

# Circulating Messenger RNA Profiling with Microarray and Next-generation Sequencing: Cross-platform Comparison

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**Abstract.** *Background:* Circulating mRNA is a less invasive and more easily accessed source of samples for biomedical research and clinical applications. However, it is of poor quality. We explored and compared the ability of two high-throughput platforms for the profiling of circulating mRNA regarding their ability to retrieve useful information out of this type of samples. *Materials and Methods:* Circulating mRNAs from three non-small cell lung cancer patients and three healthy controls were analyzed by the cDNA-mediated annealing, selection, extension, and ligation (DASL) assay and high-throughput RNA sequencing (RSEQ). Twelve genes were selected for further confirmation by reverse transcription-quantitative polymerase chain reaction (RT-qPCR). *Results:* The overall expression profiles derived from the two platforms showed modest-to-moderate correlation. Genes with higher expression levels had higher cross-platform concordance than those of medium- and low-expression levels. In addition, the pathway signatures identified by gene set enrichment analysis from both platforms were in agreement. The RT-q PCR results for the selected genes correlated well with that of RSEQ. *Conclusion:* Genes

with higher expression levels have cross-platform concordance and can be potential biomarkers. Furthermore, RSEQ is a better tool for profiling circulating mRNAs.

As an important component of liquid biopsies from peripheral blood and other body fluids, circulating RNAs, have recently attracted interest because they are a less invasive, easily-accessed source of samples for biomedical research or clinical applications (1, 2). Circulating RNA is protected in membrane vesicles released from many tissues of the body, including cancer tissues. Because circulating RNA reflects the status of its parent cells, specific circulating RNA species have the potential to serve as biomarkers for cancer diagnosis or therapeutic monitoring. Among these RNA species, small non-coding RNAs, including microRNAs (miRNAs) and small nuclear RNAs (snRNAs), are more abundant and stable, making them easier to detect. It has been suggested that several small non-coding RNAs in circulation are associated with cancerous diseases (3, 4).

Through systemic RNA profiling with high-throughput techniques, such as microarray analysis or next-generation sequencing, many circulating RNA transcripts have been found to be highly correlated with cancers and are considered potential biomarkers for diagnostics (5-7), prognostics (8), long-term surveillance (9), and evaluation of therapeutic efficacy (10). However, while most achievements on circulating RNA profiling focus on small RNA species, few reports are addressing mRNA because it is more diverse, fragmented, and less abundant in the circulation, making it relatively more difficult to detect.

Few methods can be applied to detect low-abundant and fragmented RNA. One is the cDNA-mediated annealing, selection, extension, and ligation (DASL) assay. Another is high-throughput RNA sequencing (RSEQ). The microarray-based DASL assay was originally designed for profiling

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RNA from formalin-fixed, paraffin-embedded (FFPE) tissues. The fragmented RNAs are first reverse transcribed into cDNA with designed oligomers and then amplified with polymerase chain reaction (PCR). The PCR products are hybridized to gene-specific probes on a beadchip for signal detection. This strategy can enhance opportunities for detecting low levels of fragmented RNA molecules from FFPE tissues (11-14). These studies demonstrate the potential of DASL assay in profiling circulating RNAs.

RSEQ is widely used to survey transcriptomic profiles in different types of samples. In addition to digital gene expression, it can also identify alternatively spliced transcripts as well as strand-specific expression. RSEQ has been used for profiling FFPE samples (15) and liquid biopsy (16). Many novel biomarkers in different RNA species have been identified through this approach (5, 17-20).

In the present study, we explore the ability of two methods to profile circulating mRNA. The expressing data derived from both platforms are compared and validated with reverse transcription (RT)-quantitative PCR (qPCR). The DASL assay and RSEQ have better concordance in genes that have high expression levels than in the genes with medium and low expression levels. In addition, RSEQ correlates better with RT-qPCR.

## Materials and Methods

*Sample preparation.* Plasma samples from three non-small cell lung cancer (NSCLC) patients and three healthy volunteers were used. Informed consent was obtained from each attendee. This study was approved by the Institutional Review Board of Chang Gung Memorial Hospital (approval number: 100-2065A3).

In order to prepare the plasma samples, 10 ml of venous blood from each attendee was drawn into a blood-collecting tube with K<sub>3</sub>EDTA as an anti-coagulant. After centrifugation at 1,600 × g, the plasma was collected and stored at -80°C until use. Circulating RNAs in the samples were extracted with TRIzol-LS reagent (Thermo Fisher Scientific, MA, USA) according to the manufacturer's instructions. The RNA concentration was quantitated with NanoDrop-1000 (Thermo Fisher Scientific). The RNA quality, especially integrity, was measured with a Bio-Analyzer 2100 (Agilent, CA, USA).

