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RESEARCH PAPER

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Defining the purity of exosomes required for diagnostic profiling of small RNA suitable for biomarker discovery

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ABSTRACT

Small non-coding RNAs (ncRNA), including microRNAs (miRNA), enclosed in exosomes are being utilised for biomarker discovery in disease. Two common exosome isolation methods involve differential ultracentrifugation or differential ultracentrifugation coupled with Optiprep gradient fractionation. Generally, the incorporation of an Optiprep gradient provides better separation and increased purity of exosomes. The question of whether increased purity of exosomes is required for small ncRNA profiling, particularly in diagnostic and biomarker purposes, has not been addressed and highly debated. Utilizing an established neuronal cell system, we used next-generation sequencing to comprehensively profile ncRNA in cells and exosomes isolated by these 2 isolation methods. By comparing ncRNA content in exosomes from these two methods, we found that exosomes from both isolation methods were enriched with miRNAs and contained a diverse range of rRNA, small nuclear RNA, small nucleolar RNA and piwi-interacting RNA as compared with their cellular counterparts. Additionally, tRNA fragments (30–55 nucleotides in length) were identified in exosomes and may act as potential modulators for repressing protein translation. Overall, the outcome of this study confirms that ultracentrifugation-based method as a feasible approach to identify ncRNA biomarkers in exosomes.

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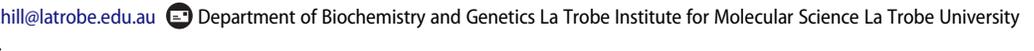
Introduction

Small RNAs are non-coding RNAs (ncRNAs) that are approximately 18–250 nucleotides (nt) in length,^{1,2} which can finely control the expression of target genes that control diverse biologic processes, such as proliferation, development, differentiation and apoptosis^{3–6} The common ncRNA species include microRNA (miRNA), piwi-interacting RNA (piRNA), rRNA (rRNA), tRNA (tRNA), small nuclear RNA (snRNA) and small nucleolar RNA (snoRNA).⁷

The role of small RNAs as potential modulators in diseases has been increasingly recognized and there is now a significant interest in using exosomes to identify small RNA biomarkers for diagnosis of disease such as neurodegenerative diseases,^{8–10} cancer^{11–13} and autoimmune disease.^{14,15} Small RNAs can be secreted in cell-derived extracellular vesicles such as exosomes as a method of intercellular communication.¹⁶ Both mRNA and miRNA species have been found contained in exosomes which are taken up by specific target cells to facilitate disease spreading and pathogenesis.¹⁷ As such, exosomes can provide a means for transfer and protection

of RNA content from degradation in the environment, enabling a stable source for reliable detection of RNA biomarkers.^{18,19}

To study exosomes and their ncRNA content, there are various methods available to isolate exosomes before performing downstream analysis such as next-generation sequencing (NGS).^{20–22} The most common method to isolate exosomes is differential ultracentrifugation (UC), however this method may also isolate microvesicles or other particles/debris of similar sizes.^{23,24} Optiprep velocity gradient ultracentrifugation has been shown to isolate a higher purity of exosomes as it can separate buoyant vesicles with similar physical properties.^{23,24} For these reasons, Optiprep velocity gradient ultracentrifugation has increasingly become a preferred choice for exosome isolation when investigating the function and transfer of exosomal material devoid of possible contamination of other extracellular vesicles. Unfortunately, preparing gradients can be time consuming and may not be required for all areas of exosomal research. It has been debated whether the additional step of using Optiprep velocity gradients is required for biomarker

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discovery work and diagnostic testing, areas which efficiency and reproducibility are the important factors.

Upon the isolation of exosomes, there are many methods to profile RNA in exosomes, ranging from microarrays, or quantitative reverse transcription polymerase chain reaction (qRT-PCR) to NGS.²⁵ Most of the existing tools (e.g. qRT-PCR and microarray) offer high sensitivity and specificity in small RNA research, however they are unable to accurately detect a wide spectrum of ncRNAs. These methods typically require prior knowledge of the sequence of interest to design primers.²⁶ NGS technology does not require any prior knowledge of ncRNAs and thus it allows all ncRNA species to be sequenced in a high throughput manner.²⁷

In this study we used, mouse hypothalamic neuronal (GT1-7) cells which have been widely used to study neuronal exosomes in neurodegenerative diseases, particularly prion disease.^{23,29,41} Using GT1-7 cells, we evaluate the two widely used techniques for profiling small RNAs in exosomes; (i) differential UC and (ii) Optiprep velocity gradient ultracentrifugation. We investigated if there are any differences in the small RNA profiles of highly purified exosomes by using a high throughput workflow, which we developed for rapid and accurate profiling of small RNA.²⁸ Using the high throughput workflow, small RNAs, including miRNA, piRNA, rRNA, tRNA, snRNA, snoRNA and protein-coding mRNA fragments, are comprehensively surveyed in neuronal exosomes prepared by the two isolation methods. The findings present a high coverage approach for determining the optimal exosomes isolation method for small RNA profiling.

Material and methods

Cell culture

Mouse hypothalamic neuronal GT1-7 cell lines were cultured in Opti-MEM (Life Technologies, Melbourne, VIC, Australia) supplemented with 1 × GlutaMax (Life Technologies), 10% fetal calf serum (FCS) (Life Technologies) and 100 µg/ml penicillin/streptomycin and maintained at 37°C in 5% CO₂.

Exosome isolation

GT1-7 cells (~1 × 10⁷ cells or 3 × T175 flasks) were cultured in exosome-depleted medium (complete medium containing exosome-free FCS) for 4 d. Exosomes were isolated using two exosome isolation methods (Fig. 1A and B). Protocol 1: Exosomes were isolated using the differential UC protocol as described previously.²⁹ Briefly, cultured supernatants were collected and centrifuged at 3,000 g for 10 min to remove cell debris. The supernatant was filtered (0.22 µm), and filtrate was centrifuged at 10,000 g for 30 min at 4°C. The supernatant was collected and exosomes were pelleted by centrifugation at 100,000 g(av). Exosome pellets were washed in filtered phosphate-buffered saline (PBS) and re-centrifuged at 100,000 g (av). The final exosome pellet was re-suspended in 100 µL filtered PBS; 50 µL was used for exosome characterization and remaining 50 µL was used for small RNA extraction. Protocol 2: Exosomes were isolated using Optiprep velocity gradient centrifugation protocol as described previously.²³ The steps

were similar to the above described differential UC method in protocol 1 except that the initial 100,000 g pellet was re-suspended in 500 µL NTE buffer (137 mM NaCl, 1 mM EDTA, and 10 mM Tris, pH 7.4). Exosome suspension was layered on a 10-mL continuous 10–30% Optiprep gradient made up in NTE buffer and centrifuged at 250,000 g, 1.5 h, 4°C. From top of the gradient, 17 fractions (600 µL) were collected; 300 µL was used for exosome characterization and remaining 300 µL was used for small RNA extraction.

Size distribution analysis

Tunable resistive pulse sensing analysis was performed using the qNano system (Izon, Christchurch, New Zealand); by applying a voltage and pressure, single particles are passed through a stretched polyurethane nanopore. As the particle traverses the pore, ions are occluded resulting in a drop in the measured current, termed a 'blockade event'. Exosome samples and calibration particles of known size were analyzed in PBS on a NP-150 nanopore. Each sample was measured with applied pressures of 8 and 12 cmH₂O, for multi-pressure calibration, where measurement consisted of a minimum of 500 blockade events.

