

A Bioinformatic Meta-Analysis of Genes Affected by Abnormal Alternative Splicing in Ovarian Cancer

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ABSTRACT: It's predicted that in 2023, there will be 19,710 new cases and 13,270 deaths due to ovarian cancer in the United States. Ovarian cancer (OV) is the leading cause of death among gynecological cancers and the 5th leading cause of death among all cancers in women in the United States. Early diagnosis provides the best solution to increase the survivability of ovarian cancer (OV), and genomic markers are proving to be the key to early diagnosis. Insight into some of the genomic contributors to ovarian cancer, specifically abnormal alternative splicing factors has surfaced recently. It is unknown which abnormal alternative splicing factors associated with ovarian cancer could help increase early diagnosis. I used the Alternative Splicing for Cancer Molecular Classification (AS-CMC) interface and Metascape to conduct a bioinformatic analysis of alternative splice events and the affected genes in ovarian cancer. The expression (gene expression) and custom analysis results show that most genes affected by AS events in OV encode proteins involved in cytoskeleton alteration/organization. The results from this research will help to discover biomarkers in ovarian cancer patients and contribute to early diagnosis and research on targeted therapy for OV.

KEYWORDS: Cellular and Molecular Biology; Genetics; Ovarian Cancer; Abnormal Alternative Splicing Events; Bioinformatics.

■ Introduction

Ovarian Cancer:

It is predicted that in 2023 there will be 19,710 new cases and 13,270 deaths due to ovarian cancer in the United States.¹ Ovarian cancer (OV) is the leading cause of death among gynecological cancers and the 5th leading cause of death among all cancers in women in the United States.¹ Abdominal swelling, urinary symptoms, pelvic pressure, shortness of breath, etc., characterize it. However, these symptoms are not consistent across all OV patients. They tend to manifest in later stages: Stages 3 or 4.² OV at Stages 3 and 4 is much harder to cure and survive than OV at Stages 1 or 2; therefore, finding a way to diagnose patients at these earlier stages would benefit survivability. Moreover, these symptoms are general and nonspecific which can cause them to be missed initially, further pushing the time of diagnosis. Screening for ovarian cancer typically includes radiographic imaging CT, transvaginal and abdominal ultrasound, and MRI.² Such screening is not done during annual gynecological check-ups; therefore, this method does not establish an early diagnosis. As a result of all of these barriers to early diagnosis of OV the abundance of deaths due to ovarian cancer stems from late-stage diagnoses.³ Therefore, the early diagnosis of ovarian cancer could have a significant effect in increasing the survival rate of ovarian cancer patients.

Abnormal Alternative Splicing Factors in Ovarian Cancer:

Recently, there has been insight into some genomic factors of ovarian cancer specifically abnormal alternative splicing factors.⁴ To elaborate, RNA splicing was first discovered to extract sequences from pre-mRNA and combine the leftover sequences.⁵ When there is a deviation from this standard sequence splicing it is described as alternative splicing. Alternative splicing creates protein diversity when mRNA is being expressed

from a genome.⁶ Moreover, one of its more interesting functions is encoding protein variants that control cell development. Therefore, when alternative splicing events experience altered expression, it can lead to cancer.⁷ Studies have outlined various protein-coding genes that undergo abnormal alternative splicing in patients with ovarian cancer such as TP53, TP73, and HMGA2.^{8,9} Furthermore, 10% of AS events specific to breast and/or ovarian cancer were found to be involved in cancer cell survival from a screen of selected splice variants.¹⁰ Although studies have shown that alternative splicing may contribute to cancer, the analysis of alternative splicing in ovarian cancer has yet to be explored in vast detail. Further research must be conducted to truly analyze the specific alternative splicing factors and the genes they influence in ovarian cancer patients. Based on previous studies the most common alternative splicing factor type that frequents patients who develop ovarian cancer is exon skip, and the genes affected are almost always protein-coding or tumor-related. Many genes that experience AS events in ovarian cancer patients have protein functions related to cellular processes/signaling, specifically actin filament/cytoskeleton alterations. This paper will further elaborate on these findings. The results from this research will help to discover biomarkers in ovarian cancer patients and contribute to increased early diagnosis of OV and research on targeted therapy for OV.

