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# MEETING REPORT



AJT

Banff 2019 Meeting Report: Molecular diagnostics in solid organ transplantation–Consensus for the Banff Human Organ Transplant (B-HOT) gene panel and open source multicenter validation

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**Correspondence** Michael Mengel Email: mmengel@ualberta.ca

Alexandre Loupy Email: alexandre.loupy@inserm.fr This meeting report from the XV Banff conference describes the creation of a multiorgan transplant gene panel by the Banff Molecular Diagnostics Working Group (MDWG). This Banff Human Organ Transplant (B-HOT) panel is the culmination of previous work by the MDWG to identify a broadly useful gene panel based on whole transcriptome technology. A data-driven process distilled a gene list from peer-reviewed comprehensive microarray studies that discovered and validated their use in kidney, liver, heart, and lung transplant biopsies. These were supplemented by genes that define relevant cellular pathways and cell types plus 12 reference genes used for normalization. The

Abbreviations: ABMR, antibody-mediated rejection; B-HOT, Banff Human Organ Transplant; CLIA, Clinical Laboratory Improvement Amendments; DIP, data integration platform; DSA, donor specific antibody; FFPE, formalin fixed, paraffin embedded; MDWG, Molecular Diagnostics Working Group; TCMR, T cell-mediated rejection.

M. Mengel, A. Loupy, B. Adam, and R.B. Colvin contributed equally to this report.

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770 gene B-HOT panel includes the most pertinent genes related to rejection, tolerance, viral infections, and innate and adaptive immune responses. This commercially available panel uses the NanoString platform, which can quantitate transcripts from formalin-fixed paraffin-embedded samples. The B-HOT panel will facilitate multicenter collaborative clinical research using archival samples and permit the development of an open source large database of standardized analyses, thereby expediting clinical validation studies. The MDWG believes that a pathogenesis and pathway based molecular approach will be valuable for investigators and promote therapeutic decision-making and clinical trials.

#### KEYWORDS

biomarker, biopsy, classification systems: Banff classification, clinical research/practice, diagnostic techniques and imaging, pathology/histopathology

#### 1 | INTRODUCTION

The XV Banff Conference for Allograft Pathology was held on September 23-27, 2019, in Pittsburgh,Pennsylvania. One main topic, continuing a theme from two previous Banff meetings, was to include applications of molecular techniques for transplant biopsies and to articulate a roadmap for the clinical adoption of molecular transplant diagnostics for allograft biopsies.<sup>1</sup> This meeting report summarizes the progress made by the Banff Molecular Diagnostics Working Group (MDWG) and the resulting next steps from the 2019 conference.

#### 2 | CHALLENGES IN MOLECULAR TRANSPLANT DIAGNOSTICS

The MDWG identified several challenges in the clinical application of molecular diagnostics. Different assays that measure different sets of genes validated for slightly different clinical contexts create a major analytical challenge. Enrolling patients into multicenter molecular diagnostic trials becomes problematic if local molecular diagnostic tests and risk stratification are done by noncomparable assays. The lack of a diagnostic gold standard for clinical validation of new molecular diagnostics requires multicenter standardization and independent validation in prospective randomized trials. Clinical and pathologic indications for molecular testing need to be defined and validated. Molecular tests must be cost effective to increase diagnostic utility beyond histopathology. For useful molecular diagnostics turnaround time needs to match immediate clinical needs. The integration of molecular tests with other diagnostic and clinical information requires standardization to make diagnosis and risk stratification comparable between centers. Industry partnerships are needed to advance the field, but transparency and appropriate disclosure of potential conflicts of interest are paramount. The MDWG believes that the present report shows a pathway that can address many of these issues.

