




# Collision Detection as a Fundamental Technology in VR Based Product Engineering

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*2<sup>nd</sup> Advanced Study Institute on "Product Engineering:  
Tools and Methods based on Virtual Reality Technology"  
Chania, Creete, 30 May – 6 June 2007*



## Motivation





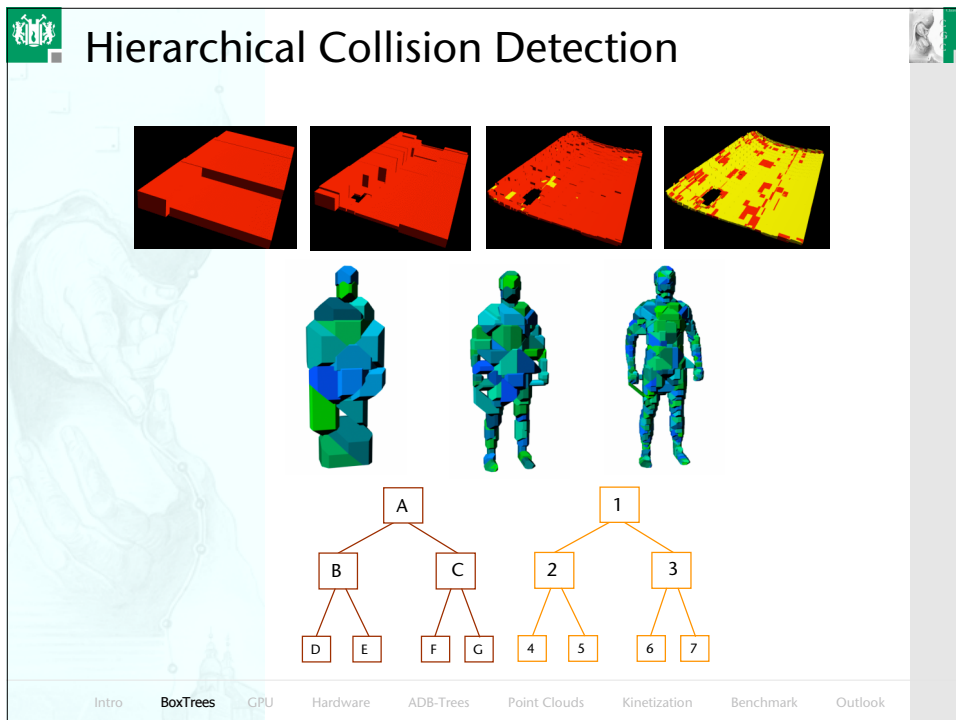
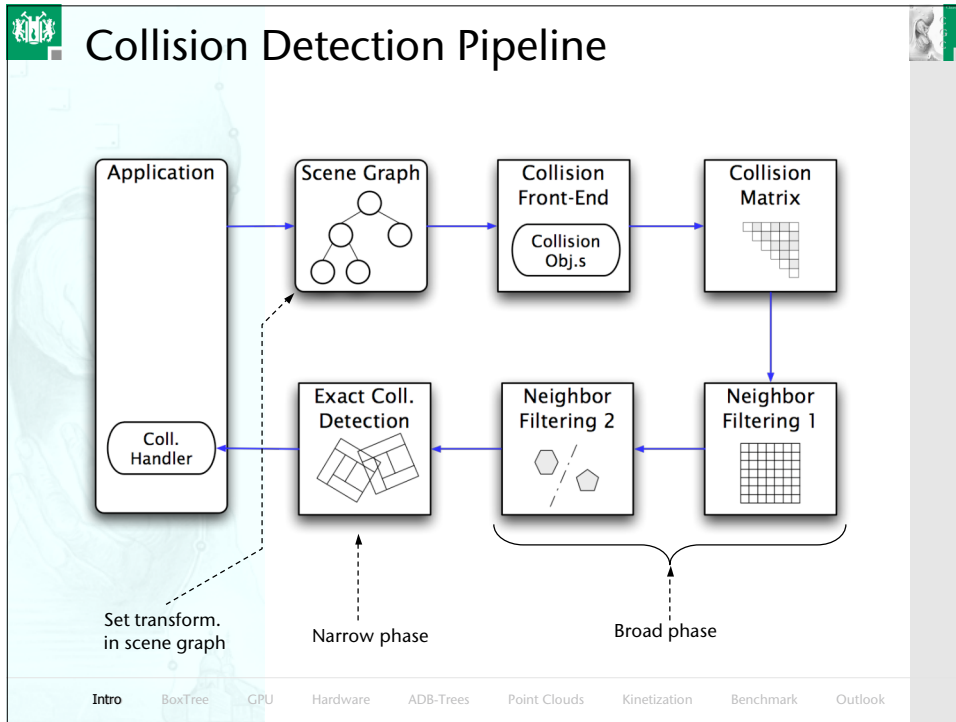






