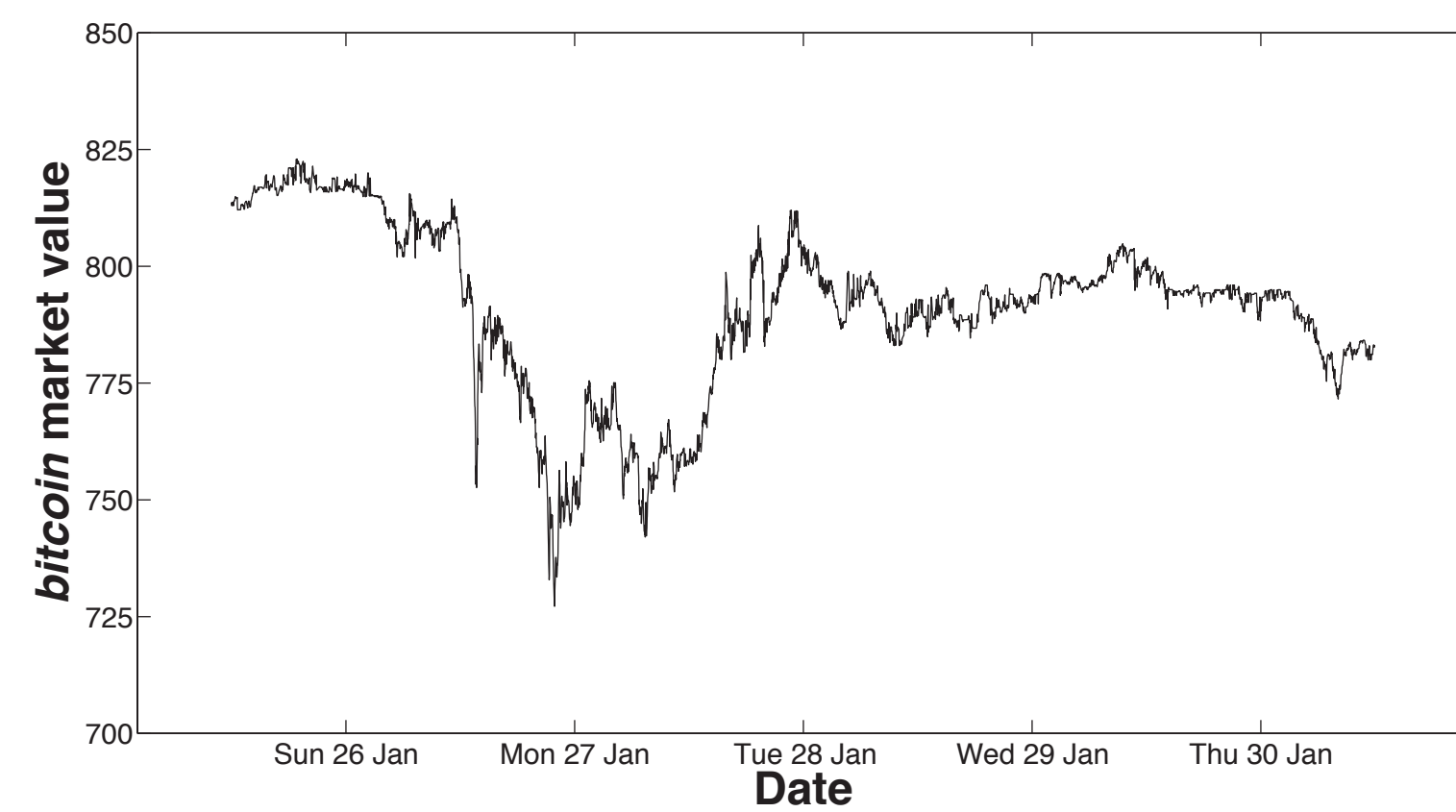


EXPLORATORY ANALYSIS OF *bitcoin* MARKET VALUE BY NETWORK GROUP DISCOVERY

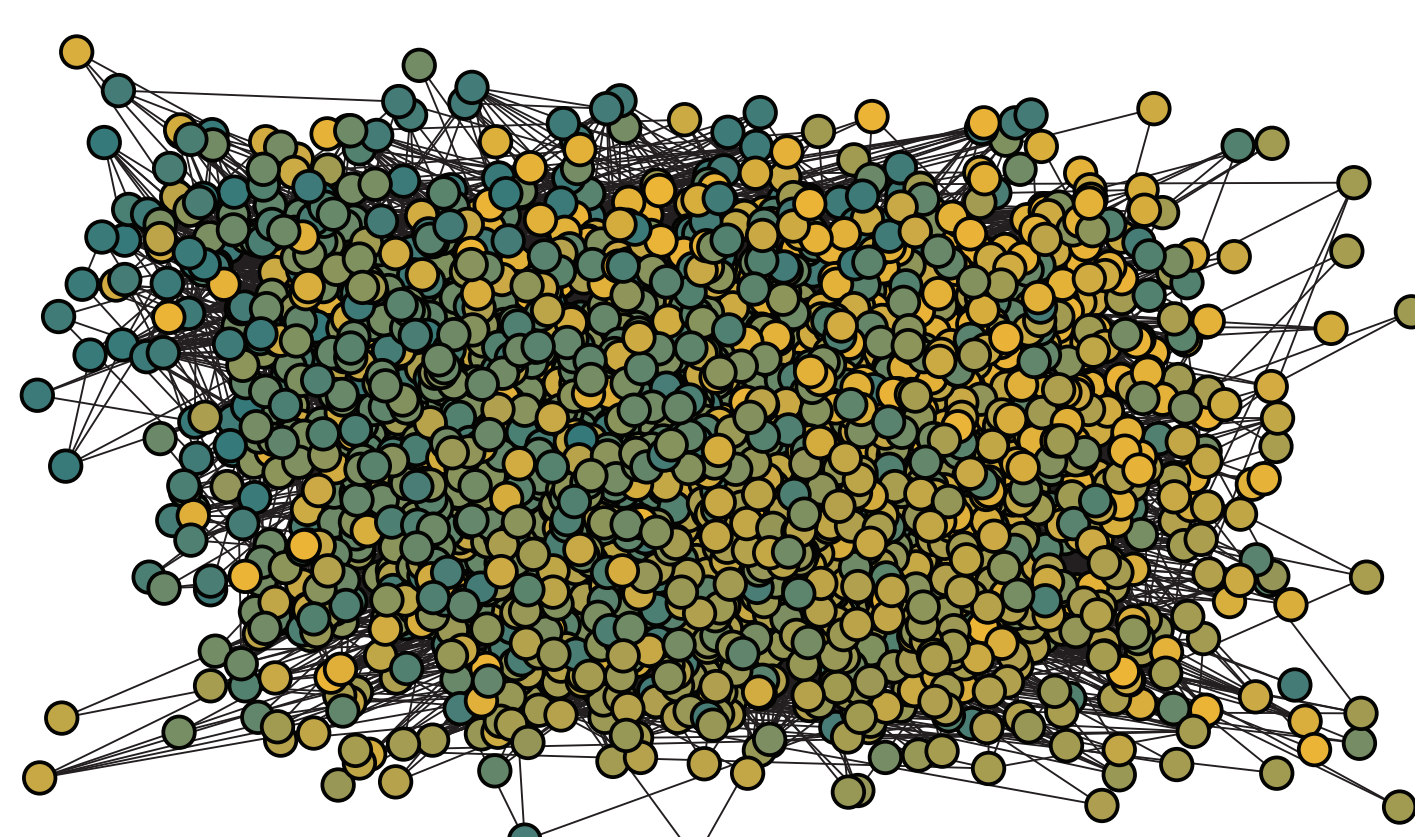
Lovro Šubelj*, Gregor Weiss, Neli Blagus & Marko Bajec
 University of Ljubljana, Faculty of Computer and Information Science
 *lovro.subelj@fri.uni-lj.si



SERIES BitStamp *bitcoin* market price
 PERIOD 5 days in January 2014
 FREQUENCY \approx per minute
 LENGTH 4339 points
 VALUE \$789.6
 METHODS network group discovery [1,2]
 APPLICATIONS stream mining process [3]