# 3 | EVOLUTION OF MOLECULAR TRANSPLANT DIAGNOSTICS

Over the past 20 years, we estimate that more than 4000 organ transplant biopsies have been studied by whole transcriptome microarrays.<sup>2</sup> These have been conducted independently by several research groups, covering transplant biopsies of kidneys<sup>3-7</sup> and, to a lesser extent, other organs.<sup>8-13</sup> Different analytical approaches addressing relevant research questions from these data have been made available and reproduced by several research groups and transplant centers, covering a broad spectrum of phenotypes and patient demographics.<sup>14</sup> These studies led to potential diagnostic applications as well as major novel mechanistic insights with changes to the Banff classification, for example, the adoption of C4d-negative antibody-mediated rejection (ABMR) and chronic-active T cell-mediated rejection (TCMR) as new diagnostic categories.<sup>3,14,15</sup> Using transcriptome arrays the molecular phenotype in renal allografts correlates well with relevant rejection clinical entities and phenotypes.<sup>2,16</sup> In liver transplantation, microarray studies confirmed that liver biopsies with TCMR share very similar transcriptional phenotypes with those in renal allograft biopsies.<sup>12,13</sup> Transcriptional similarities are also present in heart and lung allograft biopsies.<sup>8-11</sup> These publications show that groups of genes within certain molecular pathways are statistically significantly associated with specific Banff histological lesions, rejection phenotypes, and Banff diagnostic categories. Transcript analysis also reveals potentially important underlying heterogeneities not perceived by pathology alone within diagnostic groups.<sup>17</sup>

In 2013 molecular diagnostics were added as an aspirational goal to the Banff classification.<sup>15</sup> The molecular quantification of endothelial cell associated transcripts and classifier-based prediction of donor specific antibody-mediated tissue injury were adopted as diagnostic features/lesions equivalent to C4d for the diagnosis of ABMR. This was noted to be a forward-looking proposal at the time, because there was no consensus around which endothelial genes should be quantified and no independent multi-institutional validation for any diagnostic classifier or gene set. The main impetus in 2013 to adopt a molecular diagnostic option into the classification, despite these limitations, was to set the future direction for the Banff classification and to promote collaborative and multi-institutional, open source efforts to advance the field by validating, standardizing, and making molecular transplant diagnostics accessible to the broad transplant community. This is a foundational value of the Banff consortium.<sup>18</sup>

At the 2015 meeting, the Banff MDWG recommended the creation of molecular consensus gene sets as classifiers derived from the overlap between published and reproduced gene lists that associate with the main clinical phenotypes of TCMR and ABMR.<sup>1</sup> Similar roadmaps and processes for clinical adoption have been reviewed extensively and proposed by other key opinion leaders in the field.<sup>19-22</sup> Collaborative multicenter studies were proposed to close identified knowledge gaps and enable practical molecular diagnostic incorporation into diagnostic classifications.<sup>22</sup> The 2017 Banff meeting identified an initial validated, consensus gene list with potential specific indications for molecular testing.<sup>23</sup> Importantly presented at this meeting was a new technology, Nanostring, which uses robust multiplex transcript quantitation from formalin-fixed, paraffin-embedded (FFPE) biopsies. The compelling advantage of NanoString is that it performs transcriptional analysis on routine histological samples allowing correlation of both histologic with molecular phenotypes on the same tissue.<sup>1</sup>

### 4 | CURRENT STATE OF MOLECULAR TRANSPLANT DIAGNOSTICS

Most of the published research studies for molecular testing on biopsies has been performed using microarrays on an extra biopsy core stored in RNAlater Stabilization Solution. The pioneering work by Halloran and colleagues was the basis of a commercial test (Molecular Microscope MMDx) now offered by One Lambda Inc.<sup>17,24-26</sup> These insightful, prospective studies showed strong associations of transcript patterns with the histological Banff lesions and diagnosis but also identified discrepancies.<sup>17</sup> These discrepancies require further investigation to reveal the optimal integration of histology and molecular biopsy features that are informative of outcome and response to therapy. No prospective randomized outcome trial using microarray assays as the end point has been conducted, in part because of the technical challenges and the long follow-up required. Although microarray analysis is the most established method for biopsies, alternative approaches, less invasive than a biopsy, are attractive and under investigation, such as urine and blood transcript analysis.

