Supplementary information for "Integration of heterogeneous experimental data improves global map of human protein complexes"

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This file includes:

- Figure S1: Replication of performance comparison of pairwise protein interactions prediction as originally reported by Drew *et al* [1].
- Figure S2: Performance comparison of pairwise protein interactions prediction on BioPlex [3] data.
- Figure S3: Performance comparison of pairwise protein interactions prediction on Hein et al [2] data.
- Figure S4: Performance comparison of pairwise protein interactions prediction on Wan et al [4] data.
- Figure S5: Comparison of hu.MAP complexes against gold standard CORUM.
- Figure S6: Effect of protein complex refinement.
- Figure S7: Comparison between predicted and hu.MAP complexes.
- Figure S8: Distribution of enriched functional annotation as a function of complex score.
- Figure S9: Distribution of average STRING score as a function of complex score.
- Figure S10: Distribution of enriched functional annotation as a function of average STRING score.
- Figure S11: Distribution of minimum Pearson's correlation coefficient as a function of complex score.
- Supplementary file 1 (Microsoft Excel format): Full list of predicted proteins complexes.
- References

Supplementary figures

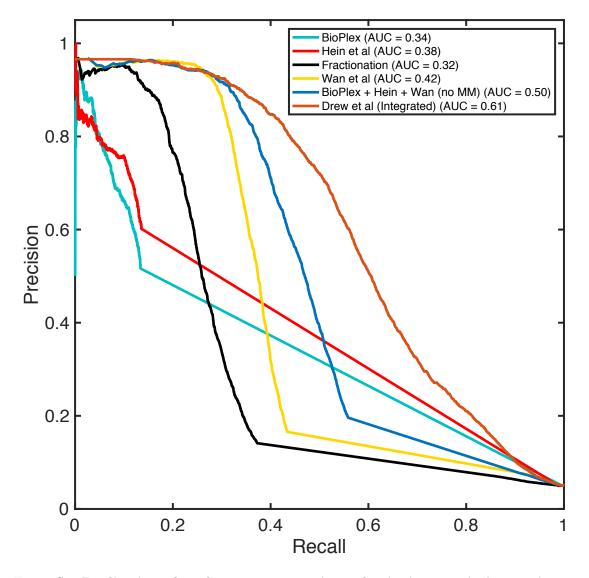


Figure S1: Replication of performance comparison of pairwise protein interactions prediction as originally reported by Drew *et al* [1]. For each method, we show precision-recall curve and area under the curve (AUC) using our in-house implementation.

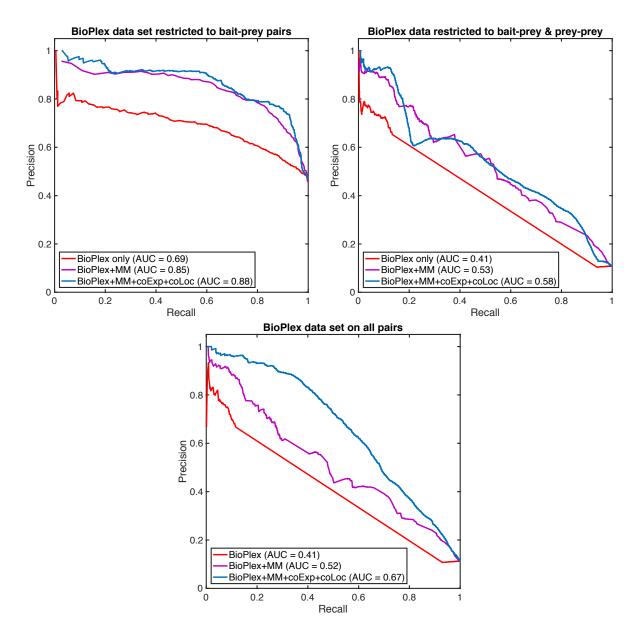


Figure S2: Performance comparison of pairwise protein interactions prediction on BioPlex [3] data. Figure shows precision-recall curve and area under the curve (AUC) under three different protein pair models of our proposed method (blue) compared against a baseline approach which only uses Bioplex specific features (red) and a previously proposed approach which adds weighted matrix model (MM) features (magenta). (A) Figure shows the comparison results restricted to bait-prey pairs. (B) Figure shows the comparison results restricted to bait-prey pairs. (C) Figure shows the comparison results on all possible pairs in BioPlex for which we had data.

