

1. INTRODUCTION

- Network (or graph) is defined as $G(V,E,W)$.
- Ensembles of *aligned* networks are common in many areas.
- Need to convey salient features of the network ensemble.
- Goals : 1) Compare ensemble to individual.
 2) Compare two ensembles.
- Questions when comparing: Is there a difference? Direction of difference? Significant?

2. BACKGROUND

- Tukey Boxplot (Points in 1-D)
- Bagplot (Points in 2-D) [1]
- Functional Boxplot (Functions)[2]
- Contour Boxplot (Contours)[3]
- Curve Boxplot (Multivariate curves)[4]
- Path Boxplot (Paths on a network)

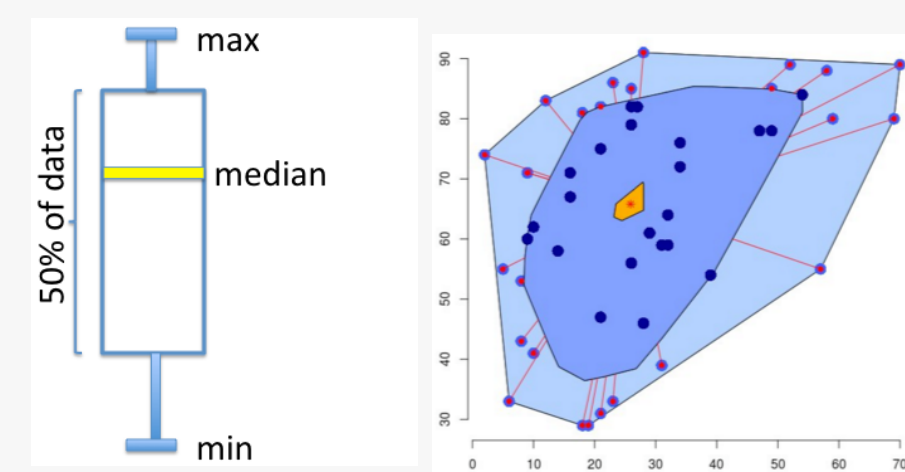
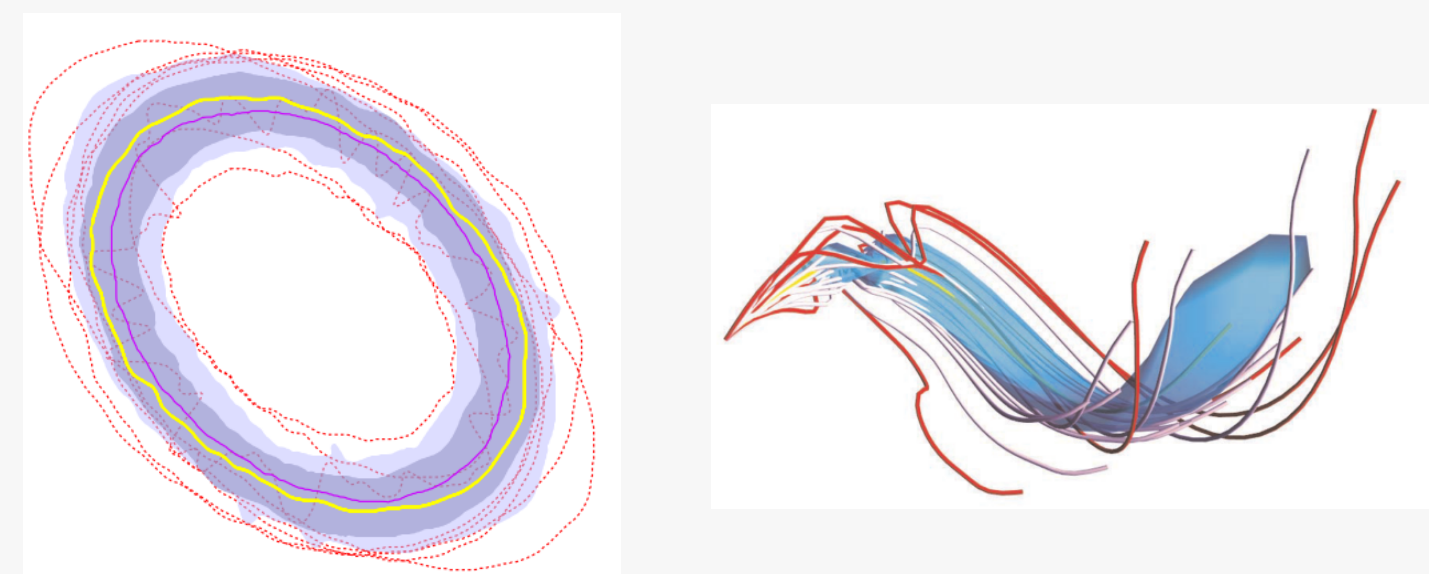


Fig. A classic boxplot for univariate data (top left). Bagplot for bivariate data (top right). Contour boxplot (bottom left). Curve boxplot (bottom right)



3. COMPUTING RANK STATISTICS

- Step 1: Convert network ensemble to function ensemble.