Intro
BoxTree
CPU
Hardware
ADB-Trees
Point Clouds
Kinetization
Benchmark
Outlook





## Examples of Common Bounding Volumes

- Cylinder [Weghorst et al., 1985]
- Sphere [Hubbard, 1996]
- Spherical shell [Manocha, 1997]
- Prism [Barequet, et al., 1996]
- k-DOP / Slabs [Zachmann, 1998]
- Box, AABB (R\*-trees) [Beckmann, Kriegel, et al., 1990]
- OBB (oriented bounding box) [Gottschalk, et al., 1996]
- Convex hull [Lin et. al., 2001]
- l'section of several BVs

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## Restricted Boustrees / SKD-Trees

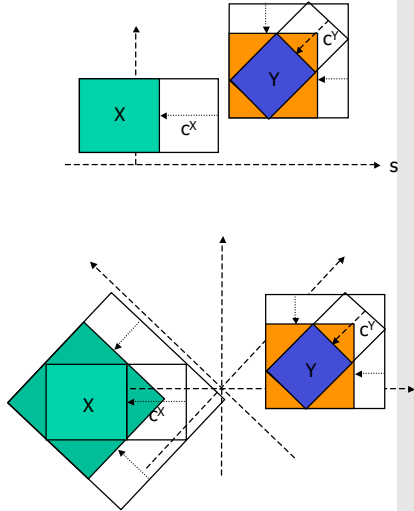
- Observation: on most sides, child boxes almost touch parent box
- Combination of kd-tree and AABB / generalization of kd-tree

- Minimal storage: 2 floats, 2 axes IDs, 1 pointer

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## Overlap Tests

- Re-alignment:
  - 12 FLOPs
- SAT:
  - 82 FLOPs
- SAT lite:
  - 24 FLOPs
- Sphere test:
  - 29 FLOPs



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## Constructing Restricted Boxtrees

- Approach: top-down
  - Compute BV covering input
  - Split input into two subsets
- Splitting criterion:
  - Expected traversal cost:

$$C(X, Y) = 4c + \sum_{i,j=1,2} P(X_i, Y_j)C(X_i, Y_j)$$

$$\approx \sum_{i,j=1,2} P(X_i, Y_j)N_iN_j$$

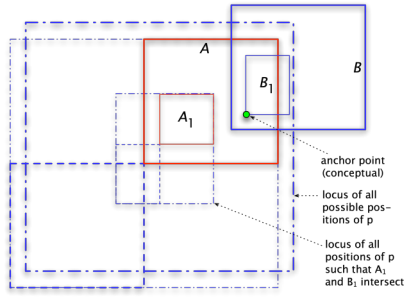
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■ Estimation of  $P(X_i, Y_j)$ :

$$A_i \cap B_j \neq \emptyset \Leftrightarrow \mathbf{p}_i \in A_i \oplus B_j$$

$$P(A_i, B_j) = \frac{V(A_i \oplus B_j)}{V(A) \oplus V(B)}$$

$$\approx \frac{V(A_i) + V(B_j)}{V(A) + V(B)}$$


■ Overall criterion: split set of polygons so as to minimize

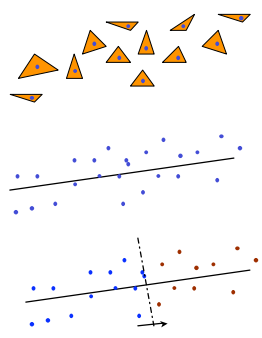
$$V(X_1)N_1 + V(X_2)N_2$$

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■ Construction Algorithm

- Represent polygons by points
- Compute axis of largest variance (PCA)
- Sort along that axis
- Sweep plane along that axis, looking for minimum of split heuristic
- Split set of polygons

■ Complexity:

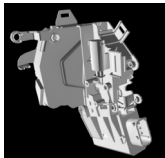
$$T(n) = T(\alpha n) + T((1-\alpha)n) + n \log n \in O(n \log^2 n)$$


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## Results

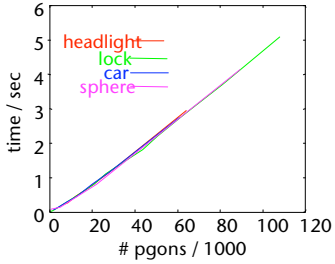
- Suite:
- Platform:
  - Pentium III, 1GHz
- Construction:

