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Molecular network analyses implicate death-associated protein kinase 3 (DAPK3) as a key factor in colitis-associated dysplasia progression

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Funding Disclosure: This work was supported by a research grant from the Canadian Institutes of Health Research (MOP#97931 to J.A.M.). H.-M.C. was recipient of CIHR Fredrick Banting and Charles Best Canada and Alberta Graduate Excellence Scholarships.

Authors' Financial Disclosure and Conflicts of Interest: J.A.M. is cofounder and has an equity position in Arch Biopartners Inc. All other authors declare no conflicts of interest.

Summary: Our investigation verified pancolitis as a conduit for UC advancement from left-sided colitis to dysplasia and uniquely identified dysregulation of actin reorganization with DAPK3 and YAP as key molecular determinants for disease progression.

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4 **ABSTRACT**
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6 *Background* Ulcerative colitis (UC) is a progressive disorder that elevates the risk of colon cancer
7 development through a colitis-dysplasia-carcinoma sequence. Gene expression profiling of colitis-
8 associated lesions obtained from patients with varied extent of UC can be mined to define
9 molecular panels associated with colon cancer development. *Methods* Differential gene expression
10 (DEGs) profiles of three UC clinical subtypes and healthy controls were developed for the
11 GSE47908 microarray dataset of healthy controls, left-sided colitis, pancolitis, and colitis-
12 associated dysplasia (CAD) using limma R. *Results* Gene ontology (GO) enrichment analysis of
13 DEGs revealed a shift in transcriptome landscape as UC progressed from left-sided colitis to
14 pancolitis to CAD, from being immune-centric to being cytoskeleton-dependent. Hippo signaling
15 (via Yes-associated protein, YAP) and Ephrin receptor signaling were the top canonical pathways
16 progressively altered in concert with the pathogenic progression of UC. Molecular interaction
17 network analysis of DEGs in left-sided colitis, pancolitis, and CAD revealed one pairwise line or
18 *edge* that was topologically important to the network structure. This edge was found to be highly
19 enriched in actin-based processes, and death-associated protein kinase 3 (DAPK3) was a critical
20 member and sole protein kinase member of this network. DAPK3 is a regulator of actin-
21 cytoskeleton reorganization that controls proliferation and apoptosis. Differential correlation
22 analyses revealed a negative correlation for *DAPK3-YAP* in healthy controls which flipped to
23 positive in left-sided colitis. With UC progression to CAD, the *DAPK3-YAP* correlation grew
24 progressively more positive. *Conclusion* In summary, DAPK3 was identified as a candidate gene
25 involved in UC progression to dysplasia.
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32 **KEY WORDS**
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34 death-associated protein kinase, zipper-interacting protein kinase, differential-gene expression,
35 ulcerative colitis, dysplasia, colon cancer
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38 **KEY MESSAGES**
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- 41 • Ulcerative colitis (UC) patients have greater risk of developing colitis-associated colorectal
42 cancer (CAC) with the evolutionary trajectory of disease initiated early in the colitis-
43 dysplasia-carcinoma sequence.
 - 44 • The dysregulation of actin reorganization, with DAPK3 and YAP involvement, was
45 uniquely identified as a determinant for the progression of UC from non-dysplastic to
46 dysplastic UC.
 - 47 • Relevant gene expression changes occur before histological evidence of dysplasia/carcinoma,
48 so the results could be exploited for the development of biomarkers that identify the risk of
49 dysplasia progression for UC patients.
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1. INTRODUCTION

Ulcerative colitis (UC) is a chronic, inflammatory bowel disease (IBD) that is confined to the mucosal layer of the large bowel, most commonly the rectum, and may extend proximally in a continuous fashion ¹. This is a heterogeneous and progressive disorder that has seen a substantial increase in global prevalence. The current framework of UC pathogenesis comprises environmental, genetic, immune, and microbiome factors that culminate at the perturbation of the mucosal barrier and prolonged mucosal inflammatory response ². Consequently, UC is a clinically-, molecularly-, and genetically- heterogeneous disease that fosters varied disease course and mixed response to therapy ³. The genetic heterogeneity is highlighted in the analysis of 75,000 IBD cases and controls by Jostins and colleagues that identified 23 UC-specific risk loci with primary involvement in the regulation of epithelial barrier function and immune pathways ⁴. Genetic studies such as this promote the concept that UC disease susceptibility is a compilation of small effects/gene-alterations that is not shared by all patients.

UC patients are at greater risk of developing colitis-associated colorectal cancer (CAC) through an acceleration of the colitis-dysplasia-carcinoma sequence of cellular transformation ⁵⁻⁷. Although the probability of developing CAC appears to have declined, likely due to advancements in medical therapies and/or optimizations in endoscopic surveillance, CAC remains a dire consequence of long-standing UC ^{5, 8}. While frequent surveillance can reduce CAC incidence and mortality in patients with IBD ⁹, surveillance of IBD patient cohorts is challenged by concomitant inflammation, scarring, and flat dysplasia with indistinct margins ¹⁰. The burden of colonoscopy surveillance may be eased with the discovery of biomarkers that can be routinely used to identify patients at high risk of developing dysplasia or CAC.

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4 Mutational signature analysis of tissue and blood samples from CAC patients showed that
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6 the evolutionary trajectory of disease is initiated early in the colitis-dysplasia-carcinoma sequence
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9 ¹¹. Furthermore, the extent of colitis has been recognized as an independent and most significant
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11 risk factor for CAC ¹². In support of this, Bjerrum and colleagues provided transcriptional profiles
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13 of colonic mucosa from patients with varying extent of UC ¹³. A gene expression dataset
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15 (GSE47908) was generated from mucosal biopsies sampled from the left colon of patients with
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17 left-sided colitis, pancolitis, or colitis-associated dysplasia (CAD) plus healthy controls. The
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19 authors identified differential transcriptional profiles aligned with UC extent (i.e., areas of
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21 involvement) that were not inferred by potential covariates in the clinical data (i.e., age, years with
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23 disease, Mayo score, and medication). Their findings suggest that gene expression profiles of
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25 colitis-associated lesions obtained from patients with varied extent of UC can be mined to support
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27 the development of molecular panels that identify patients at high risk of developing CAD or CAC
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29 ¹³. However, additional network analyses and detailed mechanistic interrogation of specific
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31 molecular participants were not completed.

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38 Elucidation of the mechanisms of colon carcinogenesis requires further investigation, and
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40 insight into the molecular events underpinning the progression of UC to colitis-associated colon
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42 cancer may be gained from the study of non-dysplastic colonic mucosa ^{11, 13}. The transcriptional
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44 dataset generated by Bjerrum and colleagues ¹³ provides an excellent resource to perform such an
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46 analysis. In this study, we performed differential expression analysis, pathway and network
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48 analyses, as well as differential correlation analysis on the GSE47908 dataset to determine how
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50 the extent of colitis impacts upon biological functions and regulatory pathways and to identify the
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52 key molecular factors that bridge the colitis-dysplasia progression. The results provide insight into
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54 the molecular events associated with colitis-dysplasia progression, which could be exploited for
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4 the development of biomarkers in non-dysplastic mucosa that identify the risk of dysplasia for UC
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10 11 **2. MATERIALS and METHODS** 12 13

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15 *2.1. Data Processing* - Data processing was completed using the R (v4.0.2) programming
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17 language, and all codes used in this study align with recommendations made by authors of R
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19 packages in their respective user's guide, which can be accessed at <https://bioconductor.org>.
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23 *2.2. Differential Gene Expression Analysis* - Log transformed microarray expression data for
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25 GSE47908 and microarray platform data for GPL570 (HG-U133_Plus_2; Affymetrix Human
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27 Genome U133 Plus 2.0 Array) were retrieved from the GEO database available at
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29 <https://www.ncbi.nlm.nih.gov/geo/> with the R package GEOquery. The limma R workflow¹⁵ was
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31 used to detect differentially expressed transcripts between the UC clinical subtypes [left-sided
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33 colitis (n=20), pancolitis (n=19), colitis-associated dysplasia, CAD (n=6)], and healthy control
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35 (HC) samples (n=15). Specifically, the function `|lmFit|` was used to generate a linear model fit to
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37 the data matrix containing log expression values for GSE47908. Next, function `|contrasts.fit|` was
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39 used to compute estimated coefficients and standard error for a given set of contrasts (e.g.,
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41 pancolitis vs. HC). Finally, function `|eBayes|` was used to compute log-odds of differential
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43 expression by empirical Bayes moderation of the standard errors towards a global value. All
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45 functions were operated with default settings.
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53 Log-fold changes calculated by function `|eBayes|` for 54,675 transcripts, along with their
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55 false discovery ratio (FDR) and p-values, were uploaded to the Ingenuity Pathway Analysis (IPA)
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57 software. Some Affymetrix transcript identifiers remain unmapped by IPA; these genes were
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59 eliminated from the study, leaving 45,480 transcripts to be mapped. Due to redundancy of the
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4 GeneChip HG-U133 Plus 2.0 Array, this transcript pool included duplicate genes. To resolve
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GeneChip HG-U133 Plus 2.0 Array, this transcript pool included duplicate genes. To resolve
duplicates, IPA Core Analyses were performed on the mapped transcripts, and transcript identifiers
were consolidated using their \log_2FC measurement, by which, representative transcript was
selected based on maximum absolute \log_2FC . This returned 21,475 ‘analysis-ready’ genes. To
distinguish the differentially expressed genes (DEGs), the combined application of a stringent FDR
threshold ($q < 0.001$) and a moderate fold change threshold $|\log_2FC| > 0.75$) was used. This reduced
the number of false positives while maintaining the ‘ideal’ dataset size (200-3,000 genes) for
subsequent IPA Core Analysis of gene expression data. Differential expression was then visualized
via the EnhancedVolcano R package.