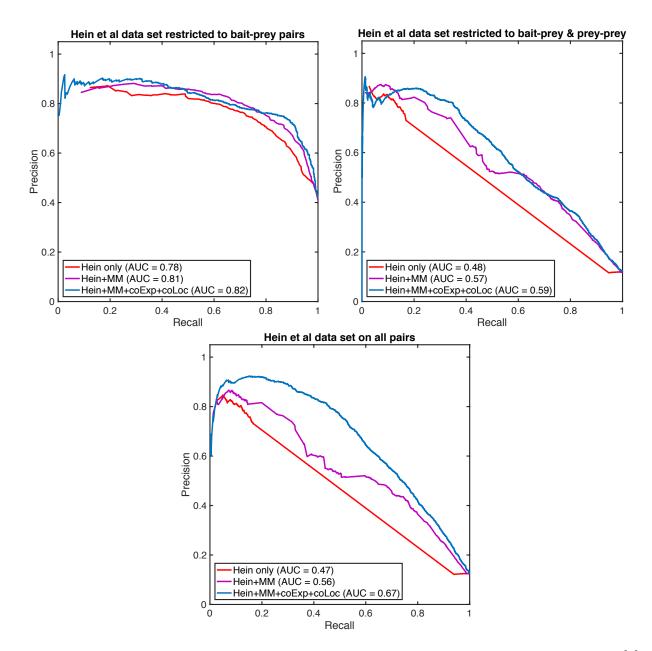


Figure S3: **Performance comparison of pairwise protein interactions prediction on Hein** *et al* [2] **data.** Figure shows precision-recall curve and area under the curve (AUC) under three different protein pair models of our proposed method (blue) compared against a baseline approach which only uses Hein *et al* specific features (red) and a previously proposed approach which adds weighted matrix model (MM) features (magenta). (A) Figure shows the comparison results restricted to bait-prey pairs. (B) Figure shows the comparison results restricted to bait-prey pairs on all possible pairs in Hein *et al* for which we had data.

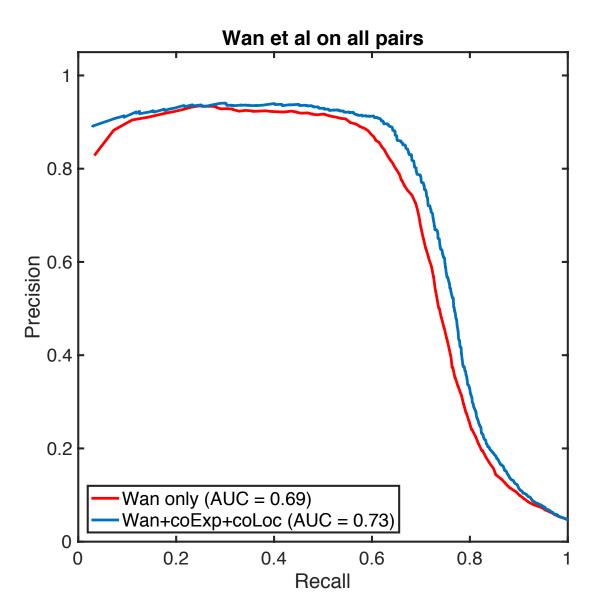


Figure S4: Performance comparison of pairwise protein interactions prediction on Wan *et al* [4] data. Figure shows precision-recall curve and area under the curve (AUC) of our proposed method (blue) compared against a baseline approach which only uses Wan *et al* specific features (red) over all protein pairs.

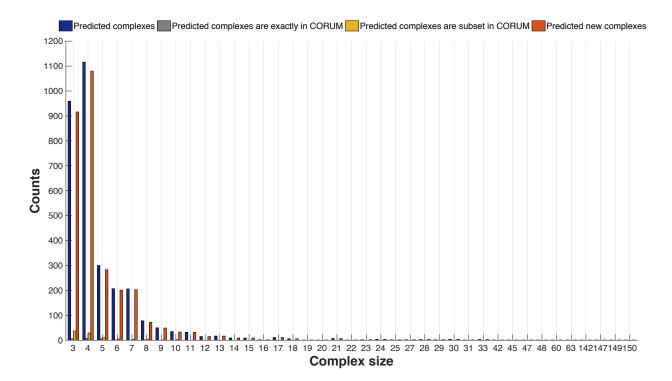


Figure S5: **Comparison of hu.MAP complexes against gold standard CORUM.** Figure shows hu.MAP complexes (blue) across three different categories as a function of complex size. The categories are (1) identical match to complex in CORUM (gray), (2) strict subset to a complex in CORUM (yellow), and (3) potentially novel complex (orange).