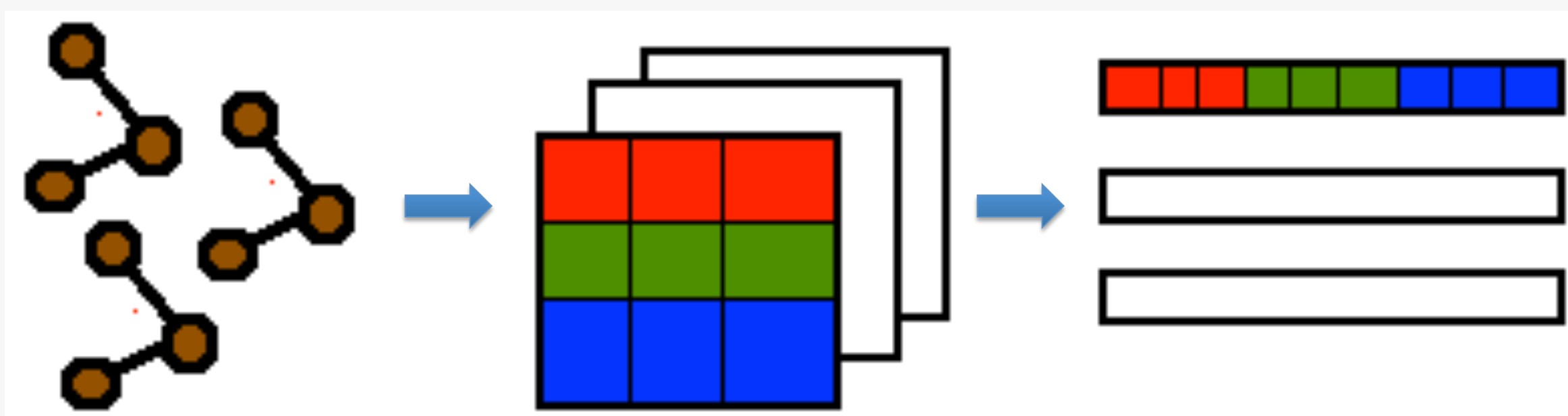


Fig. Network ensemble (left), adjacency matrix ensemble (center) and vector ensemble (right).

- Step 2: Perform functional band depth analysis[5]

$$fBD = \text{Prob}(f \in \text{Band}(f_1, \dots, f_j))$$

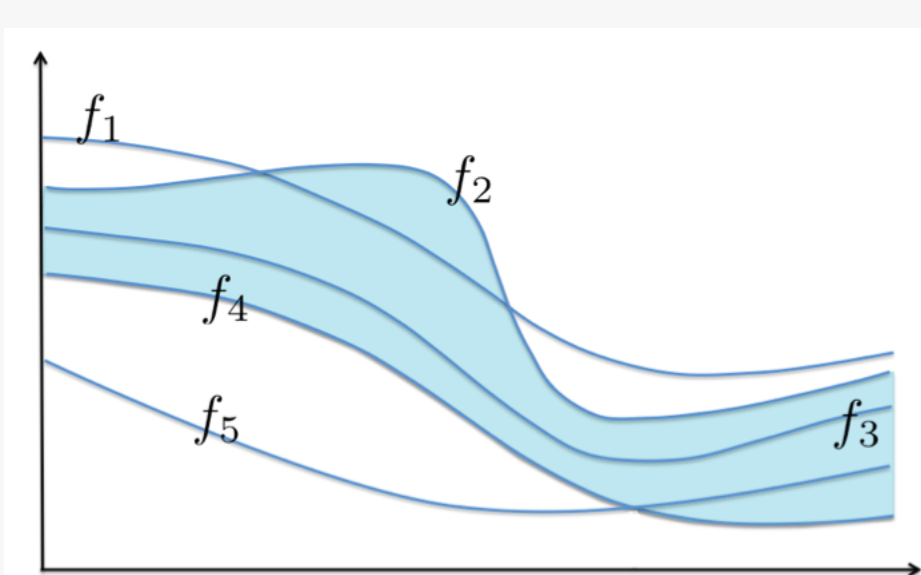
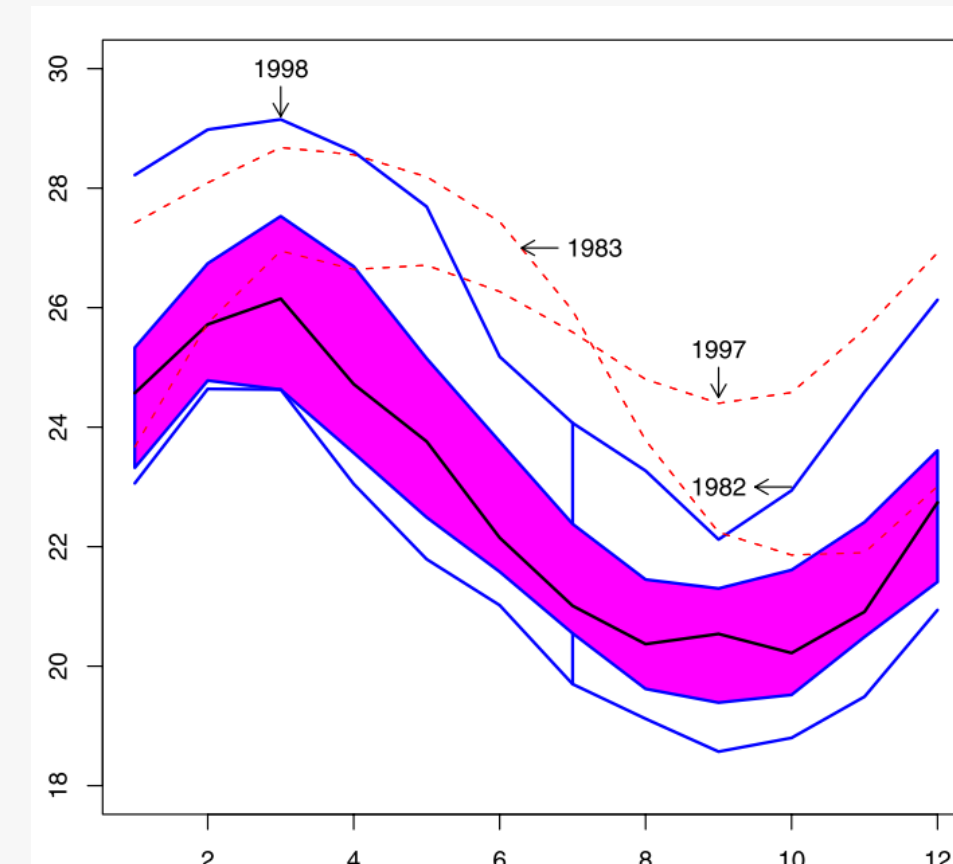


