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Article

# Machine Learning Discoveries of Wnt-X Synergy in ETC-1922159 Treated Colorectal Cancer Cells

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† Aspects of unpublished work were presented in a poster session at (1) the recently concluded first ever Wnt Gordon Conference, from 6-11 August 2017, held in Stowe, VT 05672, USA.

Abstract: Often, in biology, we are faced with the problem of exploring relevant unknown biological hypotheses in the form of myriads of combinations of factors/genes/proteins that might be affecting the pathway under certain conditions. In colorectal cancer (CRC) cells treated with ETC-1922159, many genes were found up and down regulated, individually. A recently developed search engine ranked combinations of Wnt-X (X, a particular gene/protein) at 2<sup>nd</sup> order level after drug administration. These rankings reveal which Wnt-X combinations might be working synergistically in CRC. If found true, oncologists can further test the combination of interest in wet lab and determine the mechanism of functioning between the Wnt and X. In this research work, we cover combinations of Wnt with Achaete-scute complex homolog 2 (ASCL2), ATP-binding cassette (ABC) domain transporters, Interleukin (IL), ubiquitin conjugating enzyme E2 (UBE2) family, exosome (EXOSC), caspase (CASP), TP53 and B-cell lymphoma (BCL) family.

Keywords: WNT; porcupine inhibitor ETC-1922159; sensitivity analysis; colorectal cancer

#### 1. Introduction

In the unpublished preprint [1], a frame work of a search engine was developed which can rank combinations of factors (genes/proteins) in a signaling pathway. Such combinations are of import due to the vast search space in which they exist and the difficulty to find them. The search engine facilitates in prioritizing the combinations as ranked biological hypotheses which the biologists might want to test in wet lab, to know if a synergistic combination is prevalent in a signaling pathway, in a direct or indirect manner. Interested readers are advised to go through unpublished preprints [1] and [2] for details regarding the search engine and the discoveries mentioned in there.

# 2. Materials and Methods

# 2.1. Combinatorial Search Problem and a Possible Solution

The issue of combinatorial search problem and a possible solution has been addressed in [3] and [2]. The details of the methodology of this manuscript have been explained in great detail in [3] & its application in [2]. Readers are requested to go through the same for gaining deeper insight into the working of the pipeline and its use of published data set generated after administration of ETC-1922159. In order to understand the significance of the solution proposed to the problem of combinatorial search that the biologists face in revealing unknown biological search problem, these works are of importance.

Briefly, from [2], the pipleline works by computing sensitivity indicies for each of these unique combinations and then vectorising these indices to connote and form discriminative feature vector for each combination. Since each combination is unique, the training and the test data are same. In the training data, the combinations are arranged and ranks from 1 to n are assigned. The ranking algorithm then learns the patterns from these combinations/sensitivity index vectors. Next the learned model is used to rank the test data by generating the ranking score for each of the unique

combination. Sorting these shuffled scores of test data leads to prioritization of the combinations. [4] show an example of applying learned model to training data (same as the test data) in https://www.cs.cornell.edu/people/tj/svm\_light/svm\_rank.html. Note that these combinations are now ranked and give the biologists a chance to narrow down their focus on crucial biological hypotheses in the form of combinations which the biologists might want to test. Analogous to the webpage search engine, where the click of a button for a few key-words leads to a ranked list of web links, the pipeline uses sensitivity indices as an indicator of the strength of the influence of factors or their combinations, as a criteria to rank the combinations.

#### 3. Results & Discussion

#### 3.1. WNT Related Synergies

#### 3.1.1. WNT10B-ASCL2

WNT10B has been found to be implicated in a range of cancers. In gastric cancer, the knockdown of WNT10B showed reduced expression of cell proliferation and migration as well as inhibition of epithelial-mesenchymal transition [5]. On the other hand, WNT10B is also involved in the formation of bone mass and progenitor maintenance of various kinds of tissue, while deletion of the same leads to loss of bone mass and mesenchymal progenitor cells [6]. Their contribution is also reported in axonal regeneration in injured CNS [7]. Furthermore, like WNT10B, WNT10A and WNT6 have shown to play a major role in inhibiting adipogenesis and stimulates osteoblastogenesis while regulating the mesenchymal stem cells [8] & [9]. Involvement in heptocellular carcinoma of WNT10B has been found wherein it is shown that stable silencing of WNT10B leads to significant reduction in proliferation, colony formation, migration and invasion in HepG2 HCC cell line [10]. Its implication in breast cancer [11] & [12] as well as endometrial cancer [13] has also been reported.

In colorectal cancer, WNT10B has shown to play a dual function of both oncogenesis promotion via  $\beta$ -catenin/TCF pathway and the inhibition of cell growth, possibly via FGF family of proteins [14]. Methylation of WNT10B has been found in the some of the cancer cell lines while its reversal has lead to over-expression of the WNT10B. However, the over-expression of WNT10B has lead to reduced cell growth in cancer, indicating a  $\beta$ -catenin independent component to be behind such a phenomena. Methylation of over-expressed WNT10B and synergistic work with FGF family of proteins later indicate the promotion of oncogenesis, as has been demonstrated in [14].

In a more recent work, ASCL2 has been found to play a major role in stemness in colon crypts and is implicated in colon cancer [15]. Switching off the ASCL2 leads to a literal blockage of the stemness process and vice versa. At the downstream level, ASCL2 is regulated by TCF4/ $\beta$ -catenin via non-coding RNA target named WiNTRLINC1 [16]. Activation of ASCL2 leads to feedforward transcription of the non-coding RNA and thus a loop is formed which helps in the stemness and is highly effective in colon cancer. At the upstream level, ASCL2 is known act as a WNT/RSPONDIN switch that controls the stemness [17]. It has been shown that removal of RSPO1 lead to decrease in the Wnt signaling due to removal of the FZD receptors that led to reduced expression of ASCL2. Also, low levels of LGR5 were observed due to this phenomena. The opposite happened by increasing the RSPO1 levels. After the drug treatment, it was found that ASCL2 was highly suppressed pointing to the inhibition of stemness in the colorectal cancer cells. Also, [17] show that by genetically disrupting PORCN or inducing a PORCN inhibitor (like IWP-2), there is loss of stem cell markers like LGR5 and RNF43, which lead to disappearance of stem cells and moribund state of mice. A similar affect can be found with ETC-1922159, where there is suppression of RNF43 and LGR5 that lead to inhibition of the Wnt pathway and thus the ASCL2 regulation. These wet lab evidences are confirmed in the relatively low ranking of the combination ASCL2-RNF43 via the inhibition of PORCN-WNT that leads to blocking of the stemness that is induced by ASCL2. Since ASCL2 is directly mediated by the WNT proteins, the recorded ASCL2-WNT10B combination showed low priority ranking of 488, 497 and 321

for rbf, laplace and linear kernels, respectively, thus indicating a possible connection between WNT10B and ASCL2 activation. WNT10B might be playing a crucial role in stemness. This is further confirmed by wet lab experiments in [18], which show BVES deletion results in amplified stem cell activity and Wnt signaling after radiation. WNT10B has been implicated in colorectal cancer [14].

# 3.1.2. ABC Transporters - WNT Cross Family Analysis

[19] have shown the role of ABC transporters in progression and clinical outcome of colorectal cancer. Work by [20] show that Wnt- $\beta$  catenin signaling regulates ABCC3 (MRP3) transporter expression in colorectal cancer. ABCA2 belongs to the category of ABC transporters that play an essential role in the development of resistance by the efflux of anticancer agents outside of cancer cells [19]. [19] observed that ABCA2 had no significant change/affect in colorectal cancer cases. [20] found ABCA2 to be downregulated in colorectal cancer case. In ETC-1922159 affected CRC cells, down regulation of ABCA2 was observed, after the inhibition of proliferation in respective cells. Multiple members of ABC transporters and WNTs were found to be UP regulated after ETC-159 in CRC cells and WNTs are known to regulate ABCs. Below, we show a range of up regulated, possible unknown and unexplored synergistic  $2^{nd}$  order combinations that were ranked by the search engine. Note that the high numerical valued ranks (i.e nearing to 1800/2000 and above) indicate high potential of synergy that might be existing in CRC cells after the drug administration. Majority voting of rankings across the three different kernels point to the potential of the synergistic discovery. Wet labs investigations will assist in confirmation of these discoveries and if proven true, might lead to understanding of further mechanism between the components.