Transmission electron microscopy

Exosomes were fixed with 2% glutaraldehyde/PBS for 30 min at room temperature. A volume of 6 µL was applied to a glow-discharged 200-mesh Cu grid coated with carbon-Formvar film (ProSciTech, Kirwan, QLD, Australia) and allowed to absorb for 5 min. Grids were washed twice with Milli-Q water and contrasted with 1.5% uranyl acetate. Transmission electron microscopy (TEM) was performed on a Tecnai G2 F30 (FEI, Eindhoven, NL) TEM operating at 300 kV across × 15,000 to × 36,000 magnification. Electron micrographs were captured with a Gatan UltraScan[®] 1000 2k × 2k CCD camera (Gatan, Pleasanton, CA).

Western immunoblotting

Cell lysates and exosome samples were lysed in sodium dodecyl sulfate (SDS) sample buffer (2% (w/v) SDS, 10% (v/v) glycerol, 12.5mM ethylenediaminetetraacetic acid, 2 mg Bromophenol blue, 50mM Tris pH 6.8) with 5% β-mercaptoethanol and heated at 95°C. The lysed samples were subjected to electrophoresis using precast Novex 4–12% Bis-Tris NuPAGE gels (Invitrogen). Proteins were electrotransferred onto polyvinylidene difluoride (PVDF) membranes using the Criterion Transfer system (Bio Rad, Hercules, CA, USA). The PVDF membranes were blocked with 5% (w/v) skim milk powder in PBS containing 0.05% Tween-20 (PBS-T) at room temperature. Membranes were probed with the following antibodies and working dilutions: anti-tsg101 (Santa Cruz Biotechnology, CA, USA) at 1:3000, anti-Bcl2 (BD Biosciences, Sydney, NSW, Australia) at 1:1000, anti-flotillin-1 (BD Biosciences, Sydney, NSW, Australia) at 1:3000, anti-SAF-32 (Prion protein) at 1:5000 (Sapphire Biosciences, Redfern, NSW, Australia) anti-mouse HRP (GE Healthcare, Sydney, NSW, Australia) at 1:25,000 and anti-goat HRP (Sigma-Aldrich, Sydney, NSW, Australia) at

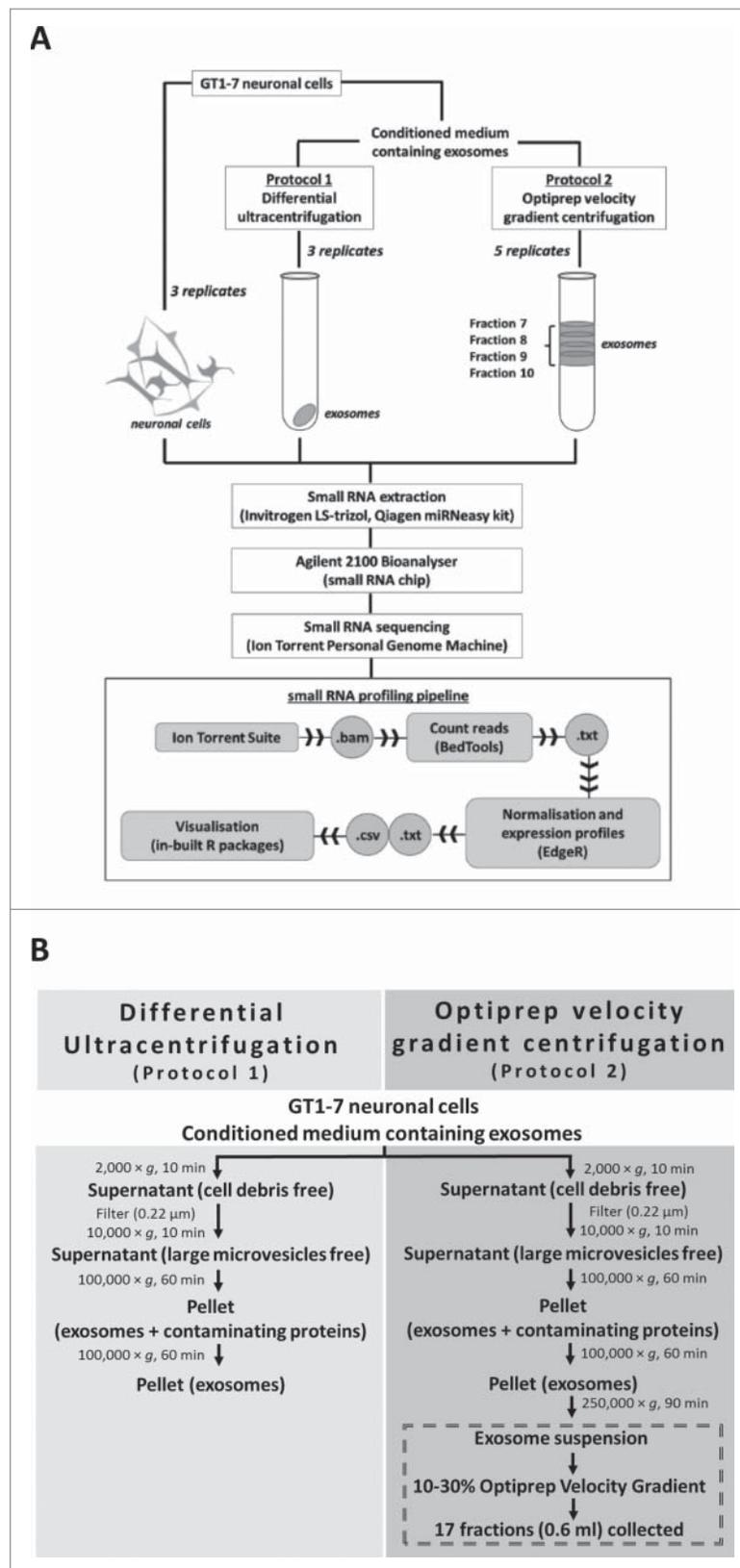


Figure 1. Workflow outlining the exosomal small RNA sequencing experiment and data analysis. (A) Exosomes released from GT1–7 neuronal cells found in the conditioned media were isolated using 2 different centrifugation-based protocols. Protocol 1 involves the use of differential UC and Protocol 2 involves isolating exosomes using differential UC over a continuous 10–30% Optiprep gradient. Upon exosome isolation small RNA was extracted from both cells and exosomes using TRIzol-LS followed by clean up using the column-based miRNeasy kit. The quality and quantity of the small RNA were checked by Agilent 2100 Bioanalyser. Libraries were constructed and subjected to small RNA transcriptome sequencing using Ion Torrent Personal Genome Machine. The initial bioinformatics analysis of pre-processing, quality assessment and sequence mapping (i.e. TMAP) were performed in Ion Torrent Suite. The generated high quality and aligned data was subjected to an in-house developed small RNA analysis pipeline that integrates BEDtools and edgeR for small RNA profiling. The pipeline automatically generates output of raw counts, normalized counts and visualization graphics including, but not limited to, hierarchical clustering heatmap and multidimensional scaling. (B) Flowchart describing the steps of the 2 protocols used to isolate exosomes from the conditioned medium; (i) differential UC and (ii) Optiprep velocity gradient ultracentrifugation.

1:100,000. Immunoreactive bands were detected using the enhanced Chemiluminescence kit (Amersham Biosciences, Rydellmere, NSW, Australia) followed by exposed to Hyperfilm (Amersham) and developed by Exomat automated developing system.

Small RNA Extraction

The total RNA including miRNA from exosome suspensions was extracted using a column-based miRNeasy kit (Qiagen, Chadstone, VIC, Australia) with the following modifications to the manufacturer's instructions. TRIzol-LS (Life Technologies), instead of QIAzol, was added to the exosome suspensions and subsequently vortexed. After incubation, chloroform was added to the homogenate and the manufacturer's protocol of the miRNeasy kit was resumed to isolate RNA sized between 18nt and above. The quantity and quality of the small RNA extractions were determined using a BioSpec-nano (Shimadzu, Rowville, VIC, Australia) and Agilent Bioanalyser 2100 with a small RNA assay Chip for cell-free exosomal small RNA, and a RNA Nano 6000 assay Chip for cellular RNA (Agilent Technologies, Mulgrave, VIC, Australia).