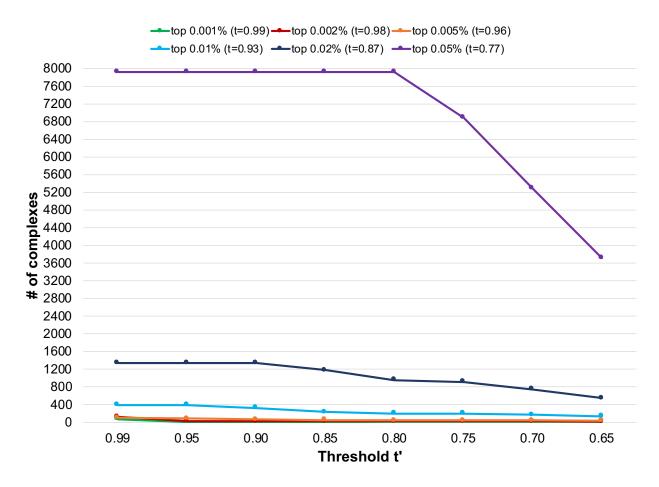


Figure S6: Effect of protein complex refinement. Figure shows the number of predicted complexes as a function of parameter t' using Algorithm 2. For each threshold, we show parameter t in parenthesis.

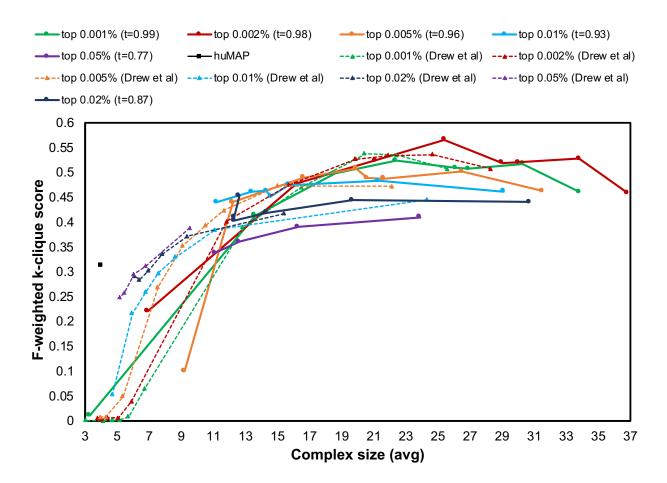
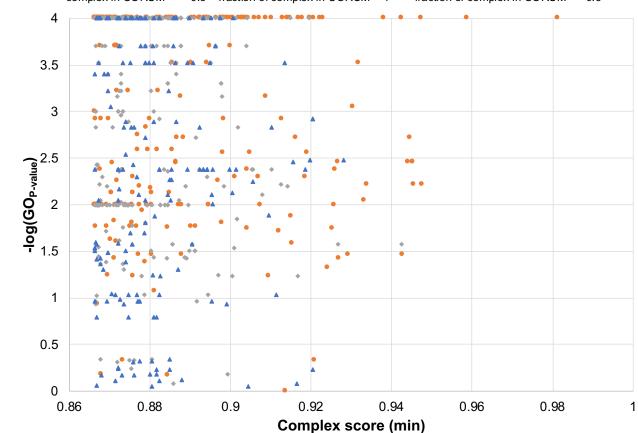


Figure S7: Comparison between predicted and hu.MAP complexes. Figure shows F-weighted kclique score [1] of our method (solid lines with circles) as a function of average complex size for each t'threshold. Figure also shows corresponding scores for hu.MAP (square) and an in-house implementation that uses hu.MAP pairwise scores as input to Algorithms 1 and 2 (dotted lines with triangles).



• complex in CORUM • 0.5 < fraction of complex in CORUM < 1 • fraction of complex in CORUM <= 0.5

Figure S8: Distribution of enriched functional annotation as a function of complex score. For each complex, we show the distribution of the largest p-value from enriched functional annotations (plotted as $-\log(GO_{P-value}))$ computed using g:Profiler and further adjusted to the estimated occurrence of significant enrichment from 10,000 random complexes of the same size as a function of complex score. Additionally, each complex is assigned to one of the following three classes based on varying degrees of overlap with CORUM complexes: (i) full overlap with CORUM complex (orange circles), (ii) at least half the member proteins overlap with CORUM complex (grey diamonds), and less than half of co-member proteins overlap with CORUM complex (blue triangles).

