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### **Cellular and Molecular Biology**

#### Original Article

## Increased expression of *PDGFA* and *RAF1* in Tumor-derived exosomes in human colorectal cancer

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#### Abstract

The overexpression of tumor markers within Extracellular Vesicles (EVs), particularly in tumor-derived exosomes (TDEs), plays a pivotal role in metastasis in the context of colorectal cancer (CRC). Nonetheless, the precise role of EV content in CRC diagnosis and prognosis necessitates extensive validation through bioinformatics and clinical investigations. We explored molecular markers shared between TDEs and circulating tumor cells (CTCs) in the blood of cancer patients to identify candidate genes involved in metastasis. Common markers were analyzed in gene expression profiles of two studies (GSE31023 and GSE72577). The expression of candidate genes was assessed by RT-PCR in CTC, TDEs, and microvesicles (MVs), and was correlated with clinicopathological features. To further confirm, the expression of candidate genes was investigated in exosomes derived from the parental HT-29 colorectal cancer cell line (HT-29-EXOs), and cancer stem cells (CSCs) -enriched spheroids (CSC-EXOs) derived thereof. Gene ontology (GO) analysis suggested platelet-derived growth factor A (PDGFA) and proto-oncogene, Serine/Threonine kinase Raf-1 (RAF1) as new CRC candidate markers in CTCs and TDEs. Expression of PDGFA (P=0.0086) and RAF1 (P=0.048) were upregulated in TDEs but significantly decreased (P=0.0001) in MVs. Furthermore, expression in CSC-EXOs (P=0.0004) was increased compared to HT-29-EXOs. PDGFA and RAF1 mRNA are higher in CSC-EXOs than in HT-29-EXOs, which correlates with higher expression in CSC than in the primary tumor. Notably, as no increase was observed in MVs, PDGFA and RAF1 mRNA appear to be actively recruited into TDE.

Keywords: Colorectal cancer; Bioinformatics analysis; Tumor-derived exosomes; PDGFA; RAF1

#### 1. Introduction

Colorectal cancer (CRC) is ranked third in both incidence and mortality rates among cancers worldwide and the incidence rate is rapidly increasing in developing countries. CRC frequently is diagnosed at the late stages by invasive biopsy techniques (colon/sigmoidoscopy) [1]. This invasive histological examination hampers regular preventive medical surveillance and post-surgery monitoring. Hence, shifting to non-invasive methods especially based on blood-born molecular markers could possibly allow for earlier detection of primary tumors as well as recurrence and metastases [2, 3]. Nucleic acid biomarkers are available in biological fluids, and in several malignancies, so-called "liquid biopsies" provide ideal biomarkers for diagnosis and prognosis [4, 5]. Successful tracing of tumors by liquid biopsies relies on the identification of molecular signatures of circulating tumor cells (CTCs) and cancer stem cells (CSCs), in addition to tumor-derived vesicles such as tumor-derived exosomes (TDEs) and microvesicles (MVs) [6].

A considerable number of CTCs and CSCs separate from primary and metastatic tumor cells, which undergo a sequence of epithelial to mesenchymal transition (EMT) steps, provoking invasion, intravasation, circulation, extravasation, pre-metastatic niche preparation, and colonization at secondary sites [7]. Single or clustered CTCs circulating to distant sites or "self-seeding" can prolong tumor cell survival and their escape from immune cells by multiple mechanisms [8, 9]. CTCs, isolated from the circulation, provided valuable information on tumor biology and cancer cell dissemination [10]. The most common obstacles are the heterogeneity and plasticity of CTC

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as well as their rarity making detection, enumeration and molecular characterization very challenging [11]. CSCs are a subpopulation of CTCs with special characteristics including self-renewal, infinite proliferation and multi-lineage differentiation. CSCs are engaged in carcinogenesis, relapse, and chemoresistance [12, 13].

Exosomes, 30-150 nm nanovesicles and microvesicles (100–350 nm), two major subtypes of extracellular vesicles (EVs), are released into the body's fluids, including the blood [14]. Tumor-derived EV modulates cellular activities in recipient cells by transferring genetic information from cancer cells. Exosomes are endosomal-derived vesicles, which are secreted at the end of the endocytic pathway when multivesicular bodies fuse with the plasma membrane [15]. Exosomes contain heterogeneous cargoes including lipids, proteins, DNAs, and RNAs (mRNA, miRNA, long non-coding RNA, circular RNA) as well as specific markers like CD9, CD63, CD81, Alix, flotillin-1 and tumor susceptibility 101 (TSG101) [16]. TDEs contribute to immunosuppression, inflammation, angiogenesis, and fibrosis and account for organ selection of the pre-metastatic niche [17]. Notably, exosomes derive from selected microdomains and are actively loaded with their cargo during the invagination of late endosomes into multivesicular bodies. Distinct from exosomes, microvesicles bud off/fission directly from the plasma membrane. They are a heterogeneous population, not displaying unique markers [18].

According to the derivation from defined membrane microdomains and the selective cargo recruitment, TDEs could compensate for gaps in knowledge on CTC activities, due to CTC rarity, fragility, and short life, whereas TDEs are abundant, comparably stable, with good enrichment by easy-to-handle isolation procedures [19, 20]. Nonetheless, the content of TDE has not yet been elaborated in detail.

Based on two studies reporting on common biomarkers in CTCs and EVs (gene expression profile of GSE31023 and GSE72577 from GEO database) and cancer-associated gene searches, we became particularly interested in platelet-derived growth factor A (*PDGFA*) and *RAF1* (Raf-1 proto-oncogene, Serine/Threonine kinase) [20-22].

*PDGFA* is a proangiogenic factor shown to be essential for tumor metastasis in multiple solid tumor types, including colon [23-25] where high expression was associated with poor survival in the four cohorts of clinical trials [26]. High level of *PDGFA* is also a validated predictor of drug resistance and poor prognosis in CRC patients and plays a crucial role in triggering cancer stemness and maintenance [27]. Platelet-derived *TGF-β* and *PDGF* induce EMT in CTCs and endow migratory and invasive properties allowing them to break through the ECM of blood vessels [28].