Recently, more practical technologies based on FFPE biopsy analysis are now available, in particular the NanoString nCounter system (NanoString Technologies, Seattle, WA). Several NanoString publications using FFPE transplant specimens identify similar transcript associations with the molecular and histologic phenotypes as those reported in microarray studies.<sup>3,4,13-18,27-29,29-33</sup> Among the advantages of NanoString are (1) a separate core processed at the time of biopsy is not required; (2) transcripts are assessed in the same sample analyzed by light microscopy; and (3) large retrospective and longitudinal analyses of archived samples can be readily performed in the setting of multicenter studies, which will enable retrospective randomization with long-term survival end points available (Table 1).<sup>27</sup> Over 1000 publications have reported its application and value. The NanoString system yields comparable results between FFPE and fresh frozen samples, with a higher sensitivity than that of microarrays and about equal to reverse transcription polymerase chain reaction (RT-PCR).<sup>34-36</sup> This technology in one assay uses color-coded molecular barcodes that can hybridize directly up to 800 different targets with highly reproducibility. NanoString thereby closes a gap between genome-wide expression (ie, microarrays and RNA sequencing as whole transcriptome discovery platforms) and mRNA expression profiling of a single target (ie, RT-PCR). But unlike quantitative RT-PCR, the NanoString system does not require enzymes and uses a single reaction per sample regardless of the level of multiplexing. Thus, it is simpler for the user and requires less sample per experiment for multiplex experiments, for example, pathway analysis, assessment of biomarker panels, or assessment of custom-made gene sets. The NanoString system is approved for clinical diagnostics and paired with user-friendly analytical software, thus representing a simple, relatively fast (24-hour turnaround time), automated platform that is well poised for integration into the routine diagnostic workflows in existing pathology laboratories.<sup>37</sup> Synthetic DNA standard oligonucleotides, corresponding to each target probe in the panel, allow normalization of expression results between different reagent batches, platforms, and users, This permits standardization of diagnostic thresholds across multiple laboratories, a major challenge using microarrays and RNA sequencing.<sup>27</sup> A major disadvantage of the NanoString approach is the need to predefine the gene panel and the restriction to 800 probes, making it better for follow-up studies once the discovery phase with microarrays has winnowed the possibilities to the most informative transcripts. The other disadvantages, shared with microarrays and RNASeq, is the loss of anatomic localization and the need for a biopsy.

# 5 | GENERATION OF A BANFF HUMAN ORGAN TRANSPLANT (B-HOT) PANEL

The B-HOT panel includes the validated genes found informative from major peer reviewed microarray and NanoString studies on kidney, heart, lung, and liver allograft biopsies, identified by the MDWG through literature review. A list of the genes with corresponding key publications is given in the Data S1. In detail, candidate genes were identified using the key words "transplantation," "kidney, "heart, " "lung, " 'liver, " "gene expression, " "molecule, " and "transcripts." Mining these publications for genes listed as significantly associated with any study variable revealed 2521 publications indexed in PubMed concerning more than 4000 genes. After redundant and duplicate genes were removed, the list contained 1749 genes. Then the MDWG members identified overlap between these genes and genes described in the peer-reviewed 2308

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Feature	FFPE tissue with NanoString nCounter	Fresh tissue with cDNA microarrays
Maximum number of transcript targets	800	>47 000 <sup>ª</sup>
Off-the-shelf panels available	Yes	Yes
Custom panels available	Yes	Yes
Recommended RNA input quantity	100 ng	50-500 ng
Requires reverse transcription/ amplification	No	Yes
Approximate assay turnaround time <sup>b</sup>	24-40 h	25.5-37.5 h
Analysis software provided by manufacturer	Yes <sup>c</sup>	Yes <sup>d</sup>
Ability to use same sample for histology and gene expression analysis, that is, ability for histomolecular integration	Yes	No
Immediate access to long-term clinical follow-up data on archival clinical samples (FFPE)	Yes	No
Food and Drug Administration approved	Yes for platform Yes for specific clinical assays <sup>e</sup>	No for platform Yes for specific clinical assay <sup>f</sup>
Approximate assay cost per sample <sup>g</sup>	\$275	\$1000-3000
Integration with local (decentralized) clinical workflow	Simple due to local testing (no shipment of samples) on regulatory approved platform using simple open source analytics	Complex (shipment of sample to referral lab, no regulatory approval of platform, complex analytics)

TABLE 1Technical comparison of geneexpression analysis using formalin-fixedparaffin-embedded (FFPE) tissue withNanoString nCounter vs fresh tissue withDNA microarrays

<sup>a</sup>Affymetrix GeneChip Human Genome U133 Plus 2.0 Array.

<sup>b</sup>Dependent on multiple variables: instrument settings, RNA input quantity, technician experience, etc. Time excludes RNA extraction time and sample shipment time if applicable.

<sup>c</sup>NanoString nSolver Analysis Software.

<sup>d</sup>Affymetrix Transcriptome Analysis Console Software.