Tables 1 and 2 show the rankings of ABC family w.r.t to WNT family members and WNT family w.r.t to ABC family members, respectively. From these two tables, we derive the plausible influences that might be existing in a two way format that is depicted in Table 3. In Table 1, WNT2B - ABC-C3 combination shows a majority voting of 1853 (laplace) and 2498 (rbf). Similarly, WNT7B - ABC-C13 shows a majority voting of 2245 (linear) and 2298 (rbf). These two combinations are depicted in Table 3 as ABC members influenced by WNT members (see under ABC w.r.t WNT). Reversibily, in Table 2 ABC-A5 - WNT2B shows a majority voting of 2018 (linear) and 2132 (rbf), ABC-A5 - WNT4 shows a majority voting of 2436 (linear) and 2449 (rbf), ABC-A5 - WNT9A shows a majority voting of 1989 (laplace), 2209 (linear) and 2365 (rbf), WNT2B - ABC-C5 shows a majority voting of 1970 (laplace), 2309 (linear) and 2248 (rbf), ABC-C5 - WNT9A shows a majority voting of 2183 (linear) and 2480 (rbf), WNT2B - ABC-C13 shows a majority voting of 2150 (linear) and 2048 (rbf), WNT7B - ABC-C13 shows a majority voting of 2508 (laplace) and 1830 (linear), WNT7B - ABC-D1 shows a majority voting of 2238 (laplace) and 2021 (linear), WNT7B - ABC-G1 shows a majority voting of 1808 (linear) and 1866 (rbf), WNT7B - ABC-G2 shows a majority voting of 2334 (linear) and 2145 (rbf) and WNT9A - ABC-G2 shows a majority voting of 1919 (laplace) and 2003 (rbf). These point to WNT members influenced by ABC members (see under WNT w.r.t ABC). Hypothetically, what we find is that the synergies can be bi-directional also and might contain various intermitent factors through which the factors might be working synergistically. These hypothese form present themselves as important combinations that might be of interest to biologists/oncologists.

One can also interpret the results of the Table 3 graphically, with the following influences -  $\bullet$  ABC w.r.t WNT with WNT-2B - > ABC-C3; WNT-7B - > ABC-C13; and  $\bullet$  WNT w.r.t ABC with ABC-A5 < - WNT-2B/4/9A; WNT-2B/9A < - ABC-C5; WNT-2B/7B < - ABC-C13; WNT-7B < - ABC-D1; WNT-7B < - ABC-G1; WNT-7B/9A < - ABC-G2. Thus, in this way, we can utilize the search engine to derive the various probable combinations between the factors of interest and their interdependent influences through the two-way cross family analysis.

**Table 1.** 2<sup>nd</sup> order interaction ranking between ABC w.r.t WNT family members.

RANKING ABC FAMILY W.R.T WNT FAMILY

RANKING	OF ABC F	AMILY W.R.	T WNT-2B	RANKIN	IG OF ABC	FAMILY W.R	a.t WNT4
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	2108	310	72	ABC-A5 -	359	1285	433
ABC-A5				WNT4			
ABC-B11	319	2132	18	ABC-B11	872	1284	867
- WNT2B				- WNT4			
WNT2B -	1853	262	2498	ABC-C3 -	10	617	296
ABC-C3				WNT4			
WNT2B -	2213	1685	840	WNT4 -	1383	2119	215
ABC-C5				ABC-C5			
WNT2B -	1149	1191	2175	WNT4 -	1649	1814	542
ABC-C13				ABC-C13			
WNT2B -	1119	177	2163	ABC-D1 -	1041	1171	1740
ABC-D1				WNT4			
WNT2B -	1068	1583	214	ABC-G1 -	1020	1146	2025
ABC-G1				WNT4			
WNT2B -	1500	1533	172	ABC-G2 -	784	1431	435
ABC-G2				WNT4			
RANKING	OF ABC F	AMILY W.R.		RANKING	G OF ABC F.	AMILY W.R.	
	laplace	linear	rbf		laplace	linear	г WNT-9A rbf
ABC-A5 -				ABC-A5 -			
ABC-A5 - WNT7B	laplace 1550	linear 516	rbf 995	ABC-A5 - WNT9A	laplace 735	linear	rbf 1479
ABC-A5 - WNT7B ABC-B11	laplace	linear	rbf	ABC-A5 - WNT9A ABC-B11	laplace	linear	rbf
ABC-A5 - WNT7B ABC-B11 - WNT7B	laplace 1550 968	linear 516 599	rbf 995 324	ABC-A5 - WNT9A ABC-B11 - WNT9A	laplace 735 843	linear 349 1647	rbf 1479 689
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 -	laplace 1550	linear 516	rbf 995	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 -	laplace 735	linear 349	rbf 1479
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B	laplace 1550 968 694	linear 516 599 1668	rbf 995 324 695	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A	laplace 735 843 1590	linear 349 1647 359	rbf 1479 689 2136
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B -	laplace 1550 968	linear 516 599	rbf 995 324	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 -	laplace 735 843	linear 349 1647	rbf 1479 689
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5	laplace 1550 968 694 979	linear 516 599 1668 1715	rbf 995 324 695 2268	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A	laplace 735 843 1590 1295	linear 349 1647 359 368	rbf 1479 689 2136 2265
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B -	laplace 1550 968 694	linear 516 599 1668	rbf 995 324 695	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13	laplace 735 843 1590	linear 349 1647 359	rbf 1479 689 2136
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B - ABC-C13	laplace 1550 968 694 979 950	linear 516 599 1668 1715 2245	rbf 995 324 695 2268 2298	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A	laplace 735 843 1590 1295 1394	linear 349 1647 359 368 2294	rbf 1479 689 2136 2265 1134
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B - ABC-C13 ABC-D1 -	laplace 1550 968 694 979	linear 516 599 1668 1715	rbf 995 324 695 2268	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A ABC-D1 -	laplace 735 843 1590 1295	linear 349 1647 359 368	rbf 1479 689 2136 2265
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B - ABC-C13 ABC-D1 - WNT7B	968 694 979 950 252	linear 516 599 1668 1715 2245 850	rbf 995 324 695 2268 2298 1215	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A ABC-D1 - WNT9A	laplace 735 843 1590 1295 1394 910	linear 349 1647 359 368 2294 2367	rbf 1479 689 2136 2265 1134 675
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B - ABC-C13 ABC-D1 - WNT7B ABC-G1 -	laplace 1550 968 694 979 950	linear 516 599 1668 1715 2245	rbf 995 324 695 2268 2298	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A ABC-D1 - WNT9A ABC-G1 -	laplace 735 843 1590 1295 1394	linear 349 1647 359 368 2294	rbf 1479 689 2136 2265 1134
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B - ABC-C5 WNT7B - ABC-C13 ABC-D1 - WNT7B ABC-G1 - WNT7B	laplace 1550 968 694 979 950 252 269	linear 516 599 1668 1715 2245 850 733	rbf 995 324 695 2268 2298 1215 1160	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A ABC-D1 - WNT9A ABC-G1 - WNT9A	laplace 735 843 1590 1295 1394 910 426	linear 349 1647 359 368 2294 2367 2457	rbf 1479 689 2136 2265 1134 675
ABC-A5 - WNT7B ABC-B11 - WNT7B ABC-C3 - WNT7B WNT7B - ABC-C5 WNT7B - ABC-C13 ABC-D1 - WNT7B ABC-G1 -	968 694 979 950 252	linear 516 599 1668 1715 2245 850	rbf 995 324 695 2268 2298 1215	ABC-A5 - WNT9A ABC-B11 - WNT9A ABC-C3 - WNT9A ABC-C5 - WNT9A ABC-C13 - WNT9A ABC-D1 - WNT9A ABC-G1 -	laplace 735 843 1590 1295 1394 910	linear 349 1647 359 368 2294 2367	rbf 1479 689 2136 2265 1134 675

**Table 2.** 2<sup>nd</sup> order interaction ranking between WNT w.r.t ABC family members.

RANKING WNT FAMILY W.R.T ABC FAMILY

			NG WINT FAMI				
RANKING		FAMILY W.R	т АВС-А5	RANKING		AMILY W.F	R.T ABC-B11
	laplace	linear	rbf		laplace	linear	rbf
ABC-A5 -	1549	2018	2132	WNT2B -	1083	703	1887
WNT2B				ABC-B11			
ABC-A5 -	1375	2436	2449	WNT4 -	156	298	1517
WNT4				ABC-B11			
ABC-A5 -	2420	1527	460	WNT7B -	1134	204	2323
WNT7B				ABC-B11			
ABC-A5 -	1989	2209	2365	WNT9A -	226	2134	1480
WNT9A				ABC-B11			
RANKING	OF WNT I	FAMILY W.F	ат АВС-С3	RANKING	G OF WNT I	FAMILY W.	R.T ABC-C5
	laplace	linear	rbf		laplace	linear	rbf
ABC-C3 -	1127	1482	1905	WNT2B -	1970	2309	2248
WNT2B				ABC-C5			
ABC-C3 -	897	1454	489	WNT4 -	2129	229	230
WNT4				ABC-C5			
ABC-C3 -	656	2080	772	WNT7B -	1539	756	1258
WNT7B				ABC-C5			
ABC-C3 -	2339	1616	814	ABC-C5 -	213	2183	2480
WNT9A				WNT9A			
RANKING	OF WNT F	AMILY W.R	т АВС-С13	RANKING	G OF WNT F	FAMILY W.	R.T ABC-D1
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	950	2150	2048	WNT2B -	1751	1370	1174
ABC-C13				ABC-D1			
WNT4 -	538	326	2242	WNT4 -	45	1784	101
ABC-C13				ABC-D1			
WNT7B -	2508	1830	1219	WNT7B -	2238	2021	1121
ABC-C13				ABC-D1			
WNT9A -	738	2501	634	WNT9A -	732	1526	1759
ABC-C13				ABC-D1			
RANKING	OF WNT I	FAMILY W.R	.т ABC-G1	RANKING	G OF WNT F	FAMILY W.	R.T ABC-G2
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	318	775	2040	WNT2B -	1342	1987	1230
ABC-G1				ABC-G2			
WNT4 -	2169	157	39	WNT4 -	862	1352	1985
ABC-G1				ABC-G2			
WNT7B -	587	1808	1866	WNT7B -	2334	2145	1526
ABC-G1				ABC-G2			
WNT9A -	856	2350	920	WNT9A -	1919	1284	2003
ABC-G1				ABC-G2			

**Table 3.** 2<sup>nd</sup> order combinatorial hypotheses between ABC and WNT family members.

# UNEXPLORED COMBINATORIAL HYPOTHESES

ABC w.r.t WNT		
WNT-2B	ABC-C3	
WNT-7B	ABC-C13	

Table 3. Cont.