There are three RAF kinases in humans, A-RAF, B-RAF and RAF1 (C-RAF) that are reported to play nonredundant roles. RAF kinases interact with activated RAS, which recruits RAF to the plasma membrane to be activated [29, 30]. Molecular mechanisms underlying the expression of *KRAS* and its effectors and the subsequent *RAS/MAPK* pathways await further clarification [31]. Van et al. showed that *KRAS* can recruit *RAF* kinase for activation at the membrane from the cytoplasm [32]. Furthermore, *RAS-RAF* complexation and *RAS-RAF* interaction were proven in colorectal cancer [33] but it attracts much more debate in colorectal cancer exosomes. *Ras* family members have been found in a variety of vesicles [34, 35] and Beckler et al were the first to specifically detect *KRAS* in exosomes [36].

Proto-oncogene *RAF1* transduces phosphorylation signals from the cell membrane to the nucleus in sequential activation of the *MAPK/ERK* pathway (also known as the *Ras-Raf-MEK-ERK* pathway) [34]. Silencing or pharmacological inhibition of *RAF1* impairs the clonogenic and tumourigenic capacity of CRC cells and restores apicobasal polarity and the formation of tight junctions in cancer cells [36]. *RAS* mutations are negative predictors of response to anti-*EGFR* antibodies. Hyperactivation of the *RAS-RAF* signaling pathway is associated with metastasis, angiogenesis, and poor outcomes in patients with CRC [37]. Where the oncogenic *RAS*-activated *MAPK* and *PI3K/AKT* pathways are considered the main effectors in treatment resistance [38, 39].

In the current research, we approached investigating potential common markers between TDEs and CTCs that are implicated in cancer development and metastasis. The mRNA expression levels of predicted target genes were evaluated by quantitative real-time polymerase chain reaction (qRT-PCR) in TDEs and MVs isolated from 20 plasma samples of CRC patients and 10 healthy donors as control. Expression levels of these markers were also examined in exosomes derived from the HT-29 colorectal cancer cell line (HT-29-EXOs) and HT-29 CSC-enriched spheroids (CSC-EXOs). We aimed to shed light on a possible correlation between candidate exosomal mRNA expression levels and CRC progression and the EVs-associated mRNA signature. Confirmation of our hypothesis, that TDEs reflect tumor state and aggressiveness, could hold tremendous potential as a minimally invasive screen and may provide hints toward new therapeutic options.

#### 2. Methods and Materials

#### 2.1. Data Collection and Bioinformatics Analysis

To obtain candidate genes for CTC and TDE in colorectal cancer, two studies (GSE31023 and GSE72577) were selected (https://www.ncbi.nlm.nih.gov/geo/); the Barbazan et al study contained six cancer and three healthy samples [40] and the Dou et al study encompassed three colorectal cancer cell lines (DLD-1, DKO-1 and DKs-8) and the corresponding TDEs [41]. First, we compared markers expressed in all three TDE and CTC, but not the cell lines. The genes common to TDEs and CTCs were selected.

Characteristic biological features of selected genes were assigned according to gene ontology analysis (GO) [42, 43] to molecular functions, biology processes and cellular components using EnrichR (amp.pharm.mssm.edu/ Enrichr/), STRING (https://string-db.org/). DisGeNET RDF v7.0 (ref: https://academic.oup.com/nar/article/48/ D1/D845/5611674) was used to search for disease-associated markers, with emphasis on tumor growth. Disease classes were ranked based on the gene-disease associated (GDA) score and tumor growth-associated markers significantly above the mean score (0.06198) were included in the network analysis, generated using Cytoscape Version 3.7.1 [44] with ClueGO plugin (http://apps.cytoscape.org/ apps/cluego) [45] based on gene ontology (GO) (http:// geneontology.org/) and pathways, including Kyoto Encyclopedia of Genes and Genomes (KEGG) (https://www. genome.jp/kegg/) [46], Reactome (https://reactome.org/) [47], and WikiPathways (https://www.wikipathways.org/ index.php/WikiPathways) [48]. DisGeNET integrates expert-curated databases with text-mined data, covering information on Mendelian and complex diseases [49]. All analyses were performed in the R programming language to reach common molecular markers between CTC and TDE.

### **2.2.** Cell Culture and Generation of CSC-Enriched Spheroids

The colorectal adenocarcinoma HT-29 cell line was obtained from the Iranian Biological Research Center (IBRC). Colonosphere formation was carried out as described [50]. Briefly, HT-29 cells were grown to 70-90% confluence. After washing with pre-warmed phosphatebuffered saline (PBS), cells were detached by trypsin/ EDTA (Gibco, Germany) and single cells were seeded in poly-HEMA (Sigma, USA)-coated plates (low attachment condition) in DMEM/F12 serum-free medium (Gibco, Germany) supplemented with 10 ng/ml of recombinant basic fibroblast growth factor (bFGF, PeproTech, USA), human recombinant epidermal growth factor (EGF, PeproTech, USA), 2% B27 supplement (Gibco, Germany), 2mM L-glutamine (Gibco, Germany), 1% nonessential amino acid (Gibco, Germany), and 1%penicillin-streptomycin (Gibco, Germany). The culture medium was supplemented with bFGF, EGF, and 2% B27 supplement every third day. After ten days, culture supernatant was collected for exosome isolation.

For HT-29 cells culture, exosome-free FBS was obtained after overnight ultracentrifugation of FBS (Gibco, Germany) at 110,000 g, 4°C (45Ti rotor, Beckman Coulter, Fullerton, California). Cells were cultured in DMEM/ high glucose media (Gibco, Germany) supplemented with 10% exosome-free FBS, 1% L-glutamine (Gibco, Germany), 100 U/mL of penicillin, and 100 mg/mL streptomycin (Gibco, Germany), and maintained at 37°C, 5% CO<sub>2</sub> in a humidified incubator. For exosome isolation, the culture supernatant was harvested at ~90% confluence.

#### 2.3. Clinical Sample Collection

Peripheral blood samples were collected from 20 CRC patients and 10 healthy controls at Bahman and Firozgar hospitals from 2018-2020 under ethical committee approval. Healthy controls were enrolled from people who underwent a routine health checkup without disease detection. Cell-free plasma was isolated from all blood samples using  $2000 \times g$  for 10 min and suspended in Qiazole (Qiagen, Germany). Samples were stored at -80°C. Patient information including gender, age, TNM stage, and tumor differentiation was also recorded.

