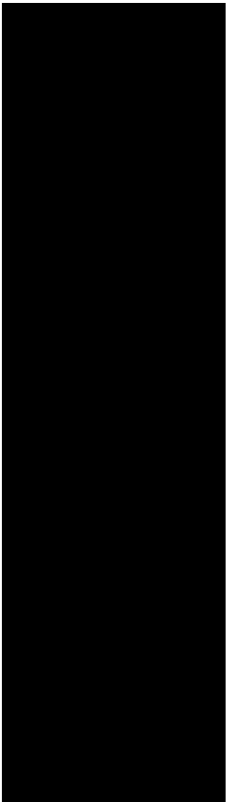
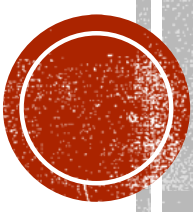
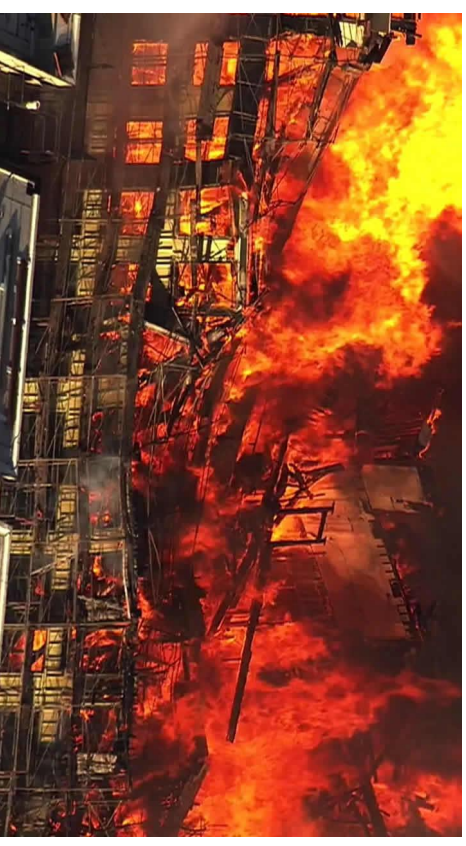


