The Small RNA Repertoire of Small Extracellular Vesicles Isolated From Donor Kidney Preservation Fluid Provides a Source for Biomarker Discovery for Organ Quality and Posttransplantation Graft Function

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Background. Delayed graft function (DGF) after kidney transplantation is negatively associated with long-term graft function and survival. Kidney function after transplantation depends on multiple factors, both donor- and recipient-associated. Prediction of posttransplantation graft function would allow timely intervention to optimize patient care and survival. Currently, graft-based predictions can be made based on histological and molecular analyses of 0-hour biopsy samples. However, such analyses are currently not implemented, as biopsy samples represent only a very small portion of the entire graft and are not routinely analyzed in all transplantation centers. Alternatives are thus required. Methods. We analyzed whether donor organ preservation fluid contain small extracellular vesicles (sEV) and whether the RNA content of these vesicles could be used as a source for potential biomarkers for posttransplantation kidney function. Results. We provide proof of principle that sEVs are present in preservation fluid, which contain RNAs associated with donor origin. Furthermore, sEV micro RNA profiles could be associated with graft function during the first 7 days posttransplantation, but no significant correlation with DGF could be established based on the current dataset. Conclusions. Overall, the predictive potential of sEV RNA biomarkers together with relatively easy and noninvasive sample collection and analysis methods could pave the way towards universal screening of donor kidney-associated risk for DGF, optimized patient treatment, and subsequently improved short- and long-term graft function and survival.

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includes little information on the individual kidney and in many cases information may be incomplete, especially in donation after circulatory death donors. Gift function and survival can be monitored by analyzing biomarkers in urine and blood (after transplantation) or by taking biopsy samples, which can be done at the time of transplantation (0-h biopsies) or after transplantation. In these samples, morphological and genetic markers that represent kidney function and survival can be identified. A great disadvantage of above-mentioned approaches is that they can either only take place after transplantation (blood/urine sampling) or that the transplanted kidney has to be intentionally damaged (biopsies). Furthermore, it is under debate whether the small piece of tissue retrieved in a renal biopsy is representative of the entire organ. Altogether, despite the identification of markers associated with transplant outcome, no routine testing on predictive biomarkers is currently performed on donor kidneys, illustrating the limited value of these markers in clinical practice and the urge for the identification of markers in representative samples.

Communication between cells, tissues, and organs is crucially important to maintain homeostasis of an organism. It allows for proper responses to endogenous and environmental cues and occurs through different pathways, such as electrical, chemical, and hormonal signaling. Especially in cases of stress (ie, ischemia-reperfusion injury), cytokine signaling plays an important role, and recently we demonstrated that cytokines secreted into donor kidney preservation fluid contain donor organ-derived information allowing to predict delayed graft function (DGF). Besides cytokines and growth factors, extracellular vesicles (EVs) gained interest for their unique potential in intercellular signaling, since they can contain complex sets of signals that can be transferred to target cells in a cell-specific manner. Small extracellular vesicles (sEVs), also termed exosomes, are 50- to 150-nm membrane vesicles that are secreted into the environment by cells upon fusion of the limiting membrane of multivesicular bodies with the plasma membrane. They arise from inward budding of endosomal membranes and, as they are formed at the late endosomes, capture a small portion of the cytoplasm, including proteins and RNA molecules.

We hypothesize that sEVs secreted into transplant kidney preservation fluid by the renal endothelium reflect the stress, and thereby the condition, of the donor organ and may therefore serve as biomarkers to assess donor kidney quality and predict posttransplantation function. To investigate this, we collected perfusion fluid after static cold storage from living, donation after brain (DBD), and donation after circulatory death (DCD) donor kidneys and investigated whether sEVs were secreted into this fluid and whether their content reflects donor organ condition. We show for the first time that sEVs are secreted into the preservation fluid. We identified an optimal procedure for the isolation of sEVs from preservation fluid and determined that they contain small RNAs that reflect donor type (living, DBD, or DCD) and associate with graft function.