Small RNA library construction and Ion Torrent sequencing

Small RNA library preparation was performed using the Ion Total RNA-Seq kit v2 (Life Technologies) for both exosome samples and GT1–7 neuronal cell samples: a total of 26 libraries including replicates (see Results for details). For each individual library, RNA was ligated to adapters containing a unique index barcode (Ion Xpress™ RNA-Seq Barcode 1–16 Kit, Life Technologies) to allow libraries to be pooled during Ion Torrent sequencing (Life Technologies). All libraries were constructed according to manufacturer's protocol. Briefly, RNA samples were reverse transcribed to cDNA using adaptor specific primers. Using the Magnetic Bead Purification Module (Life Technologies), cDNA samples were size-selected from 94 to 200 nt (the length of the small RNA insert including the 3' and 5' adaptors). PCR amplification was then performed followed by a library clean-up step using nucleic acid beads (Life Technologies). The quality and quantity of each library were determined by Agilent 2100 Bioanalyser using High Sensitivity DNA kit (Agilent Technologies). Equally pooled libraries were clonally amplified onto Ion Sphere™ Particles (ISPs) supplied by the Ion PGM™ Template OT2 200 kit (Life Technologies). ISP templates were produced by using the OneTouch™ 2 Instrument and enrichment system (Life Technologies). ISPs loaded with libraries were sequenced on the Ion Torrent PGM™ using Ion™ 318 v2 chips (Life Technologies) and the Ion PGM™ 200 Sequencing Kit v2 (Life Technologies).

Small RNA sequence data analysis

Raw reads generated by sequencing were subjected to pre-processing, quality assessment and mapping using the default parameters provided in the Ion Torrent Suite (version 4). Briefly, the Ion Torrent Suite filtered for high quality reads by removal of adaptor sequences, low quality bases at 3' ends of reads, adaptor dimers, reads lacking sequencing key, reads with

low signal and polyclonal reads. The high quality reads were mapped to mm10 build of the mouse genome from University of California Santa Cruz (UCSC) genome databases using Torrent Mapping Alignment Program (TMAP) with their default parameters.

Aligned reads were classified according to genomic loci annotations using BEDtools. For instance, miRNA reads were identified by intersecting the genomic coordinates of aligned reads with those of known miRNA from miRBase release 20.³⁰ Subsequently, additional intersection to the other non-coding small RNAs was also performed in respect to their specific databases, including Genomic tRNA database³¹ for tRNAs, piRNA Bank³² for piRNAs and Ensembl for other classes of small RNAs (i.e. snoRNA, snRNA and rRNA). Reads that were not identified as known small RNAs were intersected with repeat elements and protein-coding mRNA retrieved from UCSC database. These intersection results were converted to read-count tables containing raw counts of each RNA biotype, which were analyzed and visualised using R-packages such as 'edgeR'³³ and 'pheatmap'.³⁴ This analysis workflow (Fig. 1A) was integrated into a pipeline developed in-house with python,²⁸ and the full details of the pipeline are described in Supplementary Methods. Calculation of percentage of reads by biotype was based on raw read counts of perfectly intersected and matched transcripts for each biotype compared with the total reads for each library. Sequences were deposited into European Nucleotide Archive³⁵ under accession number PRJEB9472.

Small RNA data output visualization

Circos³⁶ was used to visualize the distribution of small RNAs from different data sets across chromosomes. Cytogenetic bands and chromosome labels were included to highlight the genomic location of small RNAs. In addition, the relationship of the replicates among the data sets was further analyzed using principle component analysis (PCA) and multidimensional scaling (MDS) in R.^{33,34} The 'tune.pca' function³⁴ was initially performed to visualize the proportion of explained variance for selecting the final principal components.^{37,38} The several inter-correlated variables across the replicates were represented in a 3-dimensional (3D) plot. Further, proportional 2-set Venn and 5-set Venn diagrams were performed to identify unique and common RNA biotypes using the respective 'Vennuler'³⁹ and 'gplots'⁴⁰ in R. The elements in each data set were compared with determine the intersection and union regions.

miRNA qRT-PCR and digital PCR assays

Individual qRT-PCR and digital PCR TaqMan® miRNA assays (Applied Biosystems) for let-7b (TaqMan® Assay ID 000378) and miR-342–3p (TaqMan® Assay ID 002260) were performed according to the manufacturer's instructions. The same amount of total RNA isolated from cells and exosomes was converted to cDNA using the miRNA reverse transcriptase Kit (Applied Biosystems) and specific miRNA assay RT primers. For qRT-PCR, cDNA was diluted 1:3 and setup in quadruplicate reactions in 96-well plates containing specific TaqMan® miRNA assays, and Fast TaqMan® Fast Advanced Master Mix in a final

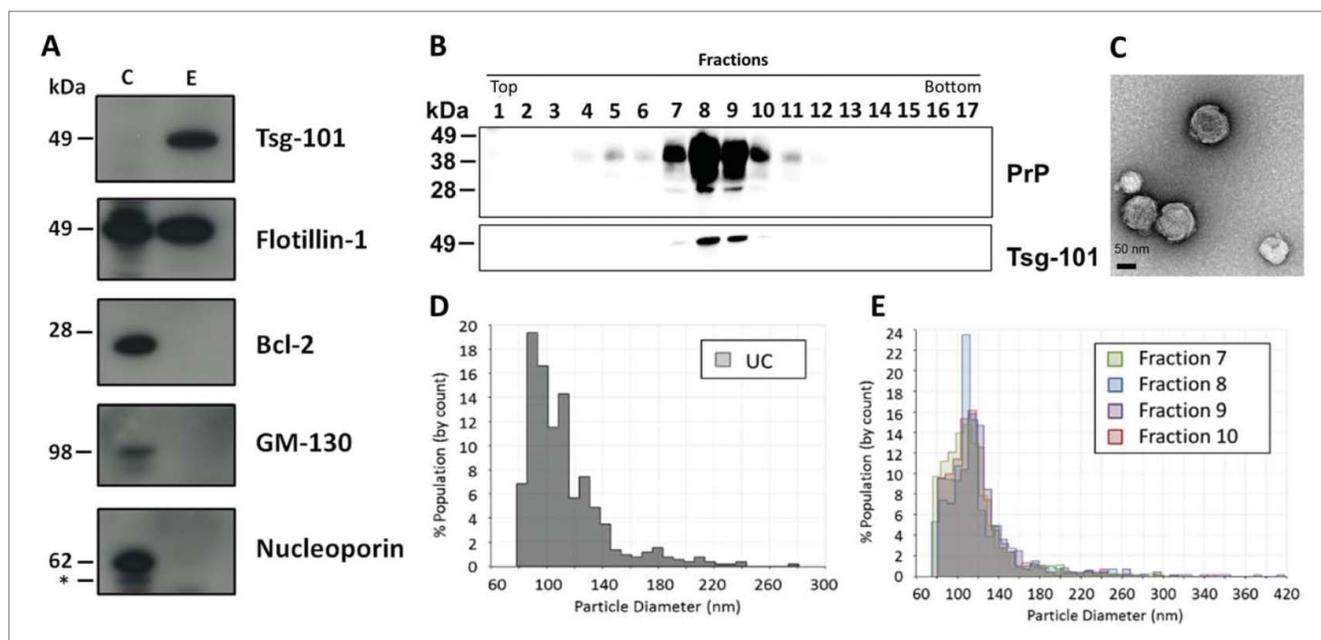


Figure 2. Characterization of exosomes and exosomal RNA content. (A) Western blot of GT1–7 cell lysates and exosomes isolated by differential UC was confirmed by enrichment of exosomes markers tsg-101 and flotillin-1, and absence of bands for negative markers Bcl2 (apoptotic bodies), GM-130 (Golgi apparatus), nucleoporin (nucleus). Abbreviations: kDa (kiloDalton); (C) (GT1–7 neuronal cells); (E) (exosomes). “*” denotes non-specific band for anti-nucleoporin. (B) Isolation of exosomes using Optiprep velocity gradient ultracentrifugation show the co-fractionation of exosomes whereby fractions ($n = 17$) were probed for the prion protein and exosome marker tsg-101. (C) Transmission electron microscope image of typical exosomes in fraction 8 isolated by Optiprep gradient. Size distribution histogram of exosomes normalized to exosome count analyzed by the qNano instrument; (D) Isolated by differential UC, (E) exosomes present in Optiprep fractions 7, 8, 9 and 10.