# POINT PROCESSES ANALYSIS OF SAN FRANCISCO PROPERTY FIRES



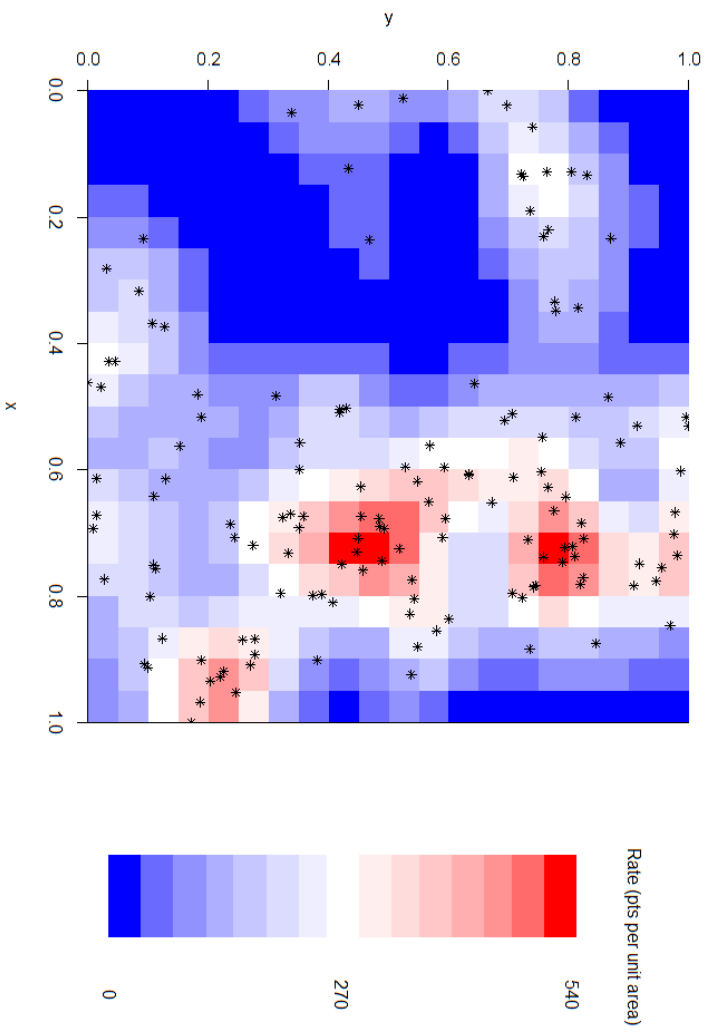
# DATA

- Obtained all SFPD data from 2016 from San Francisco city website
- Sorted on reports of fires, removed entries with estimated damages at or above \$10,000
- Total of 145 points



