

Supplementary Material

Single-cell Differential Network Analysis with Sparse Bayesian Factor Models

1 SUPPLEMENTARY FIGURES

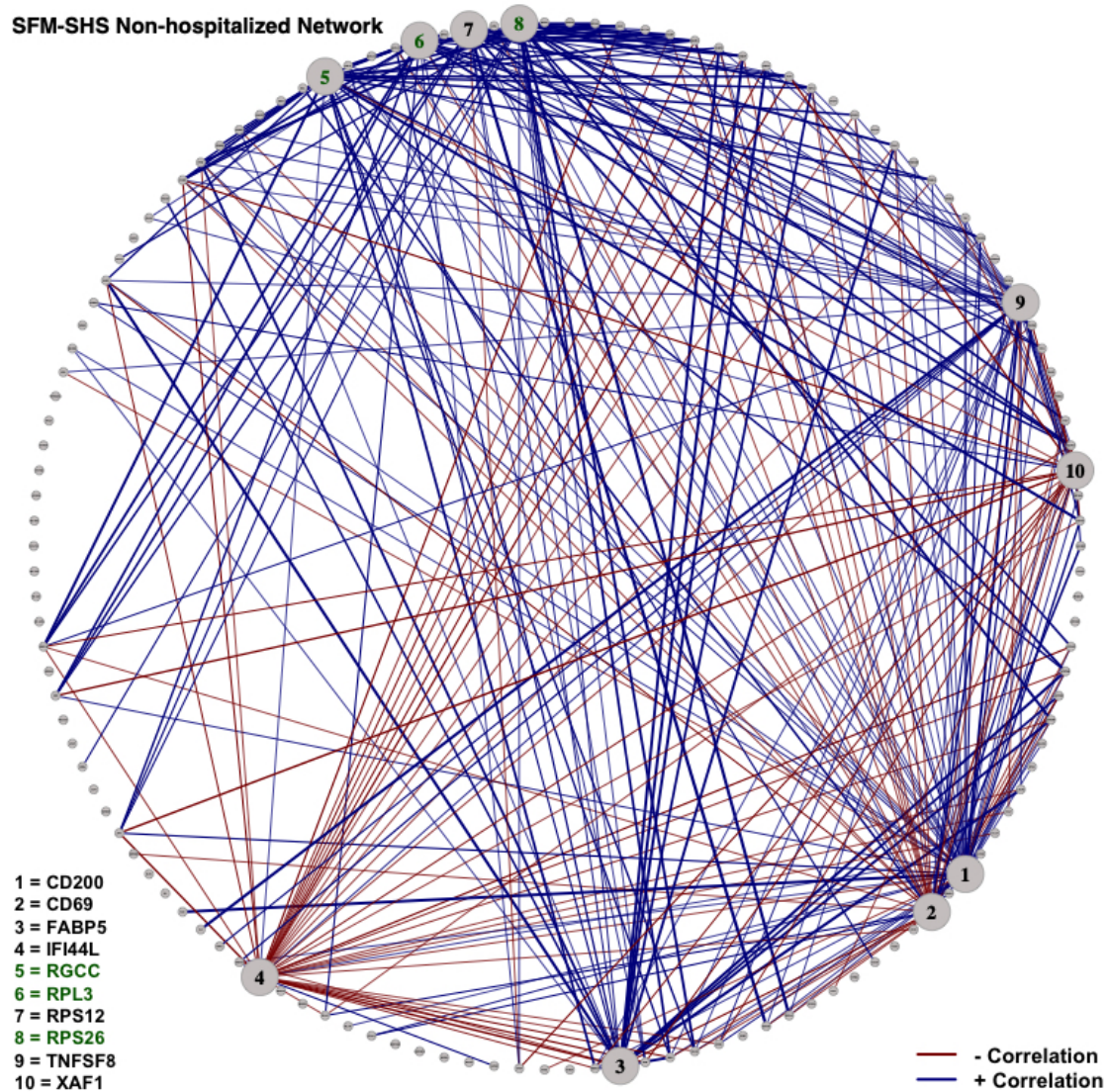


Figure S1. Network estimated by SFM-SHS with the bootstrap procedure for the non-hospitalized group in the SARS-CoV-2 case study dataset. Edges displayed are for 10 DCGs. The 7 unique top DCGs identified by both SFM-SHS and SFM-DHS are listed in black and the 3 top DCGs identified by all considered methods are listed in green. Each edge is colored to represent the direction of correlation.