volume of 20 μl using the QIAGILITY liquid handling robot (QIAGEN). The qRT-PCR assay was run on a ViiA7 qRT-PCR instrument (Applied Biosystems) using the manufacturer’s recommended cycling conditions. Data were plotted as raw cycle threshold (Ct) values. For digital PCR, cDNA was diluted 1:10 and set-up in duplicate reactions containing the specific TaqMan[®] miRNA assay and digital PCR master mix which was subsequently loaded and sealed into a QuantStudio[™] 3D Digital PCR 20K Chip using QuantStudio[™] 3D Digital PCR Chip Loader (Applied Biosystems), according to the manufacturer’s instructions. The prepared digital PCR 20K Chips were loaded into the GeneAmp[®] PCR System 9700 (Applied Biosystems) and initiated the reaction using the manufacturer’s recommended cycling conditions. The digital PCR 20K chips were then analyzed on the QuantStudio[™] 3D PCR Instrument (Applied Biosystems) and were processed using QuantStudio[®] 3D AnalysisSuite[™] for absolute quantification of miRNA targets in copies per μl .

Statistical analysis

Comparison of small RNA expression across different data sets was analyzed using Spearman’s correlation between small RNA data sets in R. Other general statistics including median and mean \pm SD were done using GraphPad Prism v5 (GraphPad Software).

Results

Characterization of neuronal cell-derived exosomes

Exosomes were isolated from GT1–7 cells using UC and Optiprep velocity gradient ultracentrifugation (Fig. 1A and B).

The presence of exosomes was determined by Western blotting with a panel of antibodies for endosomal, plasma membrane, nuclear, Golgi and mitochondrial markers (Fig. 2A). Exosomes were enriched in tsg-101 and flotillin-1 while no detectable GM130, nucleoporin or Bcl^{−2} was present. This observation indicates that exosome preparations were enriched in proteins of endosomal origin and that no contaminating nuclear, Golgi, mitochondrial and apoptotic membranes were present. Exosomes isolated by the Optiprep method were further probed with prion protein (PrP) and tsg-101 to indicate the presence of respective prion and exosomes after gradient separation (Fig. 2B).²³ Western blotting of Optiprep gradient fractions highlighted that fraction 8 and 9 were enriched with exosomes. Results from electron microscopy (Fig. 2C) and qNano (Fig. 2D and E) demonstrated that exosomes isolated from GT1–7 cells were composed of extracellular vesicles of ~ 100 nm in size. The morphology and size of vesicles were consistent with our previous studies using differential UC with or without Optiprep density gradients.^{8,23}

Exosomes released from mouse GT1–7 hypothalamic neuronal cells contain RNA

RNA was extracted from neuronal cell-derived exosomes prepared by the 2 isolation methods (Fig. 1B) and the corresponding GT1–7 cells as a control. The quality and quantity of the isolated RNA were determined using an Agilent Bioanalyser, which showed an electropherogram of enriched RNA in Optiprep fractions 7–11 (Fig. S1A). The amounts of small RNA, including miRNA, peaked at fraction 8 (range_{miRNA} = 2.14–2.66 ng/ μl , median_{miRNA} = 2.49 ng/ μl ; range_{smallRNA} = 20.5–

28.5 ng/ μ l, median_{smallRNA} = 27.2 ng/ μ l) and small RNA amounts (Fig. S1B) correlate with enriched exosomes as observed via Western blotting (Fig. 2B). Small RNA Bioanalyser profiles for exosomes isolated from either isolation method indicated that UC and fractions 8 and 9 contained high yield of RNA and a broad range of small RNA sizes between 4 and 100 nt in length, with an enriched peak at ~60 nt (Fig. S1C). Optiprep fractions 7 and 10, contained lower amounts of small RNAs, with the remaining fractions contained little or no small RNA.

Small RNA sequencing reads

To further investigate the presence of small RNA species, the Ion Torrent sequencing platform was used to perform unbiased deep sequencing of each sample. Based on the small RNA Bioanalyser profiles, Optiprep fractions 7, 8, 9 and 10 were selected for sequencing. Small RNA libraries were subsequently prepared for 6 data sets, with 5 replicates for Optiprep fractions 7–10 and 3 replicates for UC

exosome and GT1–7 cell. The same amount of RNA (20 ng) across all samples was used for small RNA library construction. Read length distribution after adaptor removal revealed 3 major peaks at 18–22, 30 and 55 nt (Fig. 3). The peak at 18–22 nt indicates an abundance of mature miRNAs in exosomes and cells. After sequence alignment, an average of 1×10^6 sequencing reads was obtained (Supplementary Table S1).

Identification of different RNA biotypes via small RNA profiling pipeline

Small RNA species were identified using in-house small RNA analysis pipeline²⁸ that integrates BEDtools and edgeR as outlined in Supplementary Methods. The analyzed data sets contained a wide array of small RNAs across all the chromosomes (Fig. 4A). The composition of small RNA libraries (Fig. 4B) revealed that Optiprep and differential UC exosomes are comprised of miRNA (median 1.29%, range 0.48–2.11%), piRNA (median 1.09%, range 0.46–1.71%), snRNA (median 0.17%,