**MATERIALS AND METHODS**

**Sample Collection**

Donor Kidney Fluid

In agreement with the declaration of Helsinki and with approval of the University Medical Center Utrecht Ethical Committee, intravascular perfusion fluid was retrieved as described. Briefly, after static cold storage donor kidneys were perfused with 40–60 mL of physiological salt solution, supplemented with 20 U/mL heparin into the renal artery. Intravascular perfusion fluid, flowing out from the renal vein, was collected in a sterile manner. Blood cells in the collected fluid were counted using a CELL DYN 1800 Hematology Analyzer (Abbott, Abbott Park, IL). Cells were removed by centrifugation at 2000g for 30 minutes, after which the supernatant was used for exosome isolation. Samples for analysis of sEV presence were collected based on availability (n = 8), and at later stages, samples from specific subgroups (n = 19), based on donor type and posttransplantation function (n = 16), were collected sequentially for retrospective analyses.

Transplantations were performed in the University Medical Center Utrecht (The Netherlands) between January 2013 and July 2015. All recipients provided informed consent to retrieve data from medical records for the Netherlands Organ Transplantation Registry.

**Cell Culture Supernatant**

HMEC-1 cells (CDC; Atlanta, GA) were used for control experiments. They were maintained up to passage 27 at 37°C, 5% CO2 in MCDB131 medium (Life Technologies, Grand Island, NY) supplemented with 10% fetal calf serum (FCS), 100 U/mL penicillin, 100 µg/mL streptomycin, 50 mmol/L hydrocortisone, 10 ng/mL human recombinant epidermal growth factor, and 10 mmol/L 1-glutamine. Exosome-free medium was prepared using FCS centrifuged for at least 1 hour at 200 000g and filter-sterilized using a 0.2-µm filter.

**Serum**

Venous blood was drawn from healthy volunteers using BD Vacutainer CAT blood collection tubes. After gentle shaking and incubation at room temperature (RT) for 1.5 hours, samples were centrifuged at 1500g for 15 minutes. The supernatant consisting of the serum was used for further experiments.

**sEV Isolation**

Ultracentrifugation

sEVs were collected by differential centrifugation. Samples—either cell culture supernatant, serum, or donor kidney perfusion fluid—were subsequently centrifuged for 30 minutes at 2000g, 30 minutes at 10 000g, and 60 minutes at 100 000g. Pelleted EVs were resuspended in phosphate buffered saline (PBS), pelleted again, and finally resuspended in 60 µL PBS (for Nanoparticle tracking, sucrose density centrifugation, or electron microscopy analysis) or 100 µL lysis buffer (for immunoblotting).

Precipitation

Samples—cell culture supernatant, serum, or donor kidney perfusion fluid—were centrifuged subsequently for 30 minutes at 2000g, after which the supernatant was mixed with Total Exosome Isolation (Texls) reagent (Invitrogen, Carlsbad, CA) following manufacturer instructions. Pelleted sEVs were resuspended in 60 µL PBS (for Nanoparticle tracking, sucrose density centrifugation, electron microscopy analysis, and RNA qPCR analysis) or 100 µL lysis buffer (for immunoblotting of RNA sequencing analysis).

**Sucrose Gradient Analysis**

Pellets obtained after centrifugation at 100 000g were resuspended in 250 µL 2.5M sucrose, 20 mmol/L Tris HCl...
described. Briefly, carbon-coated Formvar filmed grids were collected from the top and used for subsequent immunoblot and electron microscopy analyses.

**Electron Microscopy**

Transmission electron microscopy was performed as described.\(^2\)\(^3\) Briefly, carbon-coated Formvar filmed grids were placed on exosome suspension for 20 minutes and washed with 0.15% glycine in PBS 3 times followed by a 0.1% bovine serum albumin (BSA) in PBS wash. Vesicles were fixed in 1% glutaraldehyde in PBS for 5 minutes and washed twice with PBS. For CD63 labeling, grids were placed on 5 μL 1% BSA in PBS containing 5 μg/mL anti-human CD63 (CLB, Amsterdam, The Netherlands) for 20 minutes, washed 4 times with 0.1% BSA in PBS, and incubated on a drop of 1% BSA in PBS containing rabbit anti-mouse polyclonal antibody (Dako, Glostrup, Denmark) for 20 minutes. Secondary antibodies were labeled by incubation on PBS containing 1% BSA and 10nm gold particles coupled to Protein A in for 10 minutes. Specimen were fixed in 1% glutaraldehyde in PBS for 5 minutes and washed twice with PBS. After 4 washes on distilled water, grids were placed on ice-cold 1.8% methylcellulose (25 Ctp)/0.4% Uranyl acetate (MC-AU) for 5 minutes, and, after drying, vesicles were visualized using a FEI Tecnai 12 (FEI, Hillsboro, OR) transmission electron microscope.