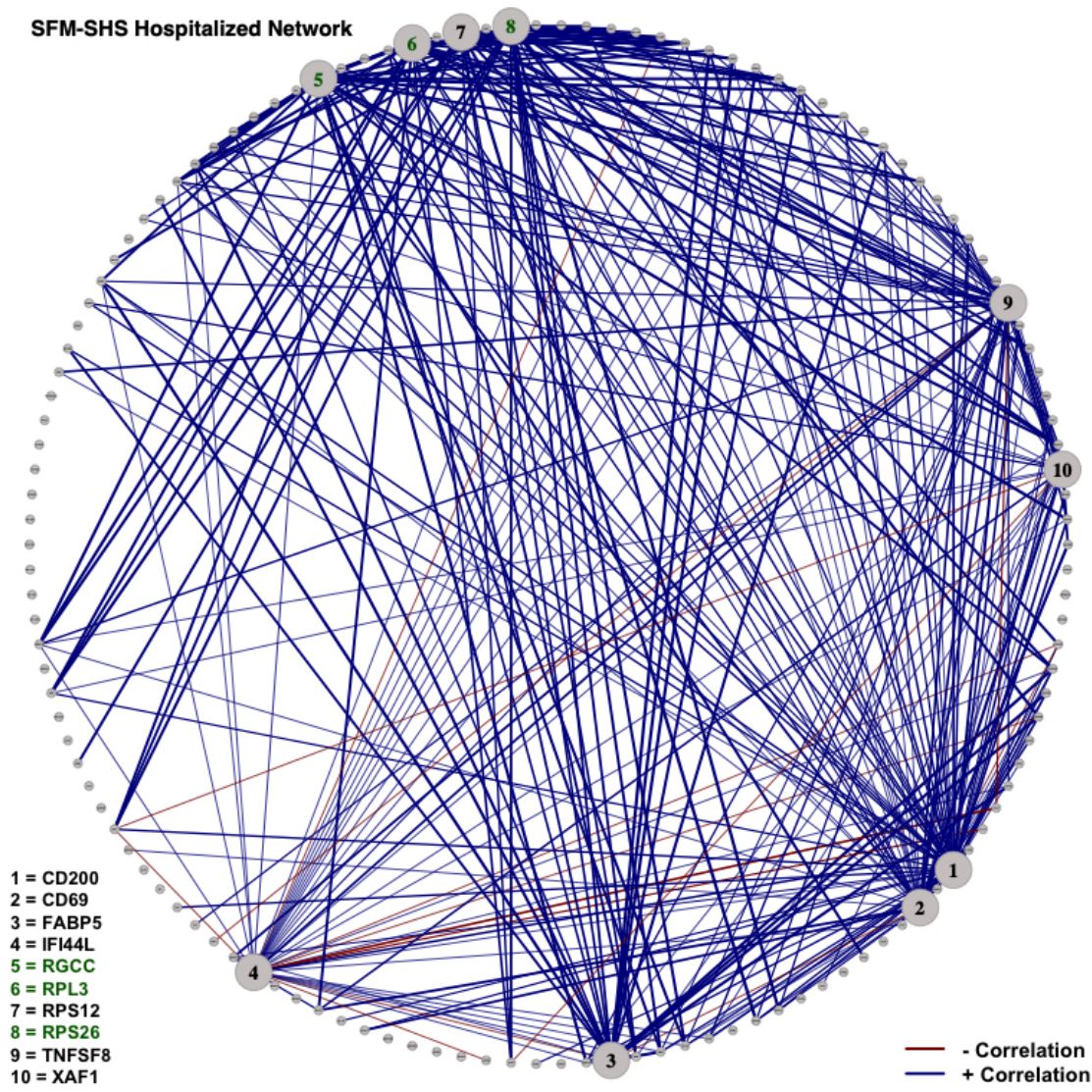


Figure S2. Network estimated by SFM-SHS with the bootstrap procedure for the hospitalized group in the SARS-CoV-2 case study dataset. Edges displayed are for 10 DCGs. The 7 unique top DCGs identified by both SFM-SHS and SFM-DHS are listed in black and the 3 top DCGs identified by all considered methods are listed in green. Each edge is colored to represent the direction of correlation.