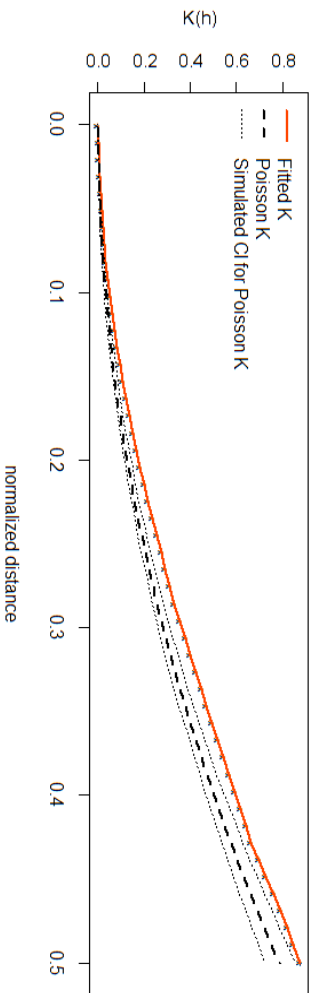
# DENSITY PLOT OF DATA

SF Fires - Quadratic Kernel

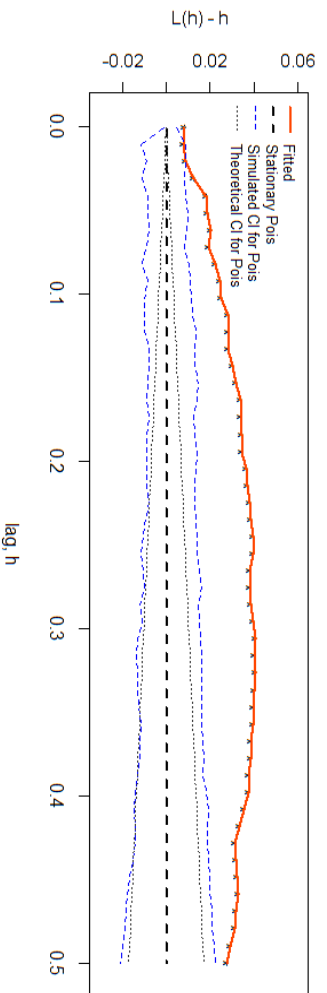


# EVIDENCE OF CLUSTERING

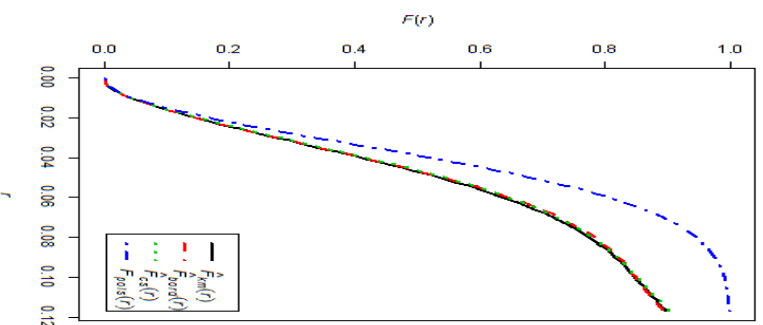
SF Fires - K Function



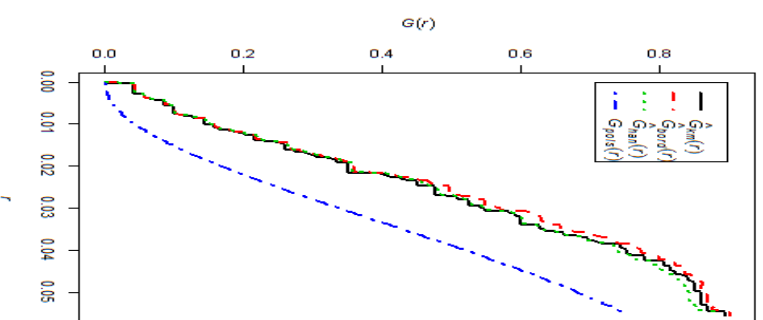
SF Fires - L Function



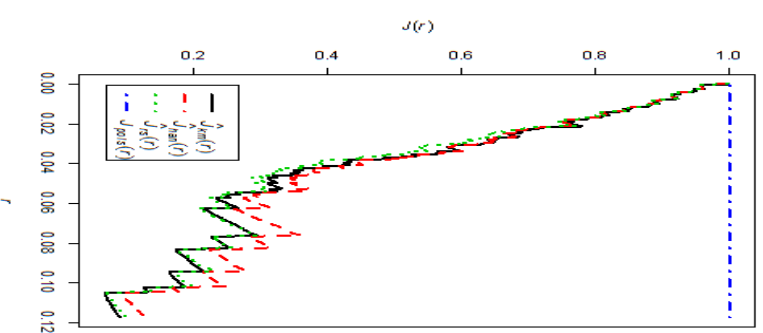
F Function



G Function



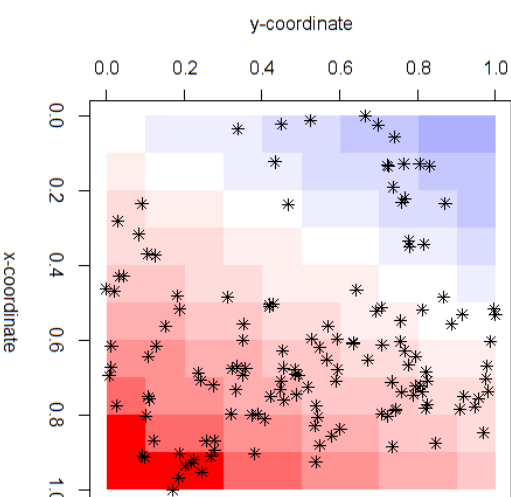
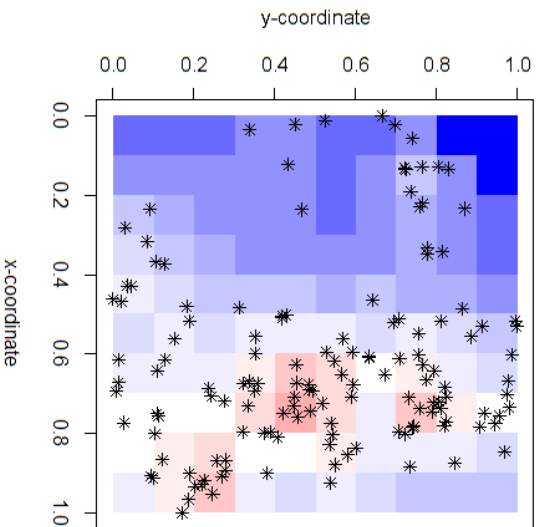
J Function



# MODEL FITTING: PSEUDO-LIKELIHOOD

$$\lambda(z|z_1, \dots, z_k) = \mu + \alpha x + \beta y + \gamma \sum_{i=1}^k \frac{a_1 e^{-a_1 D(z_i, z)}}{2\pi D(z_i, z)} \quad \text{where } z = (x, y)$$