*DASL assay and RSEQ assay.* Aliquots of 500 ng of circulating RNA were used for each DASL and RSEQ assay. The assays were outsourced to an Illumina certificated service provider, Genetech Biotech (Taipei, Taiwan). For the whole-genome DASL assay, the RNA samples were reverse transcribed, amplified, and hybridized to Human HT-12 v4 Expression BeadChip, which contains probes for 23,811 coding transcripts. For the RSEQ assay, the RNA samples were subjected to library construction with the ScriptSeq-V2 kit (Epicentre) except that the fragmentation step was skipped in the procedures before ribosomal RNA depletion. The libraries were then sequenced using a MiSeq sequencer. More than 10 million single-end reads with 100-bp in length were generated for each sample. The sequencing data were analyzed by the TopHat-Cufflinks pipeline (21). Briefly, five nucleotides and ten nucleotides were trimmed from the 5'- and 3'-ends of each read, respectively. The trimmed reads were

mapped to human genome (hg19, UCSC) with TopHat. Then, the expression level of each transcript was calculated as reads per kilobase per million mapped reads (RPKM) with Cufflinks.

*Gene set enrichment analysis.* To identify the biosignatures of circulating RNAs, gene set enrichment analysis (GSEA) was introduced. The gene expression level determined through either the RSEQ or DASL assay was processed in the GSEA module of GenePattern software (22). During analysis, the permutation type was assigned as "Gene Set", which were based on the Kyoto Encyclopedia of Genes and Genomes (KEGG) database (c2.cp.kegg.V4.0.symbols). The differences in the expression for each gene between the NSCLC patients and healthy volunteers were ranked according to the signal-to-noise ratio (SNR). The higher SNR value indicate a higher expression level in NSCLC patients than in healthy volunteers. According to the SNR of each gene, the KEGG pathways that were overexpressed in either patients or healthy volunteers were selected. The normalized enrich score (NES) represented activation in NSCLC patients.

*Reverse-transcription and quantitative PCR.* Twelve gene transcripts were selected for further confirmation by RT-qPCR, including five genes that showed high-expression levels in RSEQ and low expression levels in the DASL assay, four genes that showed low expression levels in RSEQ and high expression levels in the DASL assay, and three housekeeping genes that showed high expression levels in both platforms. The detailed information is shown in Table I. Reverse-transcription of RNA was conducted using random hexamers and M-MLV reverse transcriptase in the supplied buffer and dNTPs at 42°C for 90 min. The resulting cDNAs were used as templates for qPCR for specific genes. The PCR mixture contained the cDNA templates and specific primers, 50 mM Tris-HCl (pH8.5), 2% BSA, 3 mM MgCl<sub>2</sub>, 200 μM of each dNTP, 0.5X SYBR green I, and 0.5 U Platinum Taq. PCR was conducted on a LightCycler 480 (Roche, Basel, Switzerland). The thermal profile used for gene amplification was as follows: a pre-incubation step at 95°C for 3min, which was followed by 45 amplification cycles consisting of 3 steps: 95°C, 5 s; 60°C, 15 s; and 72°C, 30 s. During PCR, fluorescent acquisition of SYBR green I was conducted at the end of 60°C incubation of each cycle.

*Statistics.* The Pearson's correlation coefficient was applied to evaluate the correlations between the following: (1) the expression profiles generated by DASL and RSEQ assays, (2) the pathways identified from the data of DASL and RSEQ assays, and (3) the relative expression levels of selected genes between RT-qPCR and either the DASL or RSEQ assay.

The correlation between expression profiles derived from the DASL and RSEQ assays was based on the quantile-normalized gene expression level of both platforms. The correlation between pathways identified by the two platforms was according to the NES values calculated by GSEA. The correlation between the results of RT-qPCR and either DASL or RSEQ assays was based on the C<sub>T</sub> value of qPCR and the correspondent log<sub>2</sub>-transformed expression level of each platform.