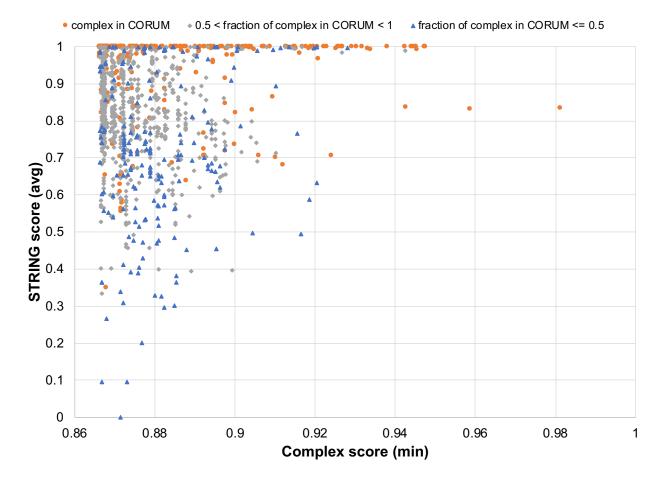
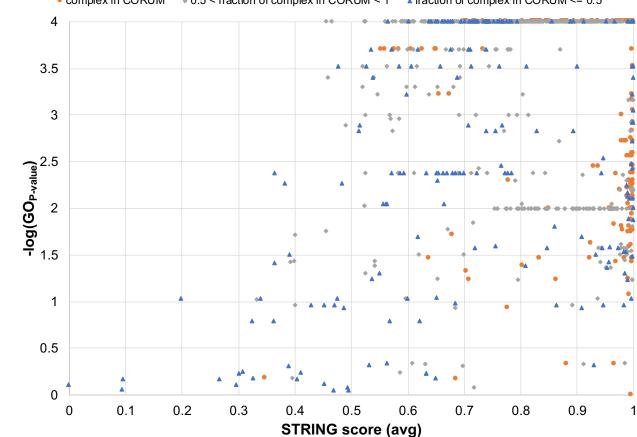


Figure S9: **Distribution of average STRING score as a function of complex score.** For each complex, we show the distribution of the average STRING score as a function of complex score. Additionally, each complex is assigned to one of the following three classes based on varying degrees of overlap with CORUM complexes: (i) full overlap with CORUM complex (orange circles), (ii) at least half the member proteins overlap with CORUM complex (grey diamonds), and less than half of co-member proteins overlap with CORUM complex (blue triangles).



 complex in CORUM • 0.5 < fraction of complex in CORUM < 1 ▲ fraction of complex in CORUM <= 0.5

Figure S10: Distribution of enriched functional annotation as a function of average STRING score. For each complex, we show the distribution of the largest p-value from enriched functional annotations (plotted as -log(GO_{P-value})) computed using g:Profiler and further adjusted to the estimated occurrence of significant enrichment from 10,000 random complexes of the same size as a function of average STRING score. Additionally, each complex is assigned to one of the following three classes of based on varying degrees of overlap with CORUM complexes: (i) full overlap with CORUM complex (orange circles), (ii) at least half the member proteins overlap with CORUM complex (gray diamonds), and less than half of co-member proteins overlap with CORUM complex (blue triangles).

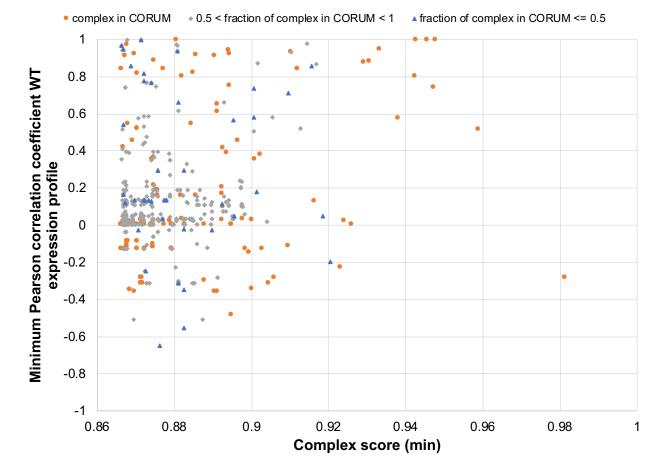


Figure S11: Distribution of minimum Pearson's correlation coefficient as a function of complex score. For each complex, we show the distribution of the minimum Pearson's correlation coefficient as a function of complex score. We further restrict the number of complexes to those with at least 50% of protein members with an entry in the expression profiles. Additionally, each complex is assigned to one of the following three classes based on varying degrees of overlap with CORUM complexes: (i) full overlap with CORUM complex (orange circles), (ii) at least half the member proteins overlap with CORUM complex (blue triangles).

Supplementary files

Supplementary file 1 Full list of predicted proteins complexes available in the following link: http://murphylab.cbd.cmu.edu/software/2019_PPI/Uncharacterized_protein_complexes.xlsx

References

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