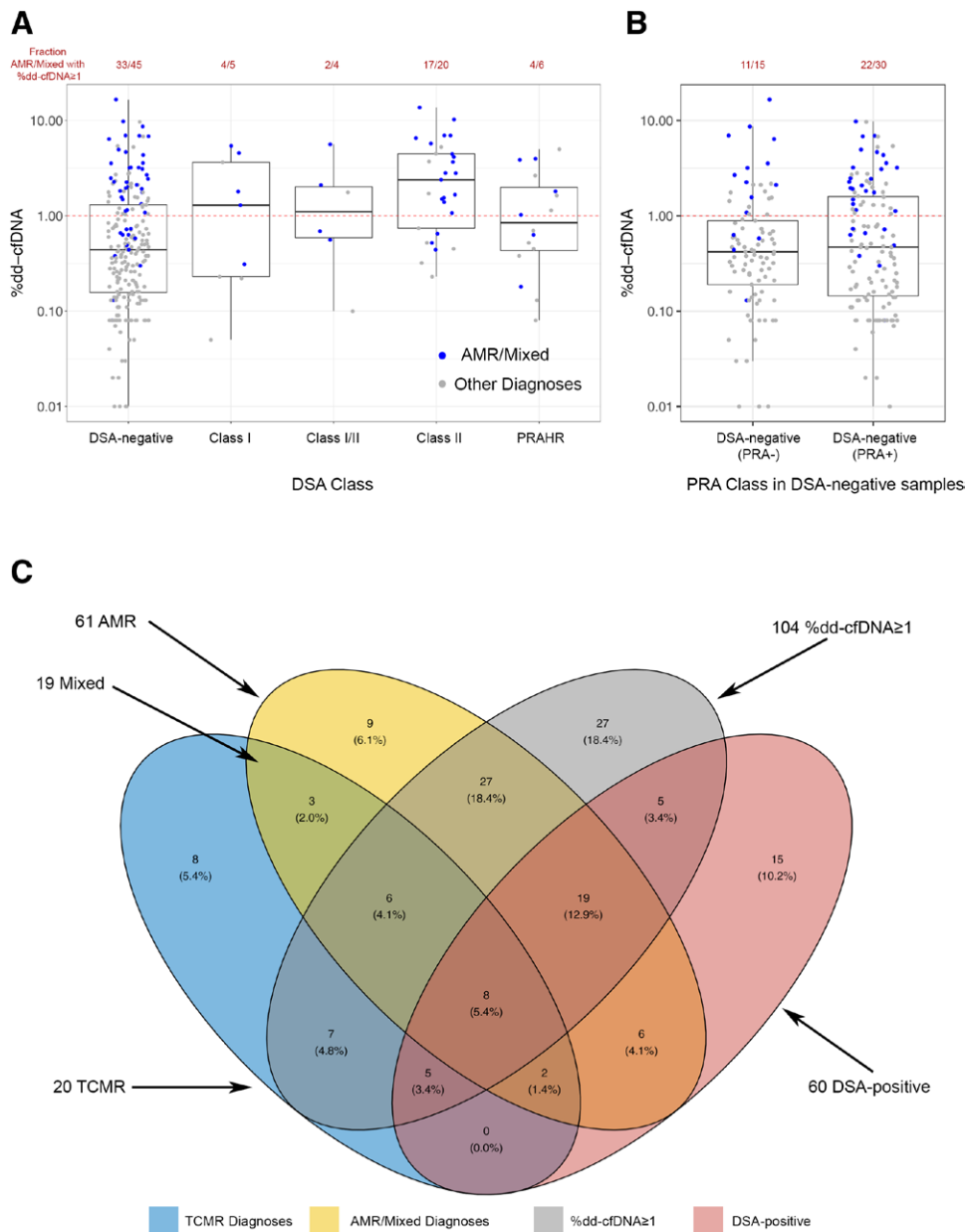


FIGURE 2. Relationships between MMDx rejection categories, DSA and %dd-cfDNA. A, Boxplots showing the distribution of %dd-cfDNA values across central DSA categories. Boxes represent the interquartile ranges and horizontal lines the medians. B, DSA-negative category split into PRA-positive and PRA-negative categories. C, Venn diagram showing overlap of samples with Molecular Microscope Diagnostic System TCMR, ABMR, %dd-cfDNA ≥ 1, and DSA positivity. Samples with mixed rejection are in the intersection between AMR and TCMR. One hundred thirty-three of the 280 samples have none of the 4 features and are therefore outside of the ellipses. AMR, antibody-mediated rejection; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; PRA, panel-reactive antibody; PRAHR, panel-reactive antibody–high risk; TCMR, T cell-mediated rejection.

would enhance predictions, but Trifecta was not designed to assess these enhancements because there were no standardized criteria by which to judge the results.