2.3. *Functional Analysis of DEGs in UC disease subtypes* - To compare DEGs and illustrate
possible relationships between left-sided colitis, pancolitis, and CAD, a Venn diagram was first
used to visualize the overlap of DEGs found in the three UC clinical subtypes. The lists of
overlapping DEGs derived from the comparison of UC subtypes were then used as input data for
gene ontology (GO) enrichment analysis, performed with the topGO R package. topGO was
chosen owing to its ‘elim’ method that takes GO hierarchy into consideration when calculating
enrichment. For the enrichment analysis, the background consisted of all genes assessed by the
microarray platform GPL570, and annotation was completed with the R package org.Hs.eg.db;
GO terms with <10 annotations were excluded for interpretability. The degree of enrichment was
reported as the odds ratio (OR), where $I^A = \# \text{ DEGs annotated with the GO term}$, $I^B = \# \text{ background}$
 $\text{genes annotated with the GO term}$, and $OR = (I^A / \text{size of DEG list}) / (I^B / \text{size of background list})$.
Statistical significance was defined with a Fisher’s Exact Test.

2.4. *Ingenuity Pathway Analyses* - To analyze changes in biological states across the UC clinical
subtypes, three sets of IPA Core Analyses were performed, followed by IPA Comparison Analysis.

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4 The IPA Comparison Analysis allows for side-by-side comparison of multiple Core Analyses,
5 which facilitated the discovery of trends amongst the three datasets. Core Analyses were
6 performed on the three datasets (i.e., left-sided colitis vs. HC, pancolitis vs. HC, and CAD vs. HC)
7 to assess the canonical pathways, upstream regulators, molecular and cellular functions, and
8 molecular interaction networks that were most likely to be perturbed based on the changes in gene
9 expression. Within IPA, canonical pathways were built with reference to literature prior to DEG
10 input and did not undergo structural changes upon DEG input. Instead, IPA computes a z-score
11 that assesses the directionality within a gene set (i.e., the DEG input) to infer the activation state
12 of each canonical pathway or molecular and cellular function. Upstream regulators were identified
13 by the observed differential regulation of known downstream effector(s). The z-score determines
14 the activation state of an upstream regulator by the regulation direction associated with the
15 relationship from the upstream regulator to the effector(s). A negative z-score indicates inhibition,
16 and a positive z-score indicates activation. Significance was calculated with the right-tailed
17 Fisher's Exact Test. Changes in activation state across UC subtypes were assessed with
18 Comparison Analysis (sort method = trend + z-score). The correlation of activation state as the
19 extent of disease progressed from left-sided colitis to pancolitis to CAD (the trend) was examined,
20 and the findings were reported as trending towards activation or trending towards deactivation.

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46 *2.5. Mapping Molecular Interaction Networks* - DEGs from the three datasets were mapped to
47 their corresponding gene objects in the Ingenuity Knowledge Base (IKB), and those that interacted
48 with other molecules in the IKB were designated focus molecules. Focus molecules were then
49 assembled into networks by maximizing their interconnectedness with each other (relative to non-
50 focus molecules with which they are connected to in the IKB). While non-focus molecules from
51 the IKB may be used to merge smaller networks into a larger network, networks are scored based
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4 on the number of focus molecules they contain. Network size, the total number of focus molecules
5 analyzed, and the total number of molecules in the IKB that could be included in the networks also
6 contribute to the network scores. The score is a test of significance using hypergeometric
7 distribution and is calculated with the right-tailed Fisher's Exact Test (Score = $-\log$ (Fisher's p-
8 value; score ≥ 2 equals $p \leq 0.01$). For this study, networks were limited to 70 molecules each, and
9 a maximum of 25 networks per UC-subtype were constructed. Individual networks (child
10 networks, count = 75) were overlapped with one another to create a single parent network by virtue
11 of common network molecules between child pairings; this was done with the R Venn R package.
12 Finally, the edge betweenness parameter for the core network was computed via the
13 NetworkAnalyzer app, included in Cytoscape v3.8.0.

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29 *2.6. Differential Correlations* - A ggplot2-based R package, ggpubr (<https://rpkgs.datanovia.com/ggpubr/>),
30 was used to investigate the relationship between the expression profiles of two genes. A
31 Shapiro-Wilk normality test was conducted to refine probe-set redundancies for *YAP* and *DAPK3*
32 probe-sets prior to completing the parametric correlation analyses (**Supplemental Figure S1**).
33 Specifically, function `|stat_cor|` was used to calculate the Pearson correlation coefficient. The size
34 of the concentration ellipse in normal probability was left at the default 0.95, which translates to a
35 95% confidence interval.

3. RESULTS

3.1. Analysis of Genes Differentially Expressed in UC Disease Subtypes.

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The distribution of gene expression ratios (log-transformed) calculated between UC subtypes and healthy controls (HC) is presented in **Figure 1A**. For the left-sided colitis vs. HC comparison, 1,016 genes had \log_2FC greater than 0.75 ($q < 0.001$); of these DEGs, 614 were

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4 upregulated, and 402 were downregulated. Pancolitis returned 2,858 DEGs, half of which were
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6 upregulated. Colitis-associated dysplasia (CAD) returned 1,842 DEGs; 393 were upregulated, and
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8 1,449 were downregulated.
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11 For functional predictions, a Venn diagram was first used to identify genes with expression
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13 regulation observed in multiple UC disease subtypes (**Supplemental Table A1**). As presented in
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15 **Figure 1B**, pancolitis overlapped both left-sided colitis and CAD in terms of common DEGs. Of
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17 the 2,858 pancolitis DEGs, 651 shared similar expression regulation as left-sided colitis DEGs
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19 (465 common upregulation plus 159 common downregulation), and 1,194 shared similar
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21 expression regulations as CAD DEGs (209 common upregulation plus 985 common
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23 downregulation). This feature was not observed when comparing left-sided colitis and CAD; less
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25 than 2% of the input DEGs appeared at the intersection of left-sided colitis \cap pancolitis \cap CAD.
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27 This analysis suggests pancolitis exists as the middle ground of UC subtypes that bridges the
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29 progression of UC from left-sided colitis to CAD. Thus, the DEGs located at the intersection of
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31 pancolitis \cap left-sided colitis or pancolitis \cap CAD were selected for functional analysis.
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39 To identify the potential biological processes associated with UC clinical progression, two
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41 sets of DEGs at the intersection of 1) pancolitis \cap left-sided colitis, or 2) pancolitis \cap CAD were
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43 processed separately with the topGO R package for functional enrichment analysis. These
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45 enrichment analyses included both up-regulated and down-regulated genes. The top 10 terms from
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47 the ‘Biological Process’ (BP) category of the GO enrichment analysis are presented in **Figure 2**.
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49 The DEGs at the intersection of pancolitis and left-sided colitis were enriched in inflammatory
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51 processes (**Supplemental Table A2**) while the pancolitis \cap CAD overlapping DEGs were
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53 enriched in actin-based processes (**Supplemental Table A3**). Specifically, the pancolitis \cap left-
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55 sided colitis DEGs showed significant enrichment for the regulation of IFN- γ mediated signaling
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4 pathways (GO:0060334), the antimicrobial humoral immune response mediated by antimicrobial
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6 peptide (GO:0061844), and the acute-phase response (GO:0006953) with 8.6-, 6.4-, and 6.0-fold
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8 enrichments, respectively. Across the pancolitis \cap CAD DEGs, microvillus assembly
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10 (GO:0030033), Golgi to plasma membrane transport (GO:0006893), and actin cytoskeleton
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12 reorganization (GO:0031532) were found significantly over-represented with 6.3-, 3.1-, and 3.0-
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14 fold enrichments, respectively. Overall, the GO enrichment analysis suggests that as UC
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16 progressed from left-sided colitis to pancolitis to CAD, the transcriptome pattern also shifted from
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18 being immune-centric to having cytoskeleton-dependence. Presumably, the regulation of actin
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20 cytoskeleton organization plays an important role in colitis-dysplasia progression.
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28 *3.2. Association of Hippo Signaling Activation with Colitis-Dysplasia Progression.*

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32 To identify canonical pathways that are most relevant to the observed shift in gene
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34 expression profile, a comparison analysis heat map for canonical pathways significantly altered by
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36 UC disease subtypes was constructed (**Figure 3A**). This heatmap displays the trend of either
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38 activation or deactivation as the gene expression profile shifted in response to UC extent, that is,
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40 from left-sided colitis to pancolitis to CAD. The heatmap revealed Hippo signaling and Ephrin
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42 receptor signaling as the top canonical pathways that were progressively altered in concert with
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44 the pathogenic progression of UC. The Hippo signaling pathway displayed incremental activation,
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46 while the Ephrin receptor signaling pathway exhibited gradual deactivation as the UC extent
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48 broadened (**Figure 3A**). Diagrammatic comparison of Hippo and Ephrin receptor analyses
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50 conducted on UC-subtype DEGs are provided in **Supplemental Figure S2 and S3**, respectively.
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56 Trends of activation or deactivation were also probed on upstream regulators and biological
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58 functions to obtain a basic view of the molecular mechanisms underlying the extent of colitis
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4 **(Figure 3B)**. In terms of upstream regulators, IL10RA exhibited a trend of increased activity
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6 whereas interferon (IFN)- γ exhibited a trend of decreased activity. Affected biological functions
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8 include apoptosis and cell movement, that underwent gradual activation and deactivation,
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10 respectively, as disease extended from left-sided colitis to pancolitis to CAD.
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16 *3.3. Actin Reorganization as a Potential Key Determinant for Colitis Progression.*