**Immunoblotting**

sEVs were lysed in lysis buffer (0.1% sodium dodecyl sulphate [SDS], 1% Triton X-100) with complete protease inhibitor cocktail [Sigma] in PBS) and concentrations were determined using a bicinchoninic acid protein assay (Pierce). Equal sample amounts were subjected to 12% SDS-PAGE electrophoresis and transferred to polyvinylidene difluoride (PVDF) membranes (Thermo Scientific, Waltham, MA). PVDF membranes were blocked in 5% low-fat dry milk powder (Campina, Amersfoort, The Netherlands) in tris buffered saline (TBS) with 0.1% Tween-20 (blocking buffer). PVDF membranes were incubated with primary antibodies in blocking buffer, washed in TBS with 0.1% Tween-20, followed by incubation with horse radish peroxidase (HRP)- conjugated secondary antibodies in blocking buffer. Proteins were detected with Chemiluminescent Peroxidase Substrate (Sigma) and imaged on the Molecular Image ChemiDoc XR System (Biorad, Hercules, CA). The primary antibodies used were mouse-anti-β-actin (A5441, 1:15000, Sigma) and rabbit-anti-Flotillin-1 (sc-25506, 1:500, Santa Cruz Biotechnologies [Santa Cruz, CA]). Secondary antibodies were HRP-conjugated Swine anti-Rabbit (P0399, 1:2000, Dako) and Rabbit anti-Mouse (P0260, 1:2000, Dako).

**Novaparticle Tracking Analysis**

Size distribution of vesicles in 100 000 pellets were analyzed using a Nanosight LM104C (NanoSight, Amesbury, UK) with a 532 nm laser-equipped sample flow-chamber. Shutter and gain were manually adjusted for optimal detection and were kept at this setting for all samples. A 1-minute audio video interleave file was recorded and analyzed using nanoparticle tracking analysis (version 2.3, build 0025, Nanosight) software to calculate size distributions and vesicle concentrations using the following settings: blur: auto; detection threshold: 7, minimum track length: auto; viscosity: 0.929 cP. Each observation represents the average of 5 measurements.

**Small RNA Sequencing Analysis**

After exosome precipitation using the TEIs from serum reagent (Invitrogen), total RNA was isolated using the Total exosome RNA and protein isolation kit (Invitrogen). Subsequently, small RNA libraries were prepared, sequenced, and bioinformatically processed as extensively described by Schagaman et al.\(^3\)\(^4\)

**RNA Isolation**

Total RNA was isolated using the Qiagen miRNasy Mini Kit (QiAgen, Hilden, Germany). After lysis in 700 μL Qiazol lysis reagent, the lysate was transferred to a new tube with 140 μL chloroform, mixed, incubated for 2 minutes at room temperature and centrifuged at 12 000g for 15 minutes at 4°C. The aqueous phase was transferred to a new tube and 1.5 vol-ume of 100% ethanol was added. After mixing, the sample was transferred to a Qiagen RNeasy Mini spin column in a collection tube followed by centrifugation at 8000g for 15 seconds at RT. Following a rinse with 700 μL Qiagen RWT buffer and centrifuged at 8000g for 15 seconds at RT, filters were rinsed with 500 μL Qiagen RPE buffer and centrifuged as above. A rinse step (500 μL Qiagen RPE buffer) was repeated twice. The Qiagen RNeasy Mini spin column was transferred to a new collection tube and centrifuged at 15000g for 2 minutes at RT. The Qiagen RNeasy Mini spin column was transferred to a new microcentrifuge tube with the lid open for 1 minute to allow the column to dry. Total RNA was eluted by adding 50 μL of RNase-free water to the spin column and centrifugation at 15000g for 1 minute after incubating at RT for 1 minute.

