

Model Degeneracy

- Using the faux.mesa.high network
- Fit a model where the formula is edges + triangle
 - What happens?

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Error: Number of edges in a simulated network exceeds that in the observed by a factor of more than 20. This is a strong indicator of model degeneracy or a very poor starting parameter configuration. If you are reasonably certain that neither of these is the case, increase the MCMLE.density.guard control.ergm() parameter.
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- Trying to fit this model, the algorithm heads off into networks that are *much* more dense than the observed network.
- What does this mean? That this model would not have produced this network, for any combination of parameter estimates for the two terms
 - i.e., this is a model misspecification problem

Degeneracy Plot (for the 2 star model)

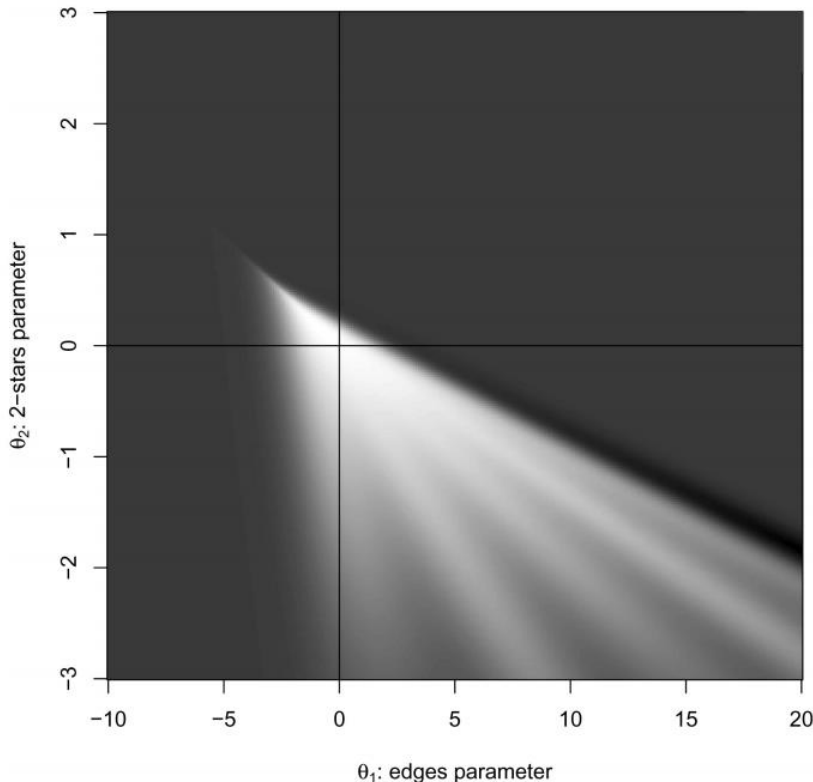


Figure 3: Cumulative Degeneracy Probabilities for graphs with 7 actors.

From Mark Handcock's 2003 tech report:

<https://www.csss.washington.edu/Papers/2003/wp39.pdf>

- Only the white area has networks with some interesting variation
- The dark areas are complete graphs, or empty graphs (+/- 1 or 2 edges)
- This model does not produce many useful networks

Solution: better network statistics

- Old statistic:

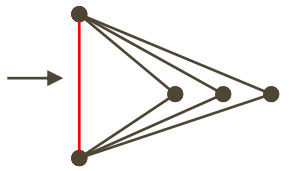
- $t(x) = \#$ of triangles in the graph

Here, every additional 3-cycle has the same impact, θ

- New statistic:

- Set declining marginal returns for each additional 3-cycle involving the same edge
- I.e., the more partners in common that A and B have, the more likely they are to become partners—but the increase in the odds gets smaller with each additional shared partner
- The specific function we place on this shared partner distribution involves a geometric weighting
- Hence the name: ***geometrically weighted edge-wise shared partners***
- A.k.a. GWESP
- The parameter that specifies the rate of decline in marginal returns is α
- The smaller the α , the more rapid the decline

Solution: better network statistics



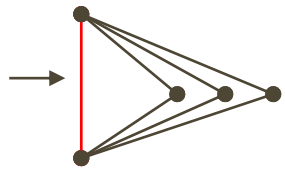
$$gwesp = e^\alpha \sum_{i=1}^{n-2} \{1 - (1 - e^{-\alpha})^i\} sp_i \quad sp_i = \# \text{ of edges with } i \text{ shared partners}$$

This configuration contains:

- 1 edge with 3 shared partners
- 6 edges with 1 shared partner

α	GWESP(α)
0	$e^0[(1 - (1 - e^{-0})^1) \times 6] + e^0[(1 - (1 - e^{-0})^3) \times 1] = 7$
0.5	$e^{0.5}[(1 - (1 - e^{-0.5})^1) \times 6] + e^{0.5}[(1 - (1 - e^{-0.5})^3) \times 1] = 7.55$
1	$e^1[(1 - (1 - e^{-1})^1) \times 6] + e^1[(1 - (1 - e^{-1})^3) \times 1] = 8.03$

Solution: better network statistics



$$gwesp = e^{\alpha} \sum_{i=1}^{n-2} \{1 - (1 - e^{-\alpha})^i\} sp_i \quad sp_i = \# \text{ of edges with } i \text{ shared partners}$$

A count of each edge in each triangle (i.e. # of triangles x 3)



A count of edges in at least one triangle (because only an edge's first triangle counts)