Door lock (BMW)



Car (courtesy VW)



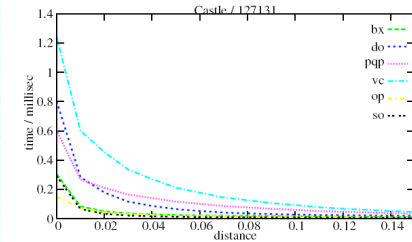


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Hardware
ADB-Trees
Point Clouds
Kinetization
Benchmark
Outlook

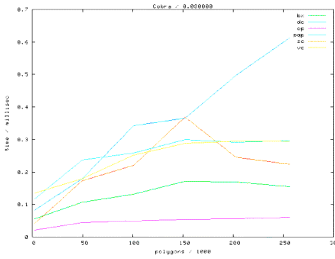
## Results


BVH	Bytes / BV
Restricted Boxtree	8
Sphere Tree	20
AABB Tree	28
OBB Tree	52
24-DOP-Tree	100

Castle / 127131



Castle - 0.050000





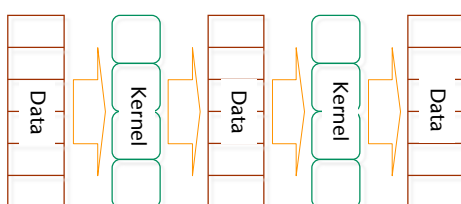
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Kinetization
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## Object-Space Coll. Detection on the GPU

- Background on streaming architectures (and GPUs):
  - Stream Programming Model = *"Streams of data passing through computation kernels."*
  - Stream = ordered, homogenous set of data of arbitrary type
  - Kernel = program to be performed on *each* element of the input stream
- Sample stream program:
 

```

{
  stream A, B, C;
  ...
  kernelfunc1( input: A,
               output: B);
  kernelfunc2( input: B,
               output: C);
  ...
}
      
```



The diagram illustrates a stream programming model. It shows a sequence of five rectangular blocks. The first, third, and fifth blocks are labeled 'Data' and are colored red. The second and fourth blocks are labeled 'Kernel' and are colored green. Orange arrows point from each 'Data' block to the following 'Kernel' block, and from each 'Kernel' block to the following 'Data' block, representing the flow of data through computation kernels.

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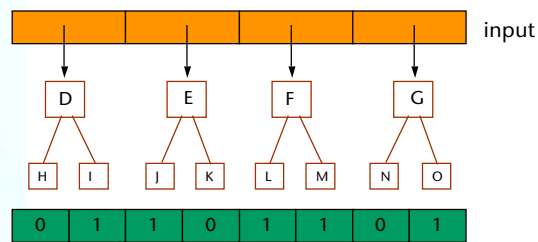
## Application to Collision Detection

- Elementary operation during traversal is overlap test of BVs
- Different pairs of BVs on same level can be tested independently
- Idea: implement as fragment program
  - Texture = set of pairs of BVs to be tested
  - Output = new texture
- Problem:
  - Conceptually 1 execution unit per output element
  - "0"s are still in the output
  - Need to "pack" output texture tightly after each level

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- Assumption (for sake of simplicity):
  - 1D Array (texture)
  - Element = pair of BVs
  - Result of 1 overlap test = overlap status for 2 child pairs

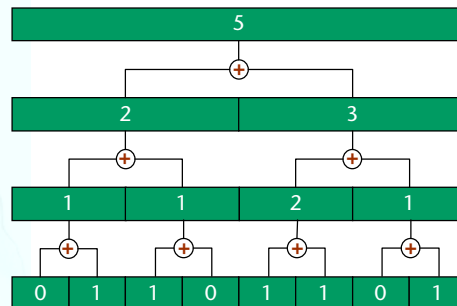
1. Step: calculate overlap status for all potential child pairs