UNEXPLORED COMBINATORIAL HYPOTHESES

WNT w.r.t ABC	
ABC-A5	WNT-2B/4/9A
WNT-2B/9A	ABC-C5
WNT-2B/7B	ABC-C13
WNT-7B	ABC-D1
WNT-7B	ABC-G1
WNT-7B/9A	ABC-G2

# 3.1.3. IL - WNT Cross Family Analysis

Interleukin (IL) has been found in cross talk with WNT pathway. [21] show that NFκB induced WNT signaling in colorectal cancer via interleukin- $1\beta$  IL1B. Further, [22] have shown that nitric oxide mediates crosstalk between interleukin  $1\beta$  and Wnt signaling in primary human chondrocytes by reducing DKK1 and FRZB expression. The role of IL-17 (Interleukin-17) family is known to be controversial in CRC, however there are cases were it has been reported to be a prognostic marker for colorectal cancer [23] & [24]. A homologue of the family, IL-17D a novel cytokine has been discovered [25] and found to play a role in many of the cancers. In cells treated with ETC-1922159, IL-17D was found to be down regulated and reversibly it must have been regulated in the colorectal cancer cases. Recently, crosstalk between WNT/ $\beta$ -Catenin and NF- $\kappa$ B signaling pathway during inflammation has been reported by [26]. [27] also show WNT/ $\beta$ -catenin negative feedback loop inhibits IL-1 induced matrix metalloproteinase expression in human articular chondrocytes. [28] conclude that WNT/ $\beta$ -catenin signaling promotes angiogenesis possibly via the induction of known angiogenic regulators such as Interleukin-8. In mouse colon, Interleukin-1 signaling is shown to mediate obesity-promoted elevations in inflammatory cytokines, WNT activation, and epithelial proliferation by [29]. In pulmonary fibrosis, [30] show that WNT/ $\beta$ -Catenin signaling induces IL-1 $\beta$ expression by alveolar epithelial cells. [31] show that IL-23 promotes the epithelial-mesenchymal transition of oesophageal carcinoma cells via the WNT/ $\beta$ -catenin pathway. Finally, [32] show that IL-6/WNT interactions in rheumatoid arthritis.

Family members belonging to each of the factors like WNT, IL etc, might be involved synergistically in pathological case or otherwise. IL and WNT members were found to be up regulated after the treatment of ETC-1922159 in colorectal cancer cells. We present here, multiple plausible and alternative synergistic combinatorial biological hypotheses for IL-WNT combination, which emerge after a cross family member analysis of the in silico revelations pertaining to the components under investigation.

Table 4 shows IL-WNT two way cross family analysis. The left side of the table contains rankings of IL family with respect to WNTs and the right side of the table contains rankings of WNT family with respect to ILs. Depicted in table are the plausible combinatorial hypotheses derived from majority voting of the rankings in table 4. On the left half, w.r.t WNT2B, IL-6ST/8/17REL show a synergy with WNT2B. These are reflected with rankings of 1797 (linear) and 2088 (rbf) for IL-6ST - WNT2B; rankings of 2107 (laplace), 1817 (linear) and 2088 (rbf) for IL-8 - WNT2B and rankings of 1824 (laplace) and 2241 (rbf) for IL-17REL - WNT2B, respectively. W.r.t WNT4, IL-1B/1RAP/15RA/17C show a synergy with WNT4. These are reflected with rankings of 1867 (laplace) and 1976 (linear) for IL-1B - WNT4; rankings of 2302 (laplace) and 1826 (linear) for IL-1RAP - WNT4; rankings of 1987 (laplace) and 2265 (linear) for IL-15RA - WNT4 and rankings of 2018 (laplace) and 1881 (linear) for IL-17C - WNT4, respectively. W.r.t WNT7B, IL-1RN/17REL show a synergy with WNT7B. These are reflected with rankings of 1882 (laplace) and 1796 (linear) for IL-1RAP - WNT7B and rankings of 2053 (laplace), 2445 (linear) and 2489 (rbf) for IL-17REL - WNT4, respectively. W.r.t WNT9A, IL-1RAP/15RA show a synergy with WNT9A. These are reflected with rankings of 2273 (linear) and 2159 (rbf) for IL-1RAP - WNT9A and rankings of 1776 (laplace) and 2380 (linear) for IL-15RA - WNT9A, respectively.

**Table 4.** 2<sup>nd</sup> order interaction ranking between ABC w.r.t IL family members.

RANKING IL FAMILY VS WNT FAMILY

Г-2В w.r.т I	
linear	rbf
1360	2427
2168	1369
35	1892
43	2514
1255	1283
242	1481
_1_	1101
2025	593
2020	0,0
856	1419
050	1417
625	1215
623	1213
1001	(E7
1021	657
1204	1001
1304	1331
010	1/17
919	1617
T 4	
	rbf
221	91
250	201
250	291
	4.550
19	1553
19 1218	1553 2029
1218	2029
1218 920	2029 424
1218	2029
1218 920 1443	2029 424 2454
1218 920	2029 424
1218 920 1443 2144	<ul><li>2029</li><li>424</li><li>2454</li><li>1267</li></ul>
1218 920 1443	2029 424 2454
1218 920 1443 2144 2259	2029 424 2454 1267 1993
1218 920 1443 2144	<ul><li>2029</li><li>424</li><li>2454</li><li>1267</li></ul>
1218 920 1443 2144 2259 553	2029 424 2454 1267 1993 448
1218 920 1443 2144 2259	2029 424 2454 1267 1993
1218 920 1443 2144 2259 553	2029 424 2454 1267 1993 448
1218 920 1443 2144 2259 553	2029 424 2454 1267 1993 448
1218 920 1443 2144 2259 553 139	2029 424 2454 1267 1993 448 645
1218 920 1443 2144 2259 553 139	2029 424 2454 1267 1993 448 645
	linear 1360 2168

Table 4. Cont.