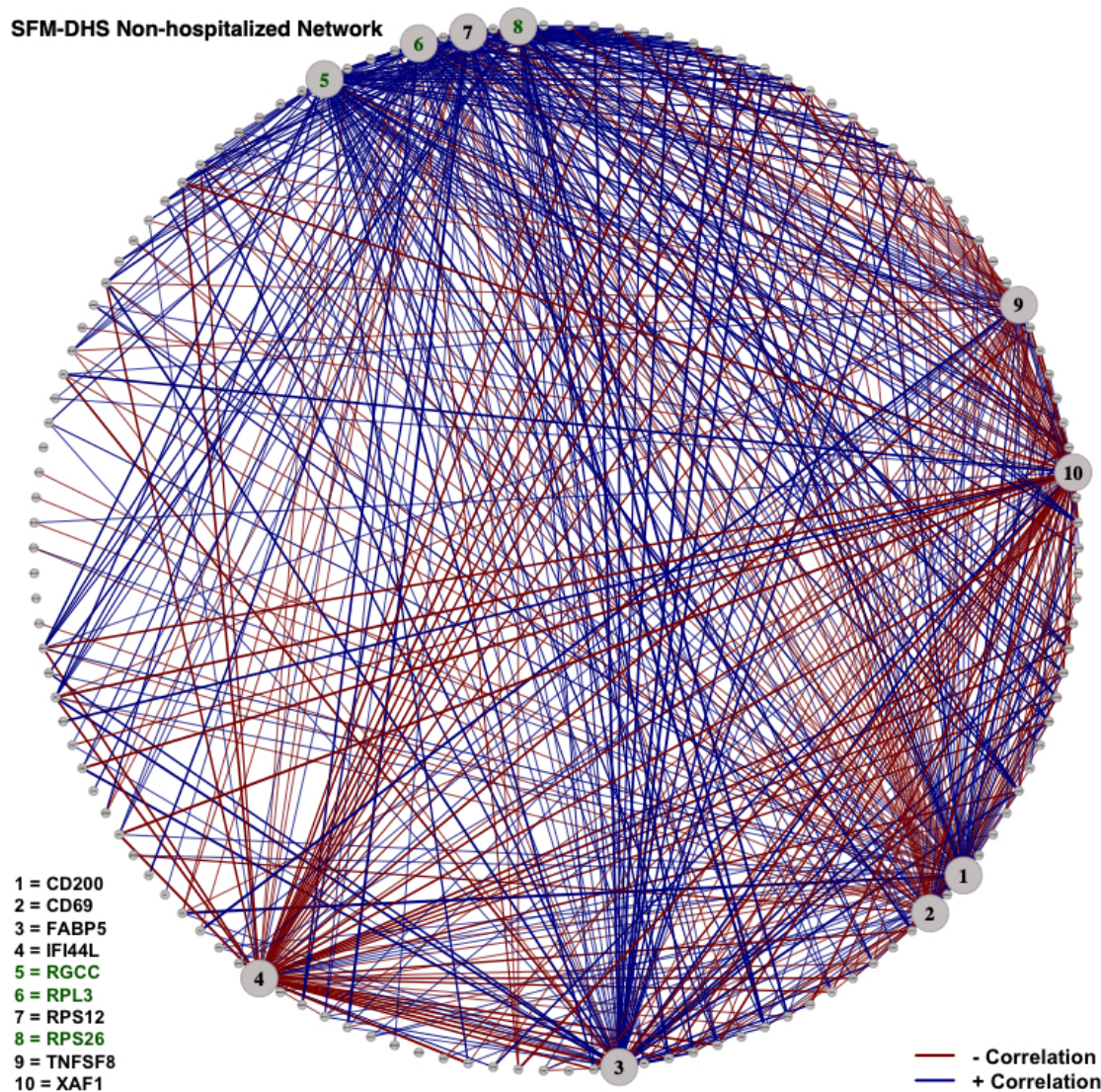


Figure S3. Network estimated by SFM-DHS with the bootstrap procedure for the non-hospitalized group in the SARS-CoV-2 case study dataset. Edges displayed are for 10 DCGs. The 7 unique top DCGs identified by both SFM-SHS and SFM-DHS are listed in black and the 3 top DCGs identified by all considered methods are listed in green. Each edge is colored to represent the direction of correlation.