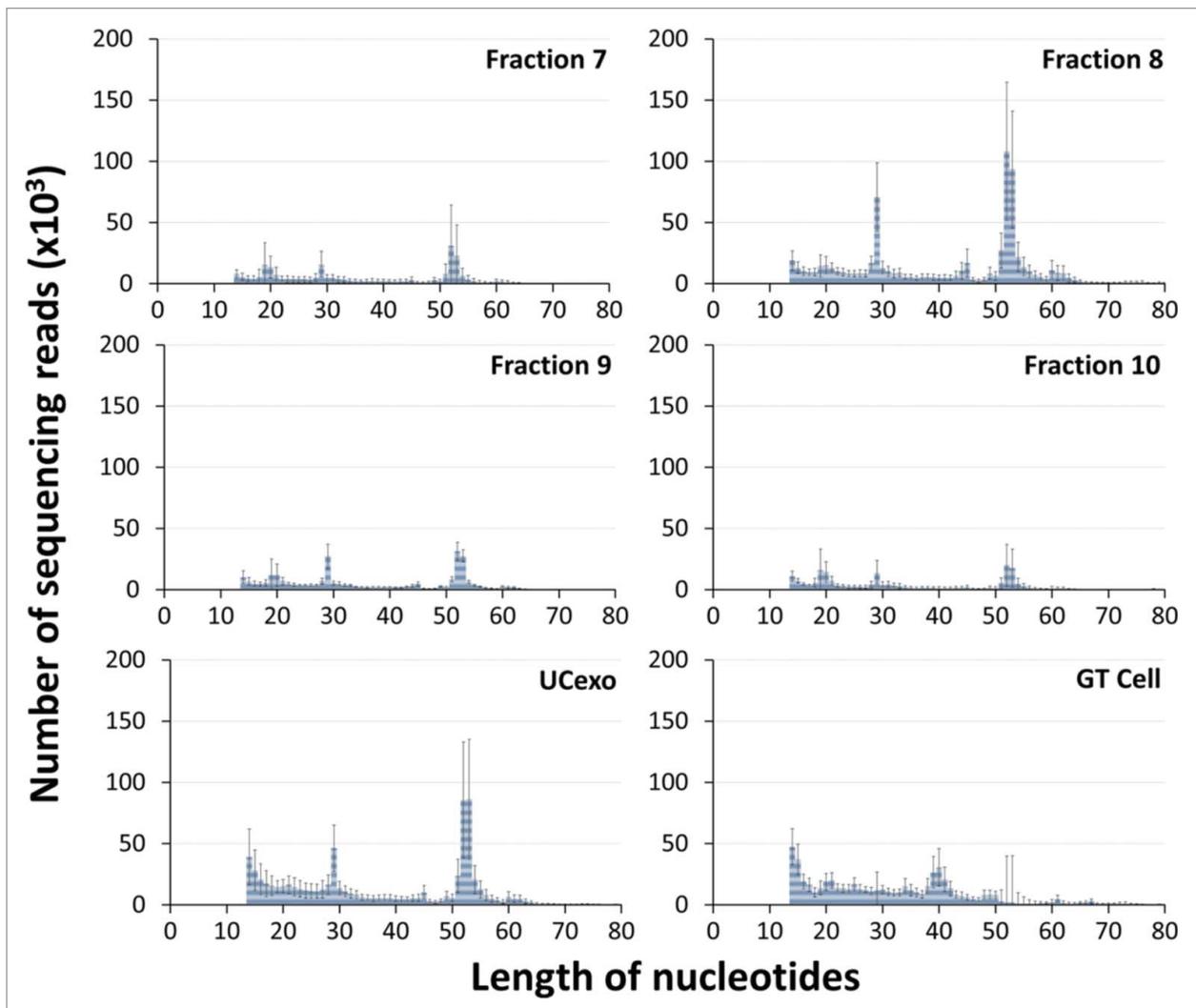


Figure 3. Read length of small RNA sequencing. Read length (nucleotide) distribution after adaptor removal. Each y-axis depicts the number of sequencing reads of all samples comprising of 5 replicates in each of the respective fraction, 3 replicates of exosomes isolated from ultracentrifugation method, and 3 replicates of GT1–7 neuronal cells. Standard deviations are shown in the bar graph.

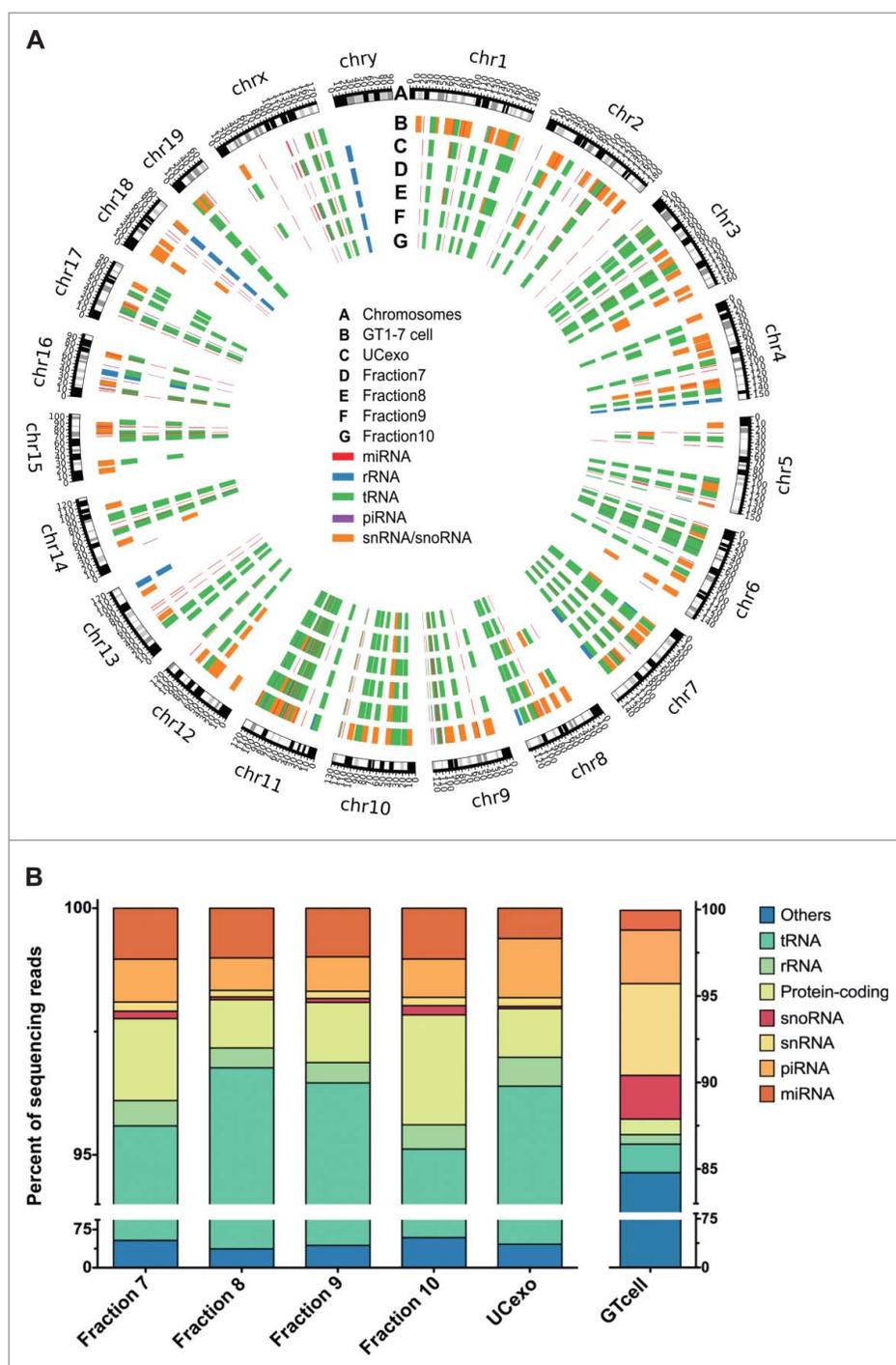


Figure 4. Small RNA sequencing of GT1-7 neuronal cells and GT1-7-derived exosomes isolated by 2 different protocols. (A) Circos diagram depicting small RNA transcriptome data. Track A: cytogenetic bands, chromosomes are depicted qter to pter. Track B to G: Highlight of all small RNAs (miRNA, rRNA, tRNA, piRNA, snRNA and snoRNA) identified across different sample groups in respect to GT1-7 neuronal cell, exosomes isolated from differential UC (protocol 1) and Optiprep fractions (i.e. Fraction 7 to 10) using Optiprep velocity gradient ultracentrifugation (protocol 2). (B) Distribution of small RNA species in the analyzed data sets. Profiles of different biotypes in each data set are percentage proportion to the total reads mapped to small RNA species and other elements, in particular to tRNA, rRNA, snoRNA, snRNA, piwi-RNA, miRNA, protein-coding fragments and others (i.e. repeat elements). Abbreviations: ‘miRNA’ – microRNA; ‘rRNA’ – rRNA; ‘tRNA’ – tRNA; ‘piRNA’ – piwi-interacting RNA; ‘snRNA’ – small nuclear RNA; ‘snoRNA’ – small nucleolar RNA; ‘UCExo’ – exosomes from differential UC.

range 0.11–0.23%), snoRNA (median 0.07%, range 0.04–0.10%) and fragments of tRNA (median 54.3%, range 41.6–67.0%), rRNA (median 0.54%, range 0.20–0.88%) and protein-coding mRNA (range 0.49–1.82%) (Table 1 and Supplementary Table S2). The remaining ~42.26% sequences contained mostly fragments of RNA repeat elements. The collated results from the identified ncRNA species displayed that exosomes isolated

from both methods consist of a diverse range of small RNA sequences.