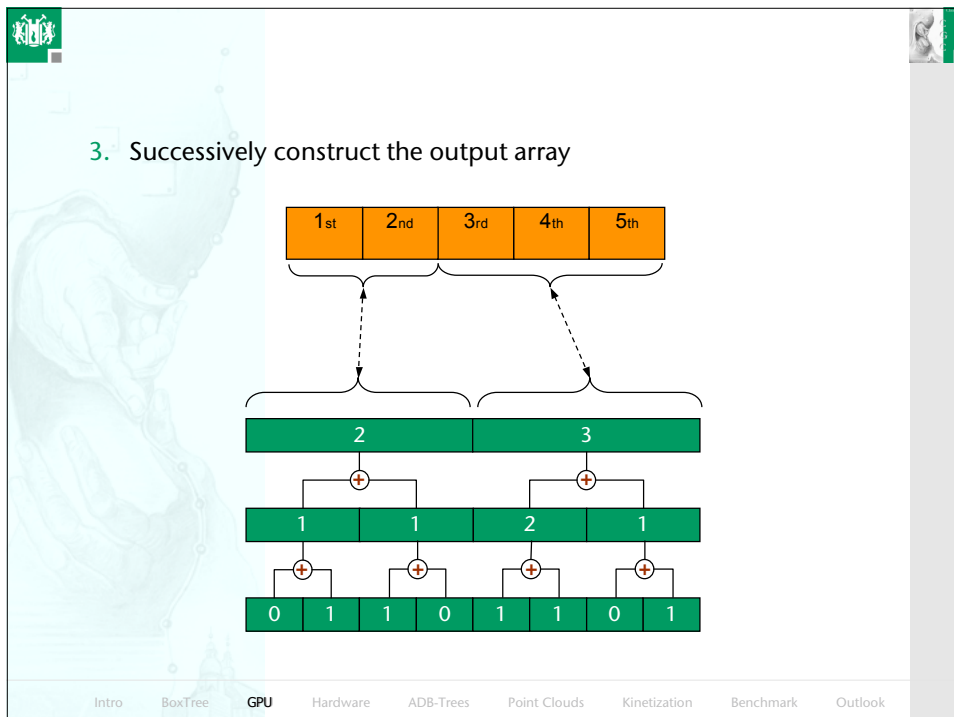
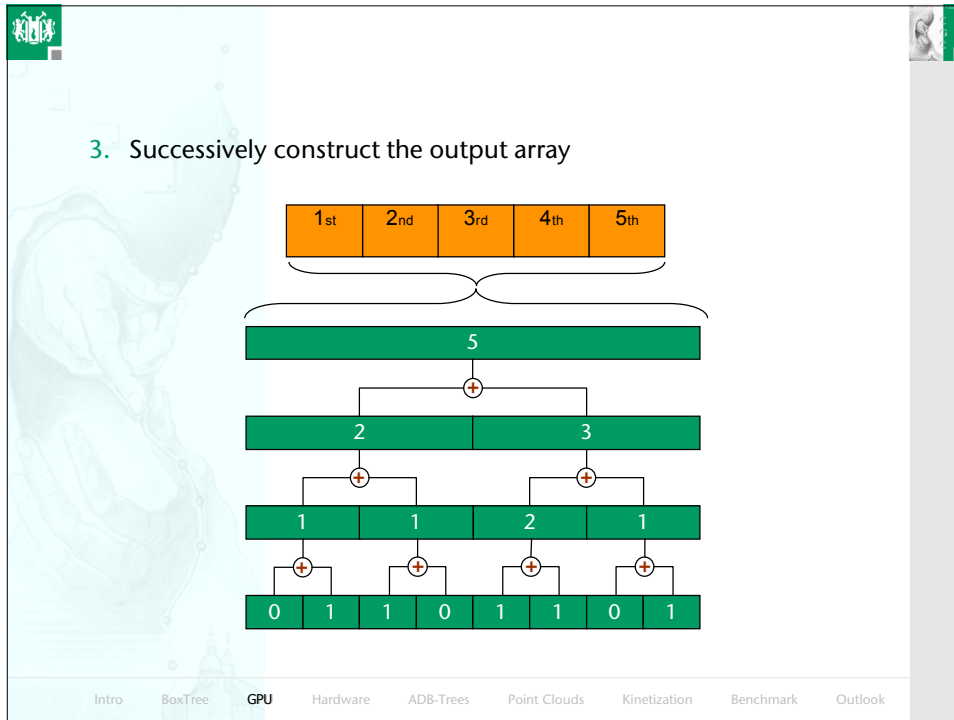
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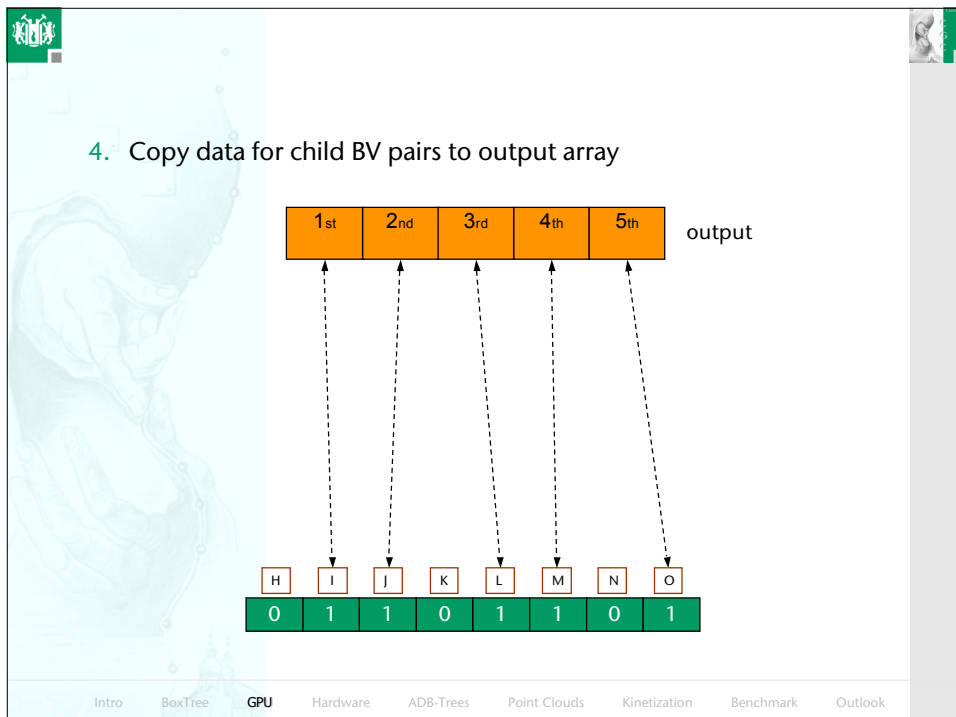
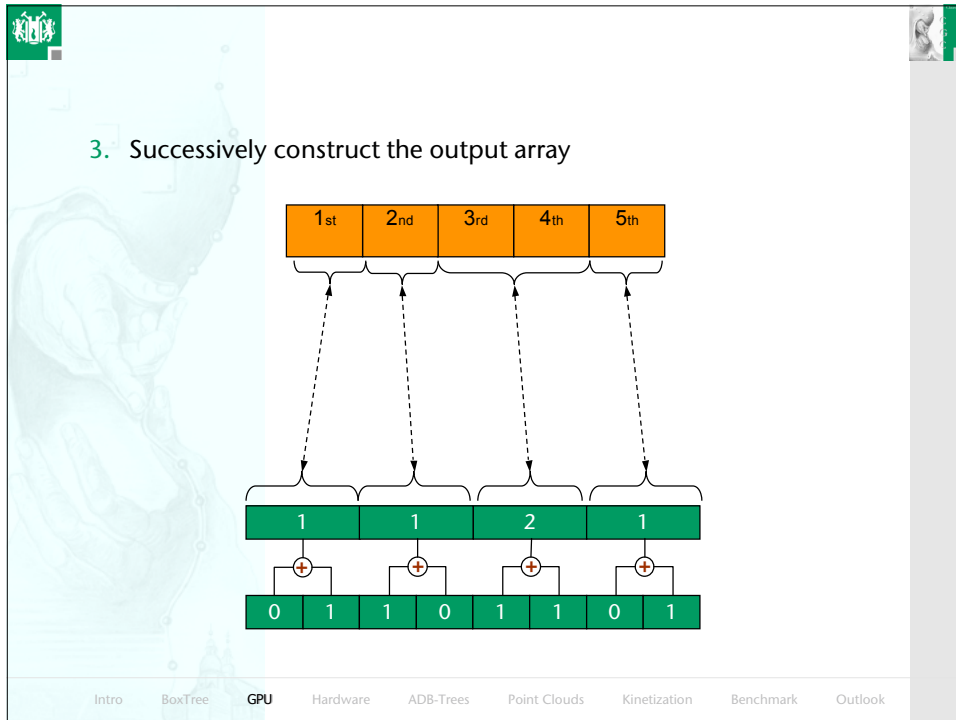
2. Build a tree by summing up overlap counts