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20 Using the limma R-derived DEGs, the IPA software generated 25 networks for each of the
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22 three UC subtypes. Molecular network intersections, assembled with the R Venn R package,
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24 revealed a single parent network that connected all 75 child networks via 757 intersections/edges
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26 **(Figure 4A)**. Among the 75 child networks, approximately two-third (48/75) were composed of
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28 less than 60 focus molecules (<85% focus molecules). The 757 intersections/edges that connected
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30 the child networks each comprise one to 24 common molecule overlaps. Nevertheless, over half
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32 (57%) of the interactions/edges were enabled by just one common molecule, and 87% of the edges
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34 involved less than four common molecules (<5% overlap). To reduce noise from the parent
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36 network depicted in **Figure 4A**, molecular network intersection was compiled once more, but with
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38 child networks that were built upon 60 or more focus molecules (>85% focus molecules) and
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40 preserving connections that were maintained by four or more common molecules (>5% overlap).
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42 This produced one core network of networks that connected 21 child networks with 21 edges; One
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44 intersection segment, though strongly connecting pancolitis network 6 to CAD network 10 with
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46 24 common molecules (34% overlap), stood apart from the core network of networks **(Figure 4B)**,
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48 so was excluded from subsequent analysis.
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57 To pinpoint a network pairing that could be used to discern pathways or molecular processes
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59 bridging pancolitis to CAD, the ‘count of overlapping molecules’ and ‘value of edge betweenness’
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4 measures were utilized for edge evaluation. Edge betweenness reflects the amount of control that
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6 an edge exerts over the interactions of other child networks in the parent network. The edge
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8 betweenness of $e=(v,w)$ is defined as the number of shortest paths between two nodes that go
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10 through e divided by the total number of shortest paths that go from the two nodes ^{16, 17}. Edge
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12 betweenness does not consider the number of overlapping molecules that contribute to the intrinsic
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14 strength of each edge. Thus, additional consideration for this attribute was completed *post hoc*. As
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16 shown in **Figure 4B**, the edge connecting pancolitis network 15 to CAD network 1 stood out from
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18 the remaining network associations by virtue of its large number of overlapping molecules (20%
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20 overlap) and high value of edge betweenness (**Supplemental Table A4**). Taken together, the
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22 findings suggest that the removal of this edge may affect interactions between the remaining
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24 networks within network. Thus, the overlap between pancolitis network 15 and CAD network 1
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26 was selected for further detailed examination.
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34 The intersection pancolitis 15 \cap CAD 1 was formed by 14 gene products, which, when
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36 analyzed for GO term enrichment, was predominantly composed of actin-based processes (**Figure**
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38 **5A**). Specifically, the DEGs at this intersection showed significant enrichment for the ruffle
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40 organization (GO:0031529), the regulation of actin filament polymerization (GO:0030833), and
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42 the myofibril assembly (GO:0030239) with 66-, 33-, and 33- fold enrichments, respectively.
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44 However, within the confines of the IKB, none of the 13 focus molecules were directly linked to
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46 UC (**Figure 5B**). All probable shortest paths by which the focus molecules were connected to UC
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48 required at least one IPA-derived intermediate node. For the majority of indirect connections, gene
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50 products CTNNB1 (β -catenin), CDH1 (E-Cadherin), and TNF (Tumor Necrosis Factor)
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52 functioned as the IPA-derived intermediates.
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4 *3.4. Implication of DAPK3 as a Key Factor in the Colitis-Dysplasia Progression.*
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7 Further dissection of pancolitis 15 and CAD 1 revealed two signal transduction gene
8 products that reside in the overlap of these two networks (**Table 1**). Namely, death-associated
9 protein kinase 3 (DAPK3) as the sole protein kinase, and protein phosphatase PP1 β catalytic
10 subunit (PPP1CB) as the sole protein phosphatase. The remaining 12 gene products were
11 categorized as either mechanochemical enzymes (i.e., motors) or scaffolding proteins involving
12 the cytoskeleton. Both DAPK3 and PPP1CB were downregulated in pancolitis (log₂FC: -1.08,
13 DAPK3; -1.56, PPP1CB) and CAD (log₂FC: -0.98, DAPK3; -1.52, PPP1CB) but showed no
14 deregulation in left-sided colitis. Presumably, DAPK3 and PPP1CB act as key factors regulating
15 the altered molecular pathways that bridge pancolitis to CAD.
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31 *3.5. Differential Correlation of DAPK3-YAP with UC Disease Progression.*
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34 Given the association of Hippo signaling activation with UC extent (**Figure 3A**), and the
35 implication of *DAPK3* and *PPP1CB* as key factors in colitis-dysplasia progression (**Figure 5**),
36 differential correlation analyses for the pairings *DAPK3-YAP* and *PPP1CB-YAP* were conducted
37 to assess potential differences in gene-gene regulatory relationships among the UC disease
38 subtypes. The GSE47908 dataset was generated using three probe sets for *DAPK3* (**Supplemental**
39 **Figure S1A**), three probe sets for *YAP* (**Supplemental Figure S1B**) and four probe sets for
40 *PPP1CB* (**Supplemental Figure S1C**). Resolution of probe set redundancy with the IPA software
41 returned one representative probe set each for *DAPK3* (203890_s_at) and *PPP1CB* (228222_at);
42 however, two representative probe sets (213342_at and 224894_at) were resolved for *YAP*. To
43 identify the *YAP* probe set that best satisfied the assumption of a Pearson correlation, namely, that
44 the expression values represented by the probe sets are normally distributed, the Shapiro-Wilk test
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4 was performed separately for each probe set. Expression values represented by two of the three
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6 *YAP* probe sets (213342_at and 224894_at) conformed to a normal distribution (i.e., $p > 0.05$ across
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8 all conditions). Additionally, expression values represented by probe set 2133342_at returned
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10 higher mean W-value (0.948 vs. 0.940 for 213342_at and 224894_at, respectively). As such,
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12 expression values represented by probe set 213342_at was utilized for subsequent Pearson
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14 correlation analysis. The Shapiro-Wilk test was also performed for the *DAPK3* and *PPP1CB* probe
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16 sets. While the representative *DAPK3* probe set selected by IPA (203890_s_at) passed the test of
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18 normality (**Supplemental Figure S1A**), the representative probe set selected by IPA for *PPP1CB*
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20 (228222_at) did not (i.e., with $p < 0.05$ for left-sided colitis, the null hypothesis of normality was
21
22 rejected; **Supplemental Figure S1C**). Because the *PPP1CB* expression values did not display a
23
24 normal distribution, the Pearson's correlation test could not be used for population inferences.
25
26 However, a relationship between the expression of *PPP1CB* and *YAP* for this sample set could still
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28 be inferred. As such, for the sake of continuity, expression values derived from probe set
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30 228222_at were used to study whether there was some association between the expression of
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32 *PPP1CB* and *YAP* and to estimate the strength of this relationship.

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41 As shown in **Figure 6A**, the *DAPK3-YAP* correlation in healthy controls was negative but
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43 flipped to positive in left-sided colitis. Moreover, as the UC disease extent progressed from left-
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45 sided colitis to pancolitis and then on to CAD, the *DAPK3-YAP* correlation grew progressively
46
47 more positive. The general direction of differential correlation for the *PPP1CB-YAP* pairing
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49 mirrors that of the *DAPK3-YAP* pairing (**Figure 6B**). However, the differential correlation with
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51 UC disease extent was less apparent for the *PPP1CB-YAP* pairing. This result suggests that
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53 changes in the potential regulatory relationship between *DAPK3* and *YAP*, conditioned on UC
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55 disease extent, may contribute to disease progression.
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4. DISCUSSION

In UC, prolonged disease duration and extensive intestinal involvement (i.e., pancolitis) are associated with an increased risk for colorectal cancer¹². The progression of carcinogenesis in UC is thought to be driven by chronic inflammation and proceeds in a stepwise manner through a colitis-dysplasia-carcinoma sequence^{5, 6}. As the area affected by UC grows so too does the inflammatory load which could in turn accelerate dysplasia and CAC tumorigenesis¹⁸. While the impact that inflammation can have on colon carcinogenesis should not be discounted, evidence also suggests that non-inflammatory factors play a role in mediating the colitis-dysplasia-carcinoma progression^{7, 18, 19}. Among patients or animals with similar inflammatory status, some develop CAC while others do not⁷. Additionally, whole-exome sequence analysis of IBD-associated colorectal cancer showed that, apart from rare cases of mutations in DNA proofreading or repair pathways, supra-IBD inflammation alone does not compel greater mutation rates when compared with sporadic CRC of non-inflammatory origin¹⁹. This also supports a role for non-inflammatory factors in mediating colitis-dysplasia-carcinoma progression. As an example, azoxymethane (AOM)-treated *IL10*^{-/-} mice infected with colitogenic *E. coli* NC101 or *E. faecalis* OG1RF exhibited a similar degree of colitis and comparable levels of immune infiltrate; tumors were only observed in 10% of *E. faecalis*-infected mice whereas 80% of *E. coli*-infected mice showed tumor development. The polyketide synthase (*pks*) genotoxic island, found in *E. coli* NC101 but not *E. faecalis* OG1RF, was linked to the DNA damage and subsequent tumorigenesis in the *E. coli* infected mice²⁰. Moreover, gene mutation and gene expression analyses have linked cytoskeleton remodeling to colitis-dysplasia-carcinoma progression^{19, 21, 22}. Our investigation verified pancolitis as a conduit for UC advancement from left-sided colitis to CAD and confirmed

