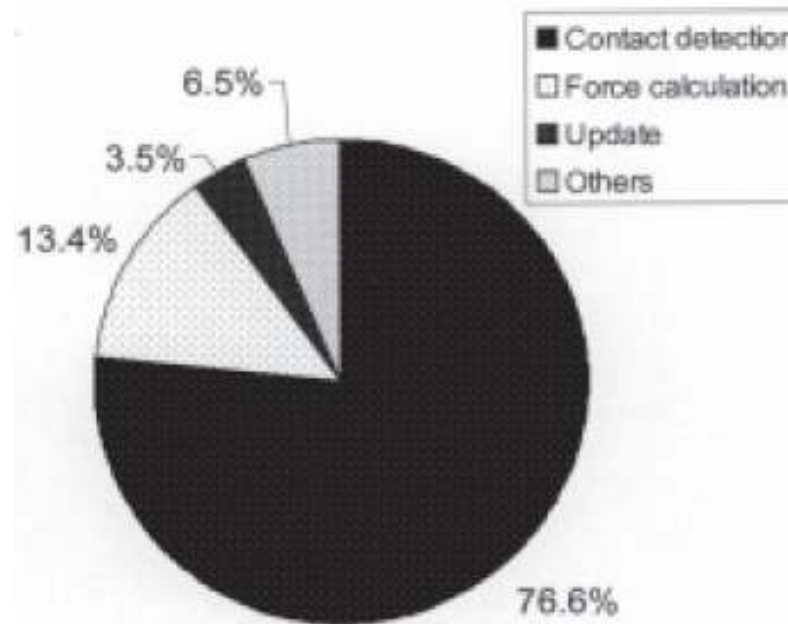


DEM Modeling: Lecture 11

Coarse Contact Detection

Coarse Contact Detection

- Contact detection is typically the most time consuming part of a soft-particle DEM simulation
- Contact between particles is often divided into two steps:
 - coarse contact detection (aka neighbor search)
 - fine contact detection

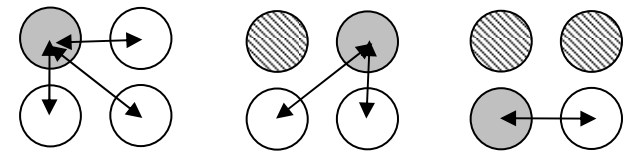


From Mio *et al.* (1995)

Brute Force

- Assume a system contains N particles
- To determine if contact occurs between any two particles
 - could check for contacts between all possible particle pairs:

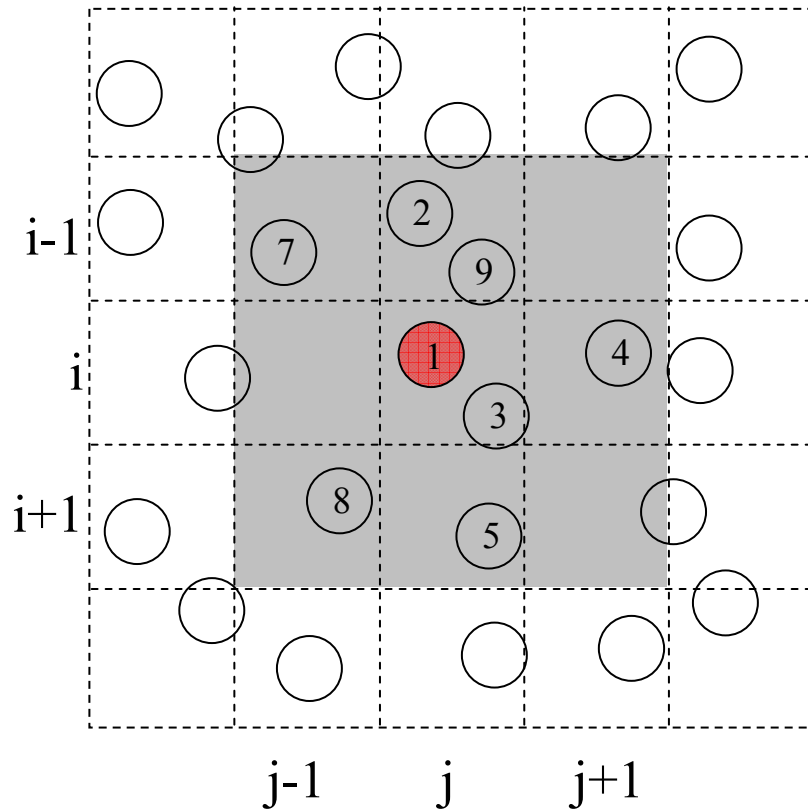
- particle 1: $N-1$ contact checks
- particle 2: $N-2$ contact checks
- particle $N-1$: 1 contact check
- particle N : 0 contact checks
- total # of contact checks:



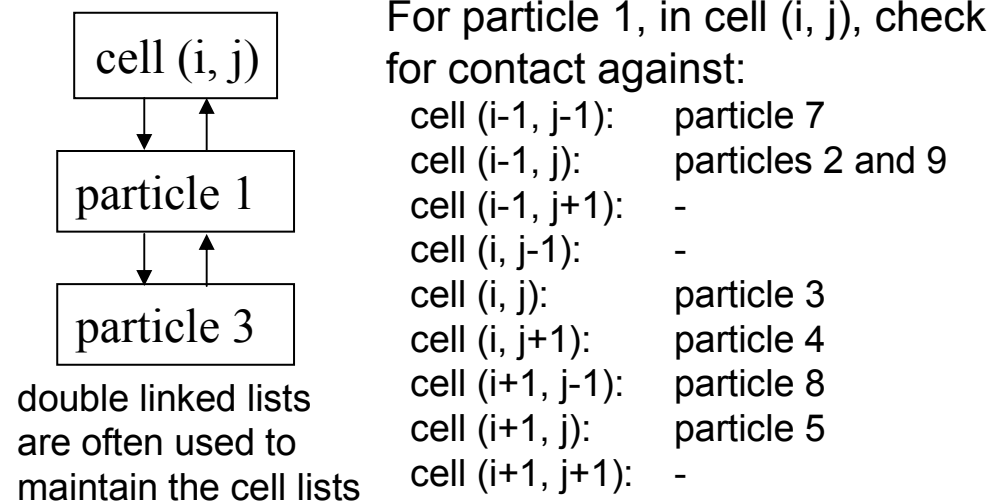
$$(N-1)+(N-2) + \dots + 1 = N(N-1)/2 \sim \mathbf{O(N^2)}$$

- aka “naïve” contact detection
- There are more efficient ways of checking for contacts!
 - neighboring-cell contact detection scheme
 - nearest-neighbor contact detection scheme
 - sweep and prune