## Results

RNAs from the plasma of three non-small cell lung cancer (NSCLC) patients and three age-matched healthy volunteers were extracted using TRIzol-LS protocol. RNA yields of the

Table I. *Primer sets for candidate genes.*

Gene	Expression (DASL)	Expression (RSEQ)	Name	Sequence (5' to 3')
<i>CDC27</i>	Low	High	mrCDC27-F mrCDC27-R	CGGTACCACGTGTCGACTTAACAGAGTGGAAATAGCCGAG CGGTACCACGTGTCGACTTATGAGGTGTTGTACTTGTGTTG
<i>ESCO2</i>	Low	High	mrESCO2-F mrESCO2-R	CGGTACCACGTGTCGACTTACCATCAAACAGGCATTTCGT CGGTACCACGTGTCGACTTAAACCCAGATTCTACTTATCCCA
<i>UBE2K</i>	Low	High	mrUBE2K-F mrUBE2K-R	CGGTACCACGTGTCGACTTAATCCCGAAATGTTCAAACAGAC CGGTACCACGTGTCGACTTATACTGCATTTCCTATCAAAGCC
<i>RHOBTB3</i>	Low	High	mrRHOBTB3-F mrRHOBTB3-R	CGGTACCACGTGTCGACTTACGACCTATCTTGAACCTCCAC CGGTACCACGTGTCGACTTAAATACTCCAACACTCCTCCA
<i>COL1A1</i>	Low	High	mrCOL1A1-F mrCOL1A1-R	CGGTACCACGTGTCGACTTAAAGGTGCCAATGGTGCTC CGGTACCACGTGTCGACTTAGTGTCTCCTTTGCTGCCA
<i>FASN</i>	High	Low	mrFASN-F mrFASN-R	CGGTACCACGTGTCGACTTACATCTACAACATCGACACCAG CGGTACCACGTGTCGACTTAGTCTTCCACACTATGCTCAG
<i>DCXR</i>	High	Low	mrDCXR-R mrDCXR-R	CGGTACCACGTGTCGACTTAGTAACATAACCATAGCGTCTACTG CGGTACCACGTGTCGACTTAAATTCACTCGGATCTTGTGGG
<i>PTOV1</i>	High	Low	mrPTOV1-F mrPTOV1-R	CGGTACCACGTGTCGACTTACCCTACTCTGACTCCACTG CGGTACCACGTGTCGACTTATCGGTCTCCAGGTTCTC
<i>PNPLA6</i>	High	Low	mrPNPLA6-F mrPNPLA6-R	CGGTACCACGTGTCGACTTACTCTCATCTTCAACTGCGA CGGTACCACGTGTCGACTTAGCGCATGATCTCATAGAAGTC
<i>ACTB</i>	High	High	mrACTB-F4 mrACTB-R4	CGGTACCACGTGTCGACTTATCAAGATCATTGCTCCTC CGGTACCACGTGTCGACTTAGGACTCGTCATACTCC
<i>B2M</i>	High	High	mrB2M-F3 mrB2M-R3	CGGTACCACGTGTCGACTTAGATGAGTATGCCTGCC CGGTACCACGTGTCGACTTAGCATCTCAAACCTCCA
<i>GAPDH</i>	High	High	mrGAPDH-F mrGAPDH-R	CGGTACCACGTGTCGACTTAGTCAACGGATTTGGTC CGGTACCACGTGTCGACTTAGGGTGGAAATCATATTGGA

samples were sufficient, with a range from 1 to 3 µg, but the integrity of the RNAs were far below the demand of most high-throughput assays. These samples were used for mRNA profiling with RSEQ and DASL assay.

*Data analysis for RSEQ and the DASL assay.* The sequencing results contained 10 to 13 million 100-bp single-end reads for each sample. To quickly access the read distribution, we mapped the reads to human RNA (GRCh37, NCBI) and DNA sequences (hg19, UCSC) using Borrowers-Wheeler Aligner (BWA). We found that approximately 20-42% of the reads could be matched to human RNA and 51-70% to human genomic DNA; the other 5-10% could not be matched to either sequences. Among the matched RNA reads, most (around 85%) were duplicate reads, suggesting a potential bias due to excess amplification from the low RNA input. The reads were then analyzed with the TopHat-Cufflinks pipeline, which is commonly used for computing gene expression profile. The expression level of each transcript was represented in RPKM format. The transcripts recorded in the Ensemble database were analyzed. A total of 41,888 transcripts were accessed in at least one sample, which included mRNAs, microRNAs, and non-coding RNAs. The RSEQ data were available in Sequence Read Archive (SRA) database (PRJNA286036). The DASL contains probes

for 29,285 transcripts. There were 20,817 transcripts identified in at least one sample in this study. The expression levels of these transcripts were computed using Genome Studio Data Analysis Software (Illumina) and have been uploaded to Gene Expression Omnibus (GEO) database (GSE69732).