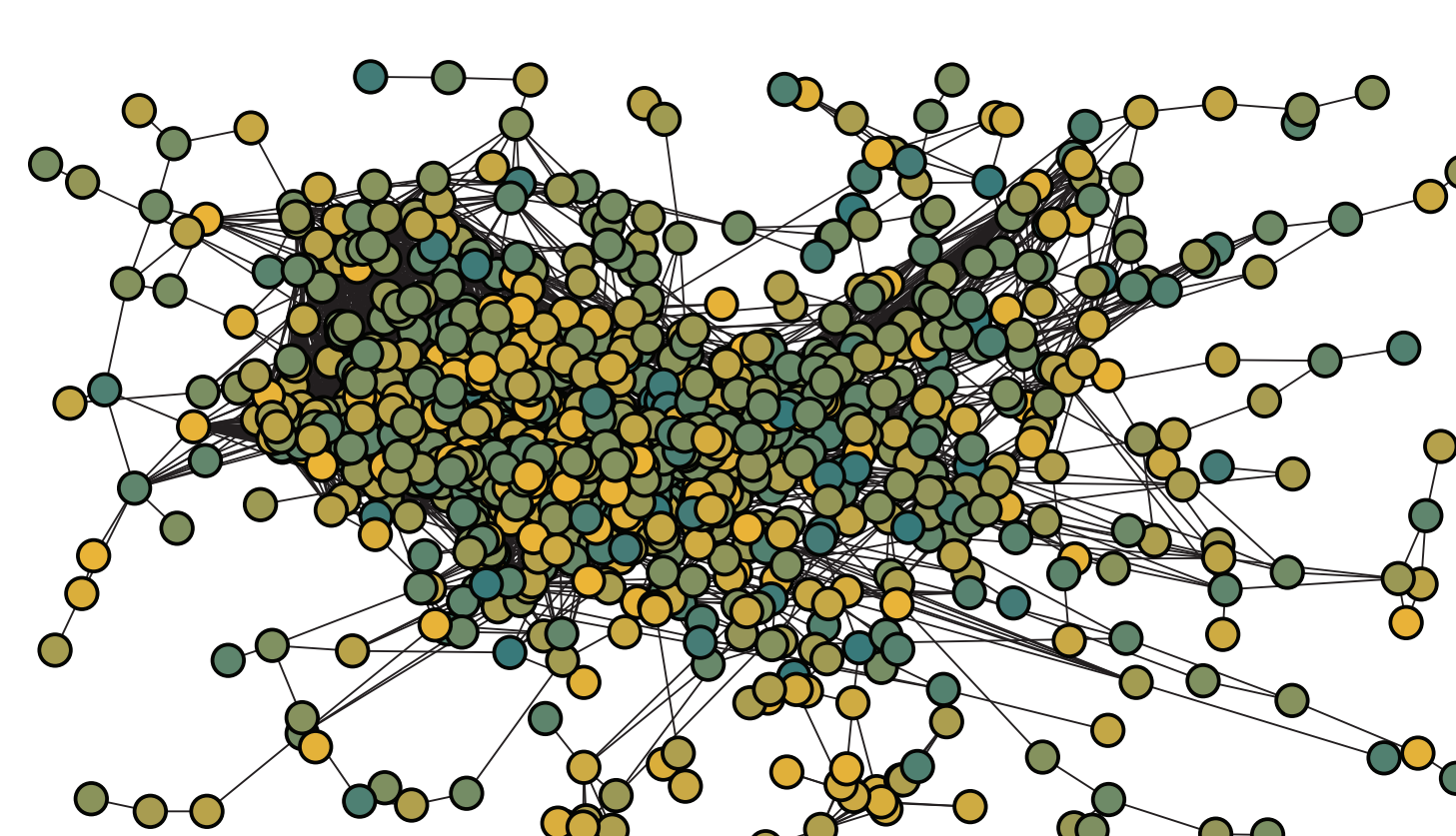
NETWORK REPRESENTATION

NETWORK undirected **visibility** graph [4]
 NODES individual **points** of time series
 LINKS **non intersecting** lines of points



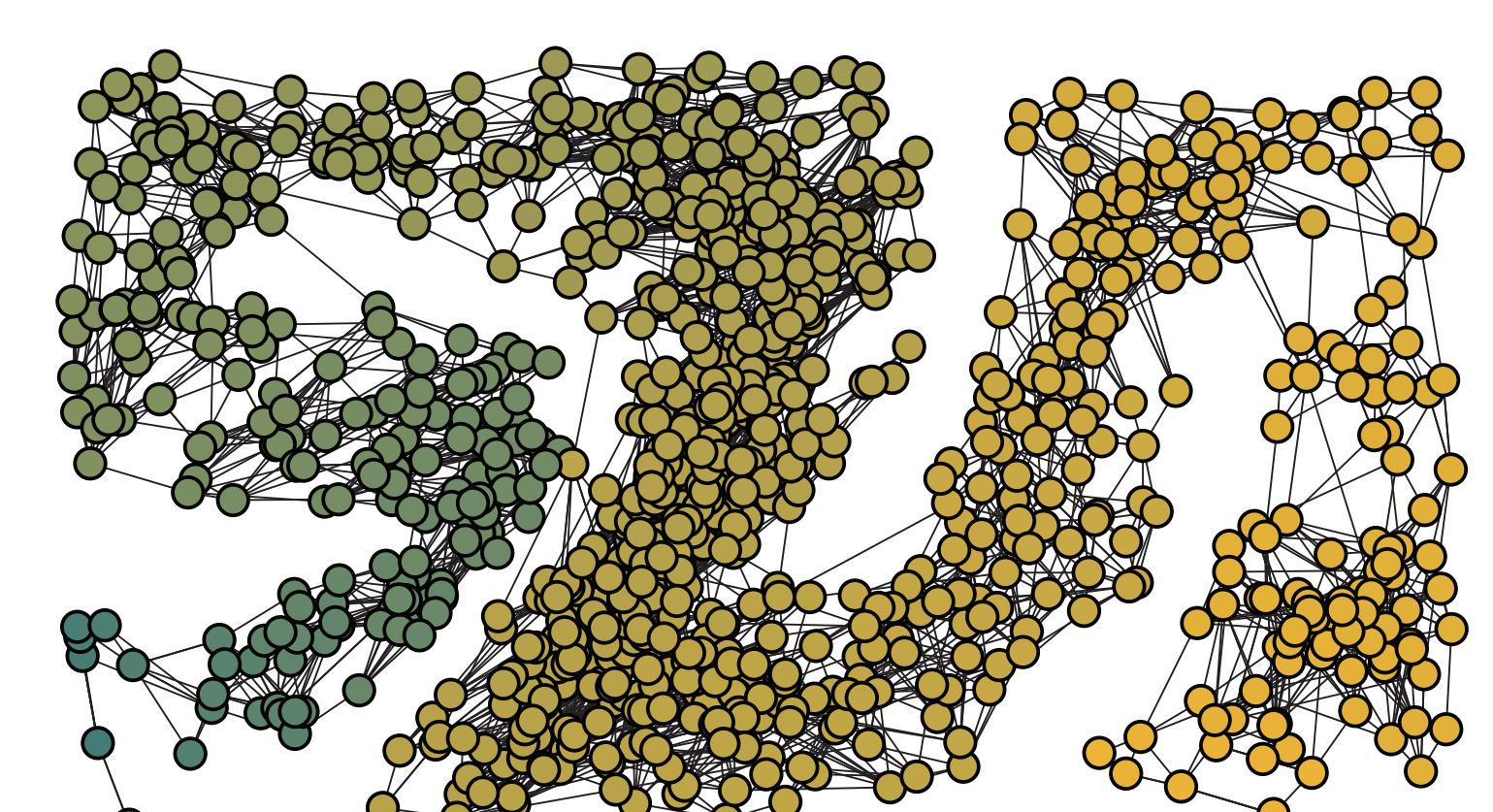
Node colors represent timestamps of points (from green to orange).

