

# PROJECT REPORT

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## Investigating the molecular cause of hypermobile Ehlers-Danlos syndrome

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# 1 Introduction

Ehlers-Danlos syndromes are a group of heritable connective tissue disorders that can be classified into multiple subtypes. The current classification proposed in 2017 describes 13 subtypes [1]. The most common type is hypermobile EDS (hEDS) which is also the only subtype with unknown molecular cause, leading to a diagnosis based on clinical presentation. Identifying the molecular cause is crucial to improve the diagnosis process, the understanding of the disease and to find potential treatment options [2].

Although many studies investigated several genes, no clear molecular cause with a connection to connective tissue has been established yet

This project aims to investigate the molecular cause of hypermobile EDS by studying the influence of differentially expressed genes in hEDS patients.

- which biological processes and pathways are affected
- similarities to pathways/processes/function affected by other EDS genes
- TODO: what do we want to do in the big picture: find candidate genes? is this too ambitious?

## 2 Methods

### 2.1 Analysis of Differentially Expressed Genes and Network Creation

A dataset of gene expression profiles from dermal fibroblasts from patients with hEDS and healthy controls is used. It is available at the NCBI GEO database with the accession number GSE218012 [2]. The analysis is performed with the R-package DeSeq2 based on the analysis script exported from GEO2R to identify up-regulated and down-regulated genes [3]. Genes with a log2-fold change  $> \pm 0.5$  and a p-value  $< 0.05$  after adjustment based on False-Discovery-Rate using the Benjamin-Hochberg procedure were considered. The cut-offs were chosen based on similar research [4, 5].

- use Cytoscape to create network [6]
- query differentially expressed genes from string db [7] (confidence cut off 0.4)
- query eds genes related to other eds types additionally: 21 genes retrieved from Disease Ontology with Disease Ontology ID 13359 [8], queried from string, again with a medium confidence cut off of 0.4
- load data about differential expression into network, for EDS genes and differentially expressed genes

### 2.2 Enrichment analysis and clustering

- exploratory enrichment analysis on whole network
- use R-package clusterProfiler [9] for enrichment
- large network, thus cluster before to get better insights for specific parts
- two different cluster methods used with different resulting cluster structure
- create subnetworks for clusters with more than 15 nodes [TODO: why this threshold? to focus on more relevant because many in MCODE between 10 and 15 nodes, for community clustering smaller ones probably found by MCODE]

### 2.2.1 MCODE

- MCODE finds "densely connected regions in large protein-protein interaction networks that may represent molecular complexes" [10]
- results in smaller clusters
- suited to analyse molecular function
- use default parameters
- analysis of molecular function with clusterProfiler with GO over-representation analysis
- do we see clusters with other molecular functions than expected
- are genes clustered together with other eds genes
- are clusters generally mostly upregulated or downregulated

### 2.2.2 Community Clustering

- small cluster not helpful for biological processes and pathways
- therefore use second clustering method
- community clustering with GLay, "more suitable for functional interpretation" [11]

## 3 Results

### 3.1 Differentially Expressed Genes and Network creation

- 908 differentially expressed genes with chosen thresholds section 2.1
- around half are upregulated, around half downregulated (Upregulated: 495, Downregulated: 413)
- String was able to query 828 of them, using alternative ID/Query methods did not change this
- after querying additional genes that are known to be related to other eds types: resulting network with 847 nodes and 6129 edges
- position of known eds genes in network is on average more central (checked degree, clustering coefficient, betweenness centrality and closeness centrality)

### 3.2 Enrichment analysis and clustering

#### 3.2.1 MCODE

- 3 clusters with more than 15 nodes (first with 66 nodes & 1953 connections, second with 44 nodes & 686 connections, third with 16 nodes & 114 connections)
- first and largest cluster upregulated only
- second one as well
- 3rd MCODE cluster, shown in figure 1, is mostly upregulated with 2 downregulated nodes, some not relevantly differentially expressed, also only 9/16 are not known eds genes, 8 are
- the eds genes are all below the threshold of  $|\log_2\text{FoldChange}| > 0.5$ , 1 of them is 1 of the two down-regulated genes
- quite interesting to see genes closely related to other eds genes, COL21A1 is also strongly upregulated ( $\log_2\text{FoldChange} > 2$ )
- all known EDS genes with ADAMTS2 as exception have a high Closeness Centrality
- regarding the enrichment of this cluster: not surprising to see extracellular

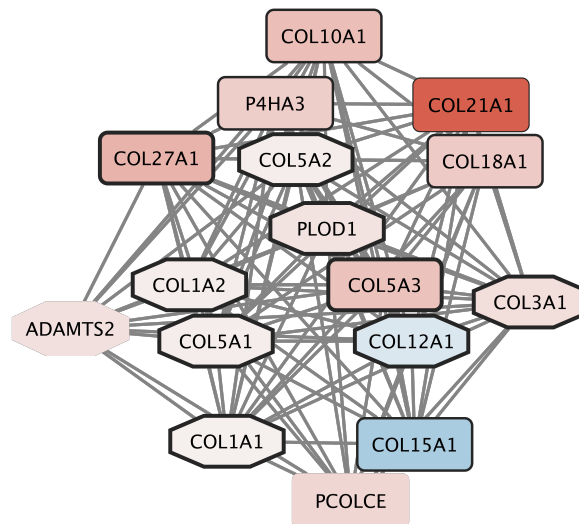


Figure 1: MCODE cluster 3 [TODO: add legend for shape and colour]

### 3.2.2 Community Clustering

- 6 clusters with more than 15 nodes
- 3 very small loosely connected clusters (18 nodes & 17 connections, 29 nodes & 32 connections, 29 nodes & 29 connections), two medium sized highly interconnected (76 nodes & 1000 connections and 105 nodes & 2330 connections) and one very large cluster (363 nodes & 1661 connections)
- especially medium sized clusters highly interconnected
- biggest one mix of up-regulated and down-regulated genes, contains all 21 genes known to cause other EDS types
- both medium sized clusters mostly upregulated → interesting!
- smallest cluster with 18 nodes too small for meaningful enrichment analysis regarding processes

## 4 Discussion

## References

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