*Genes with higher-expression levels showed cross-platform concordance.* There were 14,686 transcripts detected in both platforms and were further analyzed for cross-platform concordance. First, the expression levels of these transcripts in each sample were quantile-normalized. The correlations between the DASL and RSEQ results are shown as a scatter plot with Pearson's correlation coefficients. In the example of N11 and P08, the Pearson's correlation coefficients were 0.6028 and 0.4628, respectively, representing moderate correlations (Figure 1). Overall, there were 4 in 6 samples that had coefficients ranging from 0.4-0.7 (Figure 2). Leading to further dividing the genes into three groups, low-expression (the bottom 33%), medium-expression (the middle 33%), and high-expression (the top 33%), based on the data of the DASL assay. The Pearson's correlation coefficients were much higher in the high expression groups than that in the medium and low expression groups (Figures 1 and 2).

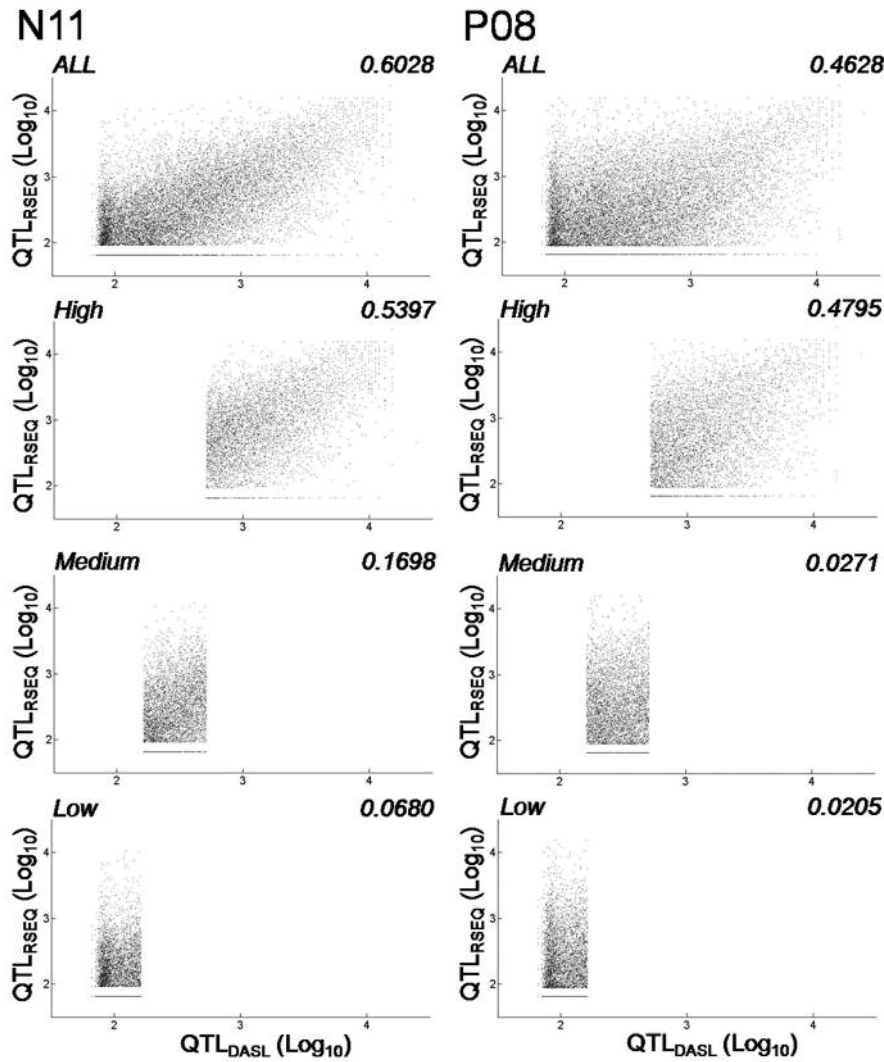


Figure 1. Scatter plot of gene expression level determined by the DASL assay and RNA sequencing. RNA expression profiles for samples N11 and P08 are demonstrated in this Figure. Based on the results of the DASL assay, all genes were separated into three groups: the high-expression, medium-expression, and low-expression group. The quantile-normalized gene expression level derived from DASL assay ( $QTL_{DASL}$ ) and RNA-sequencing ( $QTL_{RSEQ}$ ) for each group was plotted. The Pearson's correlation coefficient between the two platforms in each group was shown on the top of each plot.

Most enriched pathways were in agreement in the expression profiles determined by both platforms. The expression profiles in the three cancer patients and three healthy controls determined by either platform were then analyzed for pathway signatures using GSEA. The NES of each pathway was calculated based on signal-to-noise ratio. A positive NES indicated that the pathway was activated in the cancer group, whereas a negative one indicated that the pathway was down-regulated. The distribution of NES in most pathways were concordant from the data of both platforms (110 had negative NES and 21 had positive NES), only 32 pathways were discordant, with a Pearson's correlation coefficient of 0.6459 (Figure 3). These results

suggested that most pathway signatures determined by the two platforms were in agreement.