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4 dysregulation of actin reorganization as a key determinant for the progression of UC from non-
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7 dysplastic to dysplastic UC.
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10 Bjerrum *et al.* previously defined distinct gene expression signatures for dysplasia versus
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12 pancolitis, dysplasia versus left-sided UC, and pancolitis versus left-sided UC in the GSE47908
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14 dataset ¹³. These expression signatures manifested GO terms for left-sided UC (i.e., *protein*
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16 *metabolic process* and *cell cycle process*) that distinguished the early disease stage from pancolitis
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18 and dysplasia (i.e., *protein export from nucleus* and *response to insulin stimulus*). Our output of
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20 GO enrichment terms identifies the dysregulation of inflammatory processes to exist at the
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22 intersection of pancolitis and left-sided UC. These terms would be excluded from the original
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24 Bjerrum analysis since statistical filtering was employed to eliminate DEGs that were solely
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26 reflective of inflammation. In addition, our inquiry also uniquely revealed that the intersection of
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28 pancolitis with CAD was rooted in the dysregulation of actin-based processes (i.e., *actin*
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30 *cytoskeleton reorganization* and *microvillus assembly*). Bjerrum *et al.* further extracted a panel of
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32 transcripts for therapeutic importance based on their known involvement in inflammatory and
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34 neoplastic processes; MAPK-interacting serine/threonine protein kinase 2 (*MKNK2*) and insulin
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36 receptor alpha (*INSRA*) were authenticated as potential critical transcripts for inflammation-driven
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38 tumorigenesis. Laminin γ 2 (*LAMC2*) was also highlighted as a biomarker of preneoplastic lesions
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40 in UC that still awaits validation. In our analyses, these DEGs also exist solely within specific
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42 disease types (**Supplemental Table A1**); their absence from the DEG networks that bridge
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44 between pancolitis and CAD suggest that distinct signaling mechanisms are responsible for the
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46 progression and the maintenance of disease states.
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57 Subsequent to the Bjerrum *et al.* study, the GSE47908 dataset was also used by investigators
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59 to interrogate key genes and/or biological processes in the context of UC progression. Most
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4 commonly, GSE47908 was combined with other datasets from the Gene Expression Omnibus
5 (GEO) to conduct differential expression comparison of UC versus normal samples. As an
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7 example, Kaiko and colleagues included GSE47908 as part of their multi-institute retrospective
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9 cohort study which identified plasminogen activator inhibitor-1 as a link between the epithelium
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11 and inflammation ¹⁴. Unfortunately, when these studies consolidated GSE47908 with other GEO
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13 datasets, the key strength of GSE47908 was inadvertently lost. That is, the extent of disease, which
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15 may affect transcriptional profiles, was no longer accounted for.
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21 The prominent positioning of actin-based processes within the network intersection of
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23 pancolitis and CAD (**Figure 5**) substantiates results of a gene expression analysis of patients with
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25 CAC presented by Kanaan and colleagues, that established actin cytoskeleton organization as the
26
27 most significantly disrupted process in UC progression ²¹. Protein abundance analysis of UC
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29 progressors (UC patients with CAD or CAC) versus non-progressors has also identified
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31 enrichment of dysregulated cytoskeletal proteins in UC progressors ²³. Drawbacks in these two
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33 studies include the evaluation of UC progression in a binary fashion (presence or absence of CAD
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35 and/or CAC) as well as the small sample sizes (i.e., three unique patients in the study conducted
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37 by Kanaan and colleagues ²¹, and 15 unique patients in the study conducted by May and colleagues
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39 ²³). To provide insight into the molecular events associated with the stepwise progression of UC,
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41 it will be necessary to demonstrate that the dysregulations observed in CAD or CAC were issued
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43 forth from some form of non-dysplastic UC.
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51 Signal transduction pathways regulate many cellular functions that were found altered in UC
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53 carcinogenesis, such as proliferation, growth, differentiation, metabolism, and survival. Molecular
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55 investigations have previously associated STAT3, Wnt, TGF- β , and TLR4/NF κ B signaling with
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57 the pathogenesis of colon carcinogenesis ²⁴⁻²⁶. However, the pathways most relevant to the gene
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4 expression changes observed during the early progression of UC, before any histological evidence
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6 of dysplasia/carcinoma, remain unknown. In this regard, Hippo signaling and Ephrin receptor
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8 signaling were uncovered as the top canonical pathways that were progressively altered in concert
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10 with the extent of UC progression (**Figure 3A**). The Hippo pathway is a fundamental signaling
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12 cascade that negatively regulates the activity of YAP/TAZ to coordinate cell proliferation,
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14 apoptosis, and cell movement; as such, it is essential for tissue homeostasis, repair, and
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16 regeneration ²⁷. Importantly, YAP/TAZ-mediated cell proliferation in epithelial monolayers is
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18 controlled by a cytoskeletal checkpoint, which in turn, is monitored by actin-processing factors.
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20 The Ephrin pathway also controls intestinal homeostasis through cell proliferation and cell
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22 movement additionally to cell attachment and repulsion ^{28, 29}. However, deciphering functional
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24 outcomes by Ephrin pathway activation is circuitous due to the redundancy and idiosyncrasy of
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26 this pathway ³⁰. The Ephrin receptors (Eph) comprise the largest family of receptor tyrosine
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28 kinases (RTK). But, unlike most RTKs for which ligands are generally soluble, the cognate ligands
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30 of Eph receptors, the ephrins, are also membrane bound. This aspect of the Eph-ephrin receptor-
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32 ligand pairing consequently induces bidirectional signaling, where signaling through Eph is termed
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34 forward signaling and through ephrin is termed reverse signaling. Furthermore, there is a plethora
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36 of Ephs and ephrins (i.e., 14 Ephs, 8 ephrins) with promiscuous pairing options. Eph/ephrin also
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38 exhibits *cis* interactions to inhibit forwarding signaling. Ephrin is therefore a more convoluted
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40 pathway to render (**Supplemental Figure S3**), relative to the Hippo pathway (**Supplemental**
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42 **Figure S2**).

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45 The Hippo pathway was previously identified as a key factor for the compensatory
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47 regeneration of IECs in response to tissue injury using a colitis mouse model ³¹. The recent
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49 emergence of YAP as a potential regulator of intestinal diseases involves elements beyond the
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4 canonical Hippo pathway. For one, YAP can be sequestered at adherens junctions (AJs) via
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6 interactions with α -catenin ³², the abundance of which is significantly altered in active UC ³³.
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8 Secondly, nuclear translocation of YAP may be brought about via stimulation of gp130-associated
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10 Src family kinase Yes ³⁴. Finally, YAP was found to be a crucial pivot point of cellular
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12 reprogramming during intestinal epithelial repair, coupling epithelial restitution to the proliferative
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14 phase of regeneration by way of FAK-Src signaling ³⁵. In view of YAP as a mechanosensor and
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16 mechanotransducer amidst epithelial regeneration of injured tissue, a comprehensive understanding
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18 of the interplay between YAP and the actin cytoskeleton is needed to make rational selections of
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20 therapeutic targets for patients at high risk of UC neoplastic progression.
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27 The identification of DAPK3 as a potential key factor in UC progression is particularly
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29 interesting. DAPK3 was shown to influence the proliferation of colon cancer cells ³⁶; however, a
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31 role for DAPK3 in UC pathogenesis (i.e., within the context of colitis or colitis-associated
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33 dysplasia-carcinoma) was unknown prior to this study. DAPK1, the closely related family member
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35 and upstream regulator of DAPK3, was previously associated with UC severity ³⁷ and
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37 gastrointestinal cancer pathogenesis ³⁸. In addition, pharmacological inhibition of DAPK1 was
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39 reported to augment susceptibility to DSS-induced colitis in mice, with concomitant increase in
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41 bacterial translocation ascribed to epithelial barrier defects ³⁹. It is regrettable that the small
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43 molecule inhibitor of DAPK1 (i.e., DAPK6) applied in the study of tunicamycin (TM)-induced,
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45 ER-stress-dependent reduction of bacterial translocation, potentially cross-inhibits DAPK3
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47 (IC₅₀=225 nM ⁴⁰) and Rho-associated coil-coiled kinase (ROCK, K_i=132 nM ⁴¹). Although the
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49 Lopes study included siRNA knockdown experiments to independently validate DAPK1 signaling
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51 involvement, the potential impact of concurrent DAPK3 and ROCK inhibition brought forth with
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53 the DAPK6 inhibitor was not examined. Previously, Ito and colleagues showed that ROCK activity
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4 increased in response to TM, and that treatment with Y27632 (a selective ROCK inhibitor)
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6 completely reversed TM-induced ER-stress responses in the J774 macrophage cell line ⁴².
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8 Moreover, the involvement of DAPK3 in ER-stress response was also demonstrated in human
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10 aortic vascular smooth muscle cells, where shRNA-mediated silencing of *DAPK3* ablated the
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12 calcifying-media induced increase of CCAAT-enhancer-binding protein homologous protein
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14 (CHOP), a multifunctional transcription factor in ER-stress response ⁴³. In the same study,
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16 treatment with DAPK6 attenuated vascular calcification in rats, alongside a significant reduction
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18 in CHOP protein abundance in the aorta. It may be beneficial to learn whether DAPK3 and/or
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20 ROCK alter ER-stress-dependent autophagy in the context of DSS-induced colitis in mice.
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27 Some limitations in the present study are apparent. First, the progression of UC to CAD
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29 occurs through multiple mechanisms involving various cell types. The analyses were completed
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31 on transcriptional profiles generated from mucosal biopsies, and genes may demonstrate diverse
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33 functions across different cell types. Hence, the gene sets identified from the averaged tissue
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35 dataset will require re-examination in a cell type-specific way (e.g., single cell RNA-Seq) to
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37 precisely identify the susceptible cell types and convergent pathways among different cells.
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39 Second, we were unable to identify additional publicly available datasets that specifically assessed
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41 gene expression in inflamed (involved) colon tissues of UC patients with adequate control for the
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43 relationship between colonic biopsy location and gene expression. Five data series (i.e., GSE37283
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45 ⁴⁴, GSE38713 ⁴⁵, GSE48634 ⁴⁶, GSE105074 ⁴⁷, and GSE87466 ⁴⁸) were considered as potential
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47 verification and comparison cohorts since these possess gene expression data for colonic biopsies
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49 obtained from healthy controls and UC patients grouped by disease extension (i.e., left-sided colitis
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51 vs. pancolitis). Unfortunately, GSE48634, GSE105074 and GSE87466 were eliminated as
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53 appropriate verification datasets due to critical differences in the location and inflammatory status
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4 of biopsies. In these cases, the biopsy location was associated with greater variation than disease
5 extent (**Supplemental Figure S4**). However, *DAPK3* expression in the GSE38713 data series was
6 significantly downregulated in left-sided colitis (log-FC=-1.42, FDR=0.006; remission involved
7 biopsies) as well as in pancolitis (log-FC=-1.74, FDR=0.04; remission involved biopsies).
8
9 Differential correlation analysis of *DAPK3-YAP* expression across the active involved groupings
10 showed loss of relationship between *DAPK3* and *YAP* as disease transitioned from normal to left-
11 sided active involved, and then to pancolitis active involved (**Supplemental Figure S5**). In
12 addition, a negative correlation for *DAPK3-YAP* was corroborated in healthy controls of the
13 GSE37283 dataset ⁴⁴. The relationship flipped to positive in UC patients harboring a remote
14 neoplastic lesion (**Supplemental Figure S6**), confirming the *DAPK3-YAP* relationships identified
15 in the Bjerrum data series (**Figure 6A**). Finally, the results of this study represent a data mining
16 activity, so additional well-designed investigations will be required for validation of findings.
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18 Despite these drawbacks, independent confirmations and similarities among verification cohorts
19 provide a high level of confidence in the overall significance of *DAPK3* and *YAP* in UC neoplastic
20 progression.