**microRNA Real-time qPCR Arrays**

RNA was isolated from sEVs precipitated from 2.0 mL perfusion fluid (where possible, 1.5 mL for one sample) and reverse transcribed in 50 μL reactions using the miRCURY LNA Universal RT microRNA polymerase chain reaction (PCR), Polyadenylation and cdNA synthesis kit (Exiqon, Vedbaek, Denmark). cdNA was diluted 50× and assayed in 10 μL PCR reactions according to the protocol for miRCURY LNA Universal RT microRNA PCR; each microRNA was assayed once by qPCR on the microRNA Ready-to-Use PCR, Human Panel I using ExiLENT SYBR Green master mix. Amplification was performed in a LightCycler 480 Real-Time PCR System (Roche, Basel, Switzerland) in 384 well plates. Amplification curves were analyzed using the Roche LC software, both for determination of Cq (by the second derivative method) and melting curve analysis. Amplification efficiency was calculated using algorithms similar to the LinReg software. All assays were inspected for distinct melting curves and the Tm was checked to be within known specifications for the assay. Furthermore assays must be detected with 5 Cqs less than the negative control and Cq<37 to be included in the data analysis. Cq was calculated as the second derivative. Using NormFinder the best normalizer was found to be the average of assays detected in all samples. All data were normalized to the average of assays detected in all samples (average-assay Cq).

**Statistics**

Differences between groups were assessed using an unpaired samples Student t-test with Benjamini-Hochberg
post hoc testing. Missing, undetected values were set at 9 for calculation purposes.

Unsupervised clustering methods were used to identify patterns in the microRNA expression patterns across samples in an unbiased fashion and results from different methods were set side-by-side to check for internal consistency. For hierarchical cluster analysis, we used Euclidean distance as distance metric and the unweighted pair group method with arithmetic mean as linkage criterion. Results were verified by visual inspection of the plot of first two principal components and cluster number was assessed by partitioning around medoids with estimation of number of clusters. R version 3.5.0 was used for all analyses, with additional use of the Flexible Procedures for Clustering package.

RESULTS

Donor Kidney Preservation Fluid Contains sEVs

To investigate whether donor kidney preservation fluid contains sEVs, freshly collected fluid was subjected to the standard differential centrifugation protocol for the isolation of such vesicles and analyzed for the presence of sEVs using sucrose density centrifugation, nanoparticle tracking analysis, and electron microscopy. The density of the collected particles was determined at 1.127 ± 0.025 g/mL (n = 3), with a representative immunoblot of density gradient fractions displayed in Figure 1A. Transmission electron microscope of the peak fraction revealed the presence of 50–200 nm particles of different electron densities, among which cup-shaped vesicles, the typical appearance of sEVs in such analyses (Figure 1B). Nanoparticle tracking analysis confirmed the electron microscopic observations, showing a modal size of 83.7±10 nm and mean size of 128.3±10.5 nm (n = 3). Combined, these observations demonstrate that donor kidney preservation fluid accumulates renal sEVs.

A Precipitation Method for Renal Perfusate sEVs

For future potential use in a diagnostic setting, isolation of sEVs by differential (ultra-) centrifugation cannot be performed because this approach is time-consuming, and taking into account that the centrifuge rotor can hold only a few samples at a time— incompatible with high throughput sample processing in a clinical laboratory. We therefore aimed to precipitate a representative exosome fraction from the preservation fluid, an approach for which currently several approaches are available. We compared the TExIs reagents for serum and for cell culture supernatant for their efficiency in isolating sEVs from the corresponding biofluids and compared their performance with that of sequential ultra-centrifugation. Using sucrose density gradient and nanoparticle tracking analyses, we could demonstrate that centrifugation and precipitation of endothelial cell culture medium yields particles with identical characteristics, displaying a density and size corresponding to endothelial cell-derived sEVs22,29 (Figure 2A, C). Using serum as a source, the TExIs reagent precipitated particles with a slightly smaller size than that observed for particles isolated by centrifugation, whereas the density appeared higher, given that the peak intensity shifted by 1 fraction (Figure 2B, D).

The use of reagents thus appears a promising approach for rapid, benchtop isolation of sEVs from donor kidney preservation fluid. As the preservation fluid resembles neither cell culture medium nor serum, we first investigated which of the 2 reagents could be used to isolate sEVs from preservation fluid and directly compared this with ultracentrifugation (UC)-isolated sEVs. Isolated sEVs from 3 donor kidneys were immunoblotted for the exosome marker protein flotillin-1, and based on the obtained band pattern the TExIs reagent for serum was chosen for subsequent exosome isolations from preservation fluid (Figure 2E). Nanoparticle tracking analysis comparing
sEVs from preservation fluid isolated by UC or reagent for serum (TExIs serum) shows that particles of equal size are isolated by each method (Figure 2F). Electron microscopic analysis of these sEV isolated using the TExIs serum reagent confirms their size (Figure 2G), though their appearance differs from the UC-isolated sEVs from preservation fluid (Figure 1B).