Neighboring Cell

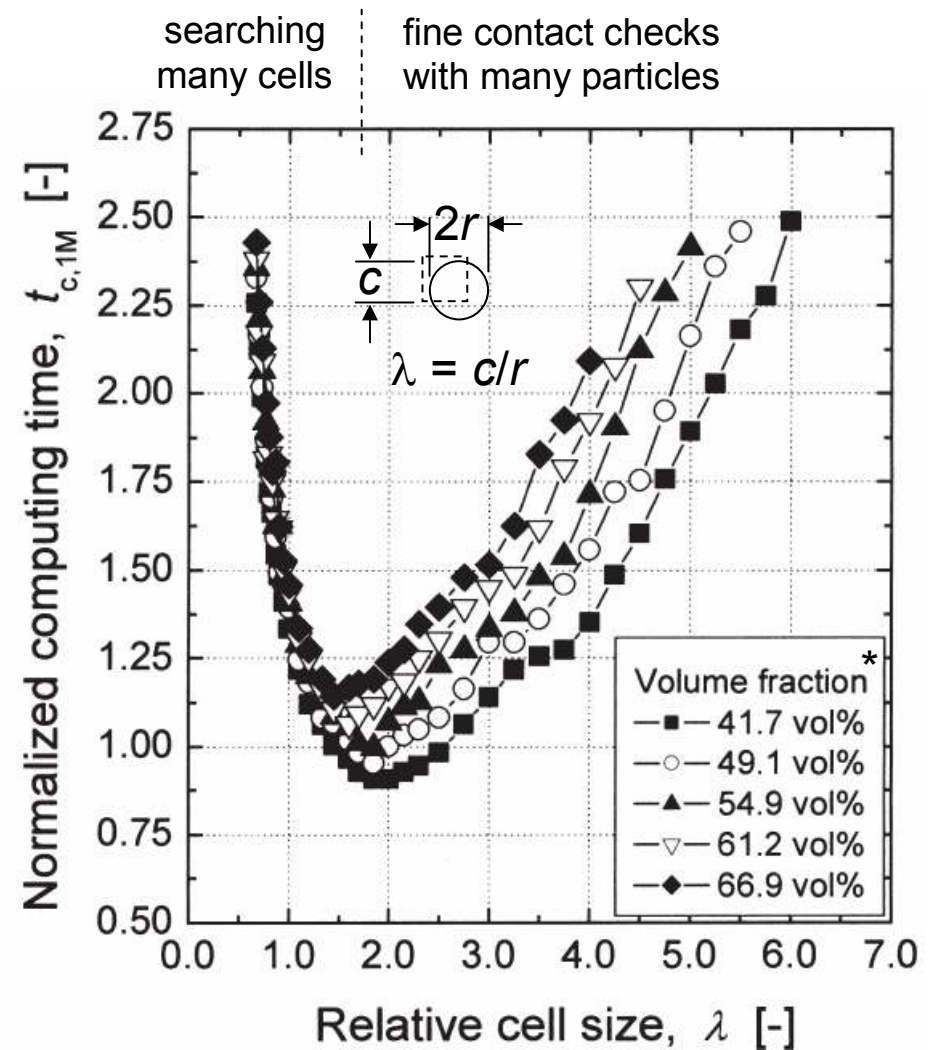


- divide the workspace into a grid of cells
- for each cell, maintain a list of the particles contained within that cell
- for a given particle, only check for contact with other particles in its own cell and neighboring cells
- cell size may be smaller than particle size, a single particle may occupy multiple cells

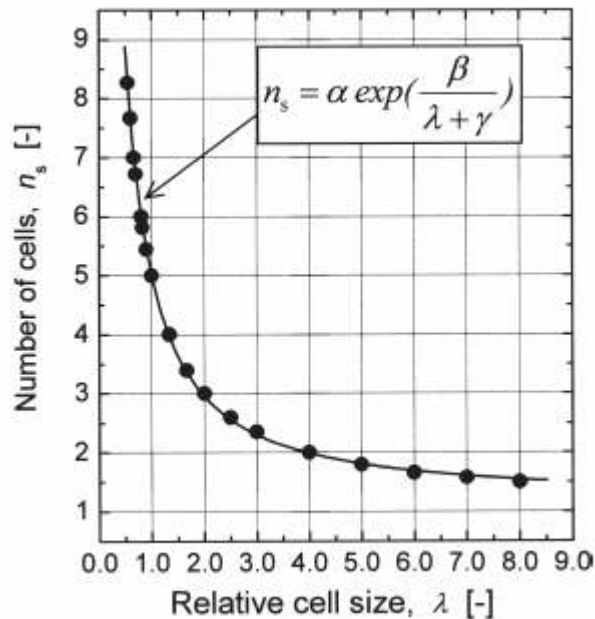
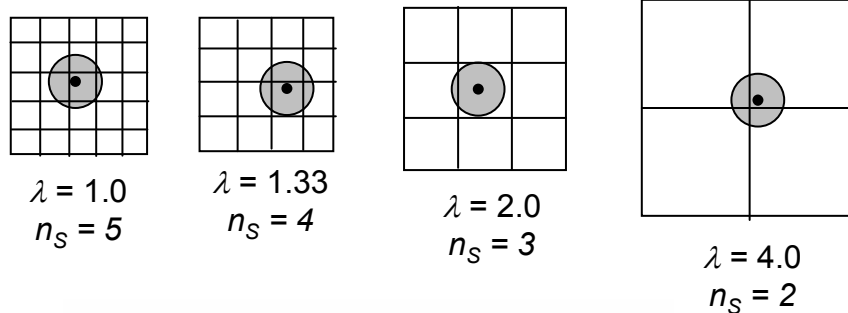


Neighboring Cell...

- Cell size optimization
 - Mio *et al.* (2005)
 - optimal $\lambda \equiv c/r \approx 1.5$ with $\lambda \uparrow$ as solid fraction \downarrow
 - optimal cell size has 0.7 – 0.8 particles per cell
 - optimum is insensitive even when a range of particle sizes is used
 - analytical derivation is presented supporting numerical findings



Neighboring Cell...



$$(\alpha, \beta, \gamma) = 1.14, 2.65, 0.80$$

$$n_{SC} = n_s^3 \quad \# \text{ of searched cells}$$

$$V_C = n_{SC} (\lambda r)^3 \quad \text{volume of searched cells}$$

$$n_C = \frac{N}{V_{WS}} V_C \quad \text{volume of particles in searched cells (} N = \text{total \# of particles, } V_{WS} = \text{volume of workspace)}$$

$$n_{CC} = \frac{n_C - 1}{2} \quad \text{avg. \# of fine contact checks for a particle}$$