RANKING IL FAMILY VS WNT FAMILY

RANKING OF IL FAMILY W.R.T WNT-7B   RANKING OF WNT-7B W.R.T IL FAMILY W.R.T WNT-7B   laplace   linear   laplace   laplace   linear   laplace   laplace   linear   laplace   lapla	rbf 2312
IL1A -       662       950       149       IL1A -       1058       2134         WNT7B       WNT7B       WNT7B       IL1B -       1683       1871         WNT7B       WNT7B       WNT7B       IL1RAP -       381       1728         WNT7B       WNT7B       WNT7B       WNT7B	
WNT7B IL1B - 290 167 502 IL1B - 1683 1871 WNT7B IL1RAP - 872 1976 789 IL1RAP - 381 1728 WNT7B WNT7B WNT7B	2312
IL1B -       290       167       502       IL1B -       1683       1871         WNT7B       WNT7B       WNT7B       IL1RAP -       381       1728         WNT7B       WNT7B       WNT7B	
WNT7B IL1RAP - 872 1976 789 IL1RAP - 381 1728 WNT7B WNT7B	1575
IL1RAP - 872 1976 789 IL1RAP - 381 1728 WNT7B WNT7B	1373
WNT7B WNT7B	1517
	1317
	1.00
IL1RN - 1882 1796 503 IL1RN - 1907 2162	1605
WNT7B WNT7B	22.45
IL2RG - 1381 446 482 IL2RG - 1070 1695	2245
WNT7B WNT7B	
IL6ST - 819 1284 1528 IL6ST - 1268 1881	2020
WNT7B WNT7B	
IL8 - 2232 220 701 IL8 - 1551 58	2149
WNT7B WNT7B	
IL10RB - 1318 1198 656 IL10RB - 375 2145	803
WNT7B WNT7B	
IL15 - 1000 290 245 IL15 - 2307 1524	1687
WNT7B WNT7B	
IL15RA - 1535 1054 2204 IL15RA - 1575 191	1949
WNT7B WNT7B	
IL17C - 515 263 113 IL17C - 1956 2388	1982
WNT7B WNT7B	
IL17REL - 2053 2445 2489 IL17REL - 322 859	1631
WNT7B WNT7B	
RANKING OF IL FAMILY W.R.T WNT-9A RANKING OF WNT-9A W.R.T IL FA	MILY
laplace linear rbf laplace linear	rbf
IL1A - 199 2228 1270 IL1A - 597 1322	469
WNT9A WNT9A	
IL1B - 305 2266 466 IL1B - 776 652	1010
1E1D 000 2200 100 1E1D 770 002	1010
WNT9A WNT9A	1010
	964
WNT9A WNT9A	
WNT9A IL1RAP - 1773 2273 2159   WNT9A IL1RAP - 2003 2179	
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A WNT9A	964
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829	964
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A WNT9A	964 1632
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260	964 1632
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A	964 1632 1276
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416	964 1632 1276
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A	964 1632 1276 1674
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A IL8 - 346 1103 1910 IL8 - 589 1751	964 1632 1276 1674
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A IL8 - 346 1103 1910 IL8 - 589 1751 WNT9A	964 1632 1276 1674 1529
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A IL8 - 346 1103 1910 IL8 - 589 1751 WNT9A IL10RB - 1836 1556 1006 IL10RB - 1021 2127 WNT9A	964 1632 1276 1674 1529
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A IL8 - 346 1103 1910 IL8 - 589 1751 WNT9A IL10RB - 1836 1556 1006 IL10RB - 1021 2127 WNT9A	964 1632 1276 1674 1529 1534
WNT9A IL1RAP - 1773 2273 2159 IL1RAP - 2003 2179 WNT9A IL1RN - 2479 1506 1503 IL1RN - 1363 1829 WNT9A IL2RG - 1489 598 865 IL2RG - 186 260 WNT9A IL6ST - 2229 761 1103 IL6ST - 2099 1416 WNT9A IL8 - 346 1103 1910 IL8 - 589 1751 WNT9A IL10RB - 1836 1556 1006 IL10RB - 1021 2127 WNT9A IL15 - 168 1445 855 IL15 - 1357 1025	964 1632 1276 1674 1529 1534
WNT9A   IL1RAP - 1773   2273   2159   IL1RAP - 2003   2179   2179   2479   1506   1503   IL1RN - 1363   1829   2479   1489   598   865   IL2RG - 186   260	964 1632 1276 1674 1529 1534 1709
WNT9A   IL1RAP - 1773   2273   2159   IL1RAP - 2003   2179   2170   21	964 1632 1276 1674 1529 1534 1709 737
WNT9A   IL1RAP - 1773   2273   2159   IL1RAP - 2003   2179   2179   2479   WNT9A   IL1RN - 2479   1506   1503   IL1RN - 1363   1829   2479   WNT9A   IL2RG - 1489   598   865   IL2RG - 186   260   260   2229   761   1103   IL6ST - 2099   1416   260	964 1632 1276 1674 1529 1534 1709
WNT9A   IL1RAP - 1773   2273   2159   IL1RAP - 2003   2179   21	964 1632 1276 1674 1529 1534 1709 737

**Table 5.** 2<sup>nd</sup> order combinatorial hypotheses between IL and WNT family members.

#### UNEXPLORED COMBINATORIAL HYPOTHESES

IL w.r.t WNT		
IL-6ST/8/17REL	WNT-2B	
IL-1B/1RAP/15RA/17C	WNT-4	
IL-1RN/17REL	WNT-7B	
IL-1RAP/15RA	WNT-9A	
WNT w.r.t IL		
IL-1A/1RAP/8	WNT-2B	
IL-8/10RB	WNT-4	
IL-1A/1RN/6ST/17C	WNT-7B	
IL-1RAP/15RA/17REL	WNT-9A	

On the right half, WNT2B w.r.t IL family, IL-1A/1RAP/8 show a synergy with WNT2B. These are reflected with rankings of 2290 (laplace) and 2427 (rbf) for IL-1A - WNT2B; rankings of 2488 (laplace) and 1892 (rbf) for IL-1RAP - WNT2B and rankings of 2157 1824 (laplace) and 2025 (linear) for IL-8 - WNT2B, respectively. WNT4 w.r.t IL family, IL-8/10RB show a synergy with WNT4. These are reflected with rankings of 1980 (laplace) and 2144 (linear) for IL-8 - WNT4 and rankings of 1828 (laplace), 2259 (linear) and 1993 (rbf) for IL-10RB - WNT4; respectively. WNT7B w.r.t IL family, IL-1A/1RN/6ST/17C show a synergy with WNT7B. These are reflected with rankings of 2134 (linear) and 2312 (rbf) for IL-1A - WNT7B; rankings of 1907 (laplace) and 2162 (linear) for IL-1RN - WNT7B; rankings of 1881 (linear) and 2020 (rbf) for IL-ST - WNT7B; and rankings of 1956 (laplace), 2388 (linear) and 1982 (rbf) for IL-17C - WNT7B, respectively. WNT9A w.r.t IL family, IL-1RAP/15RA/17REL show a synergy with WNT9A. These are reflected with rankings of 2003 (laplace) and 2179 (linear) for IL-1RAP - WNT9A; rankings of 2149 (laplace) and 2362 (linear) for IL-15RA - WNT9A; and rankings of 2101 (laplace) and 1940 (linear) for IL-17REL - WNT9A, respectively. One can also interpret the results of the Table 5 graphically, with the following influences - ● IL w.r.t WNT with IL-6ST/8/17REL <- WNT-2B; IL-1B/1RAP/15RA/17C <- WNT-4; IL-1RN/17REL <- WNT-7B; IL-1RAP/15RA < - WNT-9A and • WNT w.r.t IL with IL-1A/1RAP/8 - > WNT-2B; IL-8/10RB - > WNT-4; IL-1A/1RN/6ST/17C - > WNT-7B and IL-1RAP/15RA/17REL - > WNT-9A.

# 3.1.4. UBE2 - WNT Cross Family Analysis

[33] observed balanced ubiquitylation and deubiquitylation of Frizzled regulate cellular responsiveness to Wg/Wnt. Family members belonging to each of the factors like UBE2, WNT etc, might be involved synergistically in pathological case or otherwise. UBE2 and WNT members were found to be up regulated after the treatment of ETC-159 in colorectal cancer cells. However, not much is known about interation between the UBE2 family members and WNTs. Here we present a range of synergies that were ranked highly for up regulation. Table 6 presents the rankings of UBE family VS WNT family. Following this, is the Table 7 which derives the necessary influences via majority voting of rankings in Table 6.

**Table 6.** 2<sup>nd</sup> order interaction ranking between WNT w.r.t UBE2 family members.

RANKING UBE2 FAMILY VS WNT FAMILY

			ING UBE2 FAM				
Ranking	G OF UBE2-	A W.R.T W	'NT family	RANKING	G OF WNT I	FAMILY W.F	R.T UBE2-A
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	1608	203	181	WNT2B -	1677	899	1671
UBE2A				UBE2A			
WNT4 -	1293	2314	2279	WNT4 -	424	1062	545
UBE2A	1270	2014		UBE2A	121	1002	343
	1120	1017	1071		202	00.45	0151
WNT7B -	1139	1217	1961	WNT7B -	392	2345	2151
UBE2A				UBE2A			
WNT9A -	443	1705	287	WNT9A -	806	1581	1098
UBE2A				UBE2A			
RANKING	G OF UBE2-	B W.R.T W	NT FAMILY	RANKING	G OF WNT I	FAMILY W.I	R.T UBE2-B
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	1473	2220	599	WNT2B -	2020	553	73
UBE2B	1475	2220	577	UBE2B	2020	333	73
WNT4 -	2260	2008	2141	WNT4 -	301	334	47
	2260	2008	21 <del>4</del> 1		301	334	4/
UBE2B				UBE2B	1001		4000
WNT7B -	2116	2206	1454	WNT7B -	1336	2052	1903
UBE2B				UBE2B			
WNT9A -	2291	79	1381	WNT9A -	2300	2476	2326
UBE2B				UBE2B			
RANKING	GOF UBE2-	F W.R.T W	NT FAMILY	RANKING	G OF WNT 1	FAMILY W.I	R.T UBE2-F
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	1246	833	2387	WNT2B -	1006	1917	49
	1240	033	2307	UBE2F	1000	1717	1)
UBE2F	0105	2505	17/0		<b>60</b>	1100	
WNT4 -	2135	2505	1762	WNT4 -	63	1109	664
UBE2F				UBE2F			
WNT7B -	2423	1673	2077	WNT7B -	2236	1660	1751
UBE2F				UBE2F			
WNT9A -	2032	1165	128	WNT9A -	1014	2251	2179
UBE2F				UBE2F			
RANKING	OF UBE2-	H w.r.t W	NT FAMILY	RANKING	GOF WNT F	FAMILY W.R	ат ИВЕ2-Н
2111111111	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	1841	351	2178	WNT2B -	2015	1019	1331
	1041	331	2170		2013	1019	1331
UBE2H	1000	<b>77</b> 0	1004	UBE2H	010	22.40	0155
WNT4 -	1090	778	1224	WNT4 -	218	2248	2155
UBE2H				UBE2H			
WNT7B -	1505	1215	527	WNT7B -	2294	1209	1367
UBE2H				UBE2H			
WNT9A -	605	332	2479	WNT9A -	437	1202	2379
UBE2H				UBE2H			
	OF LIBE2-	I1 wrt W	NT FAMILY		OF WNT F	FAMILY W.R	a.T UBE2-J1
Tanvan V	laplace	linear	rbf		laplace	linear	rbf
MINITOD	1539	1251	1814	WINTOP	1500	1562	1255
WNT2B -	1339	1231	1014	WNT2B -	1300	1302	1233
UBE2J1	4500	0.450	1.01	UBE2J1	202	60	. <del>-</del>
WNT4 -	1583	2478	1604	WNT4 -	292	62	65
UBE2J1				UBE2J1			
WNT7B -	2349	1207	2183	WNT7B -	552	1877	1846
UBE2J1				UBE2J1			
WNT9A -	1835	2053	1652	WNT9A -	2471	2137	2469
UBE2J1				UBE2J1			