#### 2.4. Exosome Isolation by Ultracentrifugation

Exosomes were isolated from culture media of the HT-29 cell line, HT-29-derived spheroids and plasma samples from patients and healthy controls using ultracentrifugation. In brief, culture supernatants and plasma samples were centrifuged at  $350 \times$  g for 10 min and then at  $3000 \times$  g for 10 min to remove cell debris. To separate MV from other extracellular vesicles, supernatants were centrifuged at  $21000 \times$ g for 20 min and the pelleted microvesicles were resuspended in PBS and stored at -80°C. The supernatant was passed twice through ultracentrifugation at 110,000g for 120 min (45Ti rotor, Beckman Coulter). The exosome pellets were resuspended in 1ml PBS or lysis buffer [51].

#### 2.5. Scanning Electron Microscopy (SEM)

Isolated exosomes were fixed in 2.5% (w/v) glutaraldehyde for 20 min, washed in PBS and dehydrated using a gradient of ethanol (60%, 80%, 90% and 100%). The exosomes were dried at room temperature for 10 min on glass. To make the surface conductive, a coating of 2-5 nm gold-palladium alloy was applied by sputtering (SPI-Module Sputtering, Argon as gas for plasma) before imaging by SEM (EM3200, KYKY and SEM, Seron Technology, AIS-2100, Korea).

### **2.6.** Dynamic Light Scattering (DLS) and Protein Concentration Measurement of Exosomes

To determine the size distribution of isolated exosomes, 50  $\mu$ l of exosome samples were added to 950  $\mu$ l PBS and analyzed by dynamic light-scattering measurements (Malvern, UK). Protein quantification was performed by a Bicinchoninic acid assay (BCA) protein assay (Pierce BCA Protein Assay Kit, Thermo Fisher Scientific).

#### 2.7. Western Blot Analysis (WB)

Lysed samples (in RIPA Lysis and Extraction buffer) were subjected to 12% sodium dodecyl sulfate (SDS) polyacrylamide gel electrophoresis, transferring the separated proteins to polyvinylidene difluoride (PVDF) membranes (Bio-Rad, Hercules, California). After blocking, blots were incubated overnight with primary antibodies (*CD9* (Santacruz, Germany (Cat No. sc-13118)), *CD81* (Santacruz, Germany (Cat No. SC-166029)), *TSG101* (Gentex, U.S.A. (Cat No. GTX70255)); 1:500), followed by a two-hour incubation with secondary antibody (goat anti-mouse, Invitrogen, USA). Enhanced chemiluminescence substrate (ECLTM, Thermo Fisher Scientific, USA) was used as a detection reagent.

#### 2.8. RNA Isolation and qRT-PCR

RNeasy Micro Kit from Qiagen (Qiagen Cat No. /ID: 74004) was used to isolate the total RNA from exosomes. To remove genomic DNA contamination, RNA samples were treated with DNase I and then Nanodrop (ThermoFisher Scientific, USA) was used for RNA quantification and the purity was checked by the A260/A280 ratio. Twenty nanograms of total RNAs were used for reverse transcription (RT) to generate cDNAs using the PrimeScript RT Reagent Kit (Takara, Japan). SYBR Green real-time master mix was used for qRT-PCR. The corresponding primers were acquired from SinaClon company (Iran) as follows: GAPDH: 5'-AACTTTGGCATTGTGGAAGG-3' F and 5'-CACATTGGGGGGTAGGAACAC-3' R. PDGFA: 5'-GCC CAT TCG GAG GAA GAG AA-3' F and 5'- CAG ATC AGG AAG TTG GCG GA -3' R. RAF1: 5'- GGT GAT AGT GGA GTC CCA GC -3' F and 5'- GGT GAA GGC GTG AGG TGT AG -3' R. The expression levels of PDGFA and RAF1 mRNAs were normalized by GAPDH mRNA levels based on the  $2^{-\Delta\Delta Ct}$  approach [52].

#### 2.9. Statistical Analysis

SPSS software version 22.0 (IBM Corp, USA) was utilized to analyze the data. GraphPad Prism version 8.0 for Windows (GraphPad Software, La Jolla, CA, USA, www. graphpad.com) was used to determine the differences between tumor and normal blood samples. Pearson's  $\chi^2$  and Spearman's correlation tests were used to analyze the significance of associations and correlations between *PDGFA* as well as *RAF1* expression and clinicopathological parameters. Kruskal-Wallis and Mann-Whitney *U* tests were applied for pairwise comparisons between groups. In all parts, quantified data are derived from 20 tumors, and 10 healthy and cell line-derived exosome samples, a *p*-value of <0.05 was considered statistically significant. As noted, in the first step, all quantified data was replicated an average of three times.

#### 2.10. Ethical Approval

The research ethics committee of Iran University of Medical Sciences issued (IR.IUMS.REC 1395.9221513203) for this study. All procedures including informed consent before surgery from all participants were in accordance with the abovementioned ethical standards. The Ethics Committee of the Bahman and Firozgar Hospitals approved the use of clinical samples. Besides, the patients/participants provided their written informed consent to participate in this study.