Comparison of small RNA profiles in exosomes

The relationship of small ncRNAs was explored among samples to survey for any clustering of data sets. Three clusters were

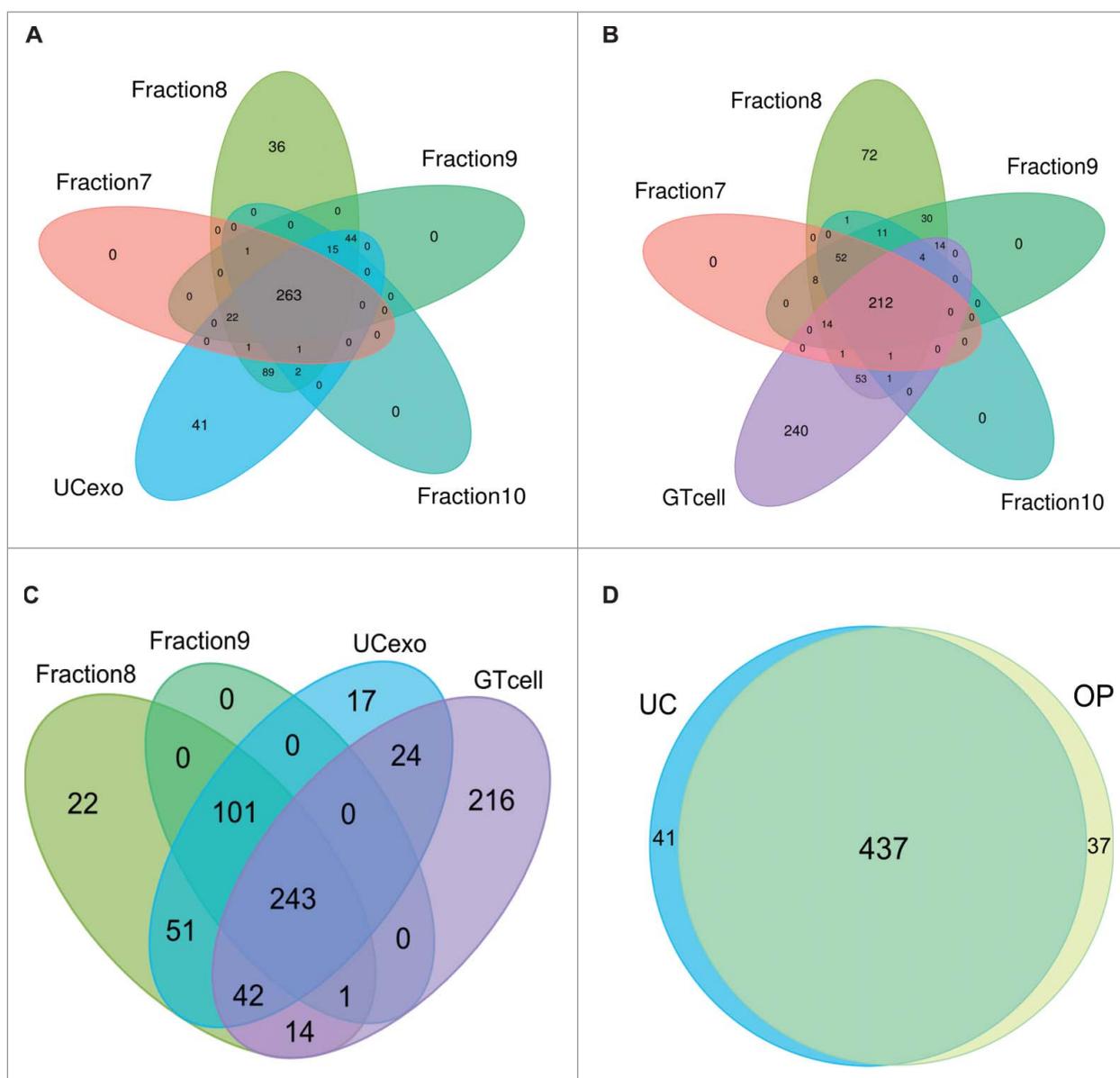


Figure 6. Venn diagrams showing unique and common small RNA detected in different exosome methods and GT1–7 neuronal cells. (A) The 5-way Venn diagram illustrates the differences and similarities of small RNAs identified in exosomes isolated from differential UC method (protocol 1) and Optiprep velocity gradient ultracentrifugation (protocol 2). (B) The 5-way Venn diagram demonstrates the overlapping of small RNAs across all fractions with enriched small RNA in Fraction 8 and 9. (C) The 4-way Venn diagram displays the unique small RNA in exosome data sets when compared with GT1–7 neuronal cells. (D) The proportional Venn diagram demonstrates the similarities of small RNA extracted from both protocols. Please see list of small RNAs across Venn diagrams in Supplementary File 1.

observed in the MDS and PCA plot with dominant clusters as cells, exosomes and other Optiprep fractions (Fig. 5A and B). In addition to the MDS and PCA plots, the correlation between the replicates of each data set were explored. The distance mapping by Euclidean distance metric (Fig. 5C) demonstrated that replicates were highly correlated; Spearman's correlation coefficients ranging from 0.8 to 0.9 for each data set (Fig. S2), in which exosomes from Optiprep and differential UC were closely associated ($r = 0.94$). The unsupervised hierarchical clustering analysis (Fig. 5D) on log₂-normalized reads also illustrated the distinct profile of small RNAs in exosomes. The individual profiles of small RNAs are shown in Fig. S3. The expression profile analysis provided an initial verification that both methods were capable of isolating exosomes with similar small RNA profiles.

To investigate in greater detail the small RNA profiles in exosomes isolated from the two different methods, small RNAs that were unique or common to the different preparation protocols were examined. Across all the different small RNA species in Optiprep fractions, 263 small RNAs overlapped between the four fractions and UC exosomes, with 41 small RNAs that were unique in the UC exosomes (Fig. 6A). By comparing the RNA biotypes identified in Optiprep and UC exosomes with cells, 243 RNAs were in common, indicating that exosomes contained a unique subset of RNA from that of cells (Fig. 6B and C). A high proportion of other small RNAs were common between the small RNA profiles of exosomes isolated from the two methods (Fig. 6D).