Table 6. Cont.

RANKING UBE2 FAMILY VS WNT FAMILY

RANKING	G OF UBE2-	Z w.r.t W	NT FAMILY	RANKING	G OF WNT I	FAMILY W.I	R.T UBE2-Z
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	58	1756	1878	WNT2B -	1576	1171	1543
UBE2Z				UBE2Z			
WNT4 -	2195	2468	938	WNT4 -	896	132	186
UBE2Z				UBE2Z			
WNT7B -	2343	1973	723	WNT7B -	1972	1800	1399
UBE2Z				UBE2Z			
WNT9A -	136	1986	4	WNT9A -	1149	865	813
UBE2Z				UBE2Z			

On the left half, w.r.t WNT family, UBE2A show a synergy with WNT4. These are reflected with rankings of 2314 (linear) and 2279 (rbf) for UBE2A - WNT4; UBE2B show a synergy with WNT4/7B. These are reflected with rankings of 2260 (laplace), 2008 (linear) and 2141 (rbf) for UBE2B - WNT4 and rankings of 2116 (laplace) and 2206 (rbf) for UBE2B - WNT7B, respectively; UBE2F show a synergy with WNT4/7B. These are reflected with rankings of 2135 (laplace) and 2505 (linear) for UBE2F - WNT4 and rankings of 2423 (laplace) and 2077 (rbf) for UBE2F - WNT7B, respectively; UBE2H show a synergy with WNT2B. These are reflected with rankings of 1841 (laplace) and 2178 (linear) for UBE2H - WNT2B; UBE2J1 show a synergy with WNT-7B/9A. These are reflected with rankings of 2349 (laplace) and 2183 (rbf) for UBE2J1 - WNT7B and rankings of 1835 (laplace) and 2053 (rbf) for UBE2J1 - WNT9A, respectively. UBE2Z show a synergy with WNT-2B/4/9A. These are reflected with rankings of 1756 (linear) and 1878 (rbf) for UBE2J1 - WNT2B, rankings of 2195 (laplace) and 2468 (rbf) for UBE2J1 - WNT4, and 2343 (laplace) and 1973 (rbf) for UBE2J1 - WNT9A, respectively.

On the right half, w.r.t UBE2, UBE2A shows a synergy with WNT4. These are reflected with rankings of 2345 (linear) and 2151 (rbf) for UBE2A - WNT7B; UBE2B shows a synergy with WNT-7B/9A. These are reflected with rankings of 2052 (linear) and 1903 (rbf) for UBE2B - WNT7B and rankings of 2300 (laplace), 2476 (linear) and 2326 (rbf) for UBE2B - WNT9A, respectively; UBE2F shows a synergy with WNT-7B/9A. These are reflected with rankings of 2236 (laplace) and 1751 (rbf) for UBE2F - WNT7B and rankings of 2251 (linear) and 2179 (rbf) for UBE2F - WNT9A, respectively; UBE2H shows a synergy with WNT4. These are reflected with rankings of 2248 (linear) and 2155 (rbf) for UBE2H - WNT4; UBE2J1 shows a synergy with WNT-7B/9A. These are reflected with rankings of 1877 (llinear) and 1846 (rbf) for UBE2J1 - WNT7B and rankings of 2471 (laplace), 2137 (linear) and 2469 (rbf) for UBE2J1 - WNT9A, respectively. UBE2Z shows a synergy with WNT-9A. These are reflected with rankings of 1972 (laplace) and 1800 (linear) for UBE2Z - WNT7B, respectively.

**Table 7.** 2<sup>nd</sup> order combinatorial hypotheses between UBE2 and WNT family members.

#### UNEXPLORED COMBINATORIAL HYPOTHESES

UBE2 w.r.t WNT	
WNT-4	UBE2-A
WNT-4/7	UBE2-B
WNT-4/7B	UBE2-F
WNT-2B	UBE2-H
WNT-7B/9B	UBE2-J1
WNT-2B/4/7B	UBE2-Z
WNT w.r.t UBE2	
WNT-7B	UBE2-A
WNT-7B/9A	UBE2-B
WNT-7B/9A	UBE2-F
WNT-4	UBE2-H
WNT-7B/9A	UBE2-J1
WNT-7B	UBE2-Z

#### 3.1.5. EXOSC - WNT10B Cross Family Analysis

Recently, emerging role of exosome (EXOSC) has been studied in WNT secretion and transportation by [34]. It has been found that exosomes play a critical role in morphogen signaling during embryonic development and cancer progression. In injured CNS, exosomes mediate mobilization of WNT10B to promote axonal regeneration as shown by [35]. [36] show the importance of exosomes in WNT transportation. Emerging on these lines, we conducted a small two-way analysis of EXOSC components and WNT10B which were found to be down regulated in CRC cells after administration of ETC-1922159. Note that here, the interpretation of the rankings changes as the low numerical valued ranks (nearing to 1) are considered of high importance as they point to the synergistic down regulation after the drug administration. In line with the experiments, as ETC-1922159 a PORCN-WNT inhibitor block the transportation of WNTs, it might be that the affects of EXOSC components are also down regulated. These were rightly allocated with the low numerical valued in-silico ranks by the engine, thus pointing to the experimental down regulation in cells also. This confirmatory results also helps us in exploring the unknown combinations that might be prevailing synergistically when the WNT-EXOSC were up regulated before the administration of ETC-1922159 in CRC cells.

Table 8 shows the rankings of EXOSC family w.r.t WNT10B and vice versa. Followed by this is the unexplored combinatorial hypotheses in Table 9 generated from two-way analysis of the ranks in Table 8. On the left half of the Table 8, except for EXOSC7 - WNT10B, all other combinations of EXOSC family show high synergy with WNT10B. This is depicted by the low numerical valued ranks allocated by the search engine for EXOSC-2/3/5/6/8/9 with WNT10B, via majority voting across the ranking methods using laplace, linear and rbf kernels. This shows that EXOSC-2/3/5/6/8/9 had a critical role in the transport of WNT10B. On the right half of the same table, EXOSC-2/5/6/7/9 show synergistic affiliation with respect to WNT10B, via low numerical valued ranks. These are translated to graphical influences in Table 9. One can also interpret the results of the Table 9 graphically, with the following influences - • EXOSC w.r.t WNT10B with EXOSC-2/5/6/7/9 < — WNT10B and • WNT10B w.r.t EXOSC with EXOSC-2/3/5/6/8/9 — > WNT10B. Further analyses of these combinations in wet lab might help biologists explore the deeper mechanism of exosome components and WNT10B in CRC cells.

Table 8.  $2^{nd}$  order interaction ranking between WNT w.r.t EXOSC family members.