■ Methods

To perform an analysis of the alternative splicing factors in ovarian cancer a list of genes implicated in AS in ovarian cancer was created from the Alternative Splicing for Cancer Molecular Classification (AS-CMC) interface (<https://www.pmrcre.kr/ASCMC/>).¹¹ AS-CMC is a data interface that allows

researchers to explore AS events from The Cancer Genomics Atlas (TCGA). AS-CMC permits users to curate a list of AS events from a single cancer type and pan-cancer lists for relevant AS events. I used the Single Cancer AS service to explore the AS events implicated in OV cancer patients specifically.

It was decided that performing an analysis on this list of genes would be important to understand why these specific alternative splicing events in these genes were influencing ovarian cancer. Furthermore, this will provide insight into how such events serve as biomarkers for early diagnosis and targeted treatment. Subsequently, all 215 genes from the AS-CMC interface under ovarian cancer AS events were imported into Metascape (<http://metascape.org>) under express and custom analysis for Homo-sapiens genes.¹² Of the 215 genes from AS-CMC, Metascape found 173 Homo-sapien. The 173 genes used in the analysis can be found in Table 1.

Table 1: 173 OV Genes from AS-CMC.

[illegible][illegible]

The genes were analyzed for gene summary, description, protein function, molecular function, subcellular location, development of diseases, RNA tissue category, and normal and cancer protein expression using custom analysis. Gene summary, description, and function were used to analyze the genes' functions and areas of impact. Normal and cancer protein expression was used to explore the difference in expression between cancerous and non-cancerous tissues. Lastly, the development of diseases was used to analyze which disease areas these genes impacted along with which tissues as shown through RNA tissue categories. The complete list of characteristics used for custom analysis can be found in Table 2. Metascape executes express analysis using CAME analysis, an automated analysis with 4 parts: ID conversion, gene annotation, membership search, and enrichment analysis.¹² This information is then expressed in graphs and tables, which will be discussed in this research's "Results" section.

Table 2: Custom Analysis Characteristics.

Gene Symbol
Type of Gene
Description
Gene Summary
Protein Functions (ChatGPT)
Biological Process (GO)
Molecular Function (GO)
Kinase Class (UniProt)
Protein Function (Protein Atlas)
Subcellular Location (Protein Atlas)
Developmental Disorders (DDG2P)
Drug (DrugBank)
Disease and gene associations (DisGeNET)
Disease & Drugs (ChatGPT)
Tissue Specificity (TIGER)
RNA Tissue Category (Protein Atlas)
Protein Expression Normal (Protein Atlas)
Protein Expression Cancer (Protein Atlas)
Canonical Pathways
Hallmark Gene Sets

■ Result and Discussion

All but gene HHLA3 (a regulatory element) from the list were found to be protein-coding via the table curated by custom analysis through Metascape. The express analysis of the genes affected by AS events in OV cancer also explored diseases associated with OV cancer. According to the graph, the most common diseases associated with these genes are Strabismus, Short metatarsal, and Platyspondyly.

Genes' enriched terms and their functional roles:

The 173 genes affected by AS events in OV patients were also analyzed for enriched terms by their functional roles. The over-represented biological units (enriched terms) with the highest p-value in Figure 1 include the Actin filament-based process, diseases of signal transduction by growth factor receptors and second messengers, and positive regulation of protein localization. The corresponding gene counts of these top 3 enriched biological processes are 23, 16, and 15. Ultimately, the analysis that Figure 1 provides uncovered that actin filament-based process, diseases of signal transduction by growth factor receptors and second messengers, and positive regulation of protein localization are the enriched terms of the most relevance regarding their correlation with OV. However, further inquiry into these enriched terms is needed to uncover how they may help early diagnosis of OV and targeted therapy for OV.

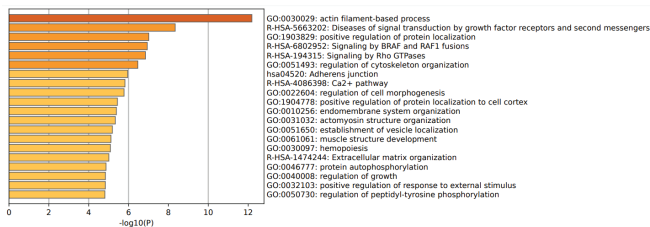


Figure 1: Bar graph of enriched terms across input gene lists, colored by p-values created using Metascape. The bar graph shows that the enriched terms with the highest p-values are actin filament-based process, diseases of signal transduction by growth factor receptors and second messengers, and positive regulation of protein localization.