<sup>e</sup>NanoString Prosigna Breast Cancer Prognostic Gene Signature Assay.

<sup>f</sup>Roche AmpliChip CYP450 Test, a pharmacogenetics assay to determine the genotype of two cytochrome P450 enzymes: 2D6 and 2C19.

<sup>g</sup>Including RNA isolation but excluding instrument expenses and labor for RNA extraction. Reagent cost varies with number of transcript targets and samples. Microarrays costs vary on scale of economy by provider.

literature<sup>2,8,12,29,32,33,38-50,9,51,52,10,53-56,11,57-64,65</sup> as being strongly associated with relevant clinical phenotypes and identified 1050 genes to be considered for inclusion. In the next step, a list including all genes with consensus expert opinion were selected and for which all Hugo duplicates were then combined, leaving 670 unique genes.

We initiated discussions with NanoString and learned they would be willing to make our panel widely available. However, their commercial panels typically have 770 genes, so they provided suggestions for addition genes to delineate relevant cellular pathways and cell types that have been used in other panels. Using an independent data-driven process, NanoString Technologies Inc recommended additional genes within relevant molecular pathways related to the 670 genes that were most informative by their Ingenuity Pathways. The final B-HOT panel included 758 genes covering the most pertinent genes from the core pathways and processes related to host responses to rejection of transplanted tissue, tolerance, drug-induced toxicity, transplantation-associated viral infections (BK polyomavirus, cytomegalovirus, Epstein-Barr virus) plus 12 internal reference genes for quality control and normalization (Figures 1 and 2, Table 2). Through that approach the B-HOT gene panel was defined, further engineered, and made commercially available (https://www.NanoS tring.com/products/gene-expression-panels/gene-expression-panels-overview/human-organ-transplant-panel). The pathways



**FIGURE 1** Banff Human Organ Transplant (B-HOT) panel design process and main pathways investigated by this panel. Banff Human Organ Transplant (B-HOT) panel design process involved 12 transplant experts from 5 universities (Harvard University, Université de Paris, University of Alberta, Imperial College of London, and Erasmus MC Rotterdam). Banff consortium was composed of B. Colvin, R.N. Smith, I. Rosales, M. Mengel, B. Adam, C. Roufosse, M.C. Clahsen-van Groningen, J.H. von der Thüsen, B. Robin, J. Dagobert, J.-P. Duong-van-Huyen, and A. Loupy. The Banff Human Organ Transplant Panel logo in Figure 1 has been reproduced with permission from NanoString

added to the list are given in Figure 2 and in more detail in the Table S1.

The panel probes were also designed to cover different organ types for transplantation and for sequence homology with nonhuman primates to facilitate preclinical research applications. The panel's broad coverage of inflammatory, adaptive, and innate immune systems; signaling; and endothelial transcripts will likely be largely applicable across organ types but with some expected organ specific variation. Furthermore, parenchymal transcripts will often be organ specific and many have been included (see Table S1). We anticipate that continued discovery of other informative transcripts not included in the B-HOT panel will occur. To provide flexibility, up to 30 custom genes can be added to the B-HOT panel by an investigator. Although the panel has been commercialized for the nCounter platform, the gene list is not proprietary and probes based on the gene list can be designed to run on any transcript analytical platform.

# 6 | NEXT STEPS: MULTICENTER ANALYTICAL AND CLINICAL VALIDATION

The Banff MDWG formed a voluntary, growing, and open international consortium, independent of commercial sponsorship, to develop future steps for validation, analyses, and database sharing. The focus of the next 2 years will be validation of the panel and discovery of the optimal algorithms and gene sets. This will be enabled by (1) the B-HOT panel and its comprehensive probe standards for comparison between laboratories, batches, and runs; (2) a shared database containing clinical, laboratory, pathological and transcript data; and (3) access to comprehensive sophisticated bioinformatics. The next steps will be to document the analytical validity across laboratories and then determine the clinical validity. The clinical validity will be assessed by analyzing B-HOT transcripts in 1000 or more clinical biopsies (as of this report the consortium has run the B-HOT panel on over 600 samples). These results along with standardized clinical and pathologic information will be entered in a shared database, which will be interrogated to discover the most useful algorithms for clinical applications.