41 **5. CONCLUSION**

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44 The probability that *DAPK3* plays a role in the progression of the pathological changes of
45 UC is notable. To substantiate the connection of *DAPK3* to UC progression, the difference in
46 correlation between *DAPK3* and *YAP* was studied in all UC clinical subtypes plus healthy control
47 samples. Differential co-expression operates on the level of gene pairs and is used as an alternative
48 approach to identify disease-related genes ⁴⁹. Results from the differential co-expression analyses
49 demonstrate the correspondence of *DAPK3-YAP* correlation with UC extent. This suggests that
50 changes in the potential regulatory relationship between *DAPK3* and *YAP*, conditioned on UC
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4 extent, may contribute to UC progression. Still, the driver(s) behind the differential *DAPK3–YAP*
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6 co-expression pattern is unclear. Better understanding of the relationship between YAP and
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8 DAPK3 may enable the discovery of targeted therapy for the prevention of UC neoplastic
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10 progression.
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14 **6. ACKNOWLEDGEMENTS**

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18 This work was supported by a research grant from the Canadian Institutes of Health Research
19
20 (MOP#97931 to J.A.M.). H.-M.C. was recipient of CIHR Fredrick Banting and Charles Best
21
22 Canada and Alberta Graduate Excellence Scholarships.
23
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26 **7. AUTHOR CONTRIBUTIONS**

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29 H.-M.C. completed the data analysis, prepared figures and wrote the manuscript. J.A.M. conceived
30
31 and coordinated the study, wrote the manuscript, supervised trainees and provided intellectual
32
33 contributions to the project. All authors reviewed the results and approved the final version of the
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35 manuscript.
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TABLE 1. Overlapping gene products in the pancolitis 15 \cap CAD network 1 intersection.

Gene	Protein	Molecular Function	Expression FC		
			L	P	D
<i>DAPK3</i>	Death-associated protein kinase 3	Kinase	-0.15	-1.08 [§]	-0.98 [§]
<i>PPP1CB</i>	Protein phosphatase PP1 β subunit	Phosphatase	-0.12	-1.56 [§]	-1.52 [§]
<i>MYO1C</i>	Unconventional myosin IC	Motor	-0.18	0.77*	0.99*
<i>MYO6</i>	Unconventional myosin VI	Motor	-0.31	-0.88 [§]	-1.36 [§]
<i>ARHGAP21</i>	Rho GTPase-activating protein 21	GTPase	-0.48	-0.98 [§]	-0.97 [§]
<i>CAPZA1</i>	F-actin-capping protein α 1	Actin	0.18	-1.89 [§]	-2.21 [§]
		Binding			
<i>CORO1B</i>	Coronin 1B	Actin	-0.08	0.88*	0.86*
		Binding			
<i>CPNE8</i>	Copine 8	Membrane	-0.34	-1.55 [§]	-1.93 [§]
		Binding			
<i>DCTN5</i>	Dynactin 5	Scaffold	-0.20	-0.80 [§]	-1.64 [§]
<i>FLNB</i>	Filamin B	Actin	-0.49	-0.76 [§]	-1.20 [§]
		Binding			
<i>FLOT2</i>	Flotillin 2	Scaffold	0.17	-0.78 [§]	-0.95 [§]
<i>TMOD3</i>	Tropomodulin 3	Actin	-0.22	-1.36 [§]	-2.15 [§]
		Binding			
<i>TPM1</i>	Tropomyosin α 1	Actin	-0.61	-0.86 [§]	1.01*
		Binding			
---	Monomeric (G) actin	Structural	Not a focus molecule		

FC = log₂ fold-change, L = left-sided colitis, P = pancolitis, and D = colitis-associated dysplasia. A gene was deemed dysregulated when |log₂FC|>0.75 and FDR<0.001; * - significant upregulation, § - significant downregulation.

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4 **FIGURE LEGENDS**
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9 **Figure 1. Differential expression of genes in UC disease subtypes.** (A), differential gene
10 expression of three UC clinical subtypes against healthy controls. Log₂FC calculated with limma
11 R for the GSE47908 dataset [n = 15 (healthy controls, HC), n = 20 (left-sided colitis), n = 19
12 (pancolitis), and n = 6 (colitis-associated dysplasia, CAD)]. The threshold set for log₂FC was |0.75|.
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16 (pancolitis), and n = 6 (colitis-associated dysplasia, CAD)]. The threshold set for log₂FC was |0.75|.
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18 Significance was determined by FDR<0.001. (B), overlap of shared differentially expressed genes
19 (DEGs) between UC subtypes. The proportional Venn diagram was generated with Bio Venn and
20 then optimized with eulerAPE_3.0.0.jar.
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28 **Figure 2. Gene ontology (GO) term enrichment analysis of differentially expressed genes**
29 **(DEGs) common among UC subtypes.** DEGs at the intersection of pancolitis ∩ left-sided colitis
30 or pancolitis ∩ CAD were subjected to GO term enrichment analysis for Biological Process
31 categories. Enrichment was performed with topGO R (“elim” algorithm, “fisher” statistic).
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Figure 3. Ingenuity Pathway Analysis (IPA) of canonical pathways, upstream regulators and
functions differentially deregulated among UC subtypes. For each colitis subtype, the activation
z-score calculated by IPA software predicts the activation (red) or inhibition (blue) potential for
each canonical pathway (A) or regulator/function (B). The reports are sorted based on correlation
of z-scores to extent of disease (left-sided colitis to pancolitis to CAD) with higher total scores
across the colitis-subtypes ranked higher than those with lower total scores. LS: left-sided colitis,
Pan: pancolitis, Dys: CAD.