#### 3. Results

### **3.1. Bioinformatics Approach to Select Appropriate Genes Involved in Metastasis**

We started searching for upregulated genes expressed

in 3 CRC-CTCs [40] and exosomes derived from these CRC lines (TDEs) [41] There have been 410 genes upregulated in CTC and exosomes of these lines (Table S1), with 56 markers overexpressed in TDEs from all three cell lines (Figure 1A and Table S2). These 56 genes included a considerable number of non-coding RNAs, where particular long non-coding RNA (lncRNA) TPTE pseudogene 1 (TPTEP1) was significantly downregulated. For the remaining genes, network and enrichment analysis of the corresponding proteins according to clustered genes (kmeans) are shown in Table S3. However, only 4 of the genes expressed in TDEs of the 3 lines were recovered in CTCs, an additional 6 were overexpressed in CTCs and at least two TDEs derived from these lines (Figure 1B and Table S2). Network and enrichment analysis of the corresponding ten proteins are shown in Table 1 and Figures 1C and 1D. Next, we searched for tumor growthassociated genes in CTCs and the TDEs of the 3 CRC lines (DisGeNET RDF v7.0 database). From all 1046 disease-related genes, 425 were tumor growth-associated genes (Table S4) and 92 displayed an above-average GDA (gene-disease associated) score. Network and enrichment analysis of the corresponding proteins uncovered 4 proteins, PDGFA, UBEH2, TPTE and YWHAZ that were also shared between CTC and tumor line exosomes and, in addition, RAF1, which clustered with TPTE and YWHAZ. In fact, RAF1, PDGFA and YWHAZ had the most shared

Gene name	Description	Metastasis- related	Stemness- related	Main Signaling Pathways
PDGFA	Platelet Derived Growth Factor Subunit A	yes	yes	Notch1/Twist1 pathway Wnt signaling related to EGFR and STAT3 constitutive signaling by aberrant PI3K in cancer cell proliferation and migration survival and chemotaxis
RNF11	Ring finger protein 11	unknown	unknown	related to NFkB and EGFR essential component of an ubiquitin-editing protein complex
TPTE	Protein Phosphatase 3 Transmembrane Phosphatase with Tensin Homology	yes	unknown	Pten-related tyrosine phosphatase signal transduction pathway of endocrine or spermatogenic functions of the testis
PPP3R1	Ubiquitin Conjugating Regulatory Subunit Bα	unknown	unknown	regulatory subunit of calcineurin calcium- dependent Calmodulin stimulated protein phosphatase
UBE2H	Enzyme E2H	yes	unknown	protein metabolism Class I MHC mediated antigen processing and presentation hypoxia-related gene
YWHAH	Tyrosine 3 Monooxygenase / Tryptophane 5 Mono- oxygenase, Activation Protein Eta	yes	unknown	binding and adaptor protein kinase activity telomerase activity
YWHAZ	Tyrosine 3 Monooxygenase / Tryptophane 5 Mono- oxygenase, Activation Protein Zeta	yes	yes	binding and adaptor protein phospholipase activity catalytic activity MAP kinase activity
NPTN	Neuroplastin	yes	unknown	DNA and protein binding kinase activity
LDLTAP1	Low Density Lipoprotein Receptor, Adaptor Protein 1	yes	unknown	protein and receptor binding catalytic activity
CAPZA2	Capping Actin Protein of Muscle Z-Line Subunit Alpha 2	yes	yes	protein and receptor binding ATP binding Actin binding telomerase activity



Fig. 1. Distribution and protein-protein interaction network of genes in cell line-derived exosomes. (A) Distribution of genes in cell line-derived exosomes from three cell lines, where 56 markers were expressed in all three cell line-derived exosomes (intersection). (B) Ten markers are expressed in at least two cell line-derived TDEs and CTCs. (C) Network and enrichment analysis for these 10 protein-coding genes according to String functional protein clusters (kmeans). The strength of interaction is indicated by the thickness of the connecting lines. Recovery in CTC and all 3 or 2 Exo preparations is indicated by a colored dot. The network shows significantly more interactions than expected (p-value: 0.0156) (D) Network and enrichment analysis for these 11-tumor growth-associated protein-coding genes according to String functional protein clusters (kmeans). The strength of interaction is indicated by the thickness of the connecting lines. Recovery in the 10 CTC and 3 or 2 Exo preparations is indicated by a colored dot. The central node is RAF1 (yellow circle). The network shows significantly more interactions than expected (p-value: 0.00639).

tumor growth nodes (**Figure S1**). Based on the connectivity and its central importance in CRC [53-55], *RAF1* was included in the downstream analysis.

Next, we examined by EnrichR reactome, molecular functions, biological processes and KEGG pathway analysis in CRC TDE- and CSC- including oncogenesis-related genes (**Table S3**). The analysis of cellular components, molecular functions and biological processes of our selected genes were associated with apoptotic, *PI3K-Akt* 

signaling pathway and cell cycle sequentially, substantiating that we had depicted the most relevant biomarkers, particularly for metastasis and stemness in CTCs and EVs. Besides, by using the above-mentioned tools, we generated the significantly related go-terms for *RAF1* and *PDG*-*FA* genes shown in **Table S5 and Figure 2**. To confirm this hypothesis, the expression of these two candidate genes, where one should keep in mind the association between *RAF1* with *TPTE* and *YWHAZ*, was assessed and compared in exosomes derived from the serum of 20 CRC patients and 10 healthy donors.

#### 3.2. Patients' Characteristics

The study comprised blood samples from twenty patients and ten healthy volunteers. Clinical data from all patients were recorded. The mean age of patients whose TDEs were isolated was 59 years (SD = 12.48, range 29-81) and whose MVs were isolated were 59 years (SD = 13.08, range 31-81). The mean age of healthy volunteers was 60 years (SD = 14.79, range 25-90); 6 (60%) of them were aged  $\leq$ 60 years and 4 (40%) were aged >60. All of the clinicopathological details are indicated in **Table 2**.



Fig. 1. Pathway analysis using the ClueGO plugin (Cytoscape) for *PDGFA* and *RAF1*. Pathway analysis indicated that the PDGF Pathway is in common with both.

Patients and tumor characteristics	Exosome genes N (%)	Microvesicle genes N (%)		
Gender				
Male Female (Male/Female)	12 (60.0) 8 (40.0) 1.5	8 (40.0) 12 (60.0) 0.6		
Median age, years (Range) ≤Median age >Median age	<b>59 years (29-81)</b> 12 (60.0) 8 (40.0)	<b>59 years (31-81)</b> 12 (60.0) 8 (40.0)		
Tumor grade Low High	11 (55.0) 8 (45.0)	16 (80.0) 4 (20.0)		
Nodal stage Yes No	6 (30.0) 14 (70.0)	7 (35.0) 13 (65.0)		
Primary tumor (PT) stage pT1 pT2 pT3 PT4	2 (10.0) 8 (40.0) 6 (30.0) 4 (20.0)	$\begin{array}{c} 0 \ (0.0) \\ 12 \ (60.0) \\ 8 \ (40.0) \\ 0 \ (0.0) \end{array}$		
Total (N)	20	20		

 Table 2. Patients and tumor pathological characteristic of the study population.