Analytical validation for regulatory approval must document accuracy, precision, analytical sensitivity (reproducibility, coefficient of variance), reportable ranges, reference interval values, and analytical specificity. Calibration and control procedures must be determined, and the laboratory must be enrolled in external proficiency testing programs. Clinical validation is the next step. Even an assay with perfect analytical validity does not automatically imply association between the test result and a relevant clinical outcome or action. This requires access to relevant patient populations' material of adequately powered sample size to evaluate assay performance in a real-world clinical setting. Accordingly, clinical utility of an assay needs to be established by providing evidence of improved, measurable clinical outcome or benefit that is directly related to the use of the test, that is, proof that the test adds significant value to patient care. This also needs to take into consideration how the assay is interpreted, reported, and applied in the context of clinical patient management. Ideally, proper evaluation of an assay's clinical utility requires prospective randomized control trials.66



**FIGURE 2** Examples of cells, pathways, and genes studied by the B-HOT panel. Three main pathways can be identified: tissue damage, organ rejection, and immune response. The B-HOT panel profiles a total of 758 genes across 37 pathways. Green double-stranded DNA represents gene expression, blue single-stranded RNA represents RNA expressed by cells or tissue. Cartoons of organs, cells, and other illustrations used in Figure 2 have been retrieved from http://smart.servier.com/, a free medical images bank of Servier

The B-HOT panel will undergo all of these validation steps. In the next 2 years retrospective, well-annotated cohorts will be analyzed for analytical and clinical validation. The MDWG is aligning joint efforts using available NanoString systems at participating centers for studying a broad spectrum of archived and well-annotated transplant biopsies. To centralize the resulting multicenter molecular data from archived transplant biopsies together with the related clinical and outcome data, algorithms, and tools for analysis (including explorative analytics, machine learning-based diagnostic approaches/classifiers, and risk prediction tools) with remote access by users across the world, a data integration platform (DIP) will be built<sup>67</sup> (Figure 3). Participating centers will be able to upload routinely collected transplant-related patient data in an anonymized and uniform fashion. A participating investigator will then be able to use all data in the DIP. Currently underway is the development of a consensus data template representing the variables and units to be included in the DIP. The NanoString data files also include important analytical parameters (quality control measures, background subtractions, normalization values) in addition to the individual gene expression values, which will also be part of the DIP to allow for standardization across laboratories and thus multicenter analytical validation of any diagnostic assays. The output of this effort is expected to be a robust well-characterized gene set (presumably a subset of the B-HOT panel or additional genes) and analytic methodology for interpretation, which will be presented at a subsequent Banff meeting and published. We expect to see correlations with histologic diagnosis (including interpretations not revealed by routine pathology analysis), ongoing immunosuppressive therapy, prediction of outcome, and response to treatment. We (and others, we hope) will follow this by prospective, controlled clinical trials to fully define clinical utility.

As a first evaluation, after the Banff meeting, a member of the MDWG, Neal Smith, performed an in silico assessment of the B-HOT panel genes using the archived Genomic Spatial Event databases from Halloran's group<sup>5,46,68</sup> that contains 764 kidney biopsy samples with microarray data and diagnostic classification as TCMR, chronic-active ABMR, mixed, acute kidney injury, no rejection, and normal. Briefly, 3 bioinformatics methods were used to see if they could identify the 6 diagnostic groups from the transcripts: (1) supervised, using diagnostic and pathogenesis based transcripts sets of Halloran;<sup>16</sup> (2) semisupervised, using Nanostring pathways (Data S1) plus CIBERSORT cells types; and (3) unsupervised principal component analysis. Results confirmed the correlation of expected gene sets in each analysis with the 6 diagnostic categories (Smith, manuscript in preparation). A description of the initial B-HOT results in kidney transplants to be presented at the 2020 American Transplant Conference reveals both expected and novel correlations with pathologic categories.69

The B-HOT panel will be commercially available for research use only. Whether B-HOT leads to a clinically indicated laboratory

s. Four groups (Tissue and cellular process, Immune system, Organ specific, Viral infection) and 17	sibly be related to other pathway or involved in several processes
enes integrated in the HOT panel and their rel	Twelve genes are used for internal reference. (
ABLE 2 List of the 770 g	bgroups define the genes.