Actin filament-based process pathway in OV:

The actin filament-based process pathway in OV is different than in regular tissue. Expanding cell mobility depends on reorganizing the actin cytoskeleton; this mobility is needed for OV to metastasize. In OV proteolytically active plasma membrane protrusions, or invadopodia, increase cancer cells' ability to enter vasculature.¹³ The diversity of actin organization in migrating cancer cells is due to these various actin filament structures.¹³ Therefore, the actin filament-based process pathway is important for ovarian cancer cells to develop and metastasize.

Diseases of signal transduction by growth factor receptors and second messengers pathway in OV:

In some cancers, including OV, a 3-member Raf kinase family is part of a signal transduction pathway that transmits growth factor-mediated proliferative signals, B-Raf being one of these kinases.¹⁴ Depletion of B-Raf due to mutations leads to altered cell proliferation and cell survival in these cancers.¹⁴ This information points to the explanation that AS events that

affect genes that code for proteins are involved in the diseases of signal transduction by growth factor receptors and the second messenger pathway, which play a role in OV. This occurs because the mutations of these genes prevent ovarian cancer cells from experiencing cell death.

Network of the genes' enriched terms:

This was done after the genes were graphed to show a network of the enriched terms. This can be used to see the connection between the different enriched terms, the genes, and the function of the proteins they code for. Figure 2 depicts the connections between the different enriched terms found in the gene list. They are grouped by Cluster ID, which is color-coded to represent various functions/pathways most often affected by these mutations, which are listed in the key to the right of the graph. The different-sized nodes are used to represent the number of mutations affecting that function/pathway and the connections between them represent similar protein functions. This is why there are abundant connections between nodes of the same color, as these genes all code for similar proteins, and therefore, the function of these proteins is also subsequently related. This can be seen in the green cluster ID representing positive regulation of protein localization; there are numerous connections between the green nodes, but the connection begins to dwindle amongst other cluster IDs. By analyzing Figure 2, one can discover which proteins are coded for by the genes of most relevance regarding OV and classified by their function. This will help uncover which genes are of interest for targeted therapy and increase early diagnosis.

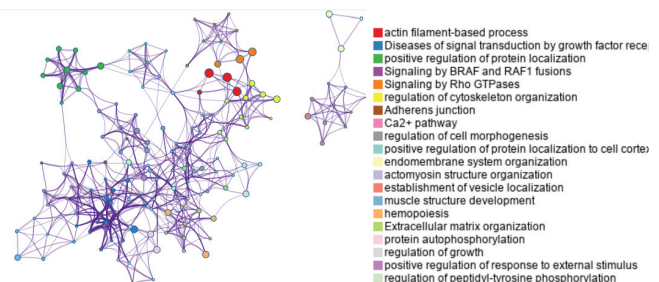


Figure 2: Network of enriched terms: colored by cluster ID, where nodes that share the same cluster-ID, are typically close to each other created using Metascape. The most prominent connections are between the actin filament-based process (red cluster ID), regulation of cytoskeleton organization (yellow cluster ID), and Signaling by Rho GTPases (orange cluster ID) enriched terms.

Observation of different cluster networks:

Off to the right, the coral cluster ID representing the establishment of the vesicle localization enriched term is solely connected to the off-white cluster ID representing the endomembrane system organization enriched term. This means these two gene functions code for similar proteins that do not connect to any other protein functions depicted. Another interesting set of nodes is made up of enriched terms: signaling by BRAF and RAF1 fusions (purple cluster ID), Diseases of signal transduction by growth factor receptors and second messengers (blue cluster ID), protein autophosphorylation (light pink cluster ID), and CA²⁺ pathway (pink cluster ID). This shows that despite these 4 nodes representing different gene functions they all have strong connections between their

protein functions. The thicker lines connecting these 4 clusters further symbolize the extent of the connection between these nodes. This is also reflected in a couple of other sets of clusters including the actin filament-based process (red cluster ID), regulation of cytoskeleton organization (yellow cluster ID), and Signaling by Rho GTPases (orange cluster ID) enriched terms. However, these nodes are less connected than the former, which can be seen in the thinness of the connections. This means the former nodes have the most significant connection between their protein functions. These observations give us insight into which connections and enriched terms may be relevant when discussing biomarkers and genes for targeted therapy for OV.