- corresponds to a mip-map; total size  $O(n)$



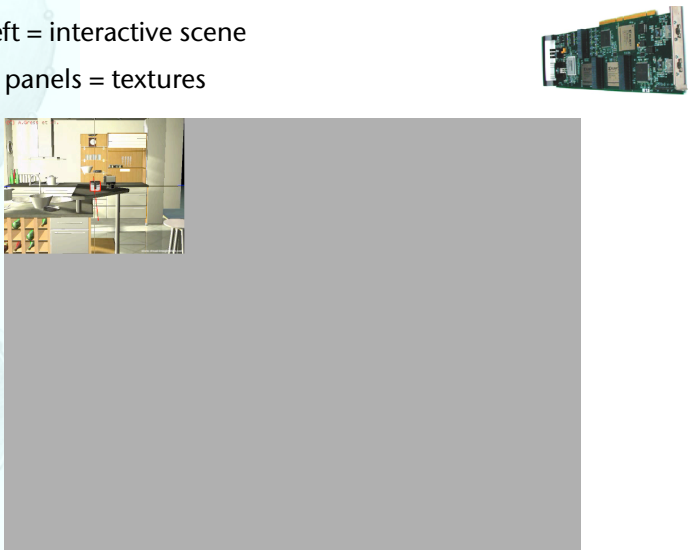
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## Watch the GPU