#### **3.3.** Characterization of Isolated Exosomes

TDEs and MVs were isolated from plasma samples of CRC patients and healthy donors through ultracentrifugation. SEM revealed TDEs and MVs presenting a homogeneous, round morphology (Figure 3A and B) with a Z-average of 133.7 and 920, and a size range of 88.26  $\pm$ 10.76 nm and  $644 \pm 49$  nm, respectively, as determined by dynamic light scattering (Figure 3C and D). In addition, HT-29-EXOs and CSC-EXOs also displayed round morphology in SEM imaging (Figure 3E and F) and consisted of homogeneous vesicles with a Z-average of 131.2 and 102.8, and a size range of  $91.53 \pm 9.65$  and  $79.53 \pm 8.46$ for HT-29-EXOs and CSC-EXOs, respectively (Figure **3G** and **H**). Western blot revealed TSG101, CD81 and CD9 exosome surface markers expression in all three exosome preparations, whereas in the negative control; calnexin (CANX) was not detected (Figure 4A and B).

### **3.4. Increased mRNA Expression levels of** *PDGFA* **and** *RAF1* **in CRC Patients' TDEs**

The nonparametric Kruskal–Wallis and Mann–Whitney U tests were utilized to measure the differences between the median mRNA *PDGFA* and *RAF1* expression levels in TDEs from CRC patients compared to the healthy control group. The results showed statistically significant differences of *PDGFA* and *RAF1* between CRC patients and healthy controls (P=0.0086 and P=0.048, respectively)

(Figure 5A and B). The median mRNA expression level of *PDGFA* and *RAF1* was 5.95 and 1.50, respectively. In addition, the median mRNA expression level of their healthy controls was 0.80 and 0.85, respectively. Moreover, Spearman's correlation analysis revealed that the expression pattern of *PDGFA* and *RAF1* genes was strongly positively correlated with each other (Spearman's rho, P=0.0084) in TDEs (Figure 5C). The results of the Mann–Whitney *U* test also showed a statistically significant difference in the median level of *RAF1* mRNA expression between patients' ages (p=0.05). Pearson's  $\chi^2$  test also revealed no statistically significant association between the mRNA expression levels of *PDGFA* and *RAF1* in TDEs and clinicopathological characteristics, summarized in Table 3.

### **3.5. Decreased mRNA Expression levels of** *PDGFA* and *RAF1* in CRC Patients'-Derived MVs

Our findings revealed that *PDGFA* and *RAF1* expression levels were decreased in MVs derived from CRC patients compared to the healthy control group (all, P=0.0001) (Figure 6A and B). The median mRNA expression level of *PDGFA* and *RAF1* in CRC patients and healthy controlsderived MVs were as follows: 0.22 and 0.10 (tumor), 0.95 and 1.0 (healthy), respectively. As described for exosomes, downregulated expression of *PDGFA* and *RAF1* genes in MVs correlated to each other (Spearman's rho, P=0.0029) (Figure 6C). Pearson's  $\chi^2$  test also exhibited no statistically significant association between mRNA expression



**Fig. 3. Exosome characterization.** Representative SEM photographs of **(A)** plasma-EXOs and **(B)** MVs show homogenous round morphology. Exosome size distribution analysis of **(C)** plasma-EXOs and **(D)** MVs by DLS. Representative SEM photograph of **(E)** HT-29-EXOs and **(F)** CSC-EXOs. Exosome size distribution analysis of **(G)** HT-29-EXOs and **(H)** CSC-EXOs by DLS. Data are represented as mean  $\pm$  SD (n = 3 each).



Fig. 4. Western blot analysis of exosome surface marker expression. (A)\_Expression of TSG101, CD9, CD81 and, as a negative control calnexin, were evaluated by WB in plasma EXOs, CSC-EXOs, and HT-29-EXOs to confirm the exosomal characteristic of isolated exosomes. (B) The relative expression levels of exosomal markers of plasma EXOs, CSC-EXOs, and HT-29- EXOs. Data are represented as mean  $\pm$  SD (n = 3).



Fig. 5. Real-time PCR analysis of *PDGFA* and *RAF1* expression levels in TDEs. TDEs from CRC patients revealed statistically significant differences between (A) median mRNA expression levels of *PDGFA* (P=0.0086) and (B) *RAF1* (P=0.048) compared to healthy control samples. (C) A statistically significant positive correlation was observed between *PDGFA* and *RAF1* mRNA expression patterns in TDEs (P=0.0084). Data are represented as mean  $\pm$  SD (n = 3). \*P < 0.05 and \*\*P < 0.01.

**Table 3.** The association between tumor exosome genes mRNA expression and clinicopathological parameters of colorectal cancer (CRC) samples (*P value*; Pearson's  $\chi^2$  test).

Patients and tumor	Total	PDGFA mRNA expression (Cut off = 5.95) N (%)			<i>RAF1</i> mRNA expression (Cut off = 1.5) N (%)		_
characteristics	samples N (%)	Low (≤ 5.95)	High (>5.95)	P-value	Low (≤ 1.50)	High (> 1.50)	P-value
CRC patients	20	10 (50.0)	10 (50.0)	i rutat	10 (50.0)	10 (50.0)	1 Func
Gender							
Male	12 (60.0)	7 (35.0)	5 (25.0)		7 (35.0)	5 (25.0)	
Female	8 (40.0)	3 (15.0)	5 (25.0)	0.210	3 (15)	5 (25.0)	0.210
(Male/Female)	1.5	2.3	1	0.210	2.3	1	0.210
Median age 59, years (29-81)							
<b>≤</b> Median age	12 (60.0)	6 (30.0)	6 (30.0)	1 000	8 (40.0)	2 (10.0)	0.050
>Median age	8 (40.0)	4 (20.0)	4 (20.0)	1.000	2 (10.0)	8 (40.0)	0.050
Histological grade							
Low	11 (55.0)	6 (30.0)	5 (25.0)	0.264	6 (30.0)	5 (25.0)	0.507
High	8 (45.0)	4 (20.0)	4 (20.0)	0.204	4 (20.0)	4 (20.0)	0.507
Nodal stage							
Yes	6 (60.0)	3 (15.0)	3 (15.0)	0 373	3 (15.0)	3 (15.0)	0.606
No	14 (40.0)	6 (30.0)	8 (40.0)	0.375	6 (30.0)	8 (40.0)	0.000
Primary tumor (PT) stage							
pT1	2 (10.0)	1 (5.0)	1 (5.0)		1 (5.0)	1 (5.0)	
рТ2	8 (40.0)	4 (20.0)	4 (20.0)		4 (20.0)	4 (20.0)	
рТ3	6 (30.0)	3 (15.0)	3 (15.0)	0.813	2 (10.0)	4 (20.0)	0.454
PT4	4 (20.0)	2 (10.0)	2 (10.0)		3 (15.0)	1 (5.0)	