Gene expression level determined by RSEQ showed higher concordance to that determined with RT-qPCR. RT-qPCR was used to confirm the gene expression determined by the two platforms. Twelve genes were selected as targets; five of them showed high-expression levels in RSEQ and low-expression levels in the DASL assay, four of them showed low expression levels in RSEQ and high-expression levels in the DASL assay, and the other three were housekeeping genes that showed high-expression levels in both platforms. The correlations of the expression levels determined using

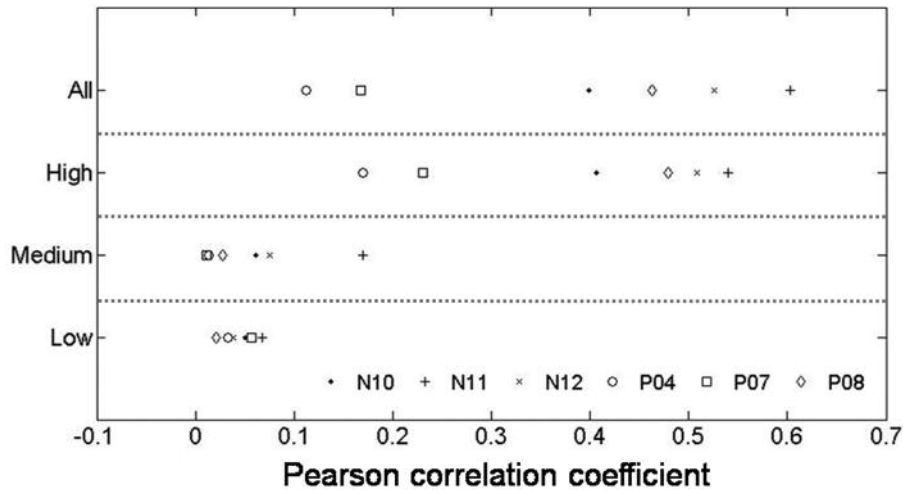


Figure 2. Correlation of the expression data determined by the DASL assay and RNA sequencing. The Pearson's correlation coefficients for genes with different expression levels in each sample were plotted.

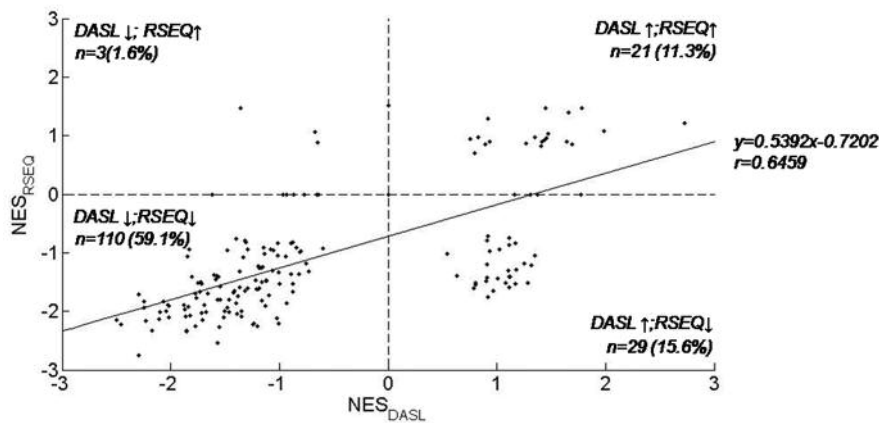


Figure 3. Correlation of the pathway signatures derived from the two platforms. The pathways or gene sets that were enriched in the expression data derived from the two platforms were analyzed by GSEA. The normalized enrichment score (NES) of each pathway in both platforms was plotted.

the two methods in each sample were shown in Figure 4A and 4B. The Pearson's correlation coefficient between the RT-qPCR and DASL assays ranged from 0.23 to 0.54 (modest to moderate correlation), without significance. The correlation between RT-qPCR and RSEQ ranged from 0.56 to 0.70 (moderate-to-high correlation) with statistical significance ( $p$ -value  $< 0.05$ ). These results demonstrated a higher concordance between RT-qPCR and RSEQ.

## Discussion

In clinical practice, 5-10 ml volume is regular for a single blood draw. The quantity and quality of circulating mRNA in the above blood sample is low. To test if high-throughput

methods can be applied to profile mRNA and retrieve useful information from this type of samples, we explored and compared the ability of two platforms, the microarray-based DASL assay and high-throughput sequencing-based RSEQ. The reason is that both methods have a potential to accept fragmented RNAs: The DASL assay is designed for degraded RNA from FFPE tissues; RSEQ has a RNA fragmentation step during library preparation, so an input of degraded RNA might be processed directly. In addition, both methods have a PCR step so a small amount of RNA can be amplified before signal acquisition.