Analysis of cluster networks:

These results may explain why these 173 genes appear to experience AS events in OV patients. One possible explanation could be that the 4 nodes with the strongest connections, signaling by BRAF and RAF1 fusions (purple cluster ID), Diseases of signal transduction by growth factor receptors and second messengers (blue cluster ID), protein autophosphorylation (light pink cluster ID), and CA^{2+} pathway (pink cluster ID), contain the set of genes that experience AS events which influence OV. Another explanation is that the green cluster ID represents positive regulation of protein localization with very thick connections and contains the genes that, when experiencing abnormal AS events, serve as the primary cause for OV. It could also be assumed that either the coral cluster ID representing the establishment of the vesicle localization enriched term and the off-white cluster ID representing the endomembrane system organization enriched term is the sole cluster IDs associated with OV or that the rest of the cluster IDs all interact together to cause OV. Lastly, the actin filament-based process (red cluster ID), regulation of cytoskeleton organization (yellow cluster ID), and Signaling by Rho GTPases (orange cluster ID) enriched terms could be the explanation. Looking into which enriched terms have the most genes will uncover the enriched terms that are of most relevance to OV and further the process of discovering the genes that can serve as biomarkers and areas for targeted therapy for OV.

Network of enriched terms by p-value:

Figure 3 displays the same interactions except classified by the p-value of each enrichment term. Here you can see that the enriched terms with lower p-values are more closely gathered together than the terms with high p-values. This explains that these genes are most likely to influence OV, as genes are abundant with these enriched terms. This supports the idea that sets of nodes connected and close to each other interact with one another to influence OV. Rather than one cluster representing an enriched term being the source of genes that, when experiencing AS events, contribute to OV. The actin filament-based process seems to have the lowest p-value; yet again, it is an influential enriched term regarding OV.

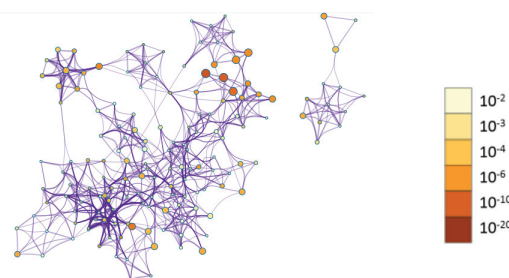


Figure 3: Network of enriched terms: colored by p-value, where terms containing more genes tend to have a more significant p-value created using Metascape. Actin filament-based process is characterized as the term with the lowest p-value and the most relevance.

Discussion:

The express and custom analysis results show that most genes that are affected by AS events in OV code for proteins associated with cellular processes and cellular signaling, specifically actin filament/cytoskeleton alterations. In Figure 1, the enriched terms with high p-values depict actin filament-based process, diseases of signal transduction by growth factor receptors and second messengers, and positive regulation of protein localization. This means that the likelihood of significance of these enriched terms is high. All three phenotypes are associated with actin filament/cytoskeleton alterations.

Furthermore, Figure 2 brings to light a different set of phenotypes with protein functions that are closely related and, therefore, could contribute to OV: actin filament-based process (red cluster ID), regulation of cytoskeleton organization (yellow cluster ID), and Signaling by Rho GTPases (orange cluster ID). Figure 2 also brings insight into 4 other enriched terms: signaling by BRAF and RAF1 fusions (purple cluster ID), Diseases of signal transduction by growth factor receptors and second messengers (blue cluster ID), protein autophosphorylation (light pink cluster ID), and CA^{2+} pathway (pink cluster ID). As these clusters are densely connected and close to each other, it is reasonable to consider the relevance of these genes in their relationship to OV. Signaling by BRAF and RAF1 fusions pertains to activating downstream signaling.¹⁵ Protein autophosphorylation and the CA^{2+} pathway are also related to cellular signaling.¹⁶

However, the 3 closely connected enriched terms found in Figure 2 (actin filament-based process, regulation of cytoskeleton organization, and Signaling by Rho GTPases), contain the lowest p-values in Figure 3, so it is more likely that those genes, when affected by abnormal AS events influence OV. These 3 enriched terms are all involved with altering the cytoskeleton. This discovery concludes that genes associated with changing the cytoskeleton can be biomarkers for targeted therapy concerning OV. However, it remains to be seen why this connection exists and whether other studies have similar findings to cement this conclusion.

A study of 17 proteins involved in cytoskeleton modulation and their role in ovarian cancer further supports these findings. Ovarian carcinomas rapidly increase and the cell spheroids produced by the primary tumor are very adhesive.¹⁷ These mechanisms, cellular proliferation, and adhesion rely on MT-dynamics (microtubules a key component of the cytoskel-

eton influence) to manage spindle dynamics and transport of adhesion molecules to the plasma membrane.¹⁷ Consequently, when genes that code for proteins with similar functions experience abnormal alternative splicing events proper MT dynamics could be interrupted. This can lead to improper function and the formation of spindles during cell division eventually leading to cancer.¹⁷ Furthermore, microtubules play a role in transporting proteins that promote cell adhesion. Ovarian cancer is known to have highly adhesive spheroids, so abnormal management of such proteins could further incite ovarian cancer.