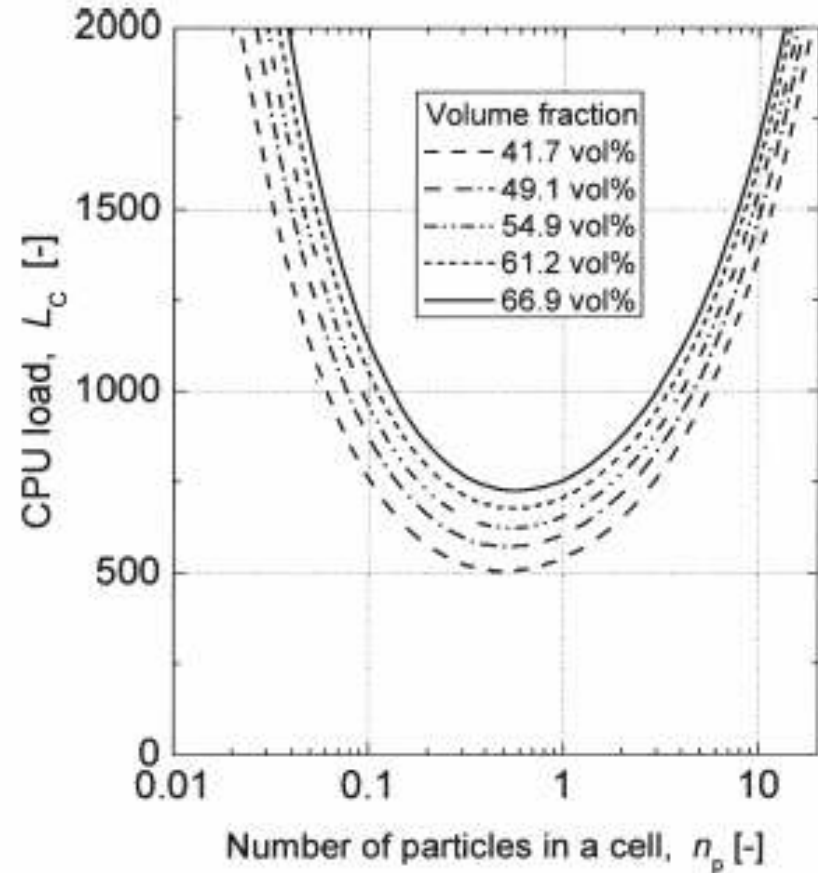
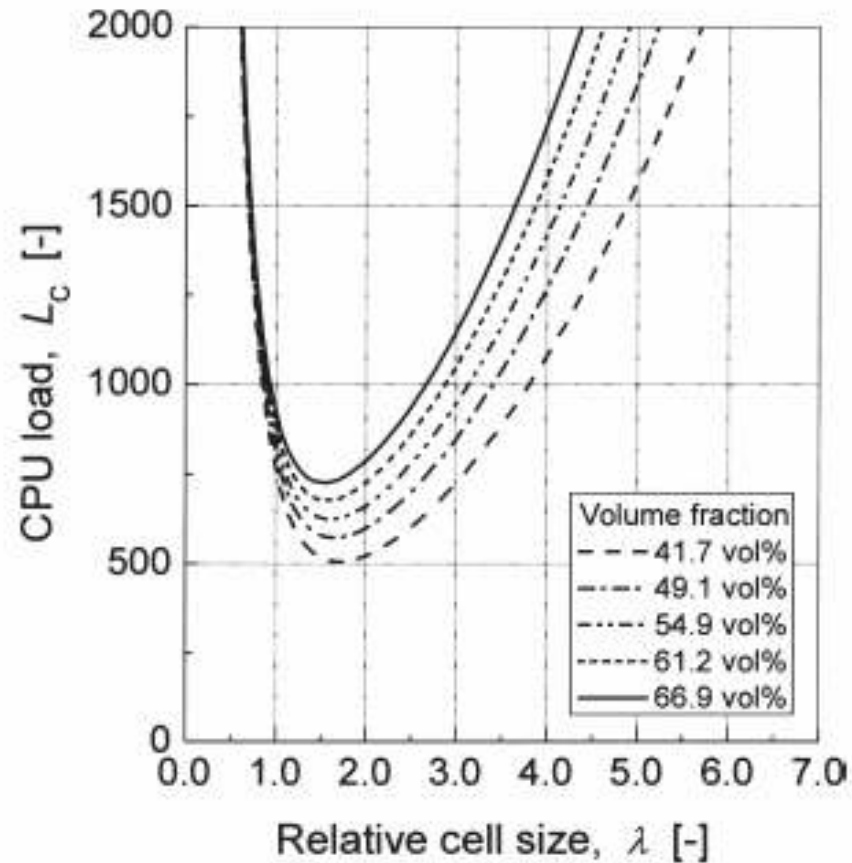
$$L_{CPU} = \kappa_{SC} n_{SC} + \kappa_{CC} n_{CC} \quad \text{CPU load}$$

κ_{SC} = CPU load for searching cells

κ_{CC} = CPU load for fine contact checks

These CPU loads will vary depending upon algorithm and implementation specifics. Mio *et al.* (2005) found that $\kappa_{CC}/\kappa_{SC} = 10.47$

Neighboring Cell...

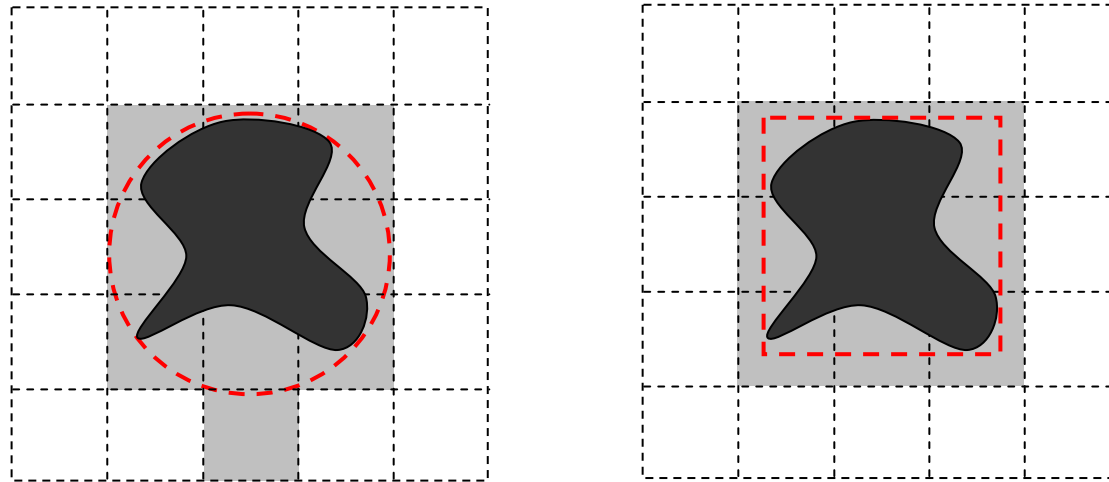


$$L_{CPU} = \kappa_{SC} n_s^3 + \frac{1}{2} \kappa_{CC} \left[\frac{N}{V_{WS}} (n_s \lambda r)^3 - 1 \right] \quad \text{where } n_s = \alpha \exp\left(\frac{\beta}{\lambda + \gamma}\right)$$