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Organ specific, Vir. cesses		HFE	ICAM1	ICAM2	IF144	IFNG	IFNGR1	IFNGR2	IKBKB	IKBKG	IKZF1	IL10	IL10RB	IL12A	IL12B	IL12RB2	IL13	IL15	IL16	IL17F	IL17RC	IL1A	IL1R1	IL1R2	IL1RAP	IL1RN	IL21	IL21R	IL23A	IL23R	IL27	IL27RA	
mune system, in several proc		CD209	CD83	CSF1	CSF3R	FCER1A	FCGR2A	FCGR3A/B	GNLY	GZMH	GZMK	IF127	IFNA1	IL1B	IL33	KLRB1	KLRC1	KLRD1	KLRG1	KLRK1	NKG7	NOD1	PSTPIP1	SAMHD1	TAPBP	TLR2	TLR3	TLR4	TLR5	TLR7	TLR8	TLR9	
and cellular process, Im ier pathway or involved i		Chemokine Signaling	ACKR1	CCL4	CCL5	CCR2	CCR4	CCR5	CMKLR1	CX3CL1	CX3CR1	CXCL1/2	CXCL10	CXCL11	CXCL12	CXCL13	CXCL2	CXCL5	CXCL8	CXCL9	CXCR3	CXCR4	CXCR6	PF4	<b>Complement System</b>	C1QA	C1QB	C1S	C3	C3AR1	C5	C5AR1	
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their related pathwa erence. Genes can po		TIMP1	TIPARP	TM4SF1	TM4SF18	TMEM178A	TNC	TNFAIP6	TNFRSF1A	TP53	TPMT	TPSAB1/B2	TRAF6	TRIM22	VCAN	VMP1	WARS	WNT9A	ZEB1	Hematopoiesis	CD34	CSF2	EPO	FLT3	GATA3	IKZF2	IL12RB1	IL5	IL6	IL7	LCK	МҮВ	
HOT panel and for internal refe		PTGER4	PTGS2	PTPN2	PTPN22	PTPN6	PTPRO	RAB40C	RAF1	<b>RAMP3</b>	RAPGEF5	RARRES1	RASIP1	RASSF9	RELA	RGN	RHOJ	RHOU	RNF149	ROBO4	RORA	RORC	RPL19	RPS6	RPS6KB1	RTN4	RXRA	S100A12	S100A8	S100A9	S100B	S1PR1	
integrated in the l e genes are used		JAK1	JAK2	KDR	KIT	KITLG	KLF2	KLF4	KLHL13	LAMP1	LAYN	LCN2	LEF1	LHX6	LIF	ХОЛ	LRP2	LRRC32	LTBR	LYVE1	MAF	MALL	MAP3K1	MAPK11	MAPK12	MAPK13	MAPK14	MAPK3	MAPK8	<b>MARCH8</b>	MCM6	MEF2C	
if the 770 genes i the genes. Twelv	r process	CDH13	CDH5	CDKN1A	CGAS	CHCHD10	CITED4	CLEC4C	COL13A1	COL1A1	COL3A1	COL4A1	COL4A3	COL4A4	COL4A5	CRIP2	<b>CSF2RB</b>	CTNNB1	CTSL	DCAF12	DDX50	DNMT1	DNMT3A	DUSP2	ECSCR	EDA	EEF1A1	EGFR	EGR1	EHD3	EMP3	EPAS1	
TABLE 2 List c   subgroups define	Tissue and cellula	Angiogenesis	ADAMTS1	ADGRL4	ENG	ERG	MMRN2	VEGFA	VEGFC	VWF	Apoptosis	BAX	BCL2	BCL2A1	BCL2L1	BCL2L11	<b>BIRC3</b>	CASP1	CASP3	CASP4	CASP8	CFLAR	FADD	FAS	FASLG	GIMAP5	IFI6	NLRP3	RGS5	<b>TNFRSF1B</b>	TNFRSF4	TNFSF10	