We were pleased to find that the expression profiles derived from both methods in most samples had moderate correlations. The expression profiles in the high-expression

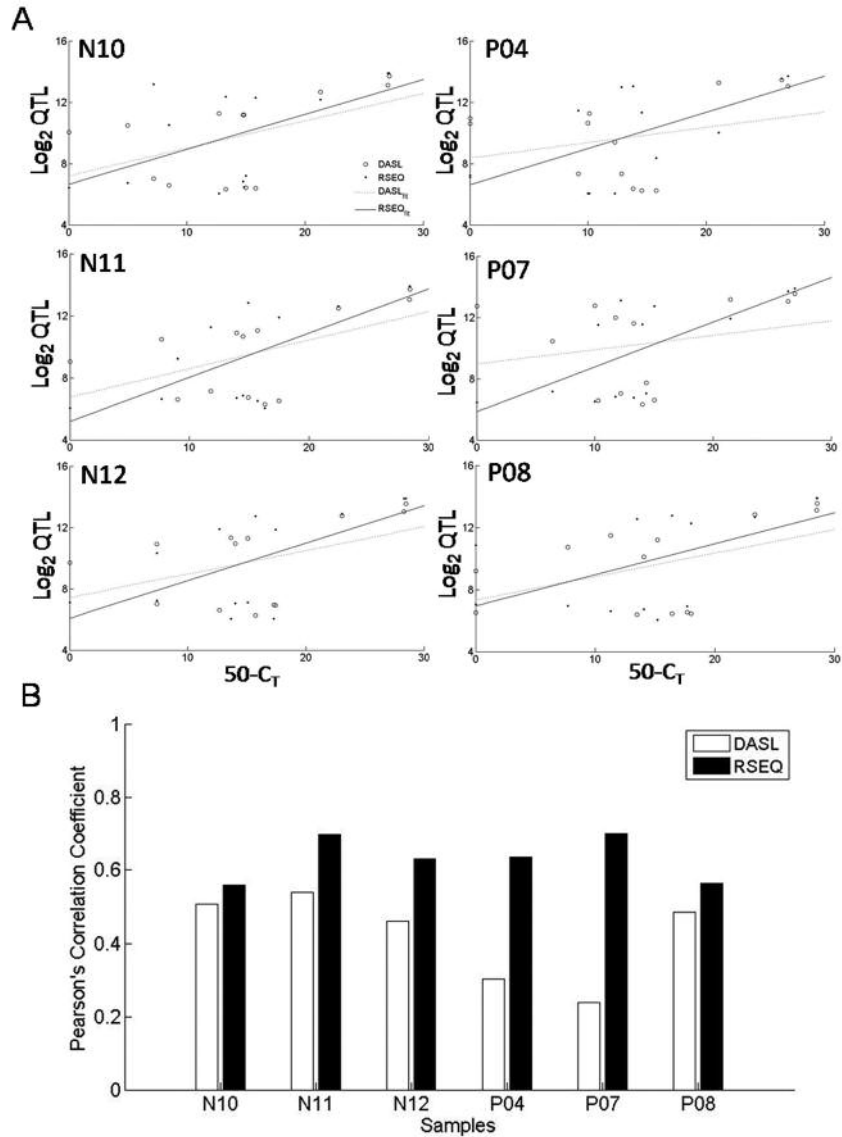


Figure 4. Correlation of the expression level determined by RT-qPCR and each platform. Expression levels of 12 genes were determined by RT-qPCR to confirm the data derived from the DASL and RSEQ assays. A, The expression level of each gene determined by both platforms and the corresponding  $C_T$  value determined by RT-qPCR. B, The summary of Pearson's correlation coefficients between RT-qPCR and each platform in all patients is shown.

genes had a stronger correlation than that in the medium- and low-expression genes. In addition, the pathway signatures identified from the profiles also had good concordance between both platforms. We also found that the RSEQ results were more concordant to RT-qPCR than the DASL results, suggesting that RSEQ and RT-qPCR have similar efficiency and dynamic range for the quantitation of circulating mRNA.

The fact that both platforms identified similar pathway signatures suggests that finding cancer-related pathways and biomarkers from circulating mRNA may be possible. In the present study, the most markedly enriched pathways or gene

sets are those involved in olfactory receptors, the WNT pathway, amino acid metabolism, neuron-associated receptors, and cytochrome-related genes. All the pathways or biological functions have been reported to be associated with cancer development (23-28), further supporting this argument.