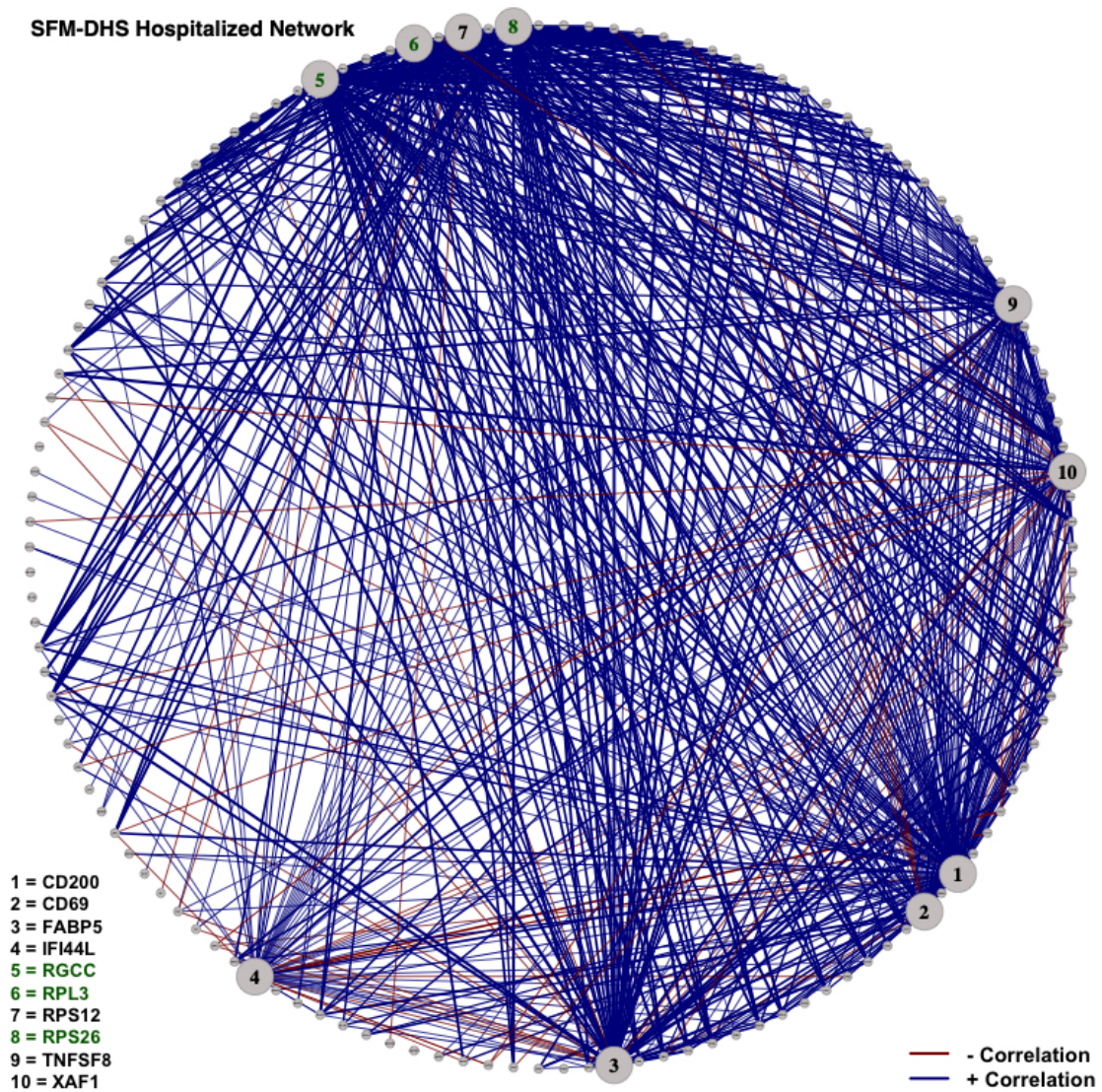


Figure S4. Network estimated by SFM-DHS with the bootstrap procedure for the hospitalized group in the SARS-CoV-2 case study dataset. Edges displayed are for 10 DCGs. The 7 unique top DCGs identified by both SFM-SHS and SFM-DHS are listed in black and the 3 top DCGs identified by all considered methods are listed in green. Each edge is colored to represent the direction of correlation.

2 SUPPLEMENTARY TABLES

| Sim 1: $G = 50, N = 1000$ | | | | |
|-----------------------------------------------|---------|---------|-----------|-----------|
| Network Structure A | TPR_0 | FDR_0 | $AUROC_0$ | $Edges_0$ |
| SFM-SHS; $F = 8$ | 0.766 | 0.082 | 0.978 | 292 |
| SFM-DHS; $F = 10$ | 0.817 | 0.154 | 0.960 | 338 |
| DGCA | 0.906 | 0.086 | 0.983 | 347 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.914 | 0.056 | 0.983 | 339 |
| SFM-DHS; $F = 13$ | 0.923 | 0.225 | 0.942 | 417 |
| DGCA | 0.937 | 0.000 | 0.985 | 328 |
| Sim 2: $G = 50, N = 500$ | | | | |
| Network Structure A | TPR_0 | FDR_0 | $AUROC_0$ | $Edges_0$ |
| SFM-SHS; $F = 7$ | 0.814 | 0.072 | 0.987 | 307 |