Fig. A functional band (left) and functional boxplot (right).



4. NETWORK BOXPLOT: UNWEIGHTED NETWORKS

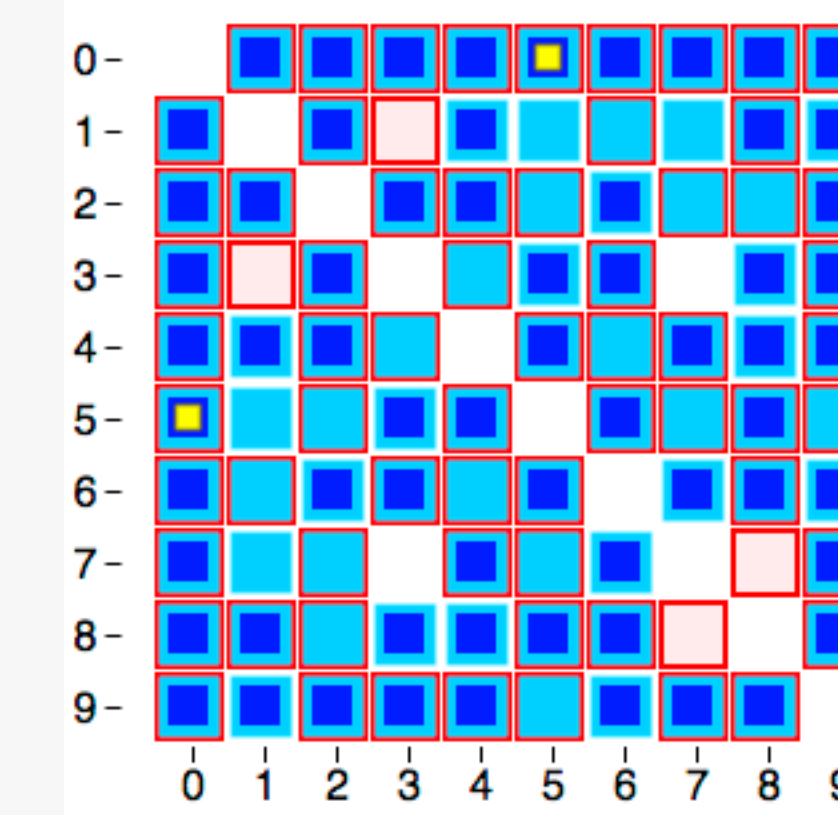
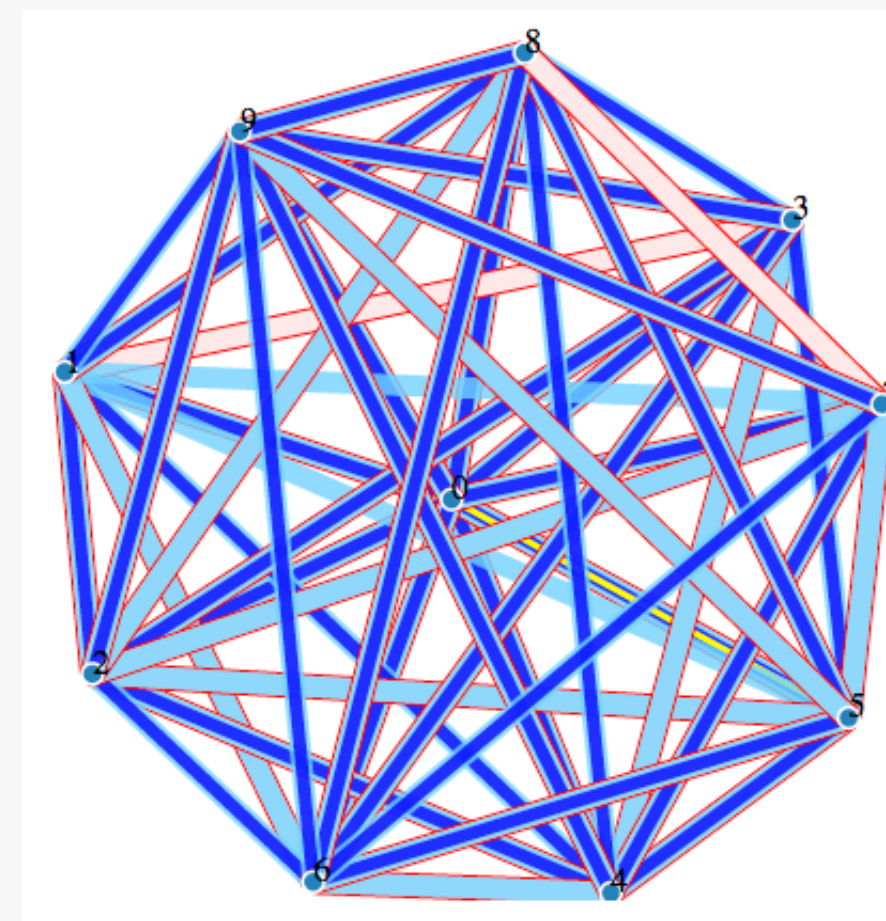