Taken together the above facts, we have demonstrated that circulating mRNA can be profiled using the DASL and RSEQ assays. Genes with higher expression levels have better cross-platform concordance. The expression profiles determined by the high-throughput methods have the potential to identify cancer-related pathways and biomarkers in circulation.

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## References

- Santiago-Dieppa DR, Steinberg J, Gonda D, Cheung VJ, Carter BS and Chen CC: Extracellular vesicles as a platform for 'liquid biopsy' in glioblastoma patients. *Expert Rev Mol Diagn* 14: 819-825, 2014.
- Crowley E, Di Nicolantonio F, Loupakis F and Bardelli A: Liquid biopsy: monitoring cancer-genetics in the blood. *Nat Rev Clin Oncol* 10: 472-484, 2013.
- Pirola CJ, Fernandez Gianotti T, Castano GO, Mallardi P, San Martino J, Mora Gonzalez Lopez Ledesma M, Flichman D, Mirshahi F, Sanyal AJ and Sookoian S: Circulating microRNA signature in non-alcoholic fatty liver disease: from serum non-coding RNAs to liver histology and disease pathogenesis. *Gut* 64: 800-812, 2015.
- Enache LS, Enache EL, Ramiere C, Diaz O, Bancu L, Sin A and Andre P: Circulating RNA molecules as biomarkers in liver disease. *Int J Mol Sci* 15: 17644-17666, 2014.
- Baraniskin A, Nopel-Dunnebacke S, Ahrens M, Jensen SG, Zollner H, Maghnouj A, Wos A, Mayerle J, Munding J, Kost D, Reinacher-Schick A, Liffers S, Schroers R, Chromik AM, Meyer HE, Uhl W, Klein-Scory S, Weiss FU, Stephan C, Schwarte-Waldhoff I, Lerch MM, Tannappel A, Schmiegel W, Andersen CL and Hahn SA: Circulating U2 small nuclear RNA fragments as a novel diagnostic biomarker for pancreatic and colorectal adenocarcinoma. *Int J Cancer* 132: E48-57, 2013.
- Schrauder MG, Strick R, Schulz-Wendtland R, Strissel PL, Kahmann L, Loehberg CR, Lux MP, Jud SM, Hartmann A, Hein A, Bayer CM, Bani MR, Richter S, Adamietz BR, Wenkel E, Rauh C, Beckmann MW and Fasching PA: Circulating micro-RNAs as potential blood-based markers for early stage breast cancer detection. *PLoS One* 7: e29770, 2012.
- Dong L, Qi P, Xu MD, Ni SJ, Huang D, Xu QH, Weng WW, Tan C, Sheng WQ, Zhou XY and Du X: Circulating CUWR, LSINCT-5 and PTENP1 long noncoding RNAs in sera distinguish patients with gastric cancer from healthy controls. *Int J Cancer* 137: 1128-1135, 2015.
- Lim SH, Becker TM, Chua W, Caixeiro NJ, Ng WL, Kienzle N, Tognela A, Lumba S, Rasko JE, de Souza P and Spring KJ: Circulating tumour cells and circulating free nucleic acid as prognostic and predictive biomarkers in colorectal cancer. *Cancer Lett* 346: 24-33, 2014.
- Gutnick J, Soldes O, Gupta M and Milas M: Circulating thyrotropin receptor messenger RNA for evaluation of thyroid nodules and surveillance of thyroid cancer in children. *J Pediatr Surg* 47: 171-176, 2012.
- Ramlau R, Thomas M, Novello S, Plummer R, Reck M, Kaneko T, Lau MR, Margetts J, Lunec J, Nutt J and Scagliotti GV: Phase I Study of Lapatinib and Pemetrexed in the Second-Line Treatment of Advanced or Metastatic Non-Small-Cell Lung Cancer With Assessment of Circulating Cell Free Thymidylate Synthase RNA as a Potential Biomarker. *Clin Lung Cancer* 2015.
- Abramovitz M, Barwick BG, Willis S, Young B, Catzavelos C, Li Z, Kodani M, Tang W, Bouzyk M, Moreno CS and Leyland-Jones B: Molecular characterisation of formalin-fixed paraffin-embedded (FFPE) breast tumour specimens using a custom 512-gene breast cancer bead array-based platform. *Br J Cancer* 105: 1574-1581, 2011.
- Abramovitz M, Ordanic-Kodani M, Wang Y, Li Z, Catzavelos C, Bouzyk M, Sledge GW Jr. Moreno CS and Leyland-Jones B: Optimization of RNA extraction from FFPE tissues for expression profiling in the DASL assay. *Biotechniques* 44: 417-423, 2008.