Fig. 6. Real-time PCR analysis of *PDGFA* and *RAF1* expression levels in MVs. MVs from CRC patients showed a statistically significant decrease in (A) median mRNA expression levels of *PDGFA* (*P*=0.0001) and (B) *RAF1* (*P*=0.0001) compared to healthy control samples (C) A statically significant positive correlation was found between mRNA *PDGFA* and *RAF1* expression patterns in MVs (*P*=0.0084). Data are represented as mean  $\pm$  SD ( $n = 3_{each}$ ). \*\**P* < 0.01 and \*\*\*\**P* < 0.0001.

levels of *PDGFA* and *RAF1* in MVs and clinicopathological parameters that are summarized in **Table 4.** The results of Real-Time PCR did not reveal any statistically significant differences in the median level of *PDGFA and RAF1* mRNA expression with TNM stage and tumor differentiation in TDE (**Figure 7A- D**) and MVs (**Figure 7E-H**). The results show that there was no statistically significant association between our groups.

### **3.6.** High *PDGFA* and *RAF1* Expression in CSC-EXOs Compared to Parental HT-29-EXOs

To further evaluate *PDGFA* and *RAF1* expression levels in exosomes from CSC or differentiated tumor cell phenotypes, CSC-derived exosomes (CSC-EXOs) from CSC-enriched spheroids were compared to those derived from the parental cell line (HT-29-EXOs). RT-PCR analysis revealed upregulated expression of both molecules in CSC-EXOs compared to HT-29-EXOs (P=0.0004) (Fi-

#### gure 8A and B).

#### 4. Discussion

CRC metastases arise from disseminated cancer cells [56]; their settlement is suggested to be dictated by TDEs



Fig. 7. Box plot analysis of expression levels of tumor exosomes and tumor microvesicles in tumor grade low versus high and tumor stage I+II versus III+IV of colorectal cancer (CRC) patients using Mann-Whitney U test. (A), (B) The results showed that there are no statistically significant associations for median expression levels of PDGFA mRNA between tumor differentiation (low) versus (high) and tumor stage (I+II) versus (III+IV) (P = 0.264, P = 0.653, respectively), and also (C) (D) median expression levels of RAF1 mRNA between tumor differentiation (low) versus (high) and tumor stage (I+II) versus (III+IV) (P = 0.507, P = 0.436, respectively) in CRC patients. (E), (F) The results revealed that there are no statistically significant associations for median expression levels of PDGFA mRNA between tumor differentiation (low) versus (high) and tumor stage II versus III (P = 0.445, P = 0.610, respectively), and also (G), (H) median expression levels of RAF1 mRNA between tumor differentiation (low) versus (high) and tumor stage II versus III (P = 0.560, P = 0.698, respectively) in CRC cases. Based on the standard definitions, each box plot shows the median (bold line) and interquartile lines (box). Data are represented as mean  $\pm$  SD (n = 3). Though no significant differences in the median level of PDGFA and RAF1 mRNA expression in tumor exosomes of different grades or stages were seen, these results should be considered with caution taking into account the small numbers of samples.

**Table 4.** The association between tumor microvesicle genes mRNA expression and clinicopathological parameters of colorectal cancer (CRC) samples (*P value*; Pearson's  $\chi^2$  test).

Patients and tumor	Total	PDGFA mRNA expression (Cut off = 0.22) N (%)			<i>RAF1</i> mRNA expression (Cut off = 0.10) N (%)		
characteristics	samples N (%)	Low (≤ 0.22)	High (> 0.22)	P-value	Low (≤ 0.10)	High (> 0.10)	P-value
CRC patients	20	14 (70.0)	6 (30.0)		14 (70.0)	6 (30.0)	
Gender Male Female (Male/Female)	8 (40.0) 12 (60.0) 0.6	5 (25.0) 9 (45.0) 0.5	3 (15.0) 3 (15.0) 1	0.500	6 (30.0) 8 (40.0) 0.75	2 (10.0) 4 (20.0) 0.5	0.690
Median age 59, years (31-81) ≤Median age >Median age	12 (60.0) 8 (40.0)	10 (50.0) 4 (20.0)	5 (25.0) 1 (5.0)	1.000	10 (50.0) 4 (20.0)	1 (5.0) 5 (25.0)	1.000
Histological grade Low High	16 (80.0) 4 (20.0)	11 (55.0) 3 (15.0)	5 (25.0) 1 (5.0)	0.445	11 (55.0) 3 (15.0)	5 (25.0) 1 (5.0)	0.560
Nodal stage Yes No	7 (35.0) 13(65.0)	3 (15.0) 6 (30.0)	4 (20.0) 7 (35.0)	0.498	2 (10.0) 5 (15.0)	5 (25.0) 8 (45.0)	0.500
Primary tumor (PT) stage pT1 pT2 pT3 PT4	0 (0.0) 12 (60) 8 (40) 0 (0.0)	0 (0.0) 8 (40.0) 6 (30.0) 0 (0.0)	0 (0.0) 4 (20.0) 2 (10.0) 0 (0.0)	0.610	0 (0.0) 8 (40.0) 6 (30.0) 0 (0.0)	0 (0.0) 4 (20.0) 2 (10.0) 0 (0.0)	0.698



Fig. 8. Real-time PCR analysis of *PDGFA* and *RAF1* expression levels in CSC-EXOs compared to HT-29-EXOs. CSC-EXOs showed significantly increased expression of (A) *PDGFA* (P=0.0004) and (B) *RAF1* (P=0.0004) compared to HT-29-EXOs. Data are represented as mean  $\pm$  SD (n = 3). \*\*\*P < 0.001.