#### RANKING EXOSC FAMILY VS WNT10B

RANKING C	OF WNT10	B w.r.τ Ελ	OSC FAMILY	Ranking C	OF EXOSC	FAMILY W.	R.T WNT10B
	laplace	linear	rbf		laplace	linear	rbf
EXOSC2 -	221	433	699	EXOSC2 -	1695	1077	992
WNT10B				WNT10B			
EXOSC3 -	906	1292	860	EXOSC3 -	610	2496	2428
WNT10B				WNT10B			
EXOSC5 -	919	484	997	EXOSC5 -	832	1445	1589
WNT10B				WNT10B			
EXOSC6 -	407	1195	1747	EXOSC6 -	1319	1738	1689
WNT10B				WNT10B			
EXOSC7 -	2599	2571	2584	EXOSC7 -	2710	13	4
WNT10B				WNT10B			
EXOSC8 -	336	1437	391	EXOSC8 -	451	2284	2493
WNT10B				WNT10B			
EXOSC9 -	222	701	732	EXOSC9 -	1378	1501	1651
WNT10B				WNT10B			

**Table 9.** 2<sup>nd</sup> order combinatorial hypotheses between EXOSC and WNT10B family members.

#### UNEXPLORED COMBINATORIAL HYPOTHESES

EXOSC w.r.t WNT10B		
EXOSC-2/5/6/7/9	WNT10B	
WNT10B w.r.t EXOSC		
EXOSC-2/3/5/6/8/9	WNT10B	

# 3.1.6. CASP - WNT Cross Family Analysis

[37] show that a caspase-dependent pathway is involved in Wnt/ $\beta$ -catenin signaling promoted apoptosis in Bacillus Calmette-Guerin infected RAW264.7 macrophages. [38] have shown that WNT11 promotes cardiomyocyte development by caspase-mediated suppression of canonical WNT signals. Additionally, [39] show that Wnt5a and Wnt11 inhibit the canonical Wnt pathway and promote cardiac progenitor development via the Caspase-dependent degradation of AKT. These findings indicate probable interplay of Caspase and WNTs in various pathological cases. In mice, caspase-1 activation and IL-1 $\beta$  secretion together have shown to contribute to inflammatory condition of acute arthritis (see [40]). Recently, Caspase-3 inhibition has been found to be a therapeutic approach in colorectal cancer as shown by [41]. [42] also show synergistic role of Caspase-8 and Caspase-3 expressions as biomarkers in colorectal cancer. Family members belonging to each of the factors like CASP, WNT etc, might be involved synergistically in pathological case or otherwise. CASP and WNT members were found to be up regulated after the treatment of colorectal cancer cells with ETC-1922159.

Table 10 shows the rankings of CASP family w.r.t WNTs and vice versa. Followed by this is the unexplored combinatorial hypotheses in Table 11 generated from two-way analysis of the ranks in Table 10. On the first three tabular rows of the Table 10 show rankings of CASP family w.r.t WNT family. Here we present the possible interdependent WNT-CASP combinations that might be working synergistically in CRC cells. Considering CASP5 w.r.t WNTs, CASP5 - WNT2B show up regulated synergy through rankings of 2171 (laplace) and 2366 (linear). Considering CASP9 w.r.t WNTs, CASP9 - WNT-4/7B/9A show up regulated synergy through rankings of 2472 (laplace) and 2200 (linear) for CASP9 - WNT4; 2196 (laplace) and 1935 (linear) for CASP9 - WNT7B; and 1863 (laplace) and 2002 (linear) for CASP9 - WNT9A, respectively. Finally, considering CASP16 w.r.t WNTs, CASP16 - WNT4 showed up regulated synergy with rankings of 2070 (laplace) and 1783 (linear).

The next three tabular rows show rankings of WNT family w.r.t CASP family. W.r.t CASP4, WNT-7B/9A show promise of up regulation. These are reflected with rankings of 2479 (linear) and

1739 (rbf) for WNT7B - CASP4 and rankings of 2278 (linear) and 1939 (rbf) for WNT9A - CASP4, respectively. W.r.t CASP5, WNT-7B shows promise of up regulation. This is reflected with rankings of 2112 (laplace), 1919 (linear) and 2440 (rbf) for WNT7B - CASP5. W.r.t CASP7, WNT-2B/4/9A show promise of up regulation. These are reflected with rankings of 2505 (laplace) and 1891 (linear) for WNT2B - CASP7; rankings of 2456 (linear) and 2455 (rbf) for WNT4 - CASP7; and rankings of 2183 (laplace) and 1941 (linear) for WNT9A - CASP7, respectively. W.r.t CASP9, WNT-9A shows promise of up regulation. This is reflected with rankings of 2378 (laplace), 2396 (linear) and 2058 (rbf) for WNT9A - CASP9. W.r.t CASP10, WNT-4/9A show promise of up regulation. These are reflected with rankings of 1830 (laplace), 2229 (linear) and 1847 (rbf) for WNT4 - CASP10; and rankings of 2185 (laplace) and 1977 (linear) for WNT9A - CASP10, respectively. Finally, w.r.t CASP16, WNT-2B/4/9A show promise of up regulation. These are reflected with rankings of 2197 (laplace), 2489 (linear) and 1775 (rbf) for WNT2B - CASP16; rankings of 2508 (laplace), 1820 (linear) and 1867 (rbf) for WNT7B - CASP16; and rankings of 1943 (laplace) and 1839 (linear) for WNT9A - CASP16, respectively.

**Table 10.** 2<sup>nd</sup> order interaction ranking between WNT VS CASP family members.

	Table 10. 2"	" oraer inte	raction ranking b	etween WN1	VS CASP fan	nily members	5.
		Rank	ING CASP FAM	IILY VS WN	$\Gamma$ family		
RANKING	G OF CASP	4 w.r.t W1	VTS FAMILY	RANKING	G OF CASPS	5 W.R.T WN	TS FAMILY
	laplace	linear	rbf		laplace	linear	rbf
CASP4 -	2265	320	1517	CASP5 -	975	2171	2366
WNT2B				WNT2B			
CASP4 -	1050	1081	558	CASP5 -	1788	1356	569
WNT4				WNT4			
CASP4 -	622	9	632	CASP5 -	716	978	606
WNT7B				WNT7B			
CASP4 -	446	1413	583	CASP5 -	383	808	147
WNT9A				WNT9A			
RANKING	G OF CASP	7 W.R.T WI	VTS FAMILY	RANKING	G OF CASP	W.R.T WN	TS FAMILY
	laplace	linear	rbf		laplace	linear	rbf
CASP7 -	1152	305	248	CASP9 -	1345	1501	1328
WNT2B				WNT2B			
CASP7 -	936	1260	1787	CASP9 -	1344	2472	2200
WNT4				WNT4			
CASP7 -	901	1403	1303	CASP9 -	2196	1935	1713
WNT7B				WNT7B			
CASP7 -	1330	1527	2436	CASP9 -	1863	428	2002
WNT9A				WNT9A			
RANKING	OF CASP1	0 w.r.t W	NTs family	RANKING	G OF CASP1	6 W.R.T WI	NTS FAMILY
	laplace	linear	rbf		laplace	linear	rbf
CASP10 -	1607	1108	739	CASP16 -	240	621	193
WNT2B				WNT2B			
CASP10 -	432	689	132	CASP16 -	2070	1783	<i>7</i> 11
WNT4				WNT4			
CASP10 -	1906	1171	1165	CASP16 -	411	713	103
WNT7B				WNT7B			
CASP10 -	1611	2152	1451	CASP16 -	14	2512	181
WNT9A				WNT9A			

Table 10. Cont.

RANKING CASP FAMILY VS WNT FAMILY

RANKING OF WNTS FAMILY W.R.T CASP4  RANKING OF WNTS FAMILY W.R.T CASP5							
	laplace	linear	rbf		laplace	linear	rbf
CASP4 -	609	1317	2372	CASP5 -	1849	1192	1590
WNT2B				WNT2B			
CASP4 -	105	711	1062	CASP5 -	890	682	714
WNT4				WNT4			
CASP4 -	1093	2479	1739	CASP5 -	2112	1919	2440
WNT7B				WNT7B			
CASP4 -	456	2278	1939	CASP5 -	315	1880	1437
WNT9A				WNT9A			
RANKING	G OF WNTS	FAMILY W	I.R.T CASP7	RANKING	G OF WNTS	FAMILY W	V.R.T CASP9
	laplace	linear	rbf		laplace	linear	rbf
CASP7 -	2505	1891	1120	CASP9 -	282	639	1414
WNT2B				WNT2B			
CASP7 -	108	2456	2455	CASP9 -	572	1788	378
WNT4				WNT4			
CASP7 -	1380	1559	1681	CASP9 -	979	901	676
WNT7B				WNT7B			
CASP7 -	2183	1941	1632	CASP9 -	2378	2396	2058
WNT9A				WNT9A			
RANKING		FAMILY W	R.T CASP10	RANKING	OF WNTS	FAMILY W	R.T CASP16
	laplace	linear	rbf		laplace	linear	rbf
CASP10 -	625	1471	81	CASP16 -	2197	2489	1775
WNT2B				WNT2B			
CASP10 -	1830	2229	1847	CASP16 -	1382	954	1017
WNT4				WNT4			
CASP10 -	1965	937	147	CASP16 -	2508	1820	1867
WNT7B				WNT7B			
CASP10 -	2185	1977	1350	CASP16 -	1943	1154	1839
WNT9A				WNT9A			

One can also interpret the results of the Table 11 graphically, with the following influences - 
CASP w.r.t WNT with CASP5 < - WNT2B; CASP9 < - WNT-4/7B/9A; CASP16 < - WNT4 and 
WNT w.r.t CASP with. WNT-7B/9A < - CASP4; WNT7B < - CASP5; WNT-2B/4/9A < - CASP7; WNT9A < - CASP9; WNT-4/9A < - CASP10; WNT-2B/7B/9A < - CASP16.