To assess the small RNA profiles in the exosomes, the top small RNAs across the samples were tabulated in a matrix table (Fig. S4). The majority of miRNAs in exosomes was composed

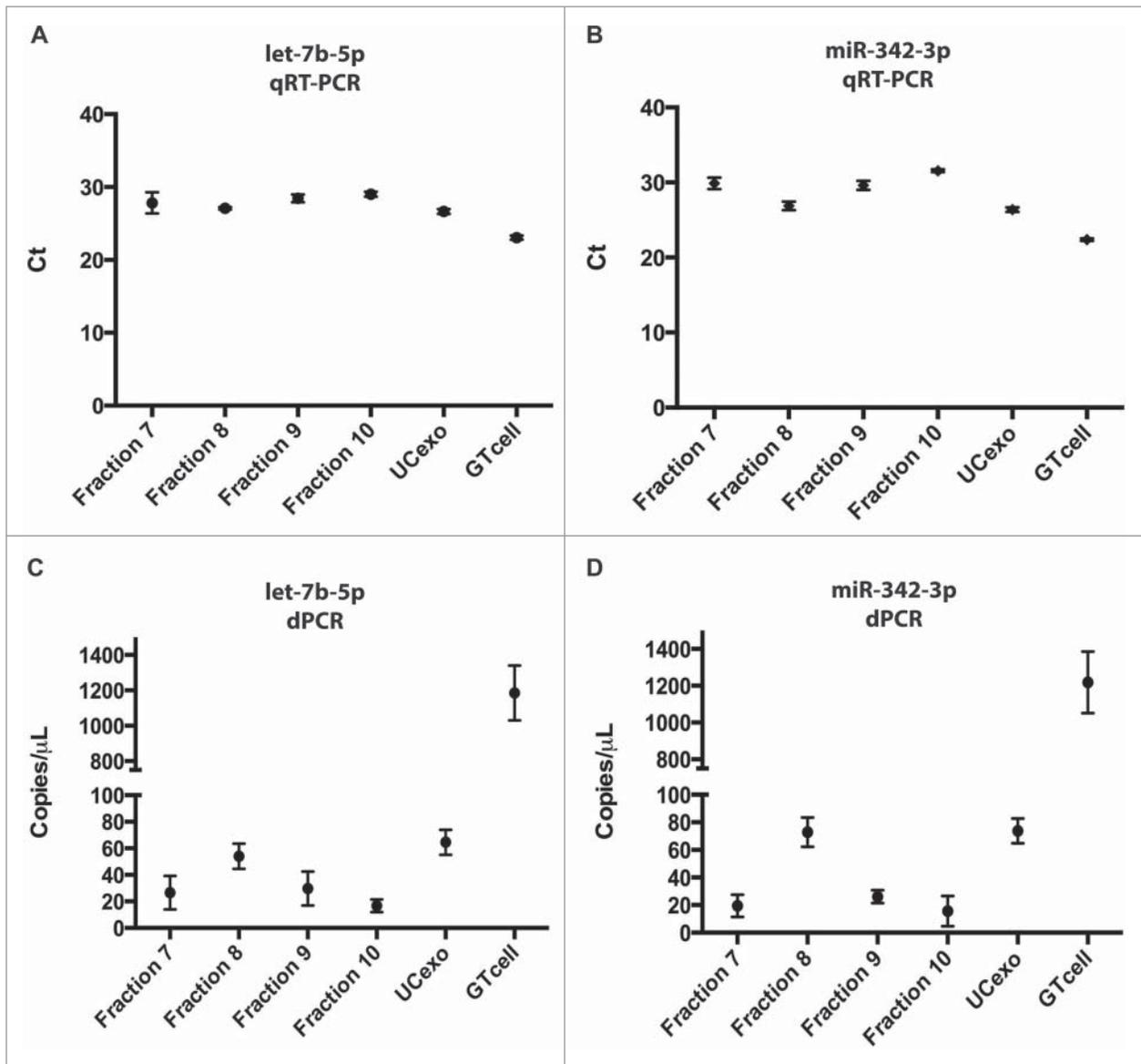


Figure 7. Validation of miRNA expression by qRT-PCR and digital PCR assays. qRT-PCR miRNA expression assays of GT1–7 cells and exosomes from differential UC (UCexo) and Optiprep fractions 7, 8, 9 and 10 for (A) let-7b and (B) miR-342-3p, data expressed as raw Ct values, $n = 3$. Digital PCR of miRNA in GT1–7 cells and exosomes from differential UC (UCexo) and Optiprep fractions 7, 8, 9 and 10 for let-7b (C) and miR-342-3p (D), data expressed as copies per μ L, $n = 3$. Standard deviations are shown in the graph.

of let-7 gene family. Another miRNA of interest was miR-342-3p due to its presence in various diseased states.⁸ To validate the NGS data we used targeted primer based technologies, qRT-PCR (Fig. 7A and B) and digital PCR (Fig. 7C and D), to confirm the presence of let-7b and miR-342-3p expression. Both primer based technologies displayed Ct values indicating a peak in abundance of let-7b and miR-342-3p with purified exosomes in Optiprep fraction 8, with similar expression observed for UC exosomes, confirming the observations seen in the NGS data. The small proportion of rRNA detected in exosomes composed of mostly 5S rRNA sequences of different variety, which was consistent with our published report.⁸ Further, other small RNAs such as piRNA, snoRNA and snRNA were expressed in neuronal cell-derived exosomes, particularly the exosomes prepared by Optiprep, but little is known about their functional roles of piRNA in exosomes.

Specific tRNA fragments are identified in exosomes

Recently, studies have reported that the production of tRNA fragments were composed of tRNA halves (30–35 nt) and tRNA-derived fragments (13 and 20 nt in size).⁴³ These tRNA fragments were observed in our present study. In Fig. 8A, a large proportion of reads were observed to map to tRNA regions in exosomal samples which mostly comprised of tRNA fragments. The percentage composition of tRNA fragments (Fig. 8B and Fig. S5) showed that tRNA-Gly, tRNA-Lys and tRNA-Val isoacceptor type were abundant in exosome samples and the majority of these tRNA fragments range between 50–53 nt in length (Fig. 8C and D), except for tRNA-Lys where fragment lengths varied (Fig. 8E). Specific tRNAs appeared to be selectively loaded into exosomes as fragments.