- Top left = interactive scene
- Other panels = textures

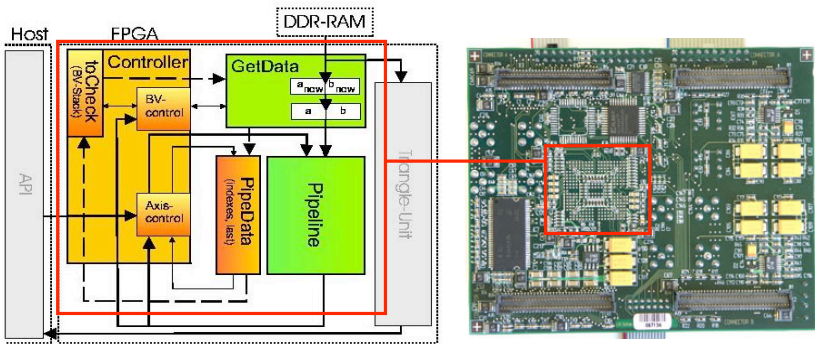


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## Dedicated Hardware for Coll.Det.

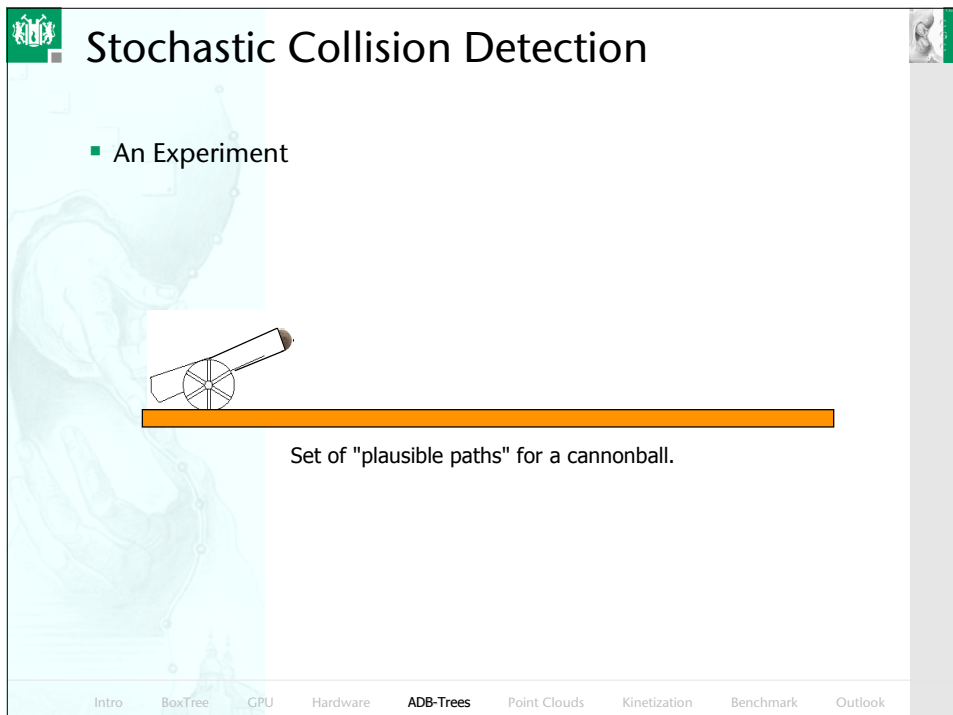
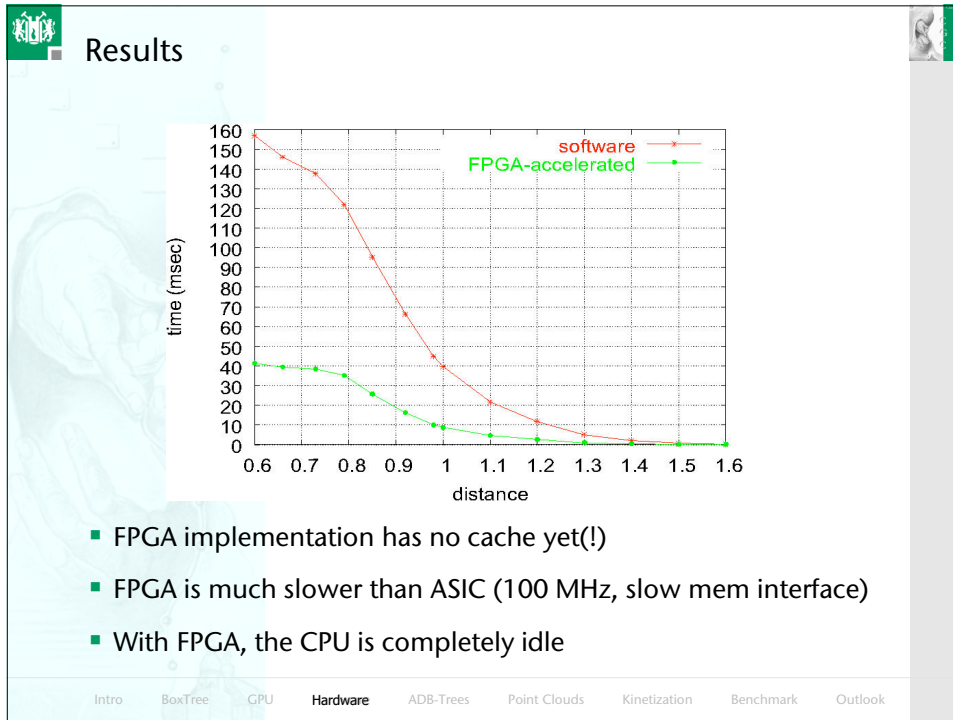
universität **bonn**