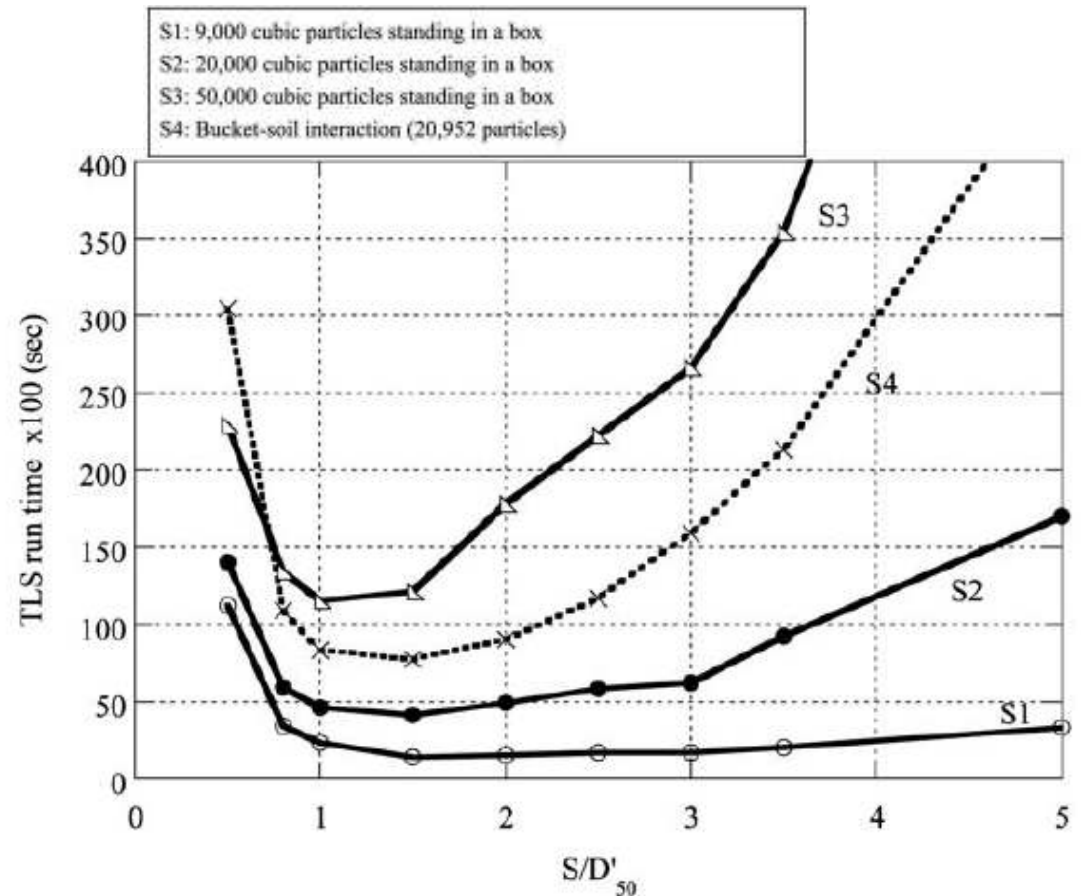
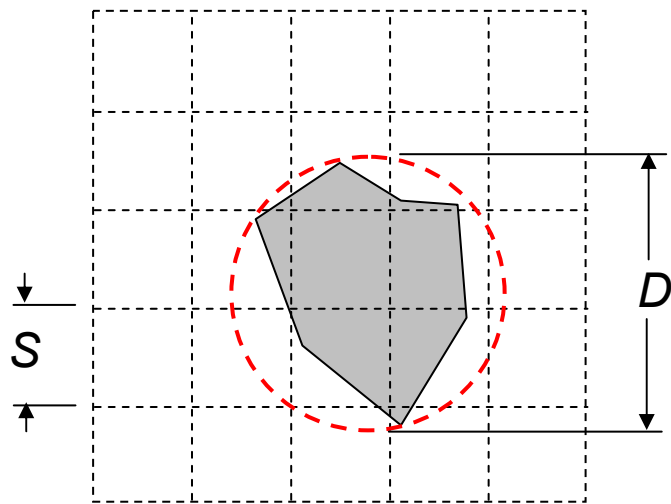
From Mio *et al.* (2005)

Neighboring Cell...

- Can also use bounding spheres or bounding boxes for non-spherical particles and then implement the neighboring cell algorithm



Neighboring Cell...



- Zhao *et al.* (2006) empirically examined optimal cell size using polygonal particles.
- The optimum ratio of cell size to median bounding sphere diameter by volume is:
 $S/D'_{50} \approx 1.5$.
- Twice the optimal size as what was found by Mio *et al.* (2005)!

Neighboring Cell...