Fig. Network boxplot for synthetic (Erdos Renyi) network ensemble in two visualization schemes. Node link diagram (left) and adjacency matrix (right).

5. NETWORK BOXPLOT: WEIGHTED NETWORKS

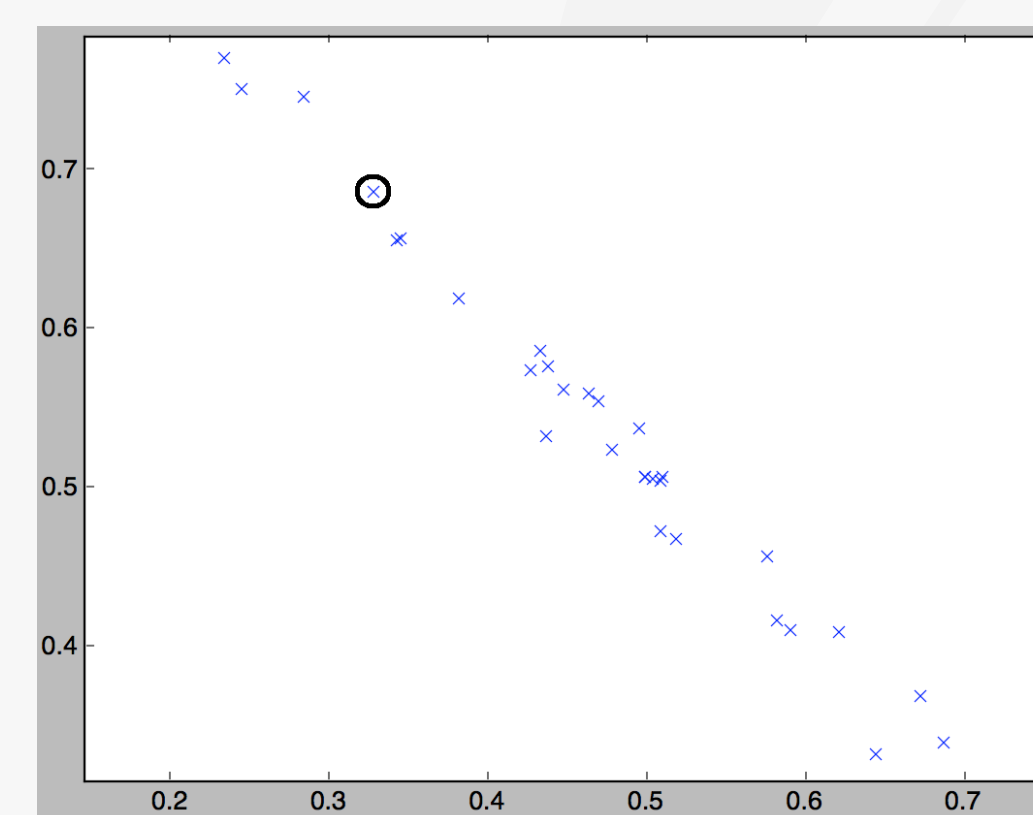


Fig. Samples from 2D normal distribution (left). Representative graph from ensemble (right).