[57, 58]. In view of the inefficacy of current therapeutic protocols in metastasis prevention, detection and functional characterization of metastasis-specific biomarkers are urgently warranted [59].

EMT and stemness have been extensively investigated in CTC [60], where subsets enriched in CSC were of particular interest [61], as an improved understanding of the EMT/CTC/CSC connections may uncover yet unknown pathways of tumor progression and possibly provide hints towards novel therapeutic targets [62].

Besides CTC/CSC, TDEs contribute to EMT, angiogenesis and tumor progression. In addition, TDEs carry selected mRNAs that are shuttled in the CRC microenvironment [63], potentiating cancer progression and affecting CRC patient's prognosis [64, 65]. TDEs also suppress immune responses, promote immune evasion and increase drug/ chemotherapy resistance [66, 67]. The steadily increasing interest in CTC and TDE biomarkers in relation to tumor metastasis is forced by high-throughput analyses, which allow for simultaneous identification and quantification of multiple mRNAs. Novel bioinformatic tools facilitate the integration of this multitude of genes into functional networks [68].

We used bioinformatic tools to search for molecular markers shared between CTCs and TDEs in CRC. For EVs isolation we choose ultracentrifugation, considered the gold standard for exosome isolation [69]. Expression levels of markers, including *PDGFA* and *RAF1*, shared by either CTC and TDE or serum-derived TDEs and MVs were evaluated by RT-PCR. To further validate the engagement of TDE-derived *PDGFA* and *RAF1* in the CSC phenotype and characteristics, their expressions were investigated in HT-29-EXOs compared to CSC-EXOs.

Our results indicate increased expression of both PDGFA and RAF1 in TDEs of CRC patients compared to healthy controls. Unexpectedly, expression of both PDG-FA and RAF1 was decreased in MVs from CRC patients compared to healthy controls. Notably, PDGFA and RAF1 expressions were correlated in both TDEs and MVs. Low recovery of PDGFA and RAF1 in MVs is in line with MVs originating from budding membrane domains. However, this does not explain lower recovery than in healthy donors' MV. One possible mechanism could be regulation by non-coding RNA, which requires further exploration as we excluded noncoding RNAs from our analysis. Instead, molecular packaging named selective cargo may well contribute to higher PDGFA and RAF1 recovery in TDEs, where besides active recruitment, silencing of counter-regulatory elements can presently not be excluded. Finally, PDGFA and RAF1 mRNA are higher in CSC-EXOs than in HT-29-EXOs indicating their potential correlation with the CSC phenotype.

Thus, with all caution, we assume a possible correlation between increased RAF1 and PDGFA expression in exosomes with tumor progression. This study is the first report touching on the increased expression of RAF1 and PDGFA in exosomes derived from CRC patients and CSC-EXOs compared to healthy donor and HT-29 parental-derived exosomes (HT-29-EXOs). Since exosome content reflects the condition of cells of origin and can lead to modulation in recipient cells by transferring their cargo, as well as based on accumulating evidence of the role of increased expression of RAF1 and PDGFA in tumor progression (invasion, angiogenesis and EMT), we assume some possible correlation between increased RAF1 and PDGFA expression in exosomes with tumor progression.

Accumulating evidence supports that PDGFA is an important mediator of EMT that contributes to cancer invasion and angiogenesis. Overexpression of PDGF-D showed EMT promotion in prostate cancer cells [70]. The crosstalk between PDGF and EMT-related signaling pathways, such as the nuclear factor  $\kappa$ -light-chain-enhancer of activated B cells (*NF-\kappa B*) and chemokine (C-X-C motif) receptor 4 (CXCR4), further strengthens PDGF playing an important role in EMT. Interestingly, in a study on hepatocellular carcinoma (HCC), PDGF was hypothesized to be involved in TGF-β-induced EMT of metastasizing cancer cells [71]. Additional studies on the TGF- $\beta$  enhanced expression of *PDGF* and *PDGFR* via activation of  $\beta$ -catenin and the signal transducer and activator of transcription 3 (STAT3) [72]. However, it should be mentioned that unsupervised use of anti-PDGF could potentially promote tumor invasion and metastasis, stressing the dose dependence of the molecular mechanism [73]. A study on rectal cancer indicated that mRNA expression of PDGFA was decreased following anti-PDGF treatment and pointed towards PDGFA expression being also associated with drug resistance [74]. Moreover, in line with our study, expression was up-regulated under hypoxia as well as in the CSCs and high PDGFA expression was associated with poor overall survival [75, 76]. Signaling mostly proceeded through the EGF-STAT3 pathway with increased levels of LGR5, and participation of the Wnt signaling pathway in EGFR-positive CRCs. Also, in line with our study, RT-PCR confirmed increased PDGFA levels in both HCT-116-CSCs and HT-29-CSCs [27]. Our study extends those findings towards the important recovery in TDEs and is even more pronounced in CSC-EXOs, which allows for the transfer into target cells.

*RAF1* plays a carcinogenic role, especially in the angiogenesis process [38]. Moreover, targeting of *RAF1* by miR-7-5p inhibits endothelial cell proliferation. Inhibition of *RAF1* kinase activity impairs CRC growth. Furthermore, down-regulation of miR-431-5p as well as up-regulation of *FBXL19-AS1* increases *RAF1* expression. Thus, *FBXL19-AS1* knockdown-mediated inhibition of lung cancer progression and the expression of angiogenesis-associated proteins could be rescued by *RAF1* overexpression [77, 78].

In summary, in line with these studies, we observed overexpression of *PDGFA* and *RAF1* in exosomes from CRC patients, where overexpressions were associated with poor clinicopathological features. These findings suggest a possible role of TDEs with prometastatic factors, including specific mRNAs, as messengers for primary tumor growth and microenvironment preparation for metastasis.