**Table 11.**  $2^{nd}$  order combinatorial hypotheses between CASP and WNT family members.

# UNEXPLORED COMBINATORIAL HYPOTHESES

CASP w.r.t WNT	
CASP5	WNT2B
CASP9	WNT4/WNT7B/WNT9A
CASP16	WNT4
WNT w.r.t CASP	
WNT7B/WNT9A	CASP4
WNT7B	CASP5
WNT2B/WNT4/WNT9A	CASP7
WNT9A	CASP9
WNT4/WNT9A	CASP10
WNT2B/WNT7B/WNT9A	CASP16

#### 3.1.7. TP53 - WNT Cross Family Analysis

[43] have shown that down regulation of  $\beta$ -catenin is activated by TP53. Wnt/ $\beta$ -catenin signaling is known to regulate the proliferation and differentiation of mesenchymal progenitor cells through the TP53 Pathway, as shown by [44]. [45] show that WNT activation by lithium abrogates TP53 mutation associated radiation resistance in medulloblastoma. In mouse cochlea, [46] show that WNT signaling activates TP53-induced glycolysis and apoptosis regulator and protects against cisplatin-induced spiral ganglion neuron damage. These range of interactions of TP53 with WNT points towards definite synergy. [47] show that TP53 protein regulates Hsp90 ATPase activity and thereby Wnt signaling by modulating Aha1 expression. Family members belonging to each of the factors like TP53, WNT etc, might be involved synergistically in pathological case or otherwise. TP53 and WNT members were found to be up regulated after the treatment of ETC-159 in colorectal cancer cells.

Table 12 contains rankings of TP53 w.r.t WNTs and vice versa. Followed by this is the unexplored combinatorial hypotheses in Table 13 generated from two-way analysis of the ranks in Table 12. On the left half of Table 12 are rankings of TP53 w.r.t WNTs and on the right half are the rankings of WNTs w.r.t TP53 family. Beginning with the left half, TP53I3 - WNT2B shows synergistic up regulation with rankings of 2056 (laplace) and 1712 (linear); TP53INP1 - WNT2B shows synergistic up regulation with rankings of 1805 (linear) and 2056 (rbf) and TP53BP2 - WNT9A shows synergistic up regulation with rankings of 2232 (linear) and 2143 (rbf). On the right half the table, TP53INP1 - WNT2B shows synergistic up regulation with rankings of 1853 (laplace) and 2089 (linear); TP53INP1 - WNT2B shows synergistic up regulation with rankings of 1723 (linear) and 2335 (rbf); TP53INP1 - WNT4 shows synergistic up regulation with rankings of 2414 (linear) and 2493 (rbf); TP53INP1 - WNT9A shows synergistic up regulation with rankings of 1988 (laplace) and 2393 (rbf) and finally, TP53INP1 - WNT9A shows synergistic up regulation with rankings of 2045 (linear) and 2437 (rbf).

**Table 12.** 2<sup>nd</sup> order interaction ranking between WNT VS TP53 family members.

		R	ANKING TP53	family VS W	'NT		
RANKING	G OF TP53 I	FAMILY W.I	R.T WNT2B	Ranking	G OF WNT2	B w.r.t Tl	P53 FAMILY
	laplace	linear	rbf		laplace	linear	rbf
TP53BP2 -	2286	234	1550	TP53BP2 -	313	908	2457
WNT2B				WNT2B			
TP53I3 -	2056	1712	1461	TP53I3 -	713	1223	1720
WNT2B				WNT2B			
TP53INP1	945	1805	2056	TP53INP1	1853	2089	762
- WNT2B				- WNT2B			
TP53INP2	369	1277	453	TP53INP2	754	1723	2335
- WNT2B				- WNT2B			
RANKIN	G OF TP53	FAMILY W.	R.T WNT4	Rankin	g of WNT	4 w.r.t TP	53 Family
	laplace	linear	rbf		laplace	linear	rbf
TP53BP2 -	1034	315	1734	TP53BP2 -	678	1464	2500
WNT4				WNT4			
TP53I3 -	1738	1631	232	TP53I3 -	297	319	493
WNT4				WNT4			
TP53INP1	645	498	450	TP53INP1	131	2414	2493
- WNT4				- WNT4			
TP53INP2	671	1440	405	TP53INP2	529	467	154
- WNT4				- WNT4			

Table 12. Cont.

RANKING TP53 FAMILY VS WNT

RANKING OF TP53 FAMILY W.R.T WNT7B RANKING OF WNT7B W.R.T TP53 FAMILY						P53 FAMILY	
	laplace	linear	rbf		laplace	linear	rbf
TP53BP2 -	2333	1282	1673	TP53BP2 -	1442	2217	1068
WNT7B				WNT7B			
TP53I3 -	324	712	284	TP53I3 -	1712	1988	2393
WNT7B				WNT7B			
TP53INP1	1227	1585	1019	TP53INP1	1226	1685	1497
- WNT7B				- WNT7B			
TP53INP2	845	1004	470	TP53INP2	1017	1746	1925
- WNT7B				- WNT7B			
RANKING	G OF TP53 F	AMILY W.I	R.T WNT9A	RANKING	OF WNT9	A W.R.T T	P53 FAMILY
	laplace	linear	rbf		laplace	linear	rbf
TP53BP2 -	908	2232	2143	TP53BP2 -	1035	371	1218
WNT9A				WNT9A			
TP53I3 -	1707	2297	1018	TP53I3 -	1351	1281	1695
WNT9A				WNT9A			
TP53INP1	447	243	1245	TP53INP1	295	2045	2437
- WNT9A				- WNT9A			
TP53INP2	22	2497	1138	TP53INP2	421	1765	1121
- WNT9A				- WNT9A			

**Table 13.**  $2^{nd}$  order combinatorial hypotheses between TP53 and WNT family members.

	Unexplored combinatorial hypotheses
TP53 family w.r.t WNT	
TP53I3	WNT2B
TP53INP1	WNT2B
TP53BP2	WNT9A
WNT family w.r.t TP53	
TP53INP1	WNT2B
TP53INP2	WNT2B
TP53INP1	WNT4
TP53I3	WNT7B
TP53INP1	WNT9A

One can also interpret the results of the Table 11 graphically, with the following influences - TP53 family w.r.t WNTs with TP53I3 <- WNT2B; TP53INP1 <- WNT2B and TP53BP2 <- WNT9A; and WNT family VS TP53 with TP53INP1 -> WNT2B; TP53INP2 -> WNT2B; TP53INP1 -> WNT4; TP53I3 -> WNT7B and TP53INP1 -> WNT9A.

# 3.1.8. BCL - WNT Cross Family Analysis

[48] observed that silencing Wnt2B by siRNA interference inhibits metastasis and enhances chemotherapy sensitivity in ovarian cancer. More specifically, [48] show that in the presence of Wnt2B siRNA treatment, the caspase-9/B-cell lymphoma 2 (BCL2)/B-cell lymphoma-xL (BCL-xL) pathway and the epithelial-mesenchymal transition/phosphorylated protein kinase B pathway were inhibited. [49] show that targeted disruption of the BCL9/ $\beta$ -catenin complex inhibits oncogenic WNT signaling. CDK1-mediated BCL9 phosphorylation inhibits clathrin to promote mitotic Wnt signaling as shown by [50]. These findings point to the existing synergy of BCL family with WNTs. Family members belonging to each of the factors like BCL, WNT etc, might be involved synergistically in pathological case or otherwise. BCL and WNT members were found to be up regulated after the treatment of ETC-159 in colorectal cancer cells.

Table 14 contains rankings of BCL w.r.t WNTs and vice versa. Followed by this is the unexplored combinatorial hypotheses in Table 15 generated from two-way analysis of the ranks in Table 14. On the left half of Table 14 are rankings of BCL w.r.t WNTs. WNT4 - BCL2L2 shows high ranking with 2364 (laplace) and 2042 (linear); WNT7B - BCL2L2 shows high ranking with 1877 (laplace) and 2456 (linear); WNT9A - BCL2L2 shows high ranking with 1877 (laplace) and 2447 (linear); WNT4 - BCL2L13 shows high ranking with 1938 (laplace), 2425 (linear) and 1900 (rbf); WNT7B - BCL2L13 shows high ranking with 1993 (linear) and 2284 (rbf) and WNT2B - BCL10 shows high ranking with 2321 (laplace) and 2023 (linear).