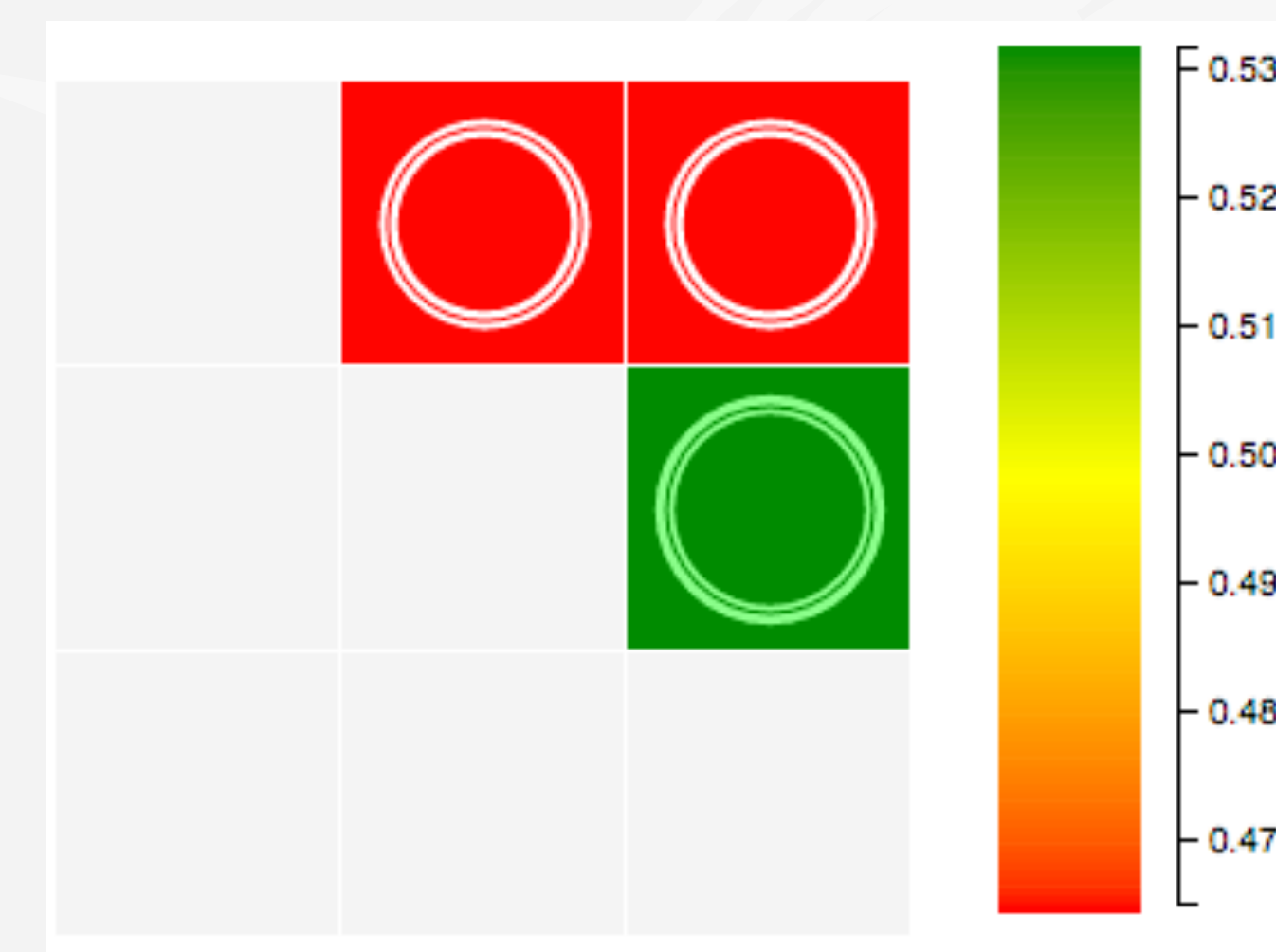
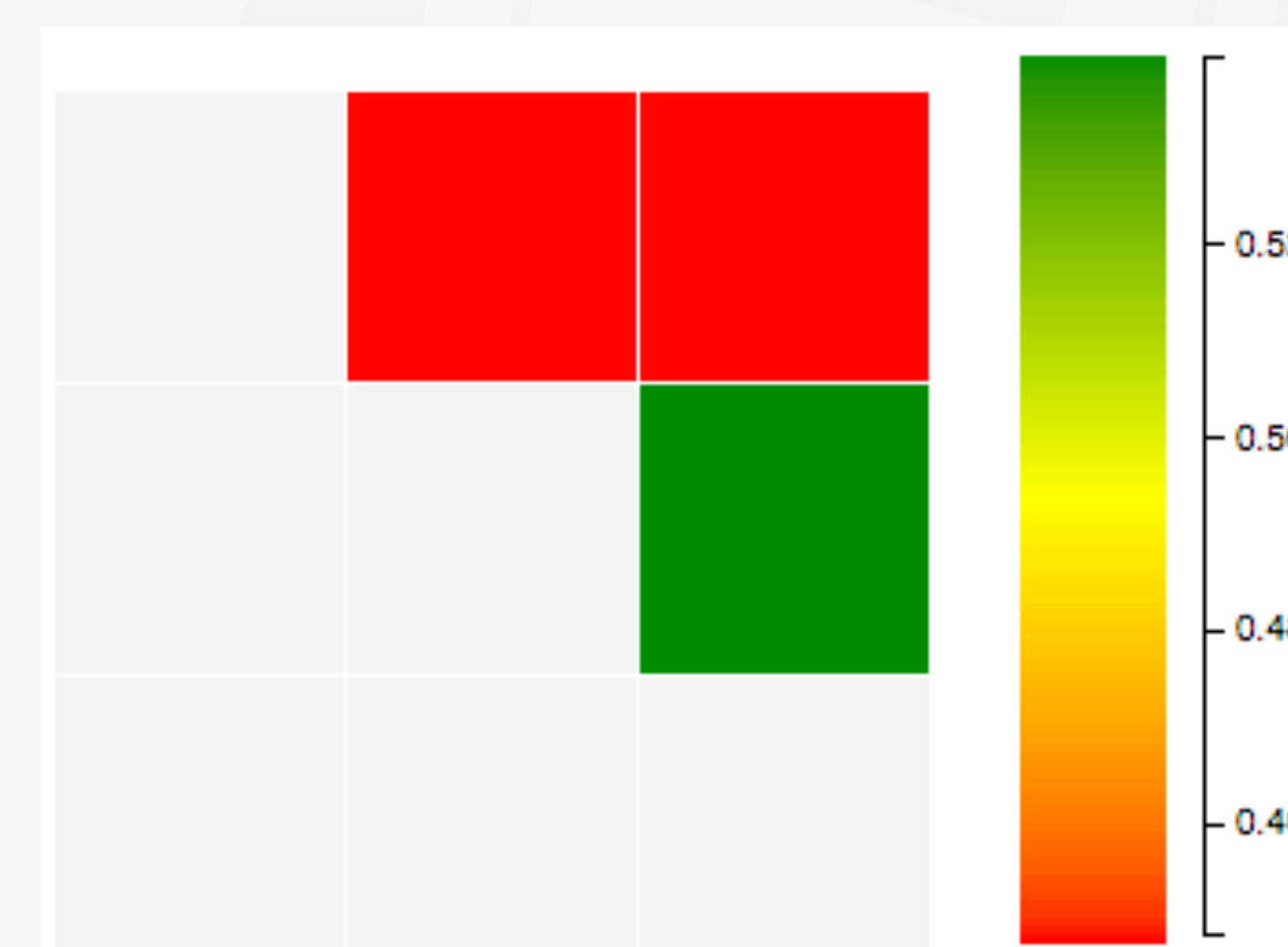