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7 **Figure 4. Intersections of UC clinical subtype molecular interactions.** Molecular networks were
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9 constructed for each UC subtype. Octagons represent networks constructed with CAD DEGs,
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11 hexagons represent pancolitis networks, and rectangles indicate left-sided colitis networks.
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13 Shape size represents the relative number of DEGs used to build each network. The networks are
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15 connected to each other if there are any overlapping gene products, and line width represent the
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17 number of shared gene products. The serpentine network overlap (**A**) was detangled by focusing
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19 on networks that had >85% of DEG inputs and keeping edges that involved >5% overlap of gene
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21 products. This returned a core network of networks (**B**) that was heavily leveraged on the edge
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23 connecting CAD network 1 and pancolitis network 15 (red).
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32 **Figure 5. Gene ontology (GO) term enrichment analysis of the pancolitis network 15 and**
33 **CAD network 1 intersection.** In (**A**), DEGs at the intersection of pancolitis network 15 \cap CAD
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35 (colitis-associated dysplasia) network 1 were subjected to GO term enrichment analysis for
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37 Biological Process categories. Network was constructed by IPA software, and intersections
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39 compiled with R Venn R. Edge-betweenness was computed by the Cytoscape app
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41 NetworkAnalyzer. Enrichment performed with topGO R. Statistical significance was defined with
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43 a Fisher's Exact Test. In (**B**), the shortest paths linking the 13 focus molecules to the disease
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45 ulcerative colitis were established using the IPA Path Explorer tool. The 13 focus molecules
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47 (highlighted in yellow) were used as the starting point for the generation of biological networks
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49 based on their connectivity as established in the Ingenuity Knowledge Base (IKB). Incorporating
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51 findings from experimentally observed/highly predicted confidence levels and direct/indirect
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53 interactions, the IPA Path Explorer tool built 88 shortest paths to connect focus molecules through
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4 a minimum of one IPA-derived intermediate molecule to the disease ulcerative colitis. All probable
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6 shortest paths by which the focus molecules were connected to the disease ulcerative colitis
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8 required at least one interconnecting gene product (i.e., none of the lines originating from any of
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10 the focus molecules (colored in light blue) connect directly to the disease ulcerative colitis).
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17 **Figure 6. Differential correlation of *DAPK3-YAP* and *PPP1CB-YAP* relationships.** The main panels
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19 display the relationship between the log-transformed expression profiles of (A) *DAPK3* and *YAP*
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21 or (B) *PPP1CB* and *YAP*. These scatterplots are overlaid with confidence ellipses of covariance,
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23 constructed for the 95% CI. In the marginal box plots of log-transformed gene expression, the
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25 lower whisker represents the lowest datum still within 1.5 interquartile range (IQR) of the lower
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27 quartile, and the upper whisker represents the highest datum still within 1.5 IQR of the upper
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29 quartile.
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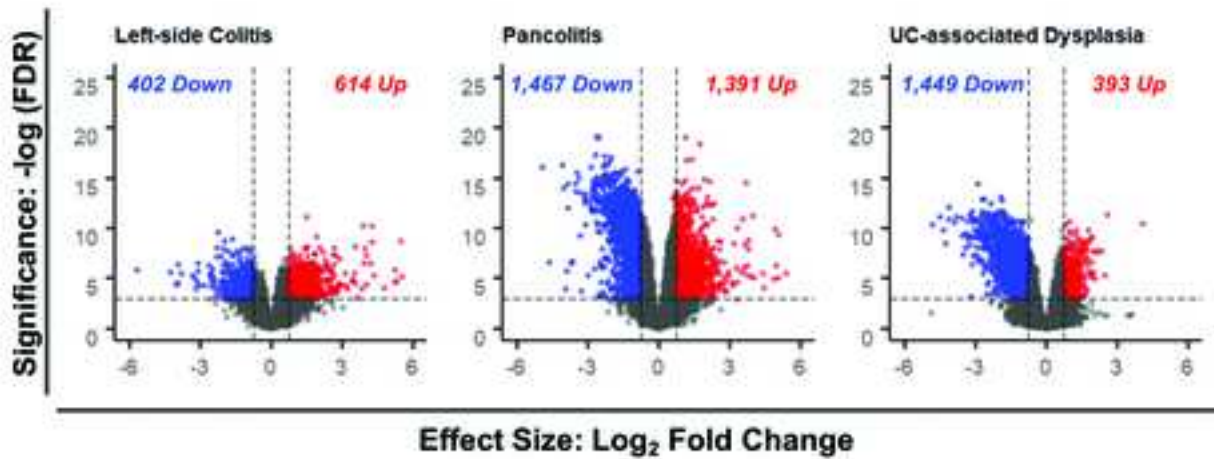
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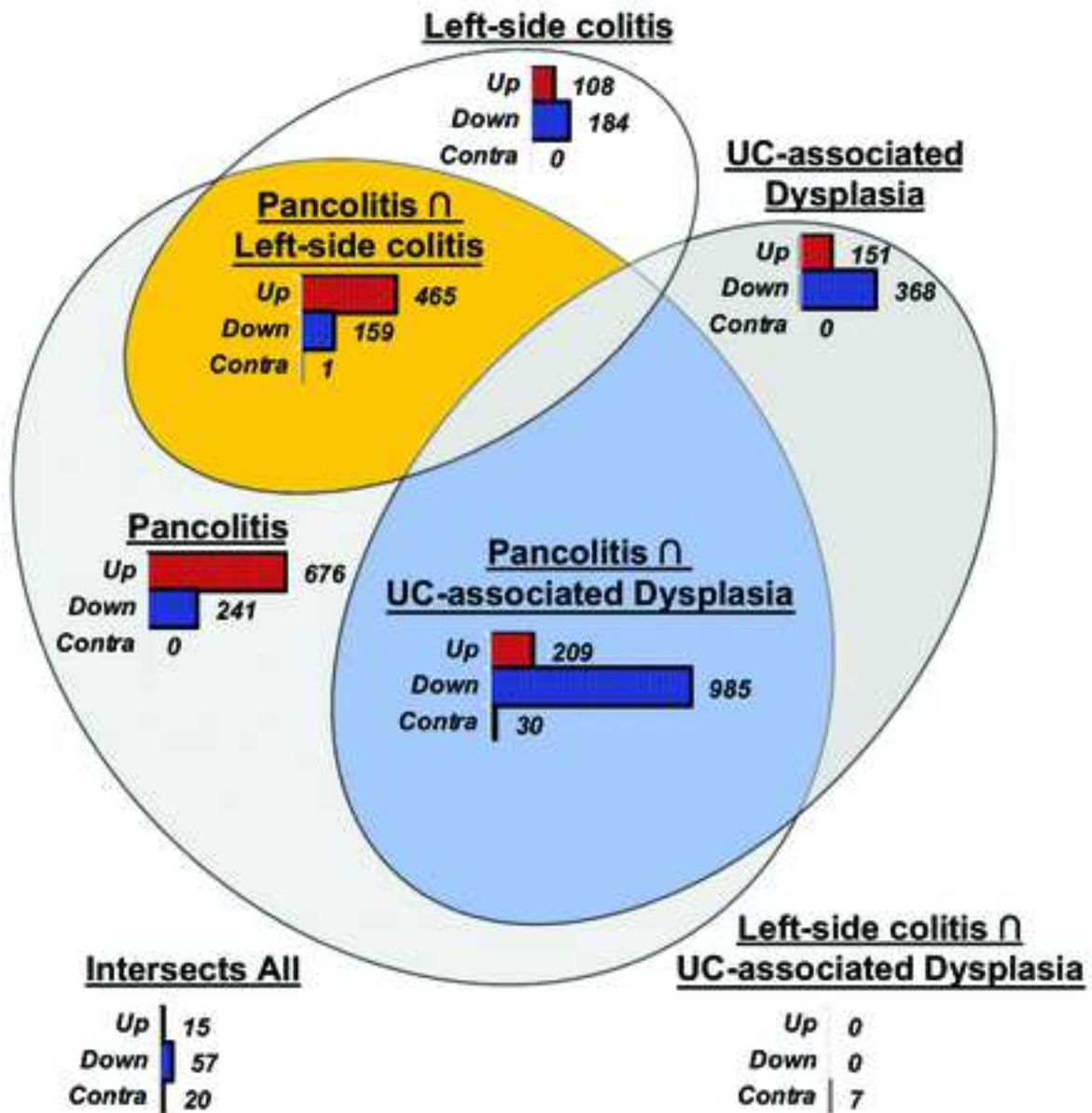
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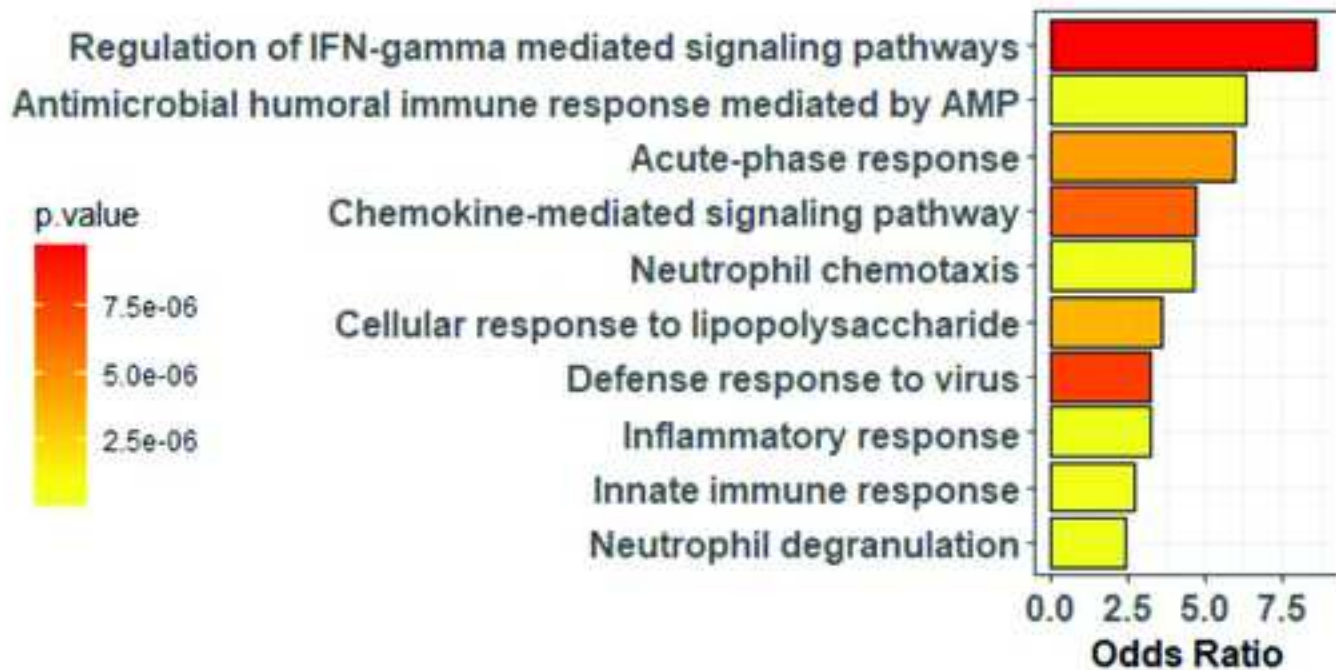
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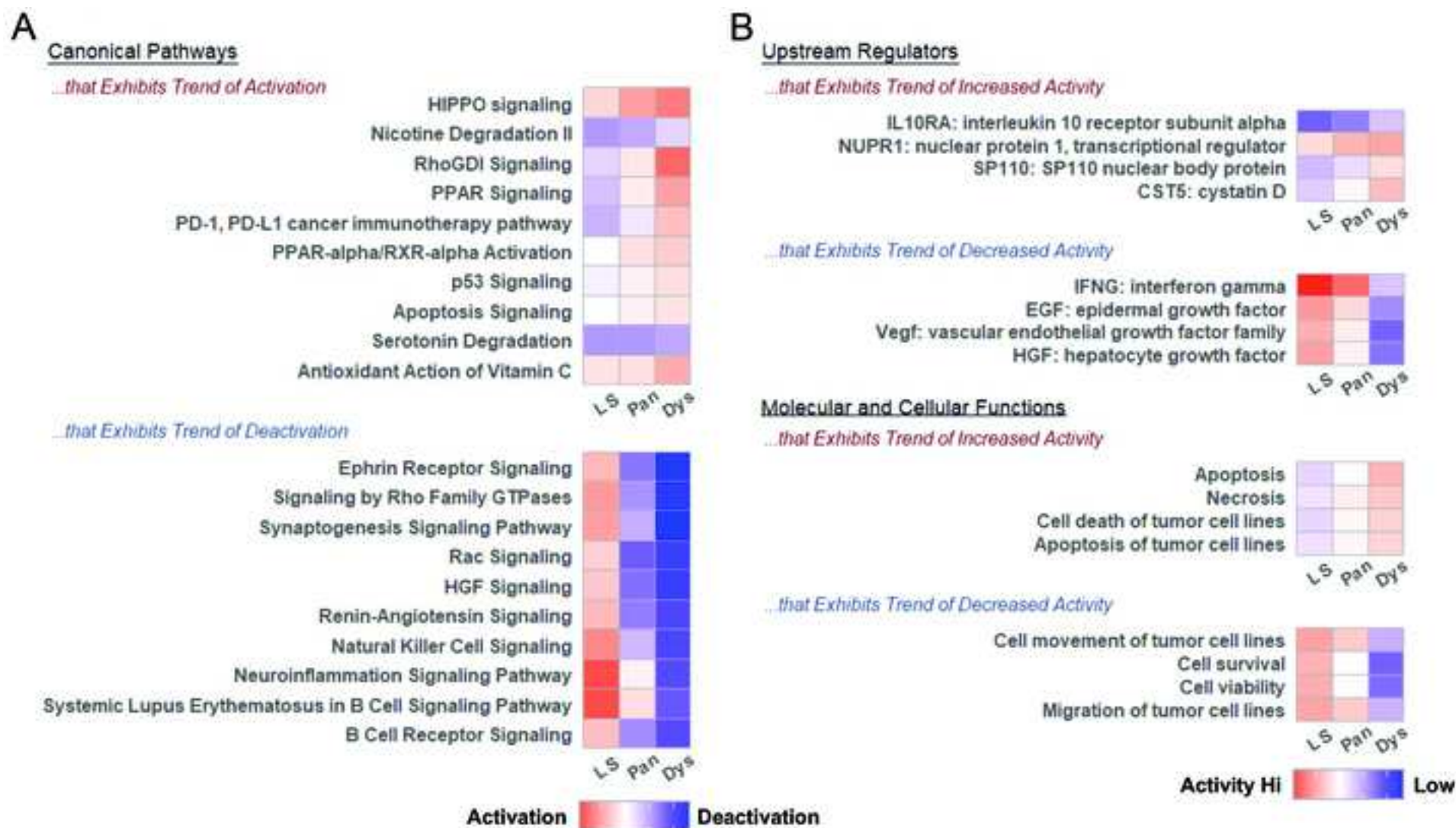