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sue and cellula	r process				Immune system					
.F1	ERRF11	MEGF11	SCGB1A1	RUNX1	HLA-A	C9	TREM1	IL2RA	STAT6	AJ
IIProcess	EVA1C	MEOX1	SDC1	TFRC	HLA-B	CD46	Other Immune Genes	IL2RG	TBX21	Т
ICB1	EZH2	MERTK	SELP	Metabolism	HLA-C	CD55	ACVRL1	IL4R	TCF7	
ICC2	F3	MET	SEMA7A	ABCA1	HLA-DMA	CD59	ADAMDEC1	IL6R	TCL1A	
SCE1	FGD2	MIR155HG	<b>SERPINA3</b>	ALDH3A2	HLA-DMB	CFB	AGER	IL6ST	TIGIT	
CVR1	FKBP1A	MMP12	SERPINE1	ALOX15	HLA-DPA1	CFH	BCL6	IL7R	TNFRSF14	
AM8	FN1	MMP14	SERTAD1	APOE	HLA-DPB1	CFI	BTLA	INPP5D	TNFRSF9	
ORA2A	FOS	MMP9	SHROOM3	APOL1	HLA-DQA1	CR1	CALHM6	IRF1	TNFSF14	
sR2	FOSL1	MT1A	SIRPG	APOL2	HLA-DQB1	MASP1	CCL2	IRF4	TNFSF18	
5R3	FOX01	MT2A	SKI	ARG2	HLA-DRA	MASP2	CCL21	IRF6	TNFSF9	
LT.	FOXP3	MTOR	SLA	B3GAT1	HLA-DRB1	MBP	CCR3	IRF8	TOX2	
łR	FPR1	MUC1	SLC11A1	CAV1	HLA-DRB3	SERPING1	CD160	ITGAM	TRIB1	
CDA	FYN	MX2	SLC19A3	CETP	HLA-E	Inflammatory Response	CD163	ITGAX	ТҮК2	
M2	GBP1	MYBL1	SLC22A2	CH25H	HLA-F	ALOX5	CD1D	JAK3	VCAM1	
(R1C3	GBP2	MYC	SLC25A15	CRHBP	HLA-G	ANXA1	CD2	KIR_Activating_ Subgroup_1	VSIR	
.AS1	GBP4	NFIL3	SLC4A1	GAPDH	ICOS	АОАН	CD24	KIR_Activating_ Subgroup_2	XCL1/2	
VKRD1	GDF15	NOS3	SMAD2	HSD11B1	ICOSLG	CARD16	CD244	KIR_Inhibiting_ Subgroup_1		
VKRD22	GEMIN7	NOTCH1	SMAD3	ID01	IFI30	CARD8	CD27	KIR_Inhibiting_ Subgroup_2		
POLD1	GNG11	NOTCH2	SMAD4	IGF1	IGHA1	CCL13	CD40	KIR3DL1	VIRAL INFECTION	
2P1	HAVCR1	NOX4	SMARCA4	LDLR	IGHG1	CCL15	CD48	KIR3DL2		
SEG	HDAC3	NPDC1	SOD2	NNMT	IGHG2	CCL18	CD5	KLRF1	Virus	
RG1	HDAC6	NPPA	SOST	PLA1A	IGHG3	CCL19	CD58	LAG3	BK large T Ag	
RHGDIB	HDC	NPPB	SOX7		IGHG4	CCL20	CD6	LAIR1	BK VP1	
RB2	HEG1	NR4A1	SP100		IGHM	CCL22	CD68	LAP3	CMV UL83	
ß15	HIF1A	OR211P	SP140	ORGAN SPECIFIC	IGKC	CCL3/L1	CD69	LGALS3	EBV LMP2	MLING
										-

2312

(Continues)