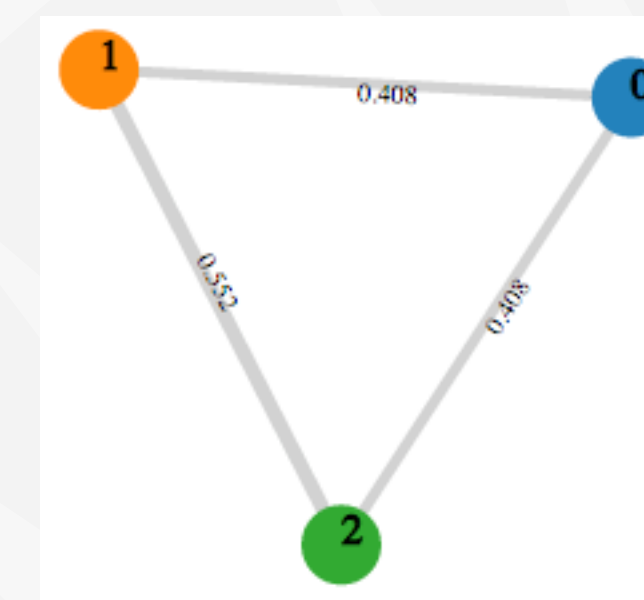
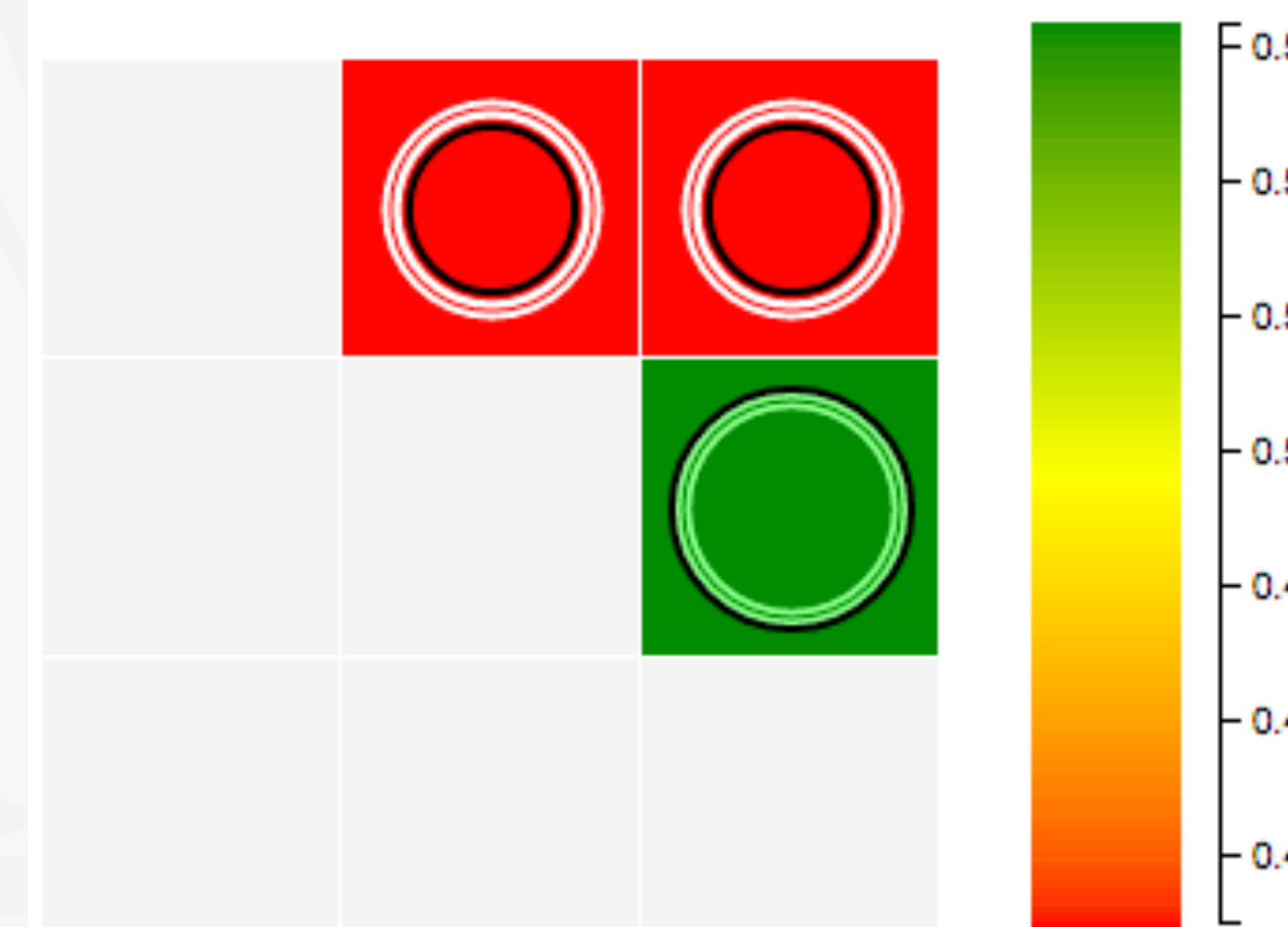