| SFM-DHS; $F = 8$ | 0.840 | 0.133 | 0.980 | 339 |
| DGCA | 0.911 | 0.000 | 0.997 | 319 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.951 | 0.015 | 0.995 | 338 |
| SFM-DHS; $F = 12$ | 0.931 | 0.133 | 0.978 | 376 |
| DGCA | 0.960 | 0.034 | 0.991 | 348 |
| Sim 3: $G = 50, N = 2,000$ | | | | |
| Network Structure A | TPR_0 | FDR_0 | $AUROC_0$ | $Edges_0$ |
| SFM-SHS; $F = 8$ | 0.863 | 0.000 | 0.995 | 302 |
| SFM-DHS; $F = 8$ | 0.914 | 0.083 | 0.983 | 349 |
| DGCA | 0.931 | 0.175 | 0.979 | 395 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.951 | 0.067 | 0.998 | 357 |
| SFM-DHS; $F = 8$ | 0.991 | 0.202 | 0.987 | 435 |
| DGCA | 0.977 | 0.128 | 0.997 | 392 |
| Sim 4: $G = 100, N = 1,000$ | | | | |
| Network Structure A | TPR_0 | FDR_0 | $AUROC_0$ | $Edges_0$ |
| SFM-SHS; $F = 8$ | 0.918 | 0.000 | 0.998 | 1331 |
| SFM-DHS; $F = 8$ | 0.921 | 0.123 | 0.975 | 1523 |
| DGCA | 0.921 | 0.016 | 0.985 | 1358 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.987 | 0.120 | 0.991 | 1627 |
| SFM-DHS; $F = 10$ | 0.974 | 0.259 | 0.954 | 1906 |
| DGCA | 0.981 | 0.003 | 0.998 | 1426 |