The issue of non-HLA alloantibodies and autoantibodies is of great interest³⁹⁻⁴¹ and is currently being addressed in the ongoing Sensitization in Transplantation: Assessment of Risk process.³⁸ We are proceeding with central autoantibody measurements in the ongoing Trifecta study and should be able to clarify this issue in the future. Candidate antibodies to explain DSA-negative AMR must *predict* the presence of AMR, whether non-HLA alloantibodies or autoantibodies.

We are currently planning to reexamine the DSA-negative samples in the Trifecta study for HLA antibodies

missed by the existing algorithms for interpreting Luminex results. In effect, we will see if the output of the HLA antibody assays can be recalibrated in a way that finds more HLA antibodies that predict AMR changes in patients currently called DSA-negative without an excessive number of false positives.

The predictive models at the time of an indication biopsy show that %dd-cfDNA or quantity of dd-cfDNA or both predict AMR activity much better than DSA status alone. This agrees with our calculations that the combination of percentage and quantity of dd-cfDNA offers slightly better predictions of AMR than either alone.¹⁶ For clinicians evaluating patients presenting with indications, considering quantity and percent dd-cfDNA and combining both

TABLE 8.
Predicting molecular antibody-mediated rejection/mixed considering only DSA, %dd-cfDNA, dd-cfDNA quantity, and TxBx

Predictor variable(s)	P	AUC
TxBx	4.4×10^{-3}	0.61
DSA	3.2×10^{-8}	0.66
%dd-cfDNA	$<1 \times 10^{-16}$	0.84
Quantity dd-cfDNA	$<1 \times 10^{-16}$	0.85
%dd-cfDNA + DSA	$<1 \times 10^{-16}$	0.86
%dd-cfDNA + DSA + quantity dd-cfDNA	$<1 \times 10^{-16}$	0.87
%cfDNA + DSA + quantity dd-cfDNA + TxBx	$<1 \times 10^{-16}$	0.88
Model comparison	P^a	Interpretation
Quantity dd-cfDNA + %dd-cfDNA vs %dd-cfDNA	0.007	Quantity dd-cfDNA adds to %dd-cfDNA
%dd-cfDNA + quantity dd-cfDNA vs quantity dd-cfDNA	0.01	%dd-cfDNA adds to quantity dd-cfDNA
DSA + %dd-cfDNA vs %dd-cfDNA	9.5×10^{-4}	DSA adds to %dd-cfDNA
DSA + %dd-cfDNA vs DSA	$<1 \times 10^{-16}$	%dd-cfDNA adds to DSA
Quantity dd-cfDNA + %dd-cfDNA + DSA vs %dd-cfDNA + DSA	0.0065	Quantity dd-cfDNA adds slightly to %dd-cfDNA + DSA
TxBx + DSA + quantity dd-cfDNA + %dd-cfDNA vs DSA + quantity dd-cfDNA + %dd-cfDNA	0.0018	TxBx adds to DSA + quantity dd-cfDNA + %dd-cfDNA

^aLikelihood ratio test.

AUC, area under the curve; dd-cfDNA, donor-derived cell-free DNA; DSA, donor-specific antibody; TxBx, time of biopsy posttransplant.

with DSA (and possibly time posttransplant) using predictive models optimize the utility of these tests for the clinician.

Limitations of this study include the recruitment of indication biopsies, as this does not permit extrapolation of the dd-cfDNA or DSA results to patients without indications. Note also that there were relatively few early AMR cases before 3 months posttransplant in the population, suggesting that more of such cases need to be studied. Finally, the Trifecta biopsies are all relatively recent, limiting the availability of outcome data. Outcomes will be collected as the Trifecta study progresses. Validation of these results in a larger dataset is in progress.

It will be of interest to see how dd-cfDNA or DSA adds to clinical management as indices of response to treatment and perhaps even as guides for decisions regarding treatment. Should DSA-negative AMR be treated the same as DSA-positive AMR, and should the dd-cfDNA results impact therapy? The use of dd-cfDNA (quantity and %), as well as DSA, adds a new level of granularity that can potentially guide management of AMR and assess the effectiveness of treatment. For example, the prevalence of DSA-negative AMR that is nevertheless releasing dd-cfDNA suggests that a treatment that simply converts DSA-positive AMR to DSA-negative AMR may not necessarily be beneficial for long-term outcomes if dd-cfDNA levels remain high. On the other hand, rendering the dd-cfDNA negative could emerge as an indicator that AMR activity has been reduced if future outcome studies are supportive. Combining the dd-cfDNA and DSA tests, particularly with enhanced DSA testing, has the potential to advance patient management and inspire a new generation of treatment trials.

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