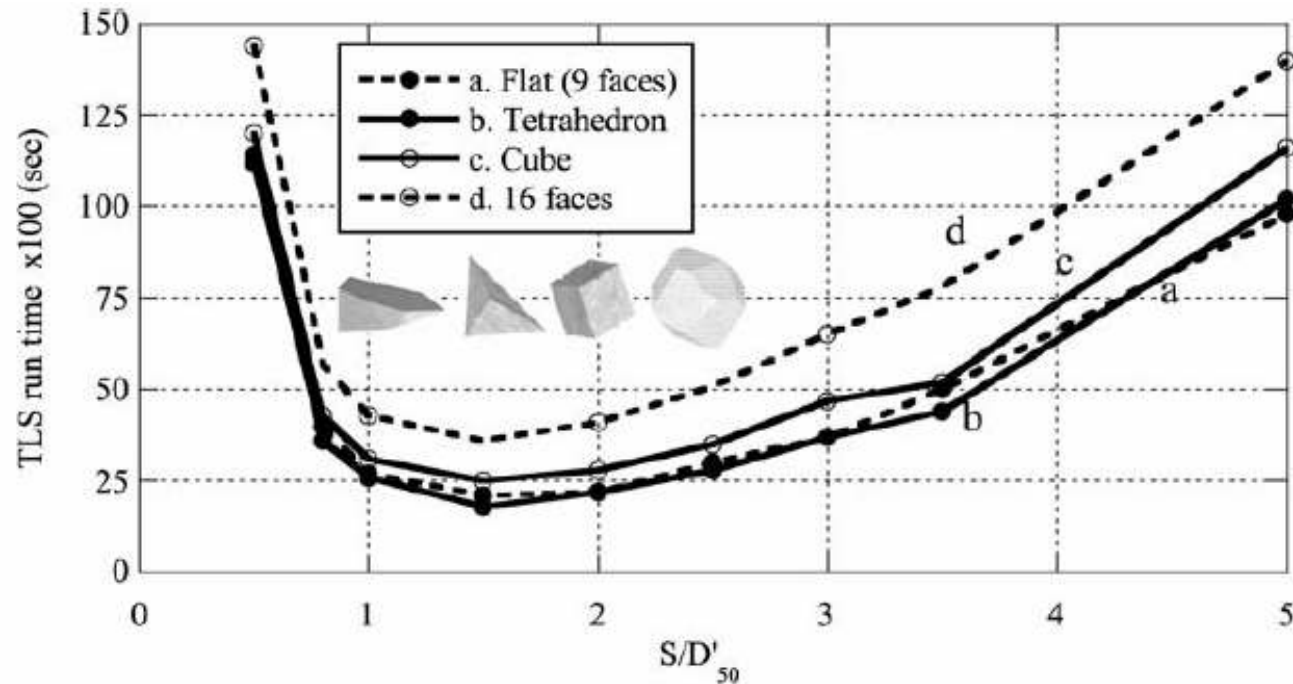
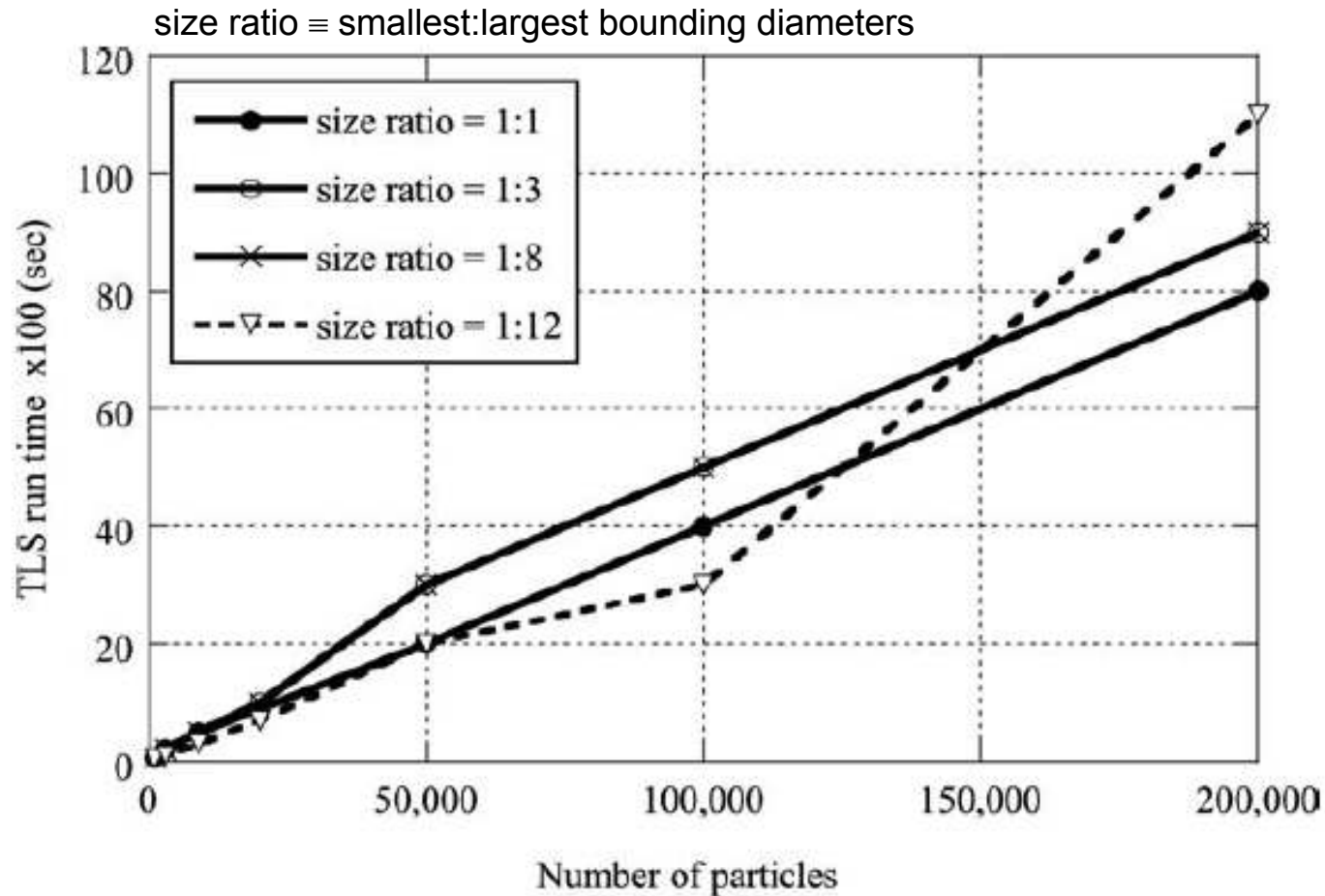


Figure 7.
TLS performance: effect of
particle shape (50,000
uniform particles standing
in a box)

- Shape has little effect on optimal cell size.
- (Increasing shape complexity results in increasing run time.)

Neighboring Cell...



**neighboring cell contact detection algorithm
is insensitive to particle size ratio**

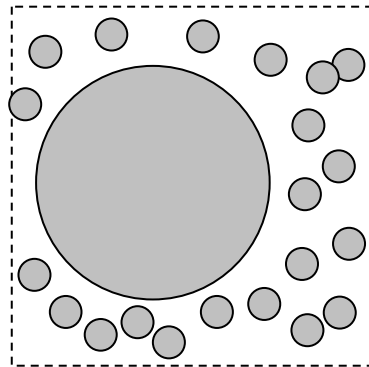
From Zhao *et al.* (2006)

Neighboring Cell...

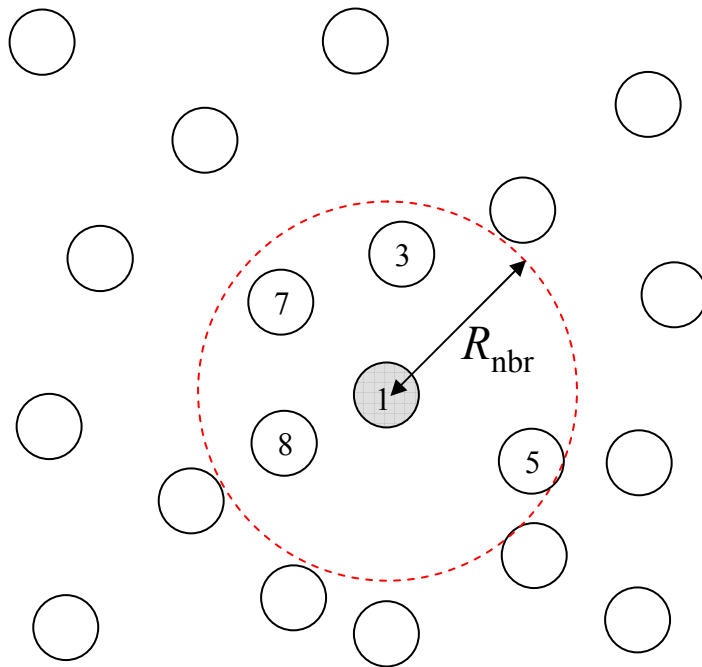
- Assuming a constant number of particles per cell, c (in 3D with one particle per cell, $c = 26$)
 - particle 1: c checks
 - particle 2: c checks
 - particle $N-1$: 1 check, at most
 - particle N : 0 checks
 - total # of contact checks:
 $(N - c)c + (c - 1) + (c - 2) + \dots + 1 \sim \mathbf{O(N)}$

Neighboring Cell...

- The additional bookkeeping of maintaining neighbor lists is computationally less costly than performing an N^2 brute force check
- For large particle size differences, the neighboring cell algorithm degenerates to the brute force method if the cell size is chosen to be \geq particle size
 - for cell sizes $<$ particle size, the algorithm is slow since many cells need to be checked, but it's not as bad as an N^2 check



Nearest Neighbor

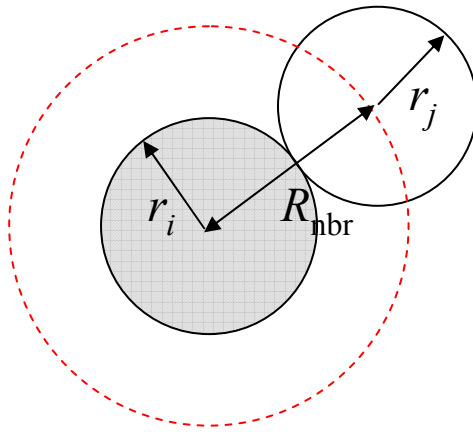


- define a neighborhood for each particle
- maintain a list of each particle's neighbors
- only check for contacts between neighbors
- periodically update particle neighbor lists so that particles outside the neighborhood will not contact the target particle without first becoming a neighbor
 - periodic updates are typically an N^2 brute force contact search

neighbor list for particle 1:

- particle 3
- particle 5
- particle 7
- particle 8

Nearest Neighbor...