**FIGURE 2.** A precipitation method for perfusion fluid sEVs. sEVs were isolated from human microvascular endothelial cells-1-conditioned culture medium or human serum using sequential UC or precipitation (using the TExIs reagent for culture medium or serum, respectively) and subsequently analyzed by sucrose density gradient ultracentrifugation and immunoblotting for β-actin. sEVs isolated from culture medium by precipitation (A, TExIs medium) appeared slightly more dense than those isolated by ultracentrifugation (A, UC). Also, sEVs isolated from serum using the TExIs reagent for serum (B, TExIs serum) appeared slightly more dense than those isolated by ultracentrifugation. Size distribution of the sEVs from either source and by either method did not significantly differ (C,D). Immunoblotting of sEVs from 3 different donor fluids isolated by ultracentrifugation (UC) or TExIs reagents for culture media (TExIs medium) or serum (TExIs serum) show a disturbed running pattern for those isolated using the reagent for serum (E). sEVs were isolated from preservation fluid by UC or using the TExIs reagent for serum (TExIs serum). F, Subsequent NTA analysis shows that both sEV preparations contain equally sized particles, consistent with the size of small EVs. G, TEM analysis of the precipitated sEVs confirms the presence of sEVs, with signs of co-isolated reagent (scale bar = 200 nm). EVs, extracellular vesicles; NTA, nanoparticle tracking analysis; sEVs, small extracellular vesicles; TExIs, Total Exosome Isolation.

**Exosomal Small RNAs Reflect Donor Type**

As we previously described that exosomal RNAs reflect the condition of the exosome-producing cells, we hypothesized that the RNA content of sEVs from preservation fluids from DCD, DBD, and living donors will reflect the donor type and may provide prognostic information about the donor kidney quality and posttransplantation kidney function. To
investigate this, RNA was isolated from 19 precipitated perfusion fluid exosome samples representing three donor types (6 × DCD, 6 × DBD, and 7 × living donor) and subjected to small RNA sequencing. Due to low RNA yields (which is typical for EV preparations), sequence analysis was successful for 11 of these 19 samples, including 1 living donor sample, 4 DCD samples, and 6 DBD samples. In total, 2111 small RNAs were identified among all samples, including 1526 microRNAs (miRNAs). Identified miRNAs were ranked based on their observed relative abundances across samples, and subsequent unsupervised clustering based on the top 400 most abundant miRNAs, which represent 99.21% of all miRNA reads and 68.61% of the total number of reads across samples, clearly distinguished donor types, with the profile of the living donor clustering with the DCD group (Figure 3).30,31 As the perfusion fluid from which the sEVs were isolated is in direct contact with the renal vascular endothelium, we compared the identified miRNA profile with the miRNA profile of sEVs from cultured endothelial cells.32 Out of the 155 miRNAs detected with an average >10 reads in cultured endothelial cell sEVs, 140 were present among the 500 most abundant miRNAs identified in perfusion fluid. Furthermore, there was a significant association between the rank-order of expression in the 2 data sets (Spearman’s rho = 0.31, P = 0.0002), suggesting that at least part of the isolated sEVs are of endothelial origin (Table S1, SDC, http://links.lww.com/TXD/A219).

**Exosome RNA Profiles Are Associated With Posttransplantation Kidney Function**

We further explored whether sEV-contained RNAs could serve as a source for biomarkers predicting posttransplantation kidney function. As RNA profiles differ between donor type, we collected 16 additional samples, only from DCD donors, with known short-term outcome (8 × DGF, 8 × immediate function [IF]) Donor, recipient, and organ characteristics are listed in Table 1, sample characteristics are listed in Table 2. RNA was isolated and analyzed using the Exiqon miRCURY LNATM Universal RT microRNA PCR Human Panel. In this miRNA PCR array analysis, 223 out of 332 miRNAs were detected in 12 or more samples. Direct comparison of miRNA abundances, normalized for on-chip control small RNA SNORD49A in sEVs from kidneys that showed DGF versus IF revealed 10 miRNAs that significantly differentiate between the 2 groups; however, none of these remained significant after multiple testing correction (Table S2, SDC, http://links.lww.com/TXD/A220). To further investigate whether miRNA profiles are associated any posttransplantation kidney function parameter, a principal component analysis was performed. Clearly, 2 distinct clusters can be observed: the first cluster consisting of 5 samples and a second cluster containing 10 samples (Figure 4A). Each cluster consists of samples from kidneys that showed DGF and IF in recipients, and although no correlation to this outcome parameter could be confirmed, average plasma creatinine levels in cluster 1 remained significantly higher from day 2 until day 7 after transplantation (Figure 4B).