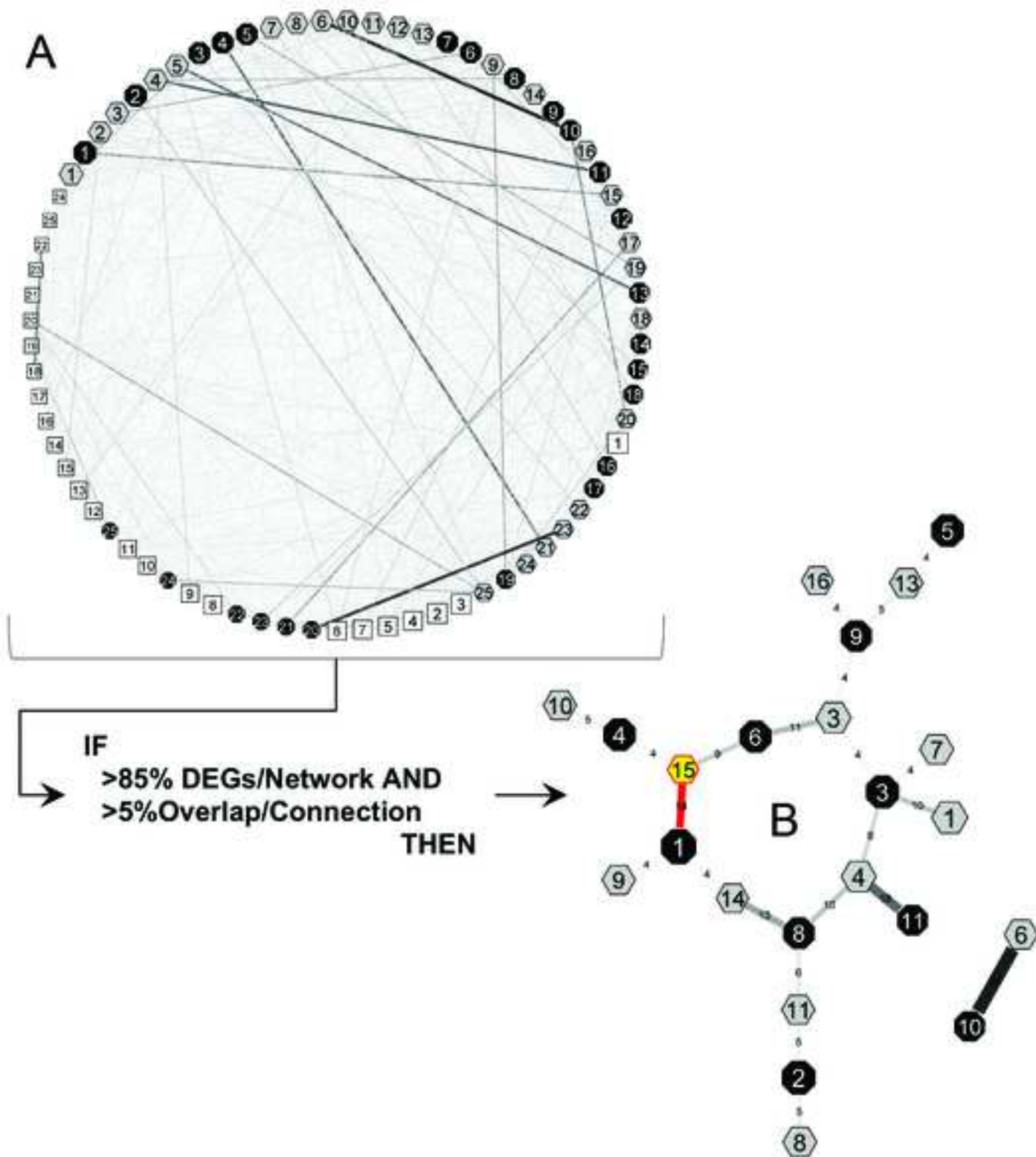
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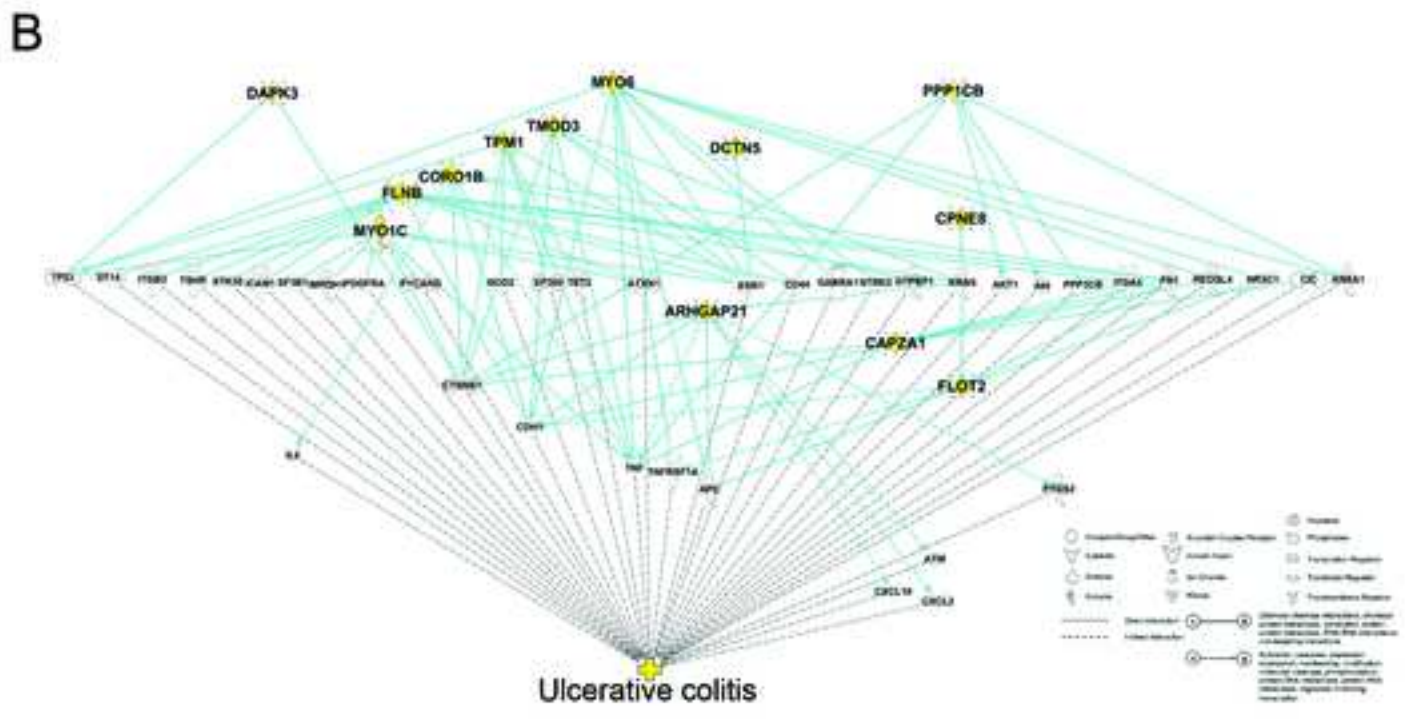
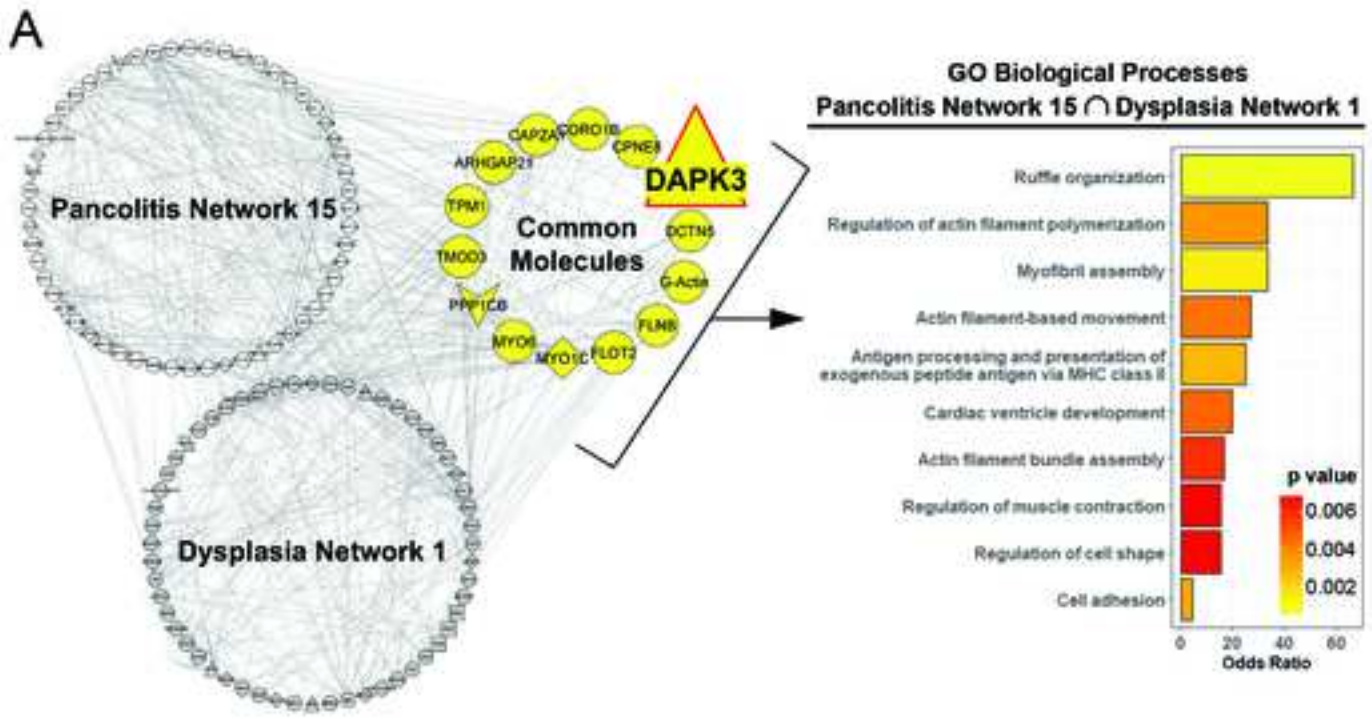