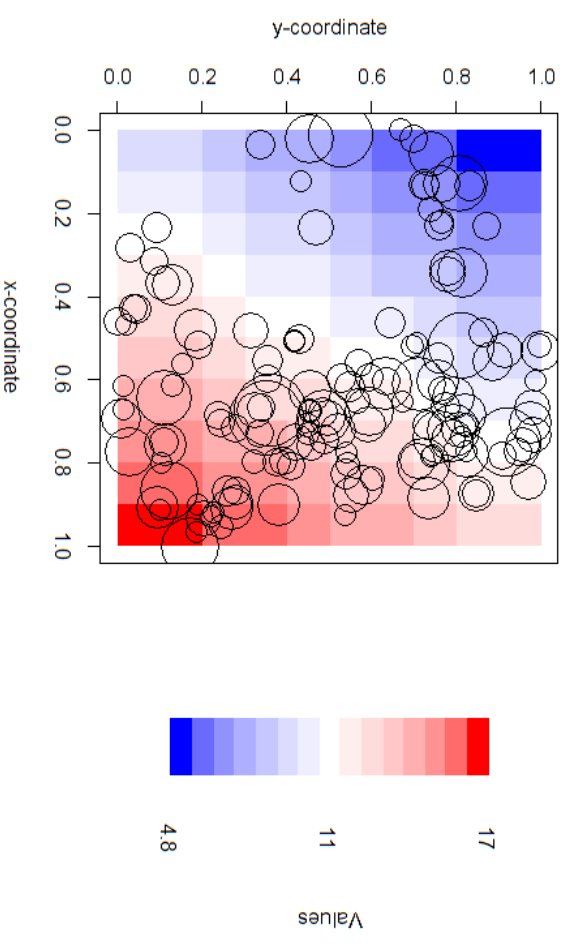
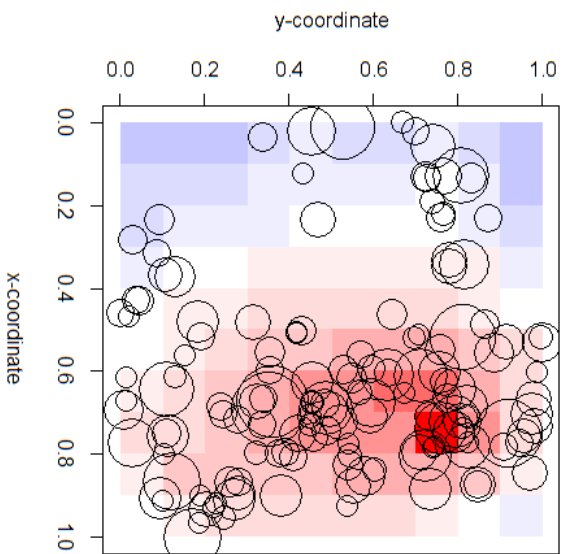
Parameter	$\mu$	$\alpha$	$\beta$	$\gamma$	$a_1$
Estimate	40.0677	46.3967	-25.5232	0.6668	22.9478
SE	23.5418	40.2591	35.5214	0.1382	5.5774



# MODEL FITTING: MARKED PSEUDO-LIKELIHOOD

$\lambda(s|s_1, \dots, s_k) = \mu + \alpha x + \beta y + \gamma \sum_{i=1}^k a_i e^{-a_1 z_i D(s_i, s)}$  where  $s = (x, y)$ ,  $z = \text{damage}$  (\$thousands)

Parameter	$\mu$	$\alpha$	$\beta$	$\gamma$	$a_1$
Estimate	9.6308	8.3263	-5.4937	0.8870	0.0949
SE	10.8862	12.1349	15.7862	0.1033	0.0136



# MODEL FITTING: HAWKES PROCESS

$$\lambda(t, x, y) = \mu(x, y) + k \int_{t' < t} g(t - t', x - x', y - y') dN(t', x', y')$$