A study on the CD44 gene, its activation of RhoGTPase signaling and cytoskeleton function, and its influence on tumor progression further supports my analysis.¹⁸ RhoGTPase signaling and cytoskeleton function encoding genes experiencing alternative splicing events were the most correlated to ovarian cancer in my bioinformatic analysis. This study further elaborates on this correlation specifically concluding that coordinated HA-mediated CD44 activation of RhoPase signaling and cytoskeleton could be an underlying mechanism of tumor cell behaviors, including adhesion growth and survival.¹⁸ These studies support the conclusion that when genes that code for proteins involved in altering the cytoskeleton experience AS events, OV closely follows.

Another study identified the expression of mitotic kinesin as a biomarker for the outcome of ovarian cancer.¹⁹ This was discovered through an experiment that measured KIF14 mRNA, a kinesin-encoding gene, in 122 ovarian cancer tumor samples. KIF14's control over cytokinesis leads to increased cell proliferation and tumor growth.¹⁹ This study further confirms the link between genes that code for proteins that alter the cytoskeleton and OV and validates these genes as biomarkers for OV and areas for targeted therapy for OV.

■ Conclusion

The results of this analysis point to the explanation that the expression of proteins involved in cytoskeleton alteration/organization may serve as biomarkers for ovarian cancer diagnosis and as an area for targeted ovarian cancer therapy. Ovarian cancer is an area of significant concern due to its high mortality rate; these results serve as a specific jumping-off point for further research to successfully uncover distinct biomarkers for early diagnosis of OV and areas for targeted therapy for OV to combat this issue. Only 173 genes that experienced AS events in OV were used in this study; a wider range of genes should be explored to exhaust other connections, possible biomarkers, and targets. Clinical trials and experiments producing new data are also needed to confirm and further investigate the connection between these genes experiencing AS events and OV.