**DISCUSSION**

Here, we demonstrate that donor kidney preservation fluid contains sEVs and these sEVs harbor a small RNA repertoire that is associated with immediate posttransplantation graft function, thereby providing a novel source for potential
biomarkers to predict graft function after transplantation. Our analysis of sEV-contained small RNAs provides a strong indication that sEVs in preservation fluid are derived from the endothelium, with which this fluid is in direct contact. Most miRNA identified in sEVs from cultured endothelial cell were represented in the top 500 miRNA identified in our analysis.

Prediction of posttransplantation kidney function is currently based on the assessment of renal (0-h) biopsies and predictive algorithms.5,6,33-35 Putative biomarkers have been identified in blood, urine, tissue biopsies, and preservation fluid,2-4,8,36,37 but clinical application of any biomarker is still hampered. sEVs are vastly explored for diagnostic information in various diseases38-41 and harbor early biomarkers for acute kidney injury.42-46 Lozano-Ramos et al 47 examined the protein and RNA content of EVs obtained from urine of (deceased) kidney donors. Their approach allowed for an elegant molecular insight into the donor kidney without the need for a biopsy, although the population of kidneys investigated was insufficient to identify biomarkers associated with either graft function or donor type. Based on our earlier analysis

### TABLE 1.
Donor, recipient, and organ characteristics discovery panel

| Parameter                  | IF (n = 8)       | DGF (n = 8)      | P     |
|----------------------------|------------------|------------------|-------|
| **Donor**                  |                  |                  |       |
| Age, y                     | 54.0 [49.5–65.3] | 61.5 [54.5–63.3] | 0.89  |
| BMI, kg/m²                 | 25.9 (2.2)       | 26.3 (4.2)       | 0.83  |
| Hypertension, %            | 37.5 (n = 3)     | 12.5 (n = 1)     | 0.28  |
| Diabetes, %                | 12.5 (n = 1)     | 12.5 (n = 1)     | >0.99 |
| Creatinine, µMol           | 80.1 (30.2)      | 54.8 (17.9)      | 0.06  |
| Cause of death: anoxia, %  | 37.5 (n = 3)     | 25 (n = 2)       | 0.62  |
| **Recipient**              |                  |                  |       |
| Age, y                     | 54.0 [49.5–65.3] | 61.5 [54.5–63.3] | 0.83  |
| BMI, kg/m²                 | 24.7 (2.7)       | 24.8 (3.5)       | 0.96  |
| Male, %                    | 75 (n = 6)       | 62.5 (n = 5)     | 0.62  |
| Peak PRA, %                | 0 (0)            | 0 [0–12.3]       | 0.10  |
| Dialysis duration, mo      | 24 [18.5–27.5]   | 25 [26.3–70]     | 0.12  |
| Prior transplants, %       | 0 (n = 0)        | 12.5 (n = 1)     | 0.33  |
| Dialysis type: HD, %       | 37.5 (n = 3)     | 25 (n = 6)       | 0.15  |
| Diabetes, %                | 1.25 (n = 1)     | 25 (n = 2)       | 0.55  |
| **Organ**                  |                  |                  |       |
| HLA mismatches             | 4 [2.8–4.3]      | 3 [1.8–3]        | 0.20  |
| CIT, h                     | 13.5 [12.9–15.0] | 15.8 [11.0–18.1] | 0.79  |
| WIT, min                   | 30.0 [29.0–34.5] | 29.0 [24.0–30.5] | 0.25  |

Standard Deviations between brackets; interquartile ranges between square brackets.

BMI, body mass index; CIT, Cold Ischemia Time; DGF, delayed graft function; IF, immediate function; KDRI, kidney donor risk index; PRA, panel-reactive antibodies; WIT, Warm Ischemia Time.