- General problem of "general purpose" computations on the GPU – competition among resources



- FPGA board (Xilinx Virtex II Pro) for prototyping

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## Motivation

- Observation: absolute accuracy is often not necessary

- New notion: **approximative collision detection**
- Goal: continuous and controlled balancing between running time and accuracy
- Benefit: **time-critical computation**

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## "Gedankenexperiment"

"wall hit cell"

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## ADB-Trees

- **Average-Case approach:**
  - Estimate probability of intersection for whole sets of polygons (at inner nodes of BVH)
  - BVH traversal guided by probability (P-Queue)
- Modification of BVHs: store **simple** description
- **Advantage** of our approach: can be applied to (almost) any kind of BVH / hierarchical collision detection

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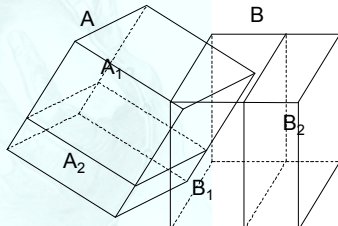
## Probability-Guided BVH Traversal

priority queue q;

(A,B) ← 

--	--	--	--

(A<sub>1</sub>,B<sub>1</sub>), p=0,9  
 (A<sub>1</sub>,B<sub>2</sub>), p=0  
 (A<sub>2</sub>,B<sub>1</sub>), p=0,5  
 (A<sub>2</sub>,B<sub>2</sub>), p=0



Traverse(A,B)

p-queue q

```

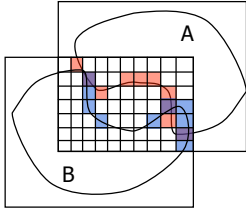
q.insert(A,B,1)
while q not empty
  A,B ← q.pop
  forall Ai, Bj
    p ← Pr[ collision in Ai, Bj ]
    if p ≥ pmin
      return "collision"
    if p ≥ 0
      q.insert(Ai, Bj, p)
  return "no collision"

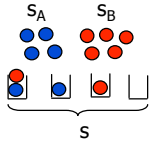
```

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## Estimating the Probability

1. Partition  $A \cap B$  with grid of  $s$  cells
2. Compute number of "well-filled" cells:  $s_A$
3. Dito for B:  $s_B$
4. Compute probability that  $x$  cells are "well-filled" from both A and B:



$$Pr[c(A \cap B) \geq x] = 1 - \sum_{t=0}^{x-1} \frac{\binom{s_B}{t} \binom{s-s_B}{s_A-t}}{\binom{s}{s_A}}$$


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## Taking curvature into account