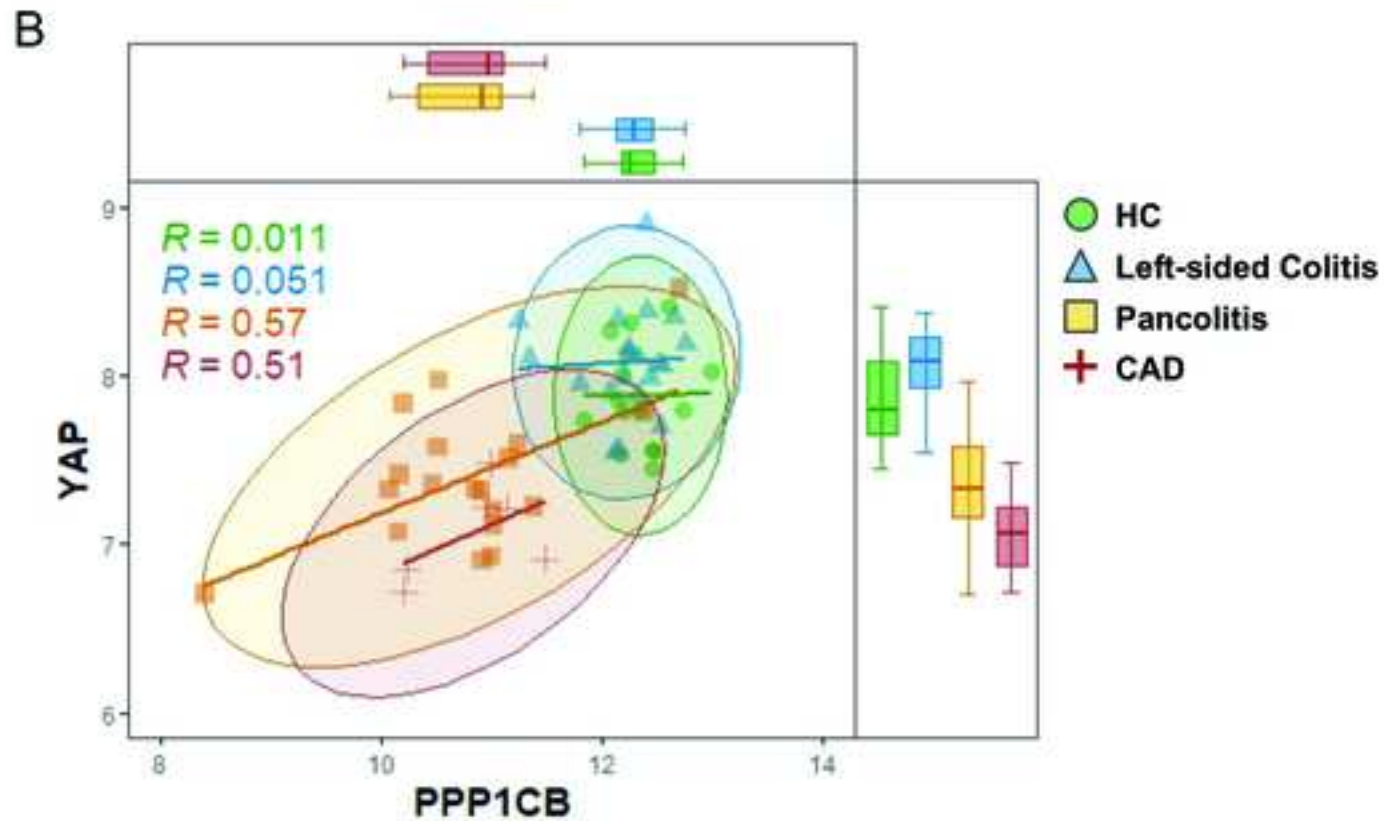
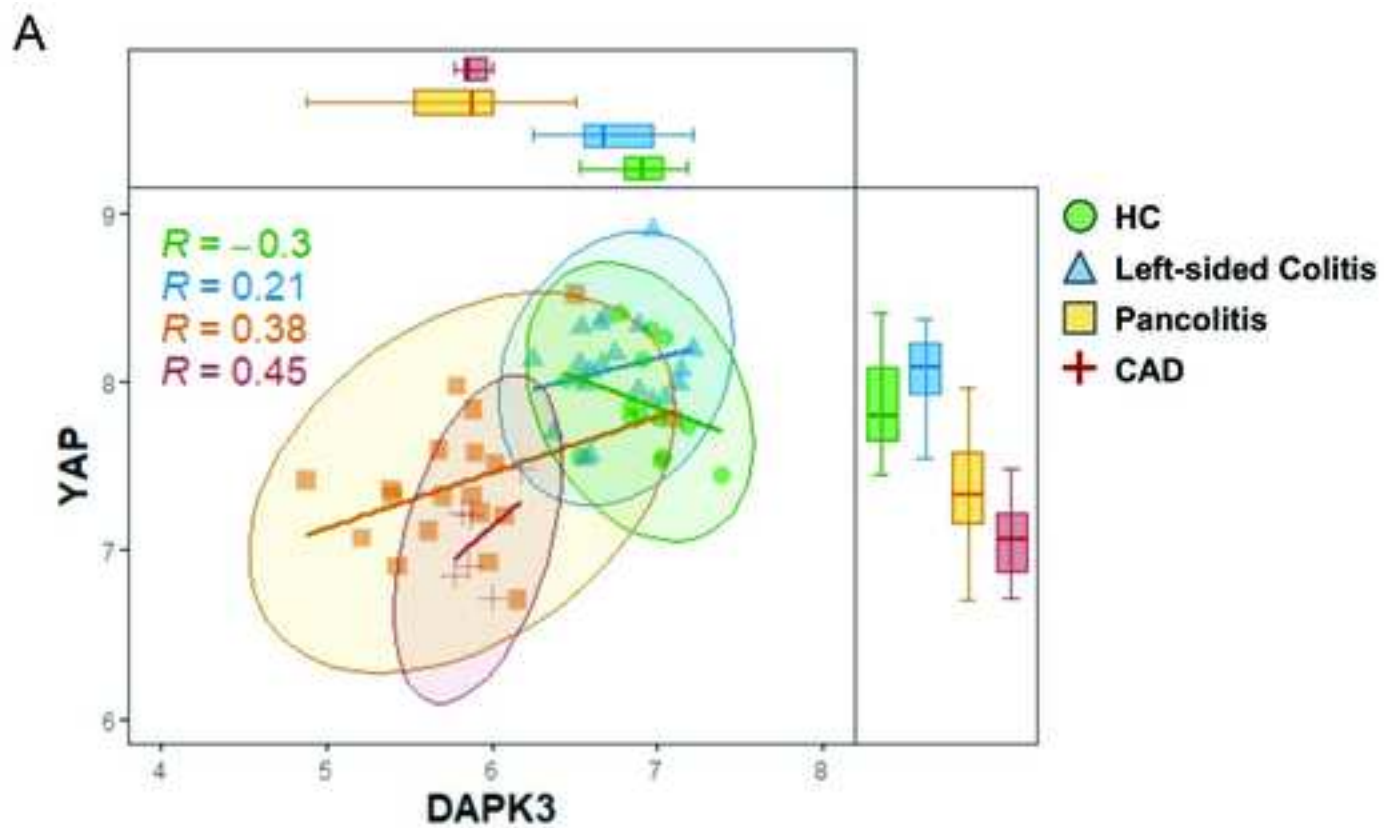
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