- Kojima K, April C, Canasto-Chibuque C, Chen X, Deshmukh M, Venkatesh A, Tan PS, Kobayashi M, Kumada H, Fan JB and Hoshida Y: Transcriptome profiling of archived sectioned formalin-fixed paraffin-embedded (AS-FFPE) tissue for disease classification. *PLoS One* 9: e86961, 2014.
- Ton CC, Vartanian N, Chai X, Lin MG, Yuan X, Malone KE, Li CI, Dawson A, Sather C, Delrow J, Hsu L and Porter PL: Gene expression array testing of FFPE archival breast tumor samples: an optimized protocol for WG-DASL sample preparation. *Breast Cancer Res Treat* 125: 879-883, 2011.
- Morton ML, Bai X, Merry CR, Linden PA, Khalil AM, Leidner RS and Thompson CL: Identification of mRNAs and lincRNAs associated with lung cancer progression using next-generation RNA sequencing from laser micro-dissected archival FFPE tissue specimens. *Lung Cancer* 85: 31-39, 2014.
- Semenov DV, Baryakin DN, Brenner EV, Kurilshikov AM, Vasiliev GV, Bryzgalov LA, Chikova ED, Filippova JA, Kuligina EV and Richter VA: Unbiased approach to profile the variety of small non-coding RNA of human blood plasma with massively parallel sequencing technology. *Expert Opin Biol Ther* 12(Suppl 1): S43-51, 2012.
- Chen HH, Lai PF, Lan YF, Cheng CF, Zhong WB, Lin YF, Chen TW and Lin H: Exosomal ATF3 RNA attenuates pro-inflammatory gene MCP-1 transcription in renal ischemia-reperfusion. *J Cell Physiol* 229: 1202-1211, 2014.
- Lasser C: Exosomal RNA as biomarkers and the therapeutic potential of exosome vectors. *Expert Opin Biol Ther* 12(Suppl 1): S189-197, 2012.
- Kuhlmann JD, Wimberger P, Wilsch K, Fluck M, Suter L and Brunner G: Increased level of circulating U2 small nuclear RNA fragments indicates metastasis in melanoma patients. *Clin Chem Lab Med* 53: 605-611, 2015.
- Zhang X, Zhang Z, Dai F, Shi B, Chen L, Zhang X, Zang G, Zhang J, Chen X, Qian F, Hu Y and Yuan Z: Comparison of circulating, hepatocyte specific messenger RNA and microRNA as biomarkers for chronic hepatitis B and C. *PLoS One* 9: e92112, 2014.
- Trapnell C, Roberts A, Goff L, Pertea G, Kim D, Kelley DR, Pimentel H, Salzberg SL, Rinn JL and Pachter L: Differential gene and transcript expression analysis of RNA-seq experiments with TopHat and Cufflinks. *Nat Protoc* 7: 562-578, 2012.
- Reich M, Liefeld T, Gould J, Lerner J, Tamayo P and Mesirov JP: GenePattern 2.0. *Nat Genet* 38: 500-501, 2006.
- Stewart DJ: Wnt signaling pathway in non-small cell lung cancer. *J Natl Cancer Inst* 106: djt356, 2014.
- Oyama T, Sugio K, Isse T, Matsumoto A, Nose N, Uramoto H, Nozoe T, Morita M, Kagawa N, Osaki T, Muto M, Yasumoto K and Kawamoto T: Expression of cytochrome P450 in non-small cell lung cancer. *Front Biosci* 13: 5787-5793, 2008.

- 25 Javid J, Mir R, Julka PK, Ray PC and Saxena A: Extracellular cytochrome c as a biomarker for monitoring therapeutic efficacy and prognosis of non-small cell lung cancer patients. *Tumour Biol* 36: 4253-4260, 2015.
- 26 Schuller HM: Impact of neuro-psychological factors on smoking-associated lung cancer. *Cancers (Basel)* 6: 580-594, 2014.
- 27 Aydiner A, Ciftci R, Karabulut S and Kilic L: Does beta-blocker therapy improve the survival of patients with metastatic non-small cell lung cancer? *Asian Pac J Cancer Prev* 14: 6109-6114, 2013.
- 28 Sanz G, Leray I, Dewaele A, Sobilo J, Lerondel S, Bouet S, Grebert D, Monnerie R, Pajot-Augy E and Mir LM: Promotion of cancer cell invasiveness and metastasis emergence caused by olfactory receptor stimulation. *PLoS One* 9: e85110, 2014.

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