- So far,  $Pr[c(A \cap B) \geq x]$  only yields number of collision cells, not collisions (i.e., cells with actual intersections)
- Curvature of surfaces A and B in collision cell ...
  - Low  $\rightarrow$  intersection likely
  - High  $\rightarrow$  not likely
- Heuristic:
  - Cell large/small compared to object  $\rightarrow$  surface in cell can make many/few "bends"
  - Depth  $d(A)$ ,  $d(B)$  of BVs A, B indicates size of cells
- "Curvature factor":
 
$$LB(A, B) := \frac{d(A) + d(B)}{d^{\max}(\text{Obj 1}) + d^{\max}(\text{Obj 2})}$$

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Overall function to estimate probability of intersection:

$$\max_{x \leq \min\{s_A, s_B\}} \{ Pr[c(A \cap B) \geq x] \cdot (1 - (1 - LB(A \cap B))^x) \}$$

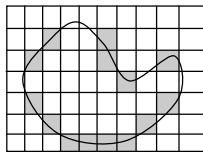
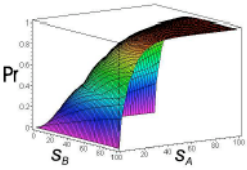
LB = 0.5

LB = 0.1

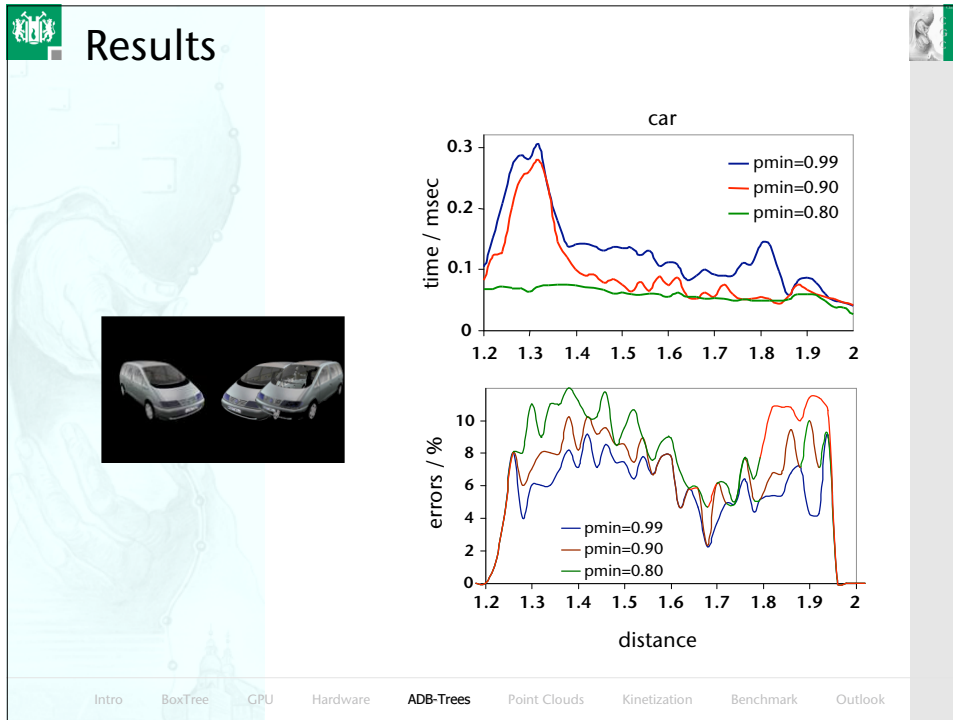
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Efficient Estimate

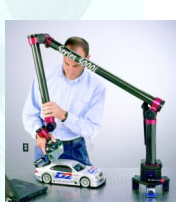

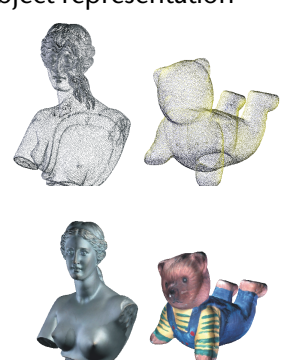
- Preprocessing:
  - Partition each BV of BVH by grid
  - Count number  $s_A$  of well-filled cells
  - Store with each node of BVH
- At runtime estimate  $s'_A$  and  $s'_B$  :
 
$$s'_A \approx s_A \frac{\text{Vol}(A \cap B)}{\text{Vol}(A)}$$
- Precompute LUT for function  $Pr$  for all possible input values
- Evaluate only for  $x \leq 10$

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## Point Clouds

- Motivation: renaissance of points as object representation because of 3D scanners
 


- Goal:
  - Fast collision detection between 2 given point clouds
  - No polygonal reconstruction

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### Definition of the surface

- Idea: assume "distance function"  $f$  from surface, then surface  $S$  is
 
$$S = \{x \in \mathbb{R}^3 \mid f(