- neighborhood radius needs to be large enough so that a particle moves into the neighborhood before contacting the target particle

$$R_{\text{nbr}} > (r_i + r_j)$$

- as $R_{\text{nbr}} \uparrow \Rightarrow$ update frequency \downarrow , but # neighbors \uparrow
- update the neighbor lists when the total distance any one particle could move relative to any other particle is equal to the neighborhood radius

$$\sum_{t_{\text{prev}}}^t \left(2 \left| \dot{\mathbf{x}}(t) \right|_{\text{max}} \Delta t \right) \geq R_{\text{nbr}}$$

where $R_{\text{nbr}} \equiv$ neighborhood radius

$t_{\text{prev}} \equiv$ time of the previous neighborhood update

$\left| \dot{\mathbf{x}}(t) \right|_{\text{max}} \equiv$ max speed of any particle at the given time

$\Delta t \equiv$ simulation time step

Nearest Neighbor...

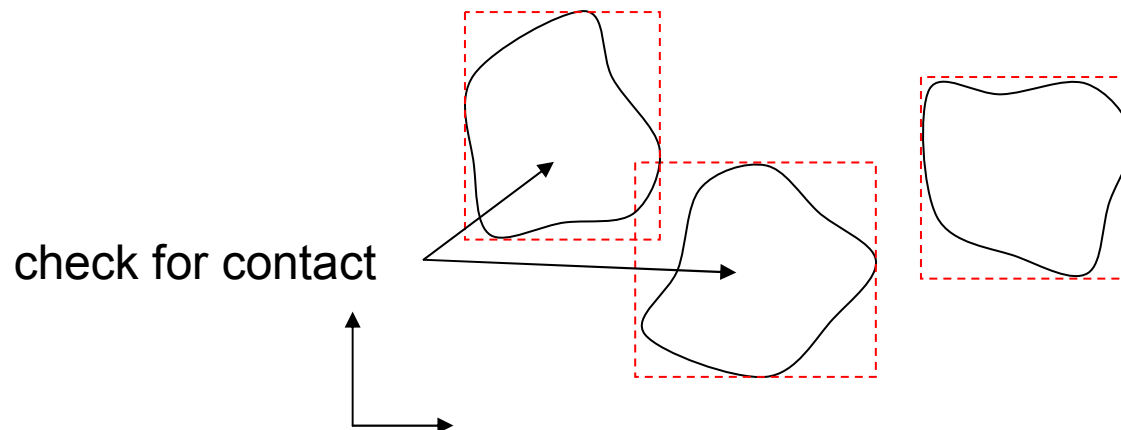
- Assuming a constant number of particles per neighborhood, c
 - particle 1: c checks
 - particle 2: c checks
 - particle $N-1$: 1 check, at most
 - particle N : 0 checks
 - total # of contact checks:
 $(N - c)c + (c - 1) + (c - 2) + \dots + 1 \sim \mathbf{O(N)}$

Nearest Neighbor...

- The additional bookkeeping of maintaining neighbor lists is computationally less costly than performing an N^2 brute force check
- Nearest-neighbor becomes less efficient as the frequency of updating the neighbor lists increases
 - *e.g.*, when particles move at large speeds
 - \Rightarrow nearest-neighbor technique is most efficient for quasi-static assemblies
- Optimal cell size and neighborhood size have not been studied
 - (left as an exercise)

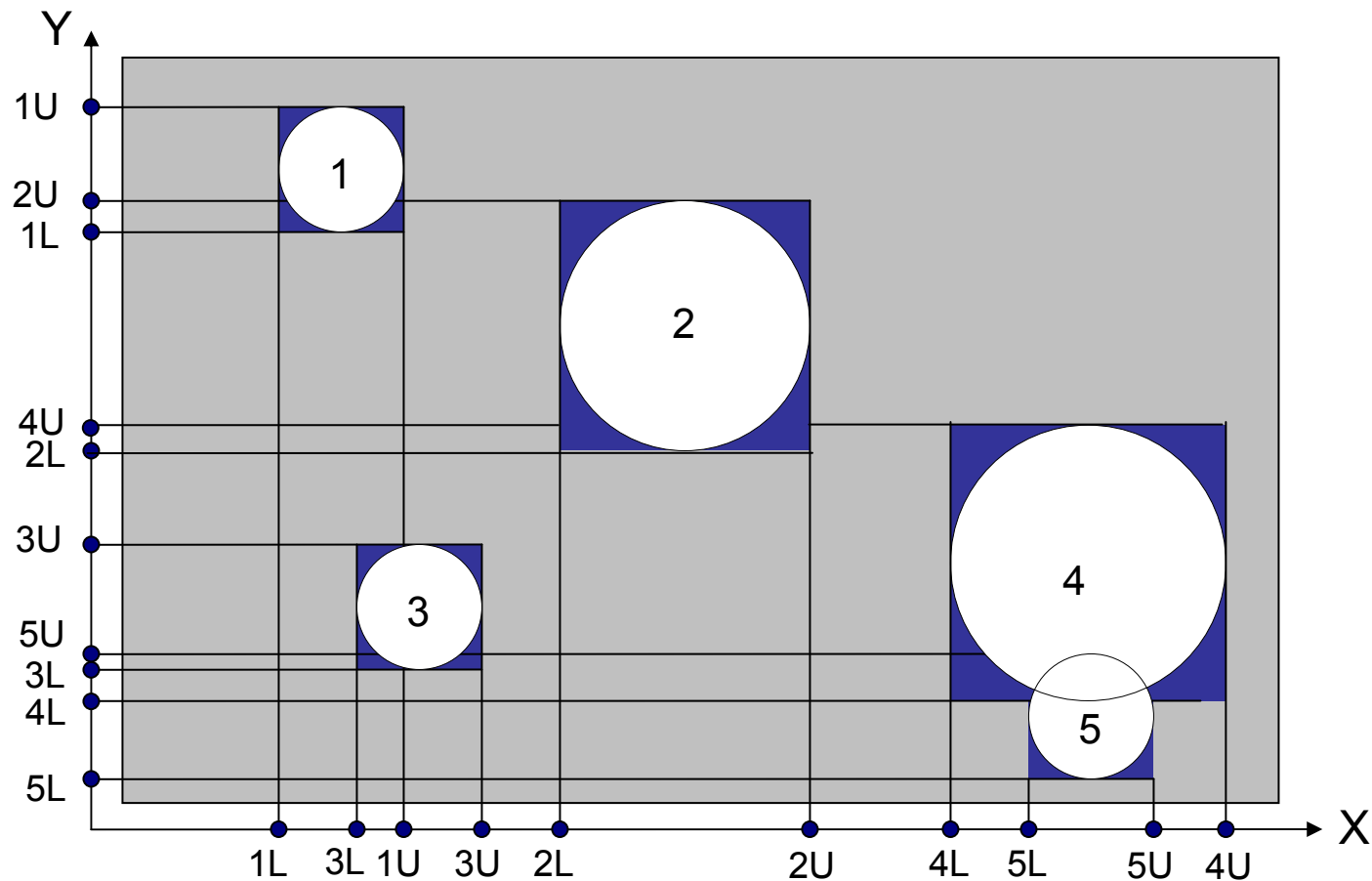
Sweep and Prune

- aka bounding box method, spatial sort
- each particle has a bounding box with edges aligned with the global axes
- if the bounding boxes don't overlap in all three coordinate directions, then the particles will not overlap
 - only check for contact between particles with overlapping bounding boxes



