## Efficient Estimation of N -point Spatial Statistics

- n-point correlation functions give the probability of points occurring in a given configuration
- A general, powerful spatial statistic, capable of fully

$d V_{1}$
 characterizing any distribution
- Previously used to understand:
- Hierarchical structure formation
- Gaussianity of the early universe
- Models of galaxy mass bias



## Computational Task

- Estimate $n$-point functions by counting $n$-tuples of points satisfying some distance constraints - $O\left(N^{n}\right)$ directly, per set of constraints
- Need many sets of constraints - repeat computation $M$ times
- Need to estimate variance - repeat the computation for J subsamples
- Need large $n$ (at least 3) to accurately distinguish distributions SDSS (millions of points) Virgo Sim. (billions of points)


Overall complexity:
$O\left(J \cdot M \cdot N^{n}\right)$

## Efficient Computation

- Build kd-trees on the data
- Compare $n$ nodes, prune if distance bounds allow


Share information among different matches

- overcome dependence on M
$\left\{\begin{array}{l}\text { incorporate jackknife }\end{array}\right.$
- overcome dependence on J

$k d$-tree Level $2 k d$-tree Level 4



# Preliminary Results \& Ongoing Work 

|  | Multi-bandwidth <br> new | Single bandwidth <br> [Moore, et al, 200I] | Naive $-O\left(\mathrm{~N}^{n}\right)$ <br> (estimated) |
| :---: | :---: | :---: | :---: |
| 2 point cor. <br> 100 matchers | 4.96 s | 352.8 s | $2.0 \times 10^{7} \mathrm{~s}$ |
| 3 point cor. <br> 243 matchers | 13.58 s | 891.6 s | $1.1 \times 10^{11} \mathrm{~s}$ |
| 4 point cor. <br> 216 matchers | 503.6 s | 14530 s | $2.3 \times 10^{14} \mathrm{~s}$ |

$10^{6}$ mock galaxies

- Heterogeneous Architectures: perform leaf-leaf computations very efficiently on GPU
- Massively Parallel tree code: scales to thousands of processors