Table S1. Comparison of the “true” control network structure and the estimated network structure in the simulation studies for SFM-SHS, SFM-DHS, and DGCA. Results displayed for SFM-SHS and SFM-DHS are from the bootstrap estimation procedure. The method of scdNet does not provide directly provide this estimation. In Sim 1 - 3, there are 350 “true” control network edges and in Sim 4 there are 1,450 “true” control network edges.

| Sim 1: $G = 50, N = 1000$ | | | | |
|-----------------------------------------------|---------|---------|-----------|-----------|
| Network Structure A | TPR_1 | FDR_1 | $AUROC_1$ | $Edges_1$ |
| SFM-SHS; $F = 8$ | 0.812 | 0.090 | 0.979 | 290 |
| SFM-DHS; $F = 10$ | 0.883 | 0.201 | 0.957 | 359 |
| DGCA | 0.902 | 0.039 | 0.953 | 305 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.969 | 0.003 | 1.000 | 316 |
| SFM-DHS; $F = 13$ | 0.957 | 0.063 | 0.993 | 332 |
| DGCA | 0.957 | 0.091 | 0.992 | 342 |
| Sim 2: $G = 50, N = 500$ | | | | |
| Network Structure A | TPR_1 | FDR_1 | $AUROC_1$ | $Edges_1$ |
| SFM-SHS; $F = 7$ | 0.822 | 0.000 | 0.994 | 267 |
| SFM-DHS; $F = 8$ | 0.840 | 0.199 | 0.954 | 341 |
| DGCA | 0.905 | 0.010 | 0.941 | 297 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.911 | 0.003 | 0.998 | 297 |
| SFM-DHS; $F = 12$ | 0.908 | 0.007 | 0.993 | 297 |
| DGCA | 0.966 | 0.003 | 0.989 | 315 |
| Sim 3: $G = 50, N = 2,000$ | | | | |
| Network Structure A | TPR_1 | FDR_1 | $AUROC_1$ | $Edges_1$ |
| SFM-SHS; $F = 8$ | 0.822 | 0.133 | 0.984 | 308 |
| SFM-DHS; $F = 8$ | 1.000 | 0.201 | 0.970 | 407 |
| DGCA | 0.991 | 0.108 | 0.998 | 361 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.902 | 0.064 | 0.985 | 313 |
| SFM-DHS; $F = 8$ | 1.000 | 0.074 | 0.988 | 351 |
| DGCA | 0.994 | 0.058 | 0.998 | 343 |
| Sim 4: $G = 100, N = 1,000$ | | | | |
| Network Structure A | TPR_1 | FDR_1 | $AUROC_1$ | $Edges_1$ |
| SFM-SHS; $F = 8$ | 0.840 | 0.038 | 0.988 | 1179 |
| SFM-DHS; $F = 8$ | 0.841 | 0.251 | 0.926 | 1517 |
| DGCA | 0.973 | 0.077 | 0.988 | 1423 |
| Network Structure B | | | | |
| SFM-SHS; $F = 7$ | 0.961 | 0.009 | 0.999 | 1310 |
| SFM-DHS; $F = 10$ | 0.923 | 0.116 | 0.985 | 1410 |
| DGCA | 0.982 | 0.019 | 0.997 | 1352 |

Table S2. Comparison of the “true” treatment network structure and the estimated network structure in the simulation studies for SFM-SHS, SFM-DHS, and DGCA. Results displayed for SFM-SHS and SFM-DHS are from the bootstrap estimation procedure. The method of scdNet does not provide directly provide this estimation. In Sim 1 - 3, there are 325 “true” treatment network edges and in Sim 4 there are 1,350 “true” treatment network edges.