### TABLE 2.
Sample characteristics IF and DGF cohort

| Sample | IF/DGF | CIP, h | Volume, mL | Protein, mg/mL | SNORD49A Ct | sEV conc, ×10¹⁰ particles/mL | sEV avg size, nm |
|--------|--------|--------|------------|----------------|-------------|-----------------------------|------------------|
| 1      | IF     | 15.0   | 4.0        | 2.929          | 35.630      | 3.12                        | 145              |
| 2      | IF     | 10.0   | 27.0       | 3.804          | 33.111      | 4.92                        | 146              |
| 3      | IF     | 22.9   | 19.0       | 3.822          | 32.201      | 2.30                        | 153              |
| 4      | IF     | 13.0   | 11.1       | 5.857          | 32.238      | 6.80                        | 138              |
| 5      | IF     | 12.5   | 3.4        | 4.875          | 35.022      | 3.74                        | 127              |
| 6      | IF     | 15.0   | 4.5        | 2.179          | 34.660      | 10.02                       | 121              |
| 7      | IF     | 13.0   | 3.0        | 8.732          | 34.354      | 5.80                        | 135              |
| 8      | IF     | 13.0   | 1.5        | 6.232          | 34.536      | 17.36                       | 143              |
| 9      | DGF    | 16.5   | 8.5        | 7.161          | 30.450      | 5.98                        | 143              |
| 10     | DGF    | 6.3    | 9.5        | 6.250          | 32.516      | 5.30                        | 125              |
| 11     | DGF    | 9.2    | 16.4       | 1.947          | 33.141      | 7.62                        | 105              |
| 12     | DGF    | 21.0   | 4.0        | 7.964          | 31.221      | 8.30                        | 115              |
| 13     | DGF    | 21.0   | 15.0       | 7.447          | 29.779      | 12.16                       | 160              |
| 14     | DGF    | 15.0   | 13.0       | 6.464          | 30.451      | 4.10                        | 139              |
| 15     | DGF    | 11.7   | 8.5        | 2.697          | 29.163      | 6.06                        | 130              |
| 16     | DGF    | 17.2   | 6.9        | 3.607          | 32.535      | 2.66                        | 151              |

CIP, Cold Ischemia Period; DGF, delayed graft function; IF, immediate function; Protein, protein concentration of the fresh sample; sEV, small extracellular vesicle; SNORD49A Ct, ct value for the control small RNA SNORD49A obtained in the qPCR array; Volume, total volume collected. sEV concentration and average size as obtained by Nanoparticle Tracking Analysis.
of proteins in donor kidney preservation fluid, we explored whether sEVs from this fluid would be a more potent biomarker source.

Indeed, we could demonstrate the sEVs are present in preservation fluid and they can be isolated using a method compatible with a clinical diagnostics setting. Analysis of small RNAs in these sEVs allowed to discriminate between DBD and DCD donors, clearly underlining the diagnostic potential of sEV-contained RNAs. Interestingly, samples from living donors contained insufficient amounts of RNA for this analysis, which may imply that accumulation of sEV in the preservation fluid is a continuous process, even during cold storage.

We have previously used donor kidney preservation fluid as a source for biomarkers to assess posttransplantation kidney function, identifying Leptin and granulocyte-macrophage colony-stimulating factor as predictive biomarkers for DGF.11 In our analysis of sEV-contained miRNAs, we could observe miRNAs that significantly differed in abundance between DGF and IF; however, unsupervised clustering analysis could not distinguish these groups. Instead, we observed a significant relation of a cluster of 5 samples with kidney function assessed by serum creatinine levels during day 2–7 after transplantation, which limits clinical applicability at this moment. The significance of the 2 identified clusters is at present unclear, although the same clustering was consistently identified using different clustering algorithms and parameter settings. We did not identify a relationship with DGF and IF; however, unsupervised clustering analysis could not distinguish these groups. Instead, we observed a significant relation of a cluster of 5 samples with kidney function assessed by serum creatinine levels during day 2–7 after transplantation, which limits clinical applicability at this moment.

FIGURE 4. Analysis of sEV-miRNA abundance from preservation fluid of 16 DCD kidneys. A, Principal Component analysis of miRNA PCR array data clearly distinguishes 2 groups, both containing samples from kidney that show IF (open circles) or DGF (closed circles) in recipients. B, Average short-term graft function in the 2 identified clusters, as assessed by serum creatinine levels. DCD, deceased donation after circulatory death; DGF, delayed graft function; IF, immediate function; miRNA, microRNA; PCR, polymerase chain reaction; sEVs, small extracellular vesicles.

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