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■ References

1. *Cancer statistics, 2023 – Siegel – 2023 – CA: A Cancer Journal for Clinicians – Wiley Online Library*. <https://acsjournals.onlinelibrary.wiley.com/doi/10.3322/caac.21763> (accessed 2023-08-03).
2. Matulonis, U. A.; Sood, A. K.; Fallowfield, L.; Howitt, B. E.; Sehouli, J.; Karlan, B. Y. Ovarian Cancer. *Nat Rev Dis Primers* **2016**, 2, 16061. <https://doi.org/10.1038/nrdp.2016.61>.
3. Yao, S.; Yuan, C.; Shi, Y.; Qi, Y.; Sridha, R.; Dai, M.; Cai, H. Alternative Splicing: A New Therapeutic Target for Ovarian Cancer. *Technol Cancer Res Treat* **2022**, 21, 15330338211067912. <https://doi.org/10.1177/15330338211067912>.
4. Wang, S.; Wang, S.; Zhang, X.; Meng, D.; Xia, Q.; Xie, S.; Shen, S.; Yu, B.; Hu, J.; Liu, H.; Yan, W. Comprehensive Analysis of Prognosis-Related Alternative Splicing Events in Ovarian Cancer. *RNA Biol* **19** (1), 1007–1018. <https://doi.org/10.1080/15476286.2022.2113148>.
5. WANG, Y.; LIU, J.; HUANG, B.; XU, Y.-M.; LI, J.; HUANG, L.-F.; LIN, J.; ZHANG, J.; MIN, Q.-H.; YANG, W.-M.; WANG, X.-Z. Mechanism of Alternative Splicing and Its Regulation. *Biomed Rep* **2015**, 3 (2), 152–158. <https://doi.org/10.3892/br.2014.407>.
6. Kelemen, O.; Convertini, P.; Zhang, Z.; Wen, Y.; Shen, M.; Falaleeva, M.; Stamm, S. Function of Alternative Splicing. *Gene* **2013**, 514 (1), 1–30. <https://doi.org/10.1016/j.gene.2012.07.083>.
7. Bonnal, S. C.; López-Oreja, I.; Valcárcel, J. Roles and Mechanisms of Alternative Splicing in Cancer – Implications for Care. *Nat Rev Clin Oncol* **2020**, 17 (8), 457–474. <https://doi.org/10.1038/s41571-020-0350-x>.
8. Hofstetter, G.; Berger, A.; Fiegl, H.; Slade, N.; Zorić, A.; Holzer, B.; Schuster, E.; Mobus, V. J.; Reimer, D.; Daxenbichler, G.; Marth, C.; Zeimet, A. G.; Concin, N.; Zeillinger, R. Alternative Splicing of P53 and P73: The Novel P53 Splice Variant P53δ Is an Independent Prognostic Marker in Ovarian Cancer. *Oncogene* **2010**, 29 (13), 1997–2004. <https://doi.org/10.1038/onc.2009.482>.
9. Wang, S.; Wang, Z.; Li, J.; Qin, J.; Song, J.; Li, Y.; Zhao, L.; Zhang, X.; Guo, H.; Shao, C.; Kong, B.; Liu, Z. Splicing Factor USP39 Promotes Ovarian Cancer Malignancy through Maintaining Efficient Splicing of Oncogenic HMGA2. *Cell Death Dis* **2021**, 12 (4), 1–18. <https://doi.org/10.1038/s41419-021-03581-3>.
10. Zhang, J.; Manley, J. L. Misregulation of Pre-mRNA Alternative Splicing in Cancer. *Cancer Discovery* **2013**, 3 (11), 1228–1237. <https://doi.org/10.1158/2159-8290.CD-13-0253>.
11. Park, J.; Lee, J.-O.; Lee, M.; Chung, Y.-J. AS-CMC: A Pan-Cancer Database of Alternative Splicing for Molecular Classification of Cancer. *Sci Rep* **2022**, 12 (1), 21074. <https://doi.org/10.1038/s41598-022-25584-6>.
12. Zhou, Y.; Zhou, B.; Pache, L.; Chang, M.; Khodabakhshi, A. H.; Tanaseichuk, O.; Benner, C.; Chanda, S. K. Metascape Provides a Biologist-Oriented Resource for the Analysis of Systems-Level Datasets. *Nat Commun* **2019**, 10 (1), 1523. <https://doi.org/10.1038/s41467-019-09234-6>.
13. Yeung, T.-L.; Leung, C. S.; Yip, K.-P.; Au Yeung, C. L.; Wong, S. T. C.; Mok, S. C. Cellular and Molecular Processes in Ovarian Cancer Metastasis. A Review in the Theme: Cell and Molecular Processes in Cancer Metastasis. *Am J Physiol Cell Physiol* **2015**, 309 (7), C444–C456. <https://doi.org/10.1152/ajpcell.00188.2015>.
14. Adjei, A. A.; Hidalgo, M. Intracellular Signal Transduction Pathway Proteins As Targets for Cancer Therapy. *JCO* **2005**, 23 (23), 5386–5403. <https://doi.org/10.1200/JCO.2005.23.648>.
15. PubChem. *Signaling by BRAF and RAF1 fusions*. <https://pubchem.ncbi.nlm.nih.gov/pathway/Reactome:R-HSA-6802952> (accessed 2023-08-14).

16. *Ca²⁺ Signaling – Basic Neurochemistry – NCBI Bookshelf*.
<https://www.ncbi.nlm.nih.gov/books/NBK27950/> (accessed 2023-08-14).
17. Schiewek, J.; Schumacher, U.; Lange, T.; Joosse, S. A.; Wikman, H.; Pantel, K.; Mikhaylova, M.; Kneussel, M.; Linder, S.; Schmalfeldt, B.; Oliveira-Ferrer, L.; Windhorst, S. Clinical Relevance of Cytoskeleton Associated Proteins for Ovarian Cancer. *J Cancer Res Clin Oncol* **2018**, *144* (11), 2195–2205. <https://doi.org/10.1007/s00432-018-2710-9>.
18. Bourguignon, L. Y. W. Hyaluronan-Mediated CD44 Activation of RhoGTPase Signaling and Cytoskeleton Function Promotes Tumor Progression. *Seminars in Cancer Biology* **2008**, *18* (4), 251–259. <https://doi.org/10.1016/j.semcancer.2008.03.007>.
19. Thériault, B. L.; Pajovic, S.; Bernardini, M. Q.; Shaw, P. A.; Gallie, B. L. Kinesin Family Member 14: An Independent Prognostic Marker and Potential Therapeutic Target for Ovarian Cancer. *International Journal of Cancer* **2012**, *130* (8), 1844–1854. <https://doi.org/10.1002/ijc.26189>.

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