NETWORK undirected **correlation** network [5]
 NODES overlapping **segments** of 15 points
 LINKS Pearson **correlations** above 0.95



Node colors represent timestamps of segments (from green to orange).

NETWORK directed **transition** network [6]
 NODES **1000-quantiles** of time series
 LINKS **transitions** of consecutive points



Node colors represent quantiles that range from \$727 (green) \$823 (orange).

NETWORK STRUCTURE

NODES **4339** SCALE-FREE $k^{-2.34}$
 LINKS **30842** CLUSTERING **0.72**
 DEGREE **14.22** DIAMETER **8.37**
 LCC **100 %** MIXING **0.27**

Visibility graphs have similar structure as collaboration networks.

NODES **1344** SCALE-FREE $k^{-1.94}$
 LINKS **10383** CLUSTERING **0.34**
 DEGREE **15.45** DIAMETER **9.53**
 LCC **87 %** MIXING **0.40**

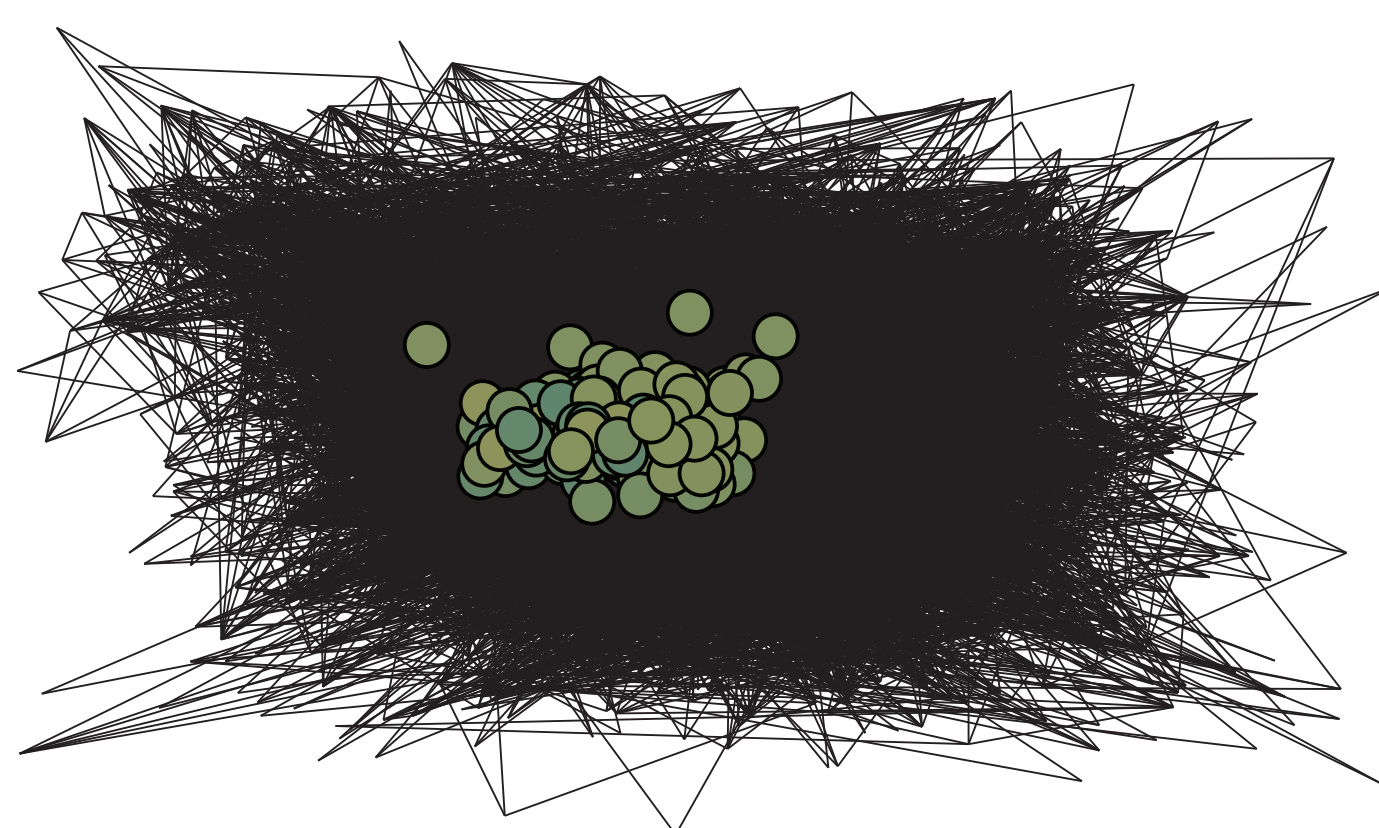
Correlation networks have similar structure as social networks.