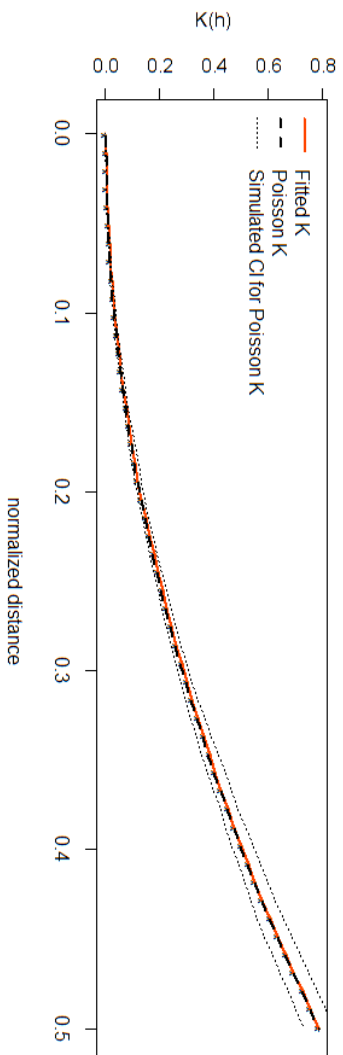
Parameter	$\mu$	$k$	$\alpha$	$\beta$
Estimate	0.0180	0.8187	29.8745	0.0345
SE	0.0078	0.0807	5.3949	0.0068

- Low background rate
- Very high  $k$  suggests only about 1/5 of the points are background points

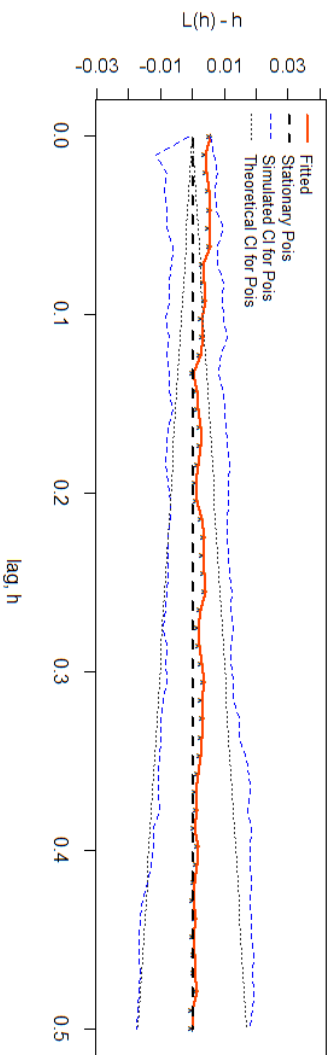


# MODEL FITTING: HAWKES PROCESS

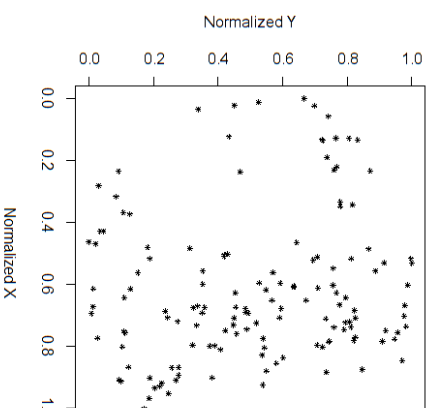
Superthinned Hawkes - K Function



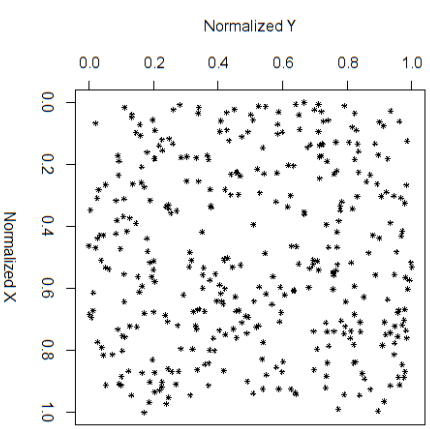
Superthinned Hawkes - L Function



original pts.



superthinned points





# DISCUSSION OF RESULTS

- Probability model for appearance of fires appears to be somewhat different than model for total damages, but more data should be added to reduce variance
- Hawkes process seems to fit well when analyzing superthinned results, but large triggering intensity is suspicious

## **Future areas of study**

- Inclusion of potential covariates such as crime, housing density, neighborhood, median property values
- Relationship between fire damage and distance from nearest fire station
- Looking at point patterns for fires in other cities