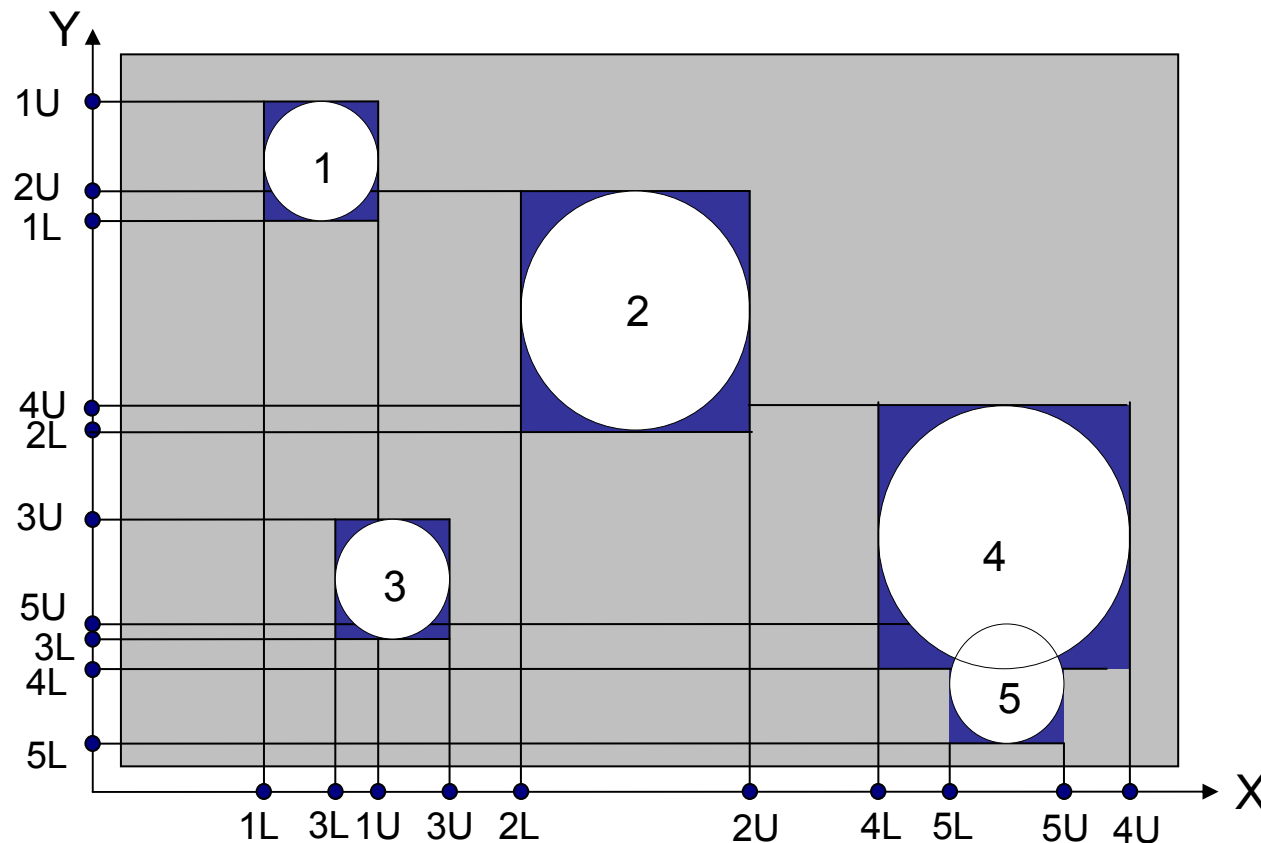
Sweep and Prune...

Step 1: Create (axis aligned) bounding boxes for each particle. Note the projected coordinates of the box extrema on each axis.



Sweep and Prune...

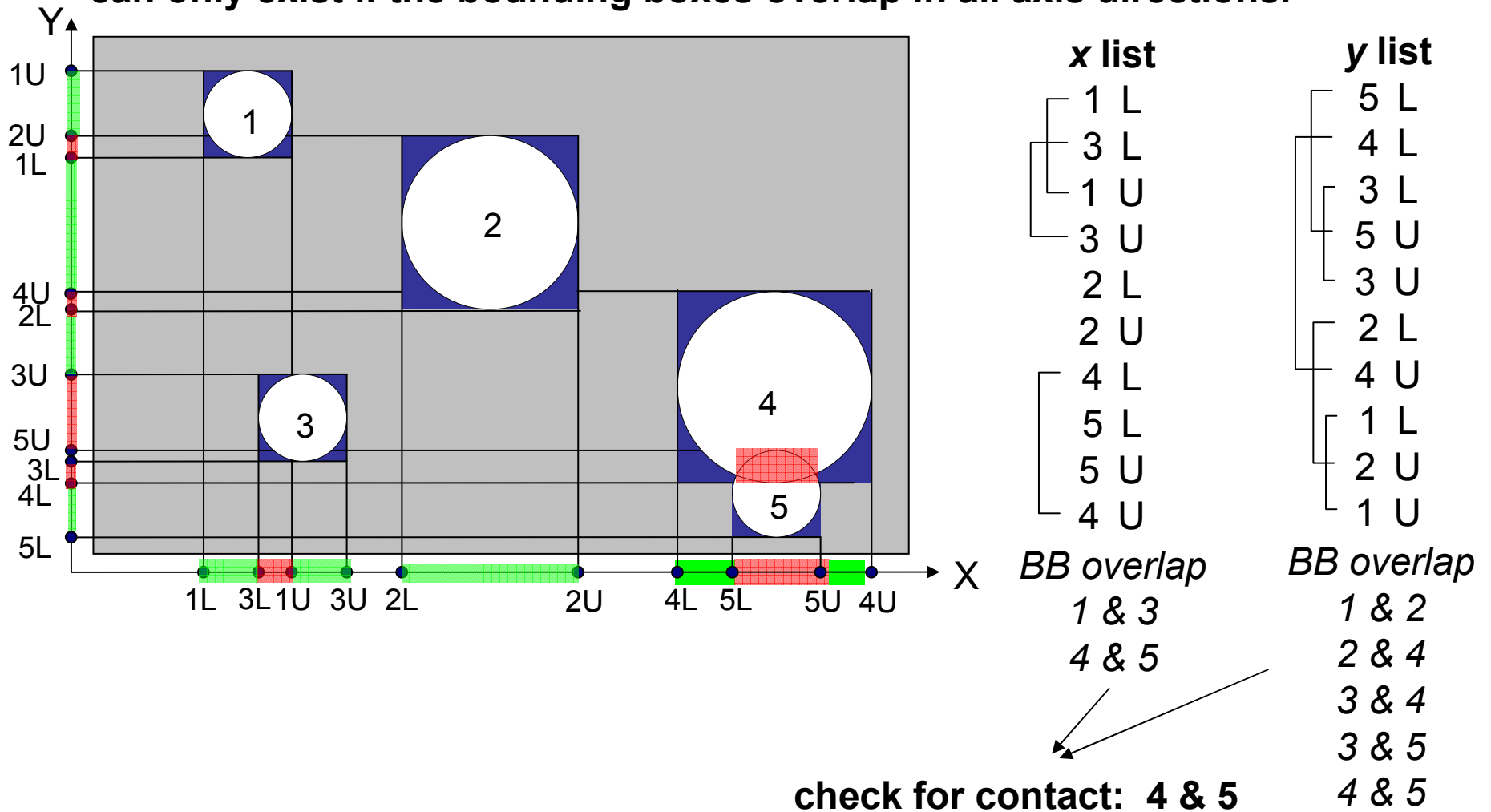
Step 2: Create sorted lists of the bounding box segments (endpoint pairs) in each projected dimension. Retaining the ordering from the last frame makes this a fast process since the ordering generally won't change much between simulation time steps (known as "coherence").