Tissue and cellular	process				Immune system				
ATF3	HK2	P2RX4	SPIB		IGLC1	CCR10	CD70	LILRB1	Viral Detection Genes
ATM	HMGB1	PADI4	SPRY4	Heart	IL17RA	CRP	CD74	LILRB2	EBI3
ATXN3	HPRT1	PALMD	SRC	ACTA2	1L2	GBP5	CD80	LILRB4	IFITM3
AXL	HSP90AA1	PDCD1LG2	ST5	MYL9	IL2RB	IL10RA	CD84	LST1	IRF7
BASP1	HSPA12B	PDGFA	ST8SIA4	TRDN	IL4	IL17A	CD96	LTA	ISG20
BATF	HYAL1	PDGFRB	STAT1	Kidney	LCP2	IL17RB	CEACAM3	LTB	NUL
BATF3	HYAL2	PHEX	STAT3	AQP2	NFATC1	IL18	CHUK	LTF	MX1
BDNF	IER5	PIN1	STAT5A	KAAG1	NFATC2	IL18BP	CIITA	LY96	
BLK	IFIT1	PLAAT4	STAT5B	NPHS1	RAG2	IL18RAP	CPA3	MCAM	
BMP2	IFITM1	PLAT	SYK	NPHS2	REL	IL1RL1	CSF3	MICA	INTERNAL REFERENCE GENES
BMP4	IFITM2	PLAU	TANK	SLC12A3	RELB	IL22	CTSS	MICB	
BMP6	IFNAR1	PLAUR	TAP1	UMOD	SELE	NFKB2	CTSW	MIF	ABCF1
BMP7	IFNAR2	PLK2	TAP2	Liver	SH2D1A	NFKBIA	CXCL14	MME	G6PD
BMPER	IGF1R	PNOC	TBK1	FABP1	SH2D1B	NFKBIZ	CXCL16	MPIG6B	GUSB
BMPR1A	IGF2R	PPM1F	TEK	HNF1A	THEMIS	PTX3	DEFB1	MRC1	NRDE2
BMPR1B	IGFL1	PPP3CA	TFF3	IGFBP1	TNFRSF17	TNF	EOMES	MS4A1	OAZ1
BRWD1	IMPDH1	PRDM1	TGFB1	KRT19	TNFRSF18	TNFAIP3	FCER1G	MS4A2	POLR2A
BTG2	IMPDH2	PROX1	TGFB2	KRT8	TNFSF4	TRAF4	FCGR1A	MS4A4A	PPIA
CD207	INHBC	PSEN1	TGFBI	Lung	TNFSF8	Innate Immune System	FCGR2B	MS4A6A	SDHA
CD38	IRS1	PSMB10	TGFBR1	MYOM2	TRAT1	B2M	FCRL2	MS4A7	STK11IP
CD44	ISG15	PSMB8	TGFBR2	SFTPA2	TRDC	BCL3	FGFBP2	MYD88	TBC1D10B
CD47	ITGA4	PSMB9	TGIF1	SFTPB	TRDV3	CCR1	FJX1	NCAM1	ТВР
CD81	ITGB2	PSME1	THBD	SFTPC	XBP1	CCR6	GZMA	NCR1	UBB
CD82	TGB6	PSME2	THBS1	SFTPD	ZAP70	CD14	HAVCR2	NFAM1	

MENGEL ET AL.

TABLE 2 (Continued)

-AJT<u>2313</u>



FIGURE 3 Data integration platform (DIP) design. Three elements are identified: (1) data production (histology, molecular, and clinical) by participating hospital; (2) DIP (web interface, cloud computing) to centralize, check, and validate all data; and (3) results production by any participating physician/scientist using built in analytical tools

developed test remains to be seen. If it does, it will probably be a simplified panel. In the future, the international, open source, multicenter Banff DIP can serve as a reference point for generating a molecular diagnostic "gold-standard" in transplantation, similar to the Banff histology lesions and diagnoses agreed upon in 1991.<sup>70</sup> As the Banff consensus rules for histology underwent refinement over the last 28 years as new knowledge emerged, any molecular "consensus" will also need to undergo constant refinement and, no doubt further, technological innovation. Only through integration with clinical decision-making and end points in clinical trials can the true clinical utility of molecular diagnostics be demonstrated.<sup>67</sup>

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#### DISCLOSURE

The authors of this manuscript have conflicts of interest to disclose as described by the *American Journal of Transplantation*. Michael Mengel received honoraria from Novartis, CSL Behring, Vitaeris. Mark Haas received consulting fees from Shire ViroPharma, AstraZeneca, Novartis, and CareDx, and honoraria from CareDx. Robert Colvin is a consultant for Shire ViroPharma, CSL Behring, Alexion and eGenesis. Candice Roufosse has received consulting fees from Achillion and UCB. Ivy Rosales is a consultant for eGenesis. Enver Akalin received honorarium and research grant support from CareDx. Marian Clahsen-van Groningen received grant support from Astellas Pharma (paid to the Erasmus MC). A. Jake Demetris receives research support from Q2 Solutions and is a member of an Adjudication Committee for Novartis. None of these conflicts are relevant to this article. The other authors have no conflicts of interest to disclose. None of the authors has a financial interest in NanoString.

#### DATA AVAILABILITY STATEMENT

Data sharing is not applicable to this article as no new data were created or analyzed in this study.

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# 2316 AIT

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#### SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section.

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