Fig. Mean adjacency matrix heatmap (top left). Network boxplot (top right). Network boxplot with highlighted outlier (bottom right).



6. COMPARING NETWORK ENSEMBLES

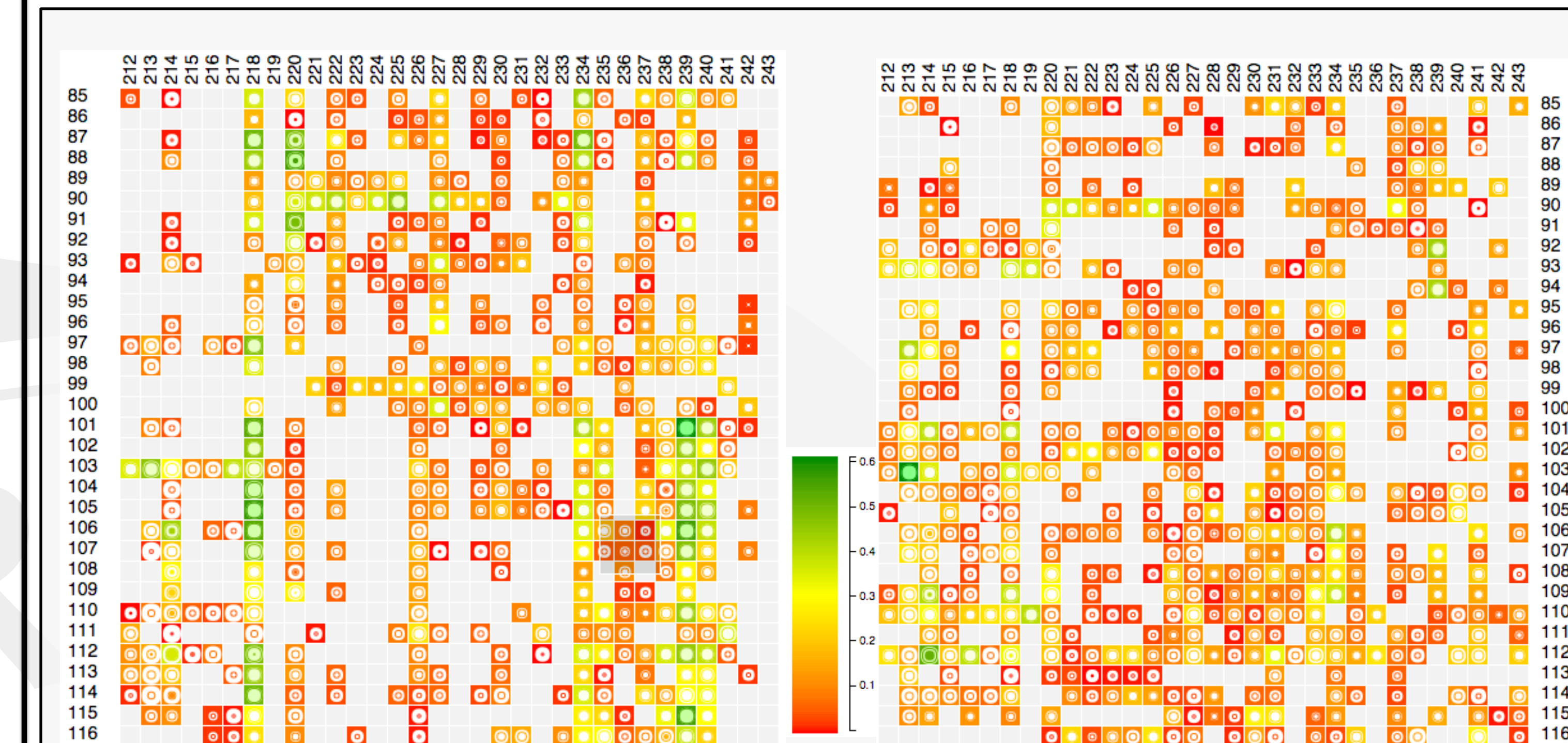
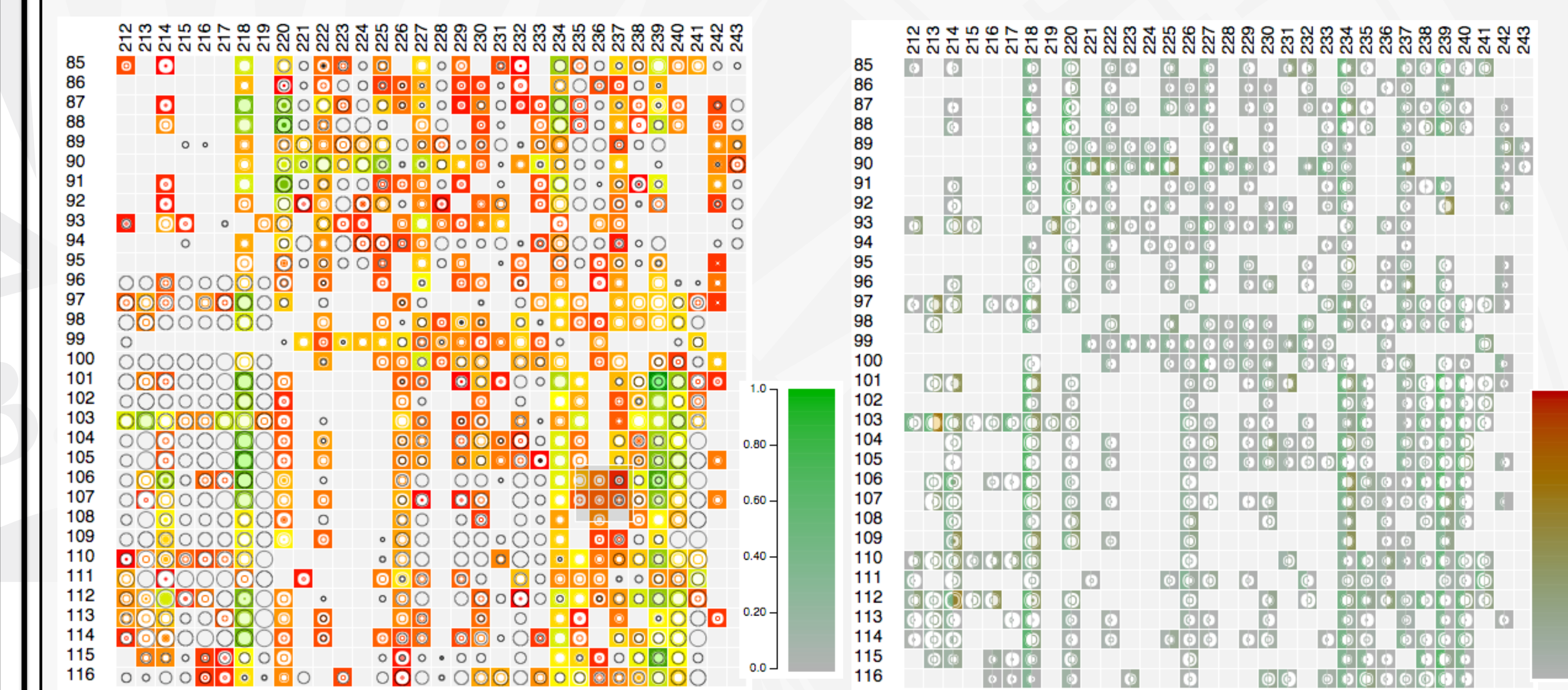


Fig. Network boxplot for fMRI data of healthy population (top left) and autistic population (top right). Population-individual comparison (bottom left). Alternative visualization scheme for difference visualization (bottom right).



7. FUTURE WORK

- User study.
- Node aggregation and node reordering.

REFERENCES

- [1] Rousseeuw et al. 1999
- [2] Sun et al. 2011
- [3] Whitaker et al. IEEE Visualization 2013
- [4] Mirzargar et al. IEEE Visualization 2014
- [5] Pintado Lopez et al. 2009

ACKNOWLEDGEMENTS

This work was supported by National Science Foundation (NSF) grant IIS-1212806.