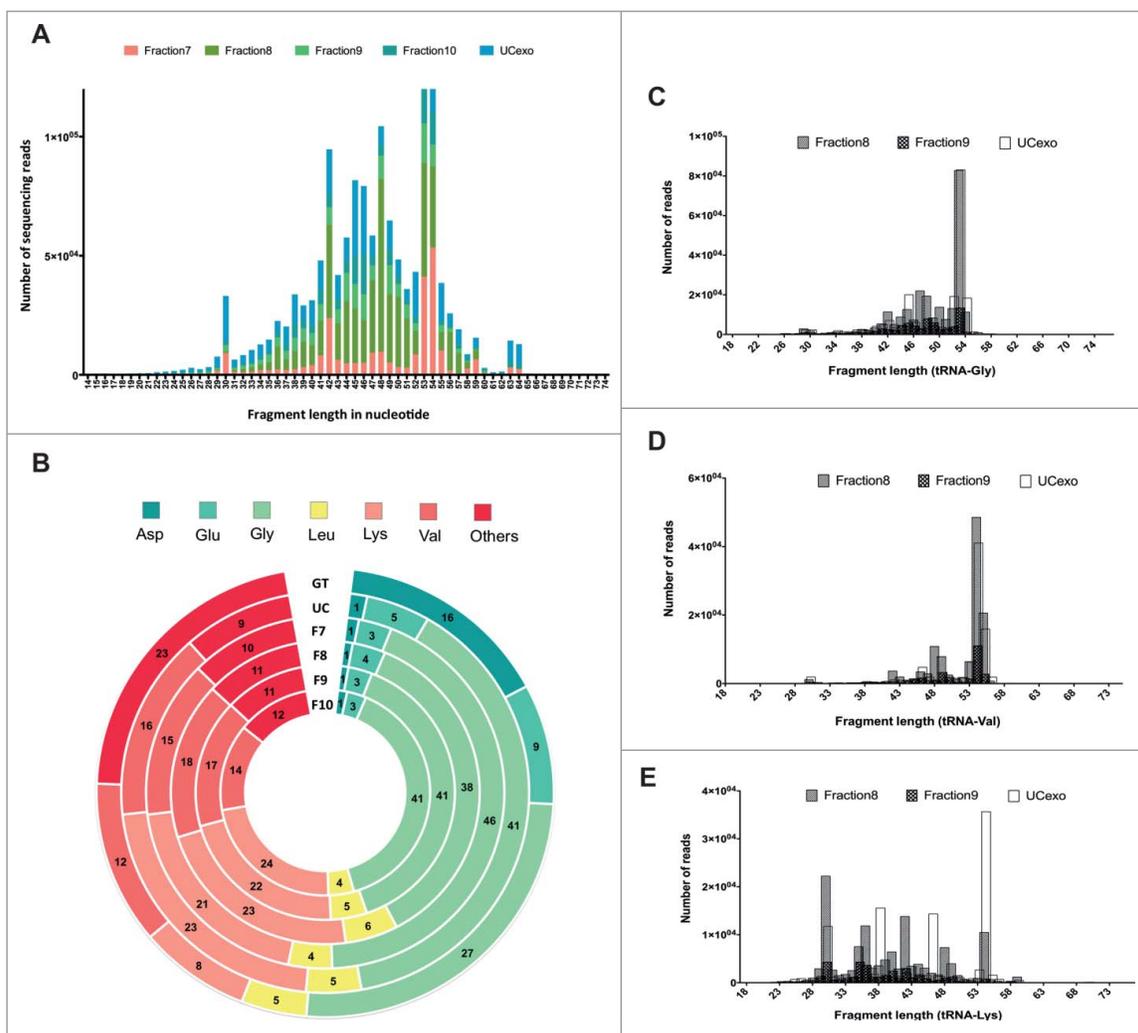


Figure 8. Exosomes contain tRNAs. (A) Histogram of transferRNA (tRNA) fragment lengths in nucleotides for tRNA-Gly, tRNA-Lys and tRNA-Val in all data sets. (B) Percentage composition of the tRNA isoacceptor type showing abundance of tRNA-Gly, tRNA-Lys and tRNA-Val. The doughnut chart illustrates the distribution of different tRNA isoacceptor types. Percentage reads mapping to each type are average across the replicates in each data set. (C) Histogram of tRNA smaller fragments in exosome data sets (i.e. exosomes from differential UC (UCexo) and Optiprep fraction 8 and 9). The bar shows peaks between 53 and 56 nucleotides.

Discussion

There has been a particular interest in determining the most appropriate method for purifying exosomes to profile small RNA.^{8,12,44} Studies have demonstrated that exosomes provide a protective and enriched source of small RNA for disease biomarker detection in biologic specimens.^{19,45–48} The method to isolate exosomes is often selected based on the ability to minimise co-purifying protein aggregates and other extracellular particles. The minimisation of such contaminating elements may provide the opportunity to perform further downstream analyses, such as structural biology, proteomics, lipidomics and genomics. In this study, we investigated the need for a more defined method for small RNA profiling.

Here, we have applied the two common protocols that were previously published for isolating GT1–7 neuronal cell-derived exosomes.^{8,23,29} Differential UC (protocol 1) is the most conventionally used technique to isolate exosomes from GT1–7 cells and other cell lines. However, UC technique is limiting in the ability to minimise contaminating proteins and other membranous particles. More specific separation methods,

particularly over a gradient is necessary for studies requiring increased purity of exosomes. Optiprep velocity gradients (protocol 2) were previously demonstrated by Coleman et al. to further purify exosome preparations devoid of contaminating elements that may hinder downstream analysis as observed by high-resolution microscopy. To perform a comprehensive survey of small RNA species in exosomes isolated from each method, a high-throughput workflow that comprised of NGS and bioinformatics was used. Sequence reads were mapped to loci of a wide variety of small ncRNA species, such as miRNA, piRNA, tRNA rRNA, snoRNA and snRNA. The expression analysis of exosomes prepared by both methods suggested that the small RNA profiles of exosomes were similar to each other and distinct from the GT1–7 neuronal cells. The overall RNA composition in exosomes further confirmed our previous study investigating small RNA profiles in circulating exosomes released from prion-infected GT1–7 neuronal cells.⁸

As miRNAs are sorted into exosomes and secreted into the bloodstream there is an interest in profiling for miRNA disease associated signatures in exosomes.^{19,22,44} Disease signatures have comprised of miRNAs such as miR-29b, miR-342–3p,

miR-424 and let-7 family which were dysregulated in neurodegenerative diseases including Alzheimer and Prion diseases.^{9,42,49} In this study, we successfully validated the presence of let-7b-5p and miR-342-3p in UC exosomes and Optiprep purified exosomes via qRT-PCR and digital PCR suggesting that Optiprep gradients are not required to detect these miRNAs for biomarker purposes. Among these miRNAs, the top miRNA signatures presented in exosomes prepared by both methods mostly overlapped thus, both Optiprep gradient and UC methods are capable of isolating exosomes that contained similar miRNA profiles. Further, these miRNAs exhibited neuronal signaling regulation such as neurologic development and differentiation,^{8,9,42} suggesting the potential functional role of exosomes implicated in neurologic processes.

Recently, studies have demonstrated that the biogenesis of tRNA fragments serves a specific process depending on the cell type and cellular condition.^{50,51} Fragments derived from tRNA were found to be specifically cleaved to perform diverse functions, such as reverse transcription and guidance of other RNAs.⁵²⁻⁵⁴ There are two main groups of tRNA fragments; tRNA halves (30–35 nt) and tRNA-derived fragments (30–50 nt).⁴³ Furthermore, specific coverage of the fragments on the 3' or 5' end of tRNA had different functional roles. For example, 3' tRNA fragments have been found to be associated with Argonaute proteins and potentially function similarly to miRNA by repressing translation. Our study displayed a large number of sequences mainly composed of ~30–53 nt tRNA-derived fragments in exosomes. Upon analyzing the abundant tRNA in exosomes, tRNA-Gly isotypes were mostly derived from the 3' end (Fig. S6). Given the potential for tRNA fragments to play important roles in regulating many biologic processes, further studies on the selective abundance of specific types of tRNA fragments in exosomes are necessary to elucidate the current finding.

Using NGS, exosomes prepared by both methods were observed to contain a significant expression of piRNAs. piRNAs are of 24–32 nt in length and associate with Piwi family of proteins including MIWI, MILI, and MIWI2.⁵⁵ Initially, piRNA were reported to be implicated in silencing transposable elements of an animal germ line.⁵⁶⁻⁵⁸ The first evidence demonstrating the presence of piRNA in the nervous system was reported by Lee et al., in which piRNA complexes were found to be implicated in dendritic spine development of axons.⁵⁹ In this study, a panel of piRNAs found in exosomes may assist in the shuttle of piRNA between cells to act upon their targets within a neuronal system. Other small RNAs detected were snRNAs or snoRNAs, based on their average size (60–300 nt), however there was a low abundance of these transcripts. Although sn/snoRNAs have been shown to regulate transcription factors and translation,^{60,61} the exact mechanism still requires further investigation. The silencing and other potential functions from these ncRNA species may provide additional mechanisms and further understanding exosomal cargo and transfer.

A noteworthy contrast of this study is one performed by Van Deun et al where they observed distinct mRNA profiles obtained from microarray analysis of exosomes isolated from UC and Optiprep.⁶² The contrast of our studies may be due to slight differences in exosomal isolation methods and our ability

to obtain high unbiased deep sequencing coverage of small RNA which demonstrated that exosomes can contain larger amounts of small RNA between 20 to 200 nt in length.

In conclusion, the use of high throughput workflow revealed a wealth of information on the different biotypes of small ncRNAs in exosomes prepared by Optiprep gradient and UC method. Similar exosomal small RNA profiles from both exosome isolation methods are demonstrated in the present study, suggesting that the presence of remaining cell debris does not influence downstream transcriptomic analysis, in particular, for the detection of small RNA biomarkers. The UC method may be the preferred protocol as it provides a time efficient and easy protocol for small RNA biomarker discovery projects and further applications.

Disclosure of potential conflicts of interest

No potential conflicts of interest were disclosed.

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