x list	y list
1 L	5 L
3 L	4 L
1 U	3 L
3 U	5 U
2 L	3 U
2 U	2 L
4 L	4 U
5 L	1 L
5 U	2 U
4 U	1 U

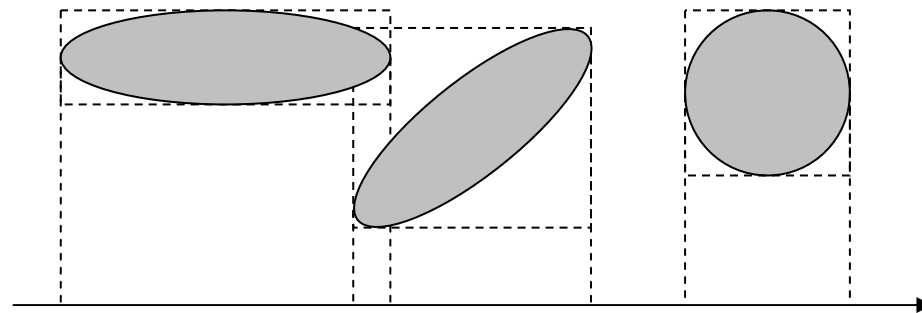
Sweep and Prune...

Step 3: Sweep through each list, tracking which boxes overlap. Contacts can only exist if the bounding boxes overlap in all axis directions.

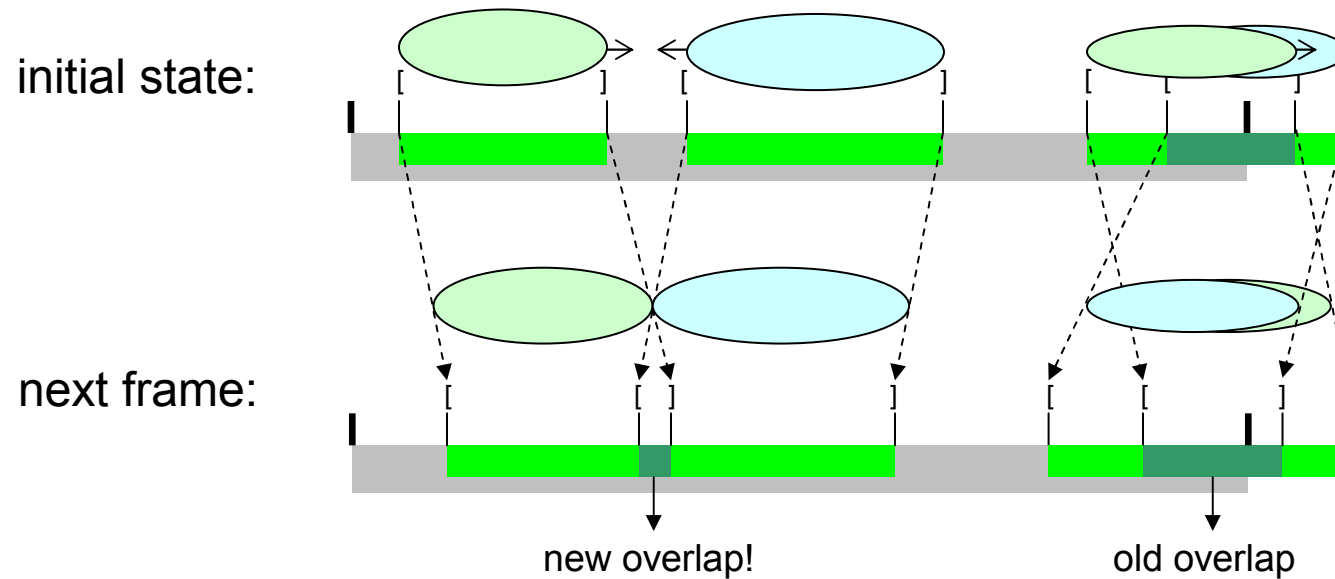


Sweep and Prune...

- $O(N)$ achieved by assuming spatial coherence: since the segments move very little, the lists are always “almost-sorted,” and only linear time is required to update them.
- Optimization: use insertion sort for the lists, “sweep” segments as they are sorted (combine steps 2 and 3).
- Any object shape can be used, as long as a bounding box encloses it.



Sweep and Prune...



- All segment list sorting involves swaps of adjacent endpoints (step 2). Use this information to accomplish step 3.
- Test for swap type to update collision table:
 - Swap] [to [] : new overlap for pair
 - Swap [] to] [: end overlap for pair
 - Otherwise do nothing ([[or]])

Sweep and Prune...

- Performs well when compared with neighboring cell, but is more complex to implement
- Advantages
 - handles poly-sized particle distributions without degenerating
 - deals with high density systems more efficiently
- Disadvantages
 - no advantage for simple systems (low density, mono-sized spheres)
 - more difficult to implement, especially for moving periodic boundaries
 - oblong particles difficult to bound efficiently
- DESS (Perkins and Williams, 2001)
 - aka sweep and prune
 - $O(N^2)$ for an insertion sort, $O(N \ln N)$ for heap sort

Summary

- Most computation time is spent in coarse contact detection
- Do NOT use brute force except for systems containing only tens of particles at most
 - (unless you like to waste time and electricity)
- Three common methods: neighboring cell, nearest neighbor, sweep and prune
- The “best” method depends upon the system under investigation
 - quasi-static systems: nearest neighbor
 - systems with large size differences: sweep and prune
 - the “work horse”: neighboring cell

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