NODES **1000** SCALE-FREE /
 LINKS **3822** CLUSTERING **0.12**
 DEGREE **7.64** DIAMETER **19.78**
 LCC **100 %** MIXING **0.05**

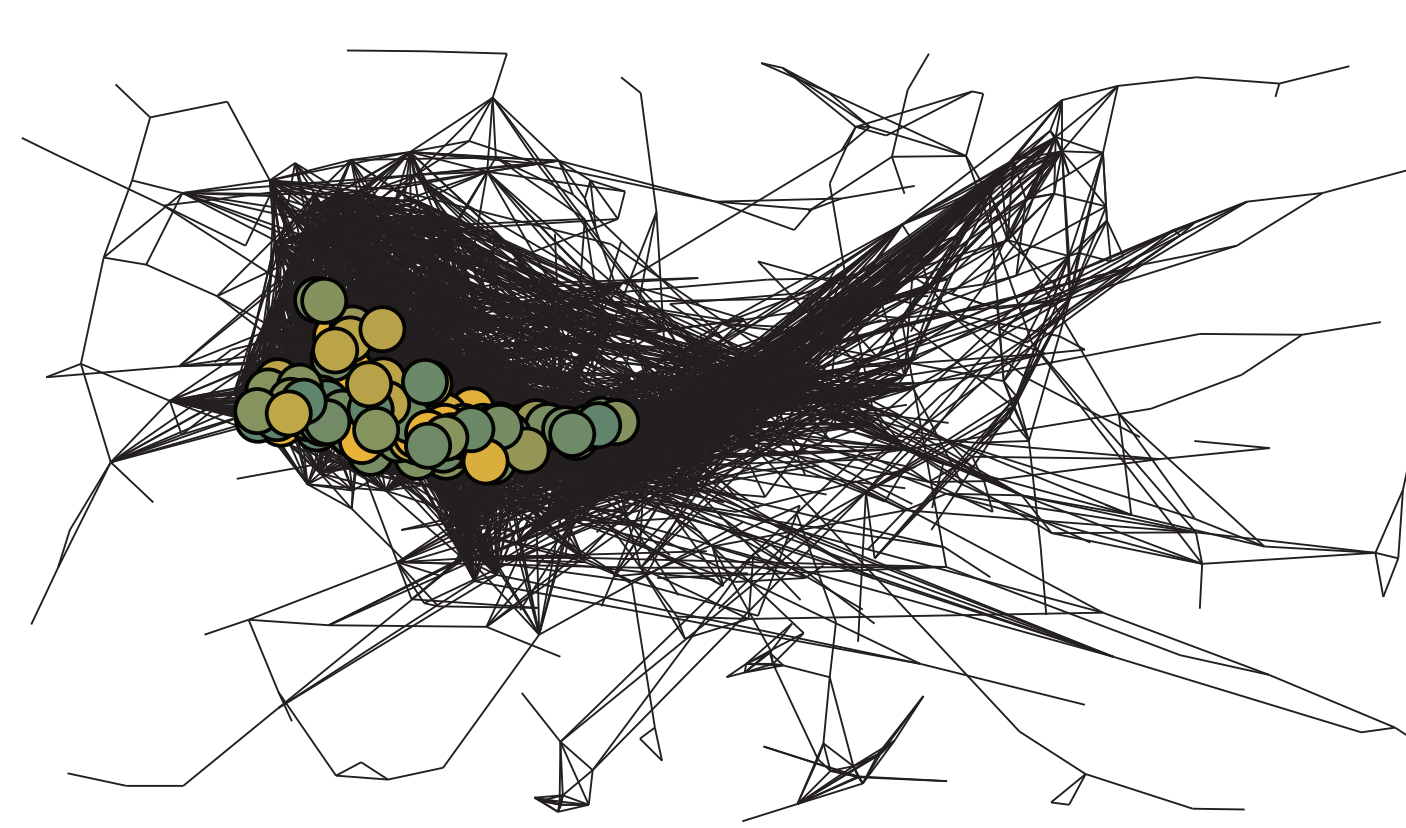
Transition networks have similar structure as technological networks.