Additional advantages of mRNA biomarkers deserve discussion. In comparison to DNA, mRNAs provide a solid base for signaling network connectivities. Uncovering signaling networks makes RNAs most important in unraveling protein-RNA complexes and allows for identifying potential candidates for follow-up work at the protein level including functional studies. Furthermore, due to translational modulation and post-translational modification, protein levels do not necessarily reflect gene expression levels, a problem that can be circumvented by elaborating RNA levels [79, 80]. Several publications also support the importance of mRNA in CRC. Furthermore, additional publications support the view that both mRNA and protein analysis can confirm each other [81-83]. Finally, again in CRC, liquid biopsy-based mRNA evaluation was suggested providing new insights into potential mRNA indicators that may allow for avoiding invasive diagnostic operations.

In spite of that, the current study had a few limitations, Firstly, our patients' sample size was small requiring future validation in large cohorts of patients' serum-derived TDEs and CSC-EXOs. Secondly, our findings need confirmation at the protein level. This accounts for clinical serum samples as well as for cell culture-derived exosomes and for *in vivo* controls in mouse models. Though our exosome sample sizes, particularly in the clinical cohort, were too small for comprehensive protein analysis, this will be possible by the restriction to *PDGFA* and *RAF1*. Thirdly, the mode of functional activity of *PDGFA* and *RAF1* in CRC requires further elaboration including the clarification of preferential actions at the mRNA or the protein level.

This is important as to our knowledge we were the first to describe high *PDGFA* and *RAF1* mRNA expression in TDEs from CRC patients and exosomes derived from CSC-enriched spheroids, exosomes being a prerequisite for transfer into host cells, may play potential roles in tumor growth and progression. Additionally, serum-derived TDEs would present an easily accessible, non-invasive tool for early diagnosis, prognosis and therapy control.

#### 5. Conclusion

Based on our results, *PDGFA* and *RAF1* mRNA are higher in CSC-EXOs than in HT-29-EXOs which correlates with higher expression in CSC than in the primary tumor. Notably, as no increase was observed in MVs, *PDGFA* and *RAF1* mRNA appear to be actively recruited into TDE. In view of the suggested importance of *PDGFA* and *RAF1* expression in CRC prognosis, further validation is a high priority in plans.

#### **Future perspective**

Large-scale sample analyses are required to unequivocally sustain the superior validity of mRNA enrichment in CRC TDEs. Moreover, next-generation sequencing should focus on blood sample-derived CTCs and TDEs of CTC to unravel a comprehensive signature of metastasizing CRC. Completion of these studies may prove serum-derived TDEs as a highly reliable tool for CRC prognostication and patient management.

#### List of Abbreviation

BCA: Bicinchoninic acid assay; bFGF: basic fibro-

blast growth factor; CAPZA2: Capping Actin Protein of Muscle Z-Line Subunit Alpha 2; CRC: colorectal cancer; CSC-EXOs: HT-29 CSC exosomes; CSCs: cancer stem cells; CTCs: circulating tumor cells; CXCR4: chemokine (C-X-C motif) receptor 4; DLS: dynamic light scattering; EGF: human recombinant epidermal growth factor; EGF-STAT3: Epidermal growth factor signal transducer and activator of transcription 3; EMT: epithelial to mesenchymal transition; EVs: Extra cellular vesicles ; GO: Gene ontology; GSEA: Gene set enrichment analysis; HCC: hepatocellular carcinoma; HT-29-EXOs: HT-29 colorectal cancer cell line exosomes; **IBRC**: Iranian Biological Research Center; LDLRAP1: Low Density Lipoprotein Receptor Adaptor Protein 1; LGR5: Leucine-rich repeatcontaining G-protein coupled receptor 5; MAPK/ERK: Ras-Raf-MEK-ERK pathway; MVs: Microvesicles; NF- $\kappa B$ : nuclear factor  $\kappa$ -light-chain-enhancer of activated B cells; NPTN: Neuroplastin; PBS: phosphate-buffered saline; PDGFA: Platelet Derived Growth Factor Subunit A; PPP3R1: Protein Phosphatase 3 Regulatory Subunit B, Alpha; PVDF: polyvinylidene difluoride; RAF1: Raf-1 Proto-Oncogene, Serine/Threonine Kinase; RNF11: Ring Finger Protein; SDS: sodium dodecyl sulfate; SEM: scanning electron microscopy; TDEs: tumor-derived exosomes; TPTE: Transmembrane Phosphatase with Tensin Homology; TSG101: Tumor Susceptibility 101; UBE2H: Ubiquitin Conjugating Enzyme E2; WB: western blot; Wnt: Wnt Family Member 1; YWHAH: Tyrosine 3-Monooxygenase/Tryptophan 5-Monooxygenase Activation Protein Eta; YWHAZ: Tyrosine 3-Monooxygenase/Tryptophan 5-Monooxygenase Activation Protein Zeta.

#### Declaration

#### Ethics approval and consent to participate

The Research Ethics Committee of Iran University of Medical Sciences issued IR.IUMS.REC 1395.9221513203 for this study. All procedures, including obtaining informed consent from each human participant before surgery, were in accordance with the above-mentioned ethical standards.

#### **Consent for publication**

The signed consent ensured that the publisher had the participant and author's permission to publish the relevant Contribution. Besides, all of the included study data were used by reference citation and all of the authors consent to publication.

#### Availability of Data and Materials

Data sharing is not applicable to this article as no new data were created or analyzed in this study. Analyzed data are openly available in [repository name at http://doi.org/[doi] and reference number.

#### **Competing Interests**

The authors whose names are listed certify that they have NO affiliations in any organization or entity with any financial interest and non-financial interest in the subject matter or materials discussed in this manuscript.

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#### **Author's Contributions**

SV, ZM, and ME conceived the presented idea. SV collected the blood samples, run the experimental laboratory tests, analyzed and interpreted data and wrote the first draft. ZM and ME developed, revised and approved the theory. MN performed cell culture and spheroid formation assay. SV performed critical revisions of the first draft and verified the concept. YG and RK helped in bioinformatics data analysis. HA, colorectal surgery specialists who provided patients' tumor sample and their data. All authors read, approved and discussed the results and contributed to the final manuscript.

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