On the right side are rankings of WNTs w.r.t BCL. WNT7B - BCL2L1 shows high ranking with 2213 (laplace) and 2266 (linear); WNT7B - BCL2L2 shows high ranking with 2456 (laplace), 2512 (linear) and 2286 (rbf); WNT9A - BCL2L2 shows high ranking with 1868 (laplace) and 2333 (rbf); WNT9A - BCL2L13 shows high ranking with 1858 (laplace), 2422 (linear) and 1934 (rbf); WNT2B - BCL3 shows high ranking with 1846 (laplace), 2056 (linear) and 1896 (rbf); WNT4 - BCL6 shows high ranking with 2483 (laplace) and 2488 (linear); WNT7B - BCL6 shows high ranking with 1893 (laplace) and 2284 (linear); WNT9A - BCL6 shows high ranking with 2098 (linear) and 1905 (rbf); WNT2B - BCL9L shows high ranking with 1918 (laplace) and 1882 (rbf) and WNT4 - BCL9L shows high ranking with 2498 (linear) and 2509 (rbf);

**Table 14.**  $2^{nd}$  order interaction ranking between WNT VS BCL family members.

		F	anking BCL i	FAMILY VS W	NT		
RANKING	G OF BCL2I	_1 w.r.t W	NT FAMILY	RANKING		FAMILY W.	R.T BCL2L1
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	1884	101	966	WNT2B -	1854	1666	1699
BCL2L1				BCL2L1			
WNT4 -	98	1162	719	WNT4 -	21	107	16
BCL2L1				BCL2L1			
WNT7B -	1434	1891	620	WNT7B -	2213	2266	1511
BCL2L1				BCL2L1			
WNT9A -	1088	1020	1318	WNT9A -	1019	1462	1345
BCL2L1				BCL2L1			
RANKING	OF BCL2I	L2 W.R.T W	NT FAMILY	RANKING	G OF WNT I	FAMILY W.	R.T BCL2L2
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	625	2204	1677	WNT2B -	1574	2206	955
BCL2L2				BCL2L2			
WNT4 -	2364	2042	1610	WNT4 -	160	590	316
BCL2L2				BCL2L2			
WNT7B -	843	1877	2456	WNT7B -	2456	2512	2286
BCL2L2				BCL2L2			
WNT9A -	1877	538	2447	WNT9A -	1868	2333	990
BCL2L2				BCL2L2			
RANKING	OF BCL2L	13 w.r.t V	VNT FAMILY	Ranking	OF WNT F	AMILY W.I	R.T BCL2L13
	laplace	linear	rbf		laplace	linear	rbf
WNT2B -	201	1862	1353	WNT2B -	1256	1254	1490
BCL2L13				BCL2L13			
WNT4 -	1938	2425	1900	WNT4 -	922	270	187
BCL2L13				BCL2L13			
WNT7B -	1105	1993	2284	WNT7B -	1610	1319	954
BCL2L13				BCL2L13			
WNT9A -	1855	268	2387	WNT9A -	1858	2422	1934
BCL2L13				BCL2L13			

**Table 14.** Cont.

RANKING BCL FAMILY VS WNT

RANKING OF BCL3 W.R.T WNT FAMILY RANK laplace linear rbf WNT2B - 950 1328 2482 WNT2B -	TATE OF TATE T		
		T family w	V.R.T BCL3
MANITOD OFO 1220 2402 MANITOD	laplace	linear	rbf
VIN12D - 950 1526 2462 VIN12D -	1846	2056	1896
BCL3 BCL3			
WNT4 - 1228 1562 1353 WNT4 -	591	359	1932
BCL3 BCL3			
WNT7B - 591 615 553 WNT7B -	1687	2160	1428
BCL3 BCL3	1007	_100	1120
WNT9A - 1037 1410 1102 WNT9A -	1539	1424	398
BCL3 BCL3	1557	1121	370
	ING OF WN	T EANITY M	IDTRCI 6
		linear	rbf
laplace linear rbf WNT2B - 455 2426 1529 WNT2B -	laplace 52	107	170
	32	107	170
BCL6	2402	0.400	1070
WNT4 - 256 486 787 WNT4 -	2483	2488	1273
BCL6		4000	•••
WNT7B - 2147 1466 1105 WNT7B -	975	1893	2284
BCL6 BCL6			
WNT9A - 1547 734 2012 WNT9A -	- 1558	2098	1905
BCL6 BCL6			
	ing of WNT	FAMILY W.	r.t BCL9L
laplace linear rbf	laplace	linear	rbf
	1010		
WNT2B - 2348 804 1558 WNT2B -	1918	700	1882
	1918	700	1882
WNT2B - 2348 804 1558 WNT2B -	303	700 2498	1882 2509
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L			
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L	303	2498	2509
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B -	303		
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L	303 1608	2498 811	2509 2168
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A -	303 1608	2498	2509
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL9L	303 1608 - 941	<ul><li>2498</li><li>811</li><li>1843</li></ul>	2509 2168 1238
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL9L RANKING OF BCL10 W.R.T WNT FAMILY RANKING W.R.T WNT FAMILY RANKING W.R.T W.R.T WNT FAMILY RANKING W.R.T W.R.	303 1608 - 941 ING OF WNT	2498 811 1843 Γ FAMILY W	2509 2168 1238 .R.T BCL10
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL9L BCL9L RANKING OF BCL10 W.R.T WNT FAMILY RANKING W.R.T W.R.T W.R.T W.R.T W.R.T WNT FAMILY RANKING W.R.T W.R.	303 1608 - 941 ING OF WNT laplace	2498 811 1843 Γ FAMILY W linear	2509 2168 1238 .R.T BCL10 rbf
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL9L BCL9L WNT9A - BCL9L BCL9L WNT9A - BCL9L BCL9L BCL9L WNT9A - BCL9L BCL9L WNT9A - BCL9L BCL9L WNT9A - BCL9L WNT9A	303 1608 - 941 ING OF WNT laplace	2498 811 1843 Γ FAMILY W	2509 2168 1238 .R.T BCL10
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL9L BCL9L WNT9A - BCL9L BCL10	303 1608 - 941 ING OF WN7 laplace 1951	2498 811 1843 FAMILY W linear 1101	2509 2168 1238 R.T BCL10 rbf 1599
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L WNT2B - 2321 69 2023 WNT2B - BCL10 WNT4 - 285 1170 465 WNT4 -	303 1608 - 941 ING OF WNT laplace	2498 811 1843 Γ FAMILY W linear	2509 2168 1238 .R.T BCL10 rbf
WNT2B - 2348 804 1558 WNT2B - BCL9L BCL9L BCL9L BCL9L BCL9L WNT4 - 1446 657 309 WNT4 - BCL9L WNT7B - 1539 253 1279 WNT7B - BCL9L BCL9L BCL9L WNT9A - 1923 677 688 WNT9A - BCL9L BCL10 WNT2B - 2321 69 2023 WNT2B - BCL10 WNT4 - 285 1170 465 BCL10 BCL10	303 1608 - 941 ING OF WN7 laplace 1951 2032	2498 811 1843 FAMILY W linear 1101 34	2509 2168 1238 R.T BCL10 rbf 1599 406
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One can also interpret the results of the Table 15 graphically, with the following influences -  $\bullet$  BCL family w.r.t WNTs with WNT4 -> BCL2L2; WNT7B -> BCL2L2; WNT9A -> BCL2L2; WNT9A -> BCL2L13; WNT7B -> BCL2L13; WNT7B -> BCL2L13; WNT7B -> BCL2L13; WNT7B -> BCL2L13; WNT9A -> BCL2L1; WNT9A -> BCL2L13; WNT9A -> BCL2L13; WNT9B -> BCL2L13; WNT9B -> BCL2L13; WNT9A -> BCL2L13; WNT9A -> BCL2L13; WNT4 -> BCL5; WNT9A -> BCL6; WNT9B -> BCL9L; WNT4 -> BCL9L.

**Table 15.** 2<sup>nd</sup> order combinatorial hypotheses between TP53 and WNT family members.

#### UNEXPLORED COMBINATORIAL HYPOTHESES

BCL w.r.t WNT family	
WNT-4/7B/9A	BCL2L2
WNT-4/7B	BCL2L13
WNT-2B	BCL10
WNT family w.r.t BCL	
WNT-7B	BCL2L1
WNT-7B/9A	BCL2L2
WNT-9A	BCL2L13
WNT-2B	BCL3
WNT-4/7B/9A	BCL6
WNT-2B/4	BCL9L

#### **Conclusions**

Presented here are a range of multiple synergistic WNT 2<sup>nd</sup> order combinations that were ranked via a search engine. Later, two way cross family analysis between components of these combinations were conducted. Via majority voting across the ranking methods, it was possible to find plausible unexplored synergistic combinations that might be prevalent in CRC cells after treatment with ETC-1922159 drug. The two-way cross family analysis also assists in deriving influences between components which serve as hypotheses for further tests. If found true, it paves way for biologists/oncologists to further investigate and understand the mechanism behind the synergy through wet experiments.

#### **Conflict of Interest**

There are no conflicts to declare.

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

Concept, design, in silico implementation - SS. Analysis and interpretation of results - SS. Manuscript writing - SS. Manuscript revision - SS. Approval of manuscript - SS

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# Source of Data

Data used in this research work was released in a publication in [51]. The ETC-1922159 was released in Singapore in July 2015 under the flagship of the Agency for Science, Technology and Research (A\*STAR) and Duke-National University of Singapore Graduate Medical School (Duke-NUS).

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