GROUP DISCOVERY

NUMBER **161** COMMUNITY **75 %**
 GROUP **38.92** PATTERN **39.29**

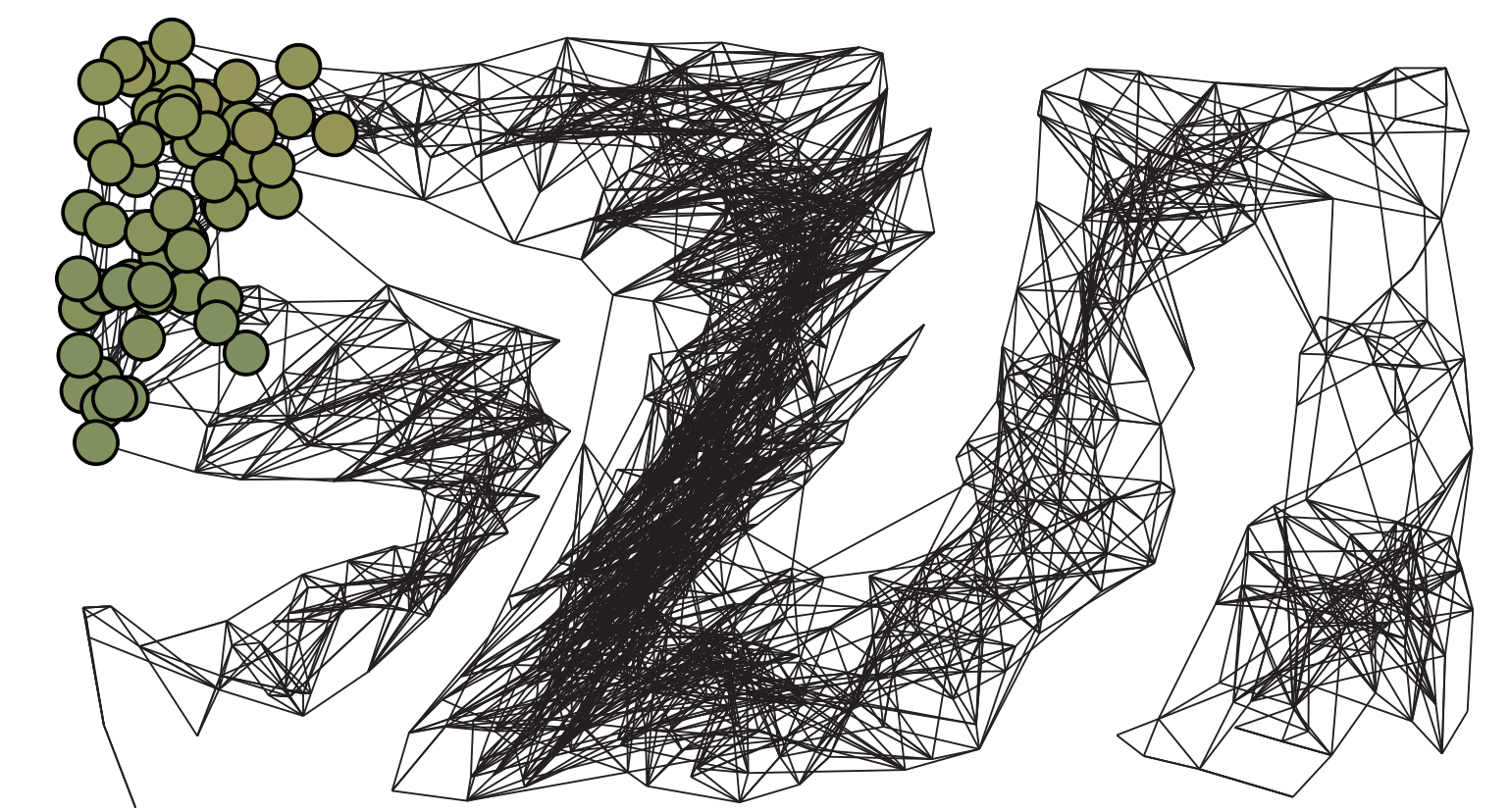


NUMBER **71** COMMUNITY **77 %**
 GROUP **26.62** PATTERN **27.82**



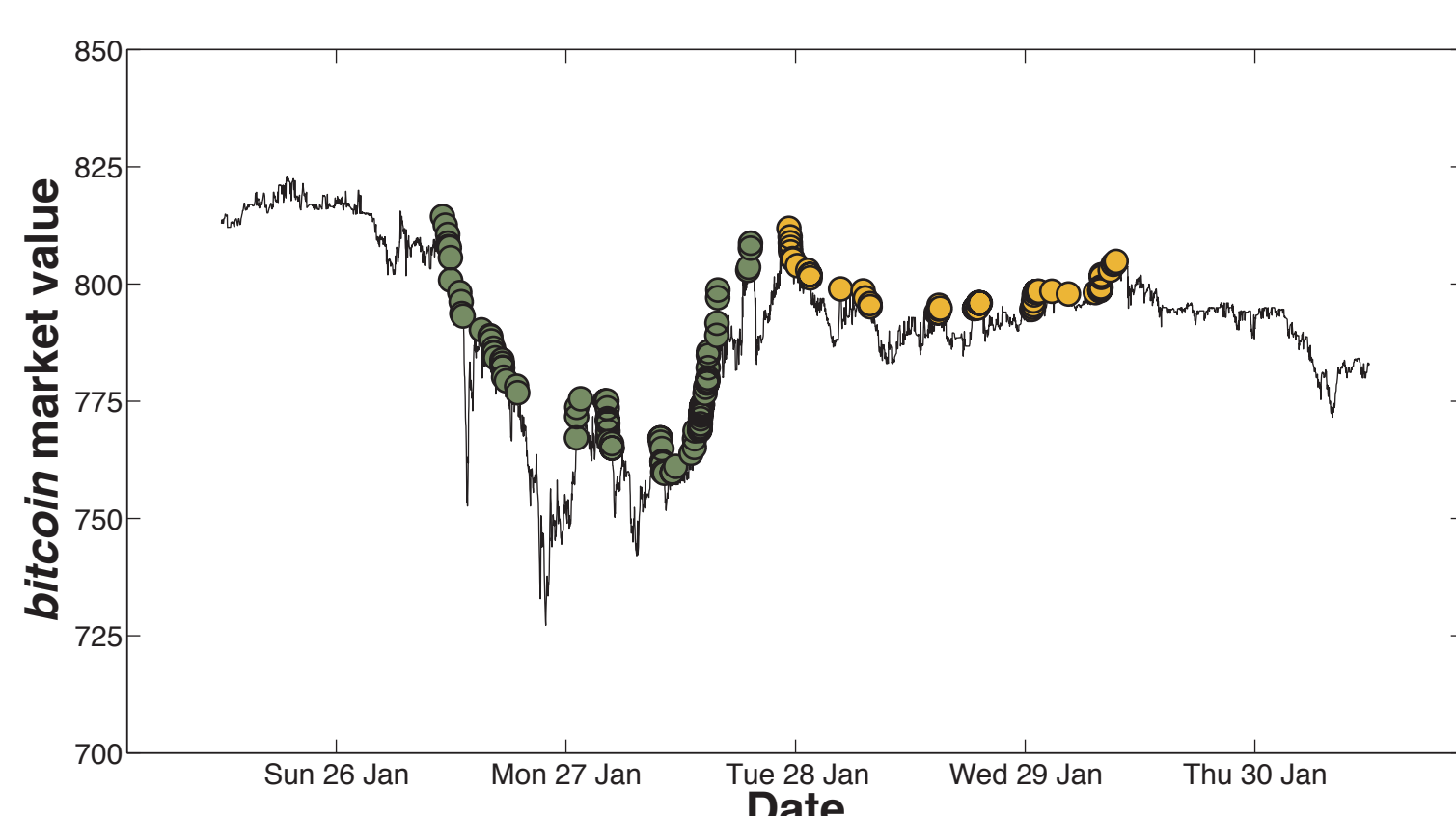
Sequential extraction of overlapping node groups and their patterns that can be communities, modules or mixtures of these (P -value = 0.01). [2]

NUMBER **40** COMMUNITY **82 %**
 GROUP **28.85** PATTERN **29.78**



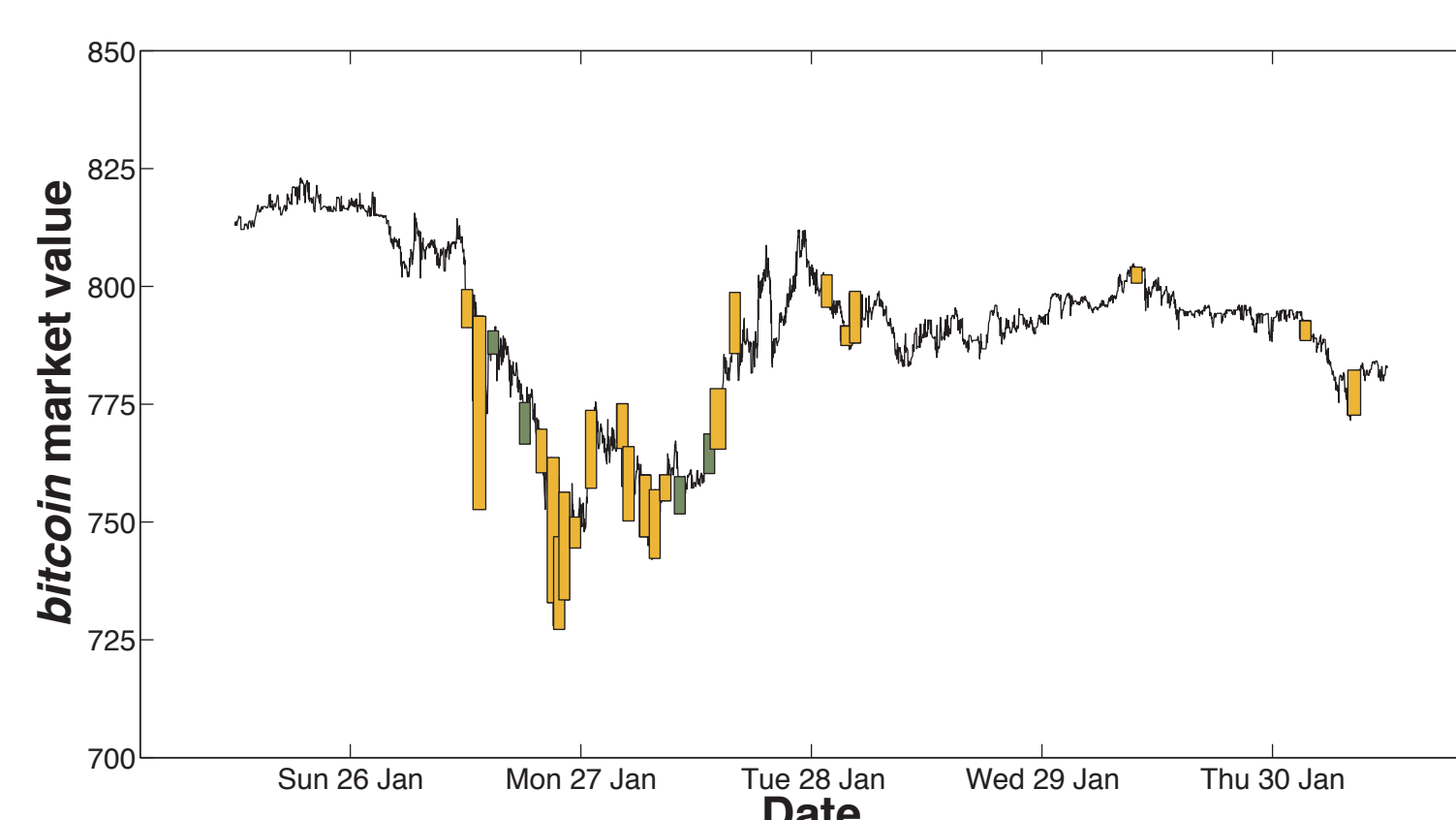
EXPLORATORY ANALYSIS

GROUPS **local maxima of *bitcoin* value**
 APPLICATIONS **period & market prediction**



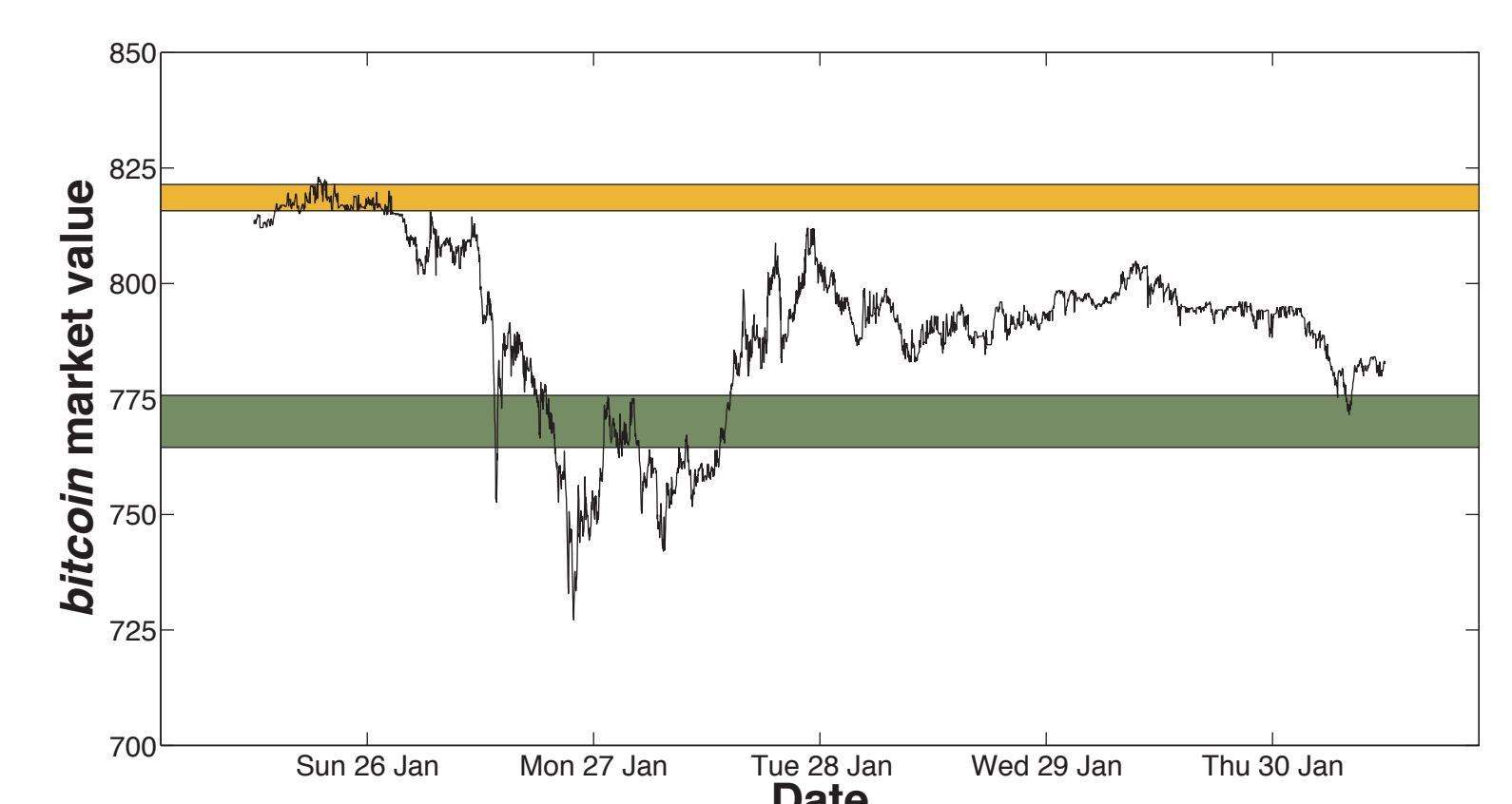
First (green) and second (orange) most significant groups of 133 and 93 points.

GROUPS **sudden shifts in *bitcoin* value**
 APPLICATIONS **anomaly & market prediction**



First (green) and second (orange) most significant groups of 117 and 67 segments.

GROUPS **steady periods of *bitcoin* value**
 APPLICATIONS **market concept drift detection**



First (green) and second (orange) most significant groups of 60 and 57 quantiles.

[1] Donner, R. V., Small, M., Dongs, J. F., Marwan, N., Zou, Y., Xiang, R., & Kurths, J. (2011) *Int. J. Bifurcat. Chaos* 21(4).
 [2] Šubelj, L., Blagus, N., & Bajec, M. (2013) In *Proc. of NetSci '13*: Copenhagen, Denmark, pp. 152–153.
 [3] Šubelj, L., Bosnić, Z., Kukar, M., & Bajec, M. (2014). In *Proc. of CAISE '14*: Thessaloniki, Greece, pp. 409–423.
 [4] Lacasa, L., Luque, B., Ballesteros, F., Luque, J., & Nuno, J. C. (2008) *P. Natl. Acad. Sci. USA* 105(13), 4972–4975.
 [5] Yang, Y. & Yang, H. (2008) *Physica A* 387(5–6), 1381–1386.
 [6] Campanharo, A. S. L. O., Sizer, M. I., Malmgren, R. D., Ramos, F. M., & Amaral, L. A. N. (2011) *PLoS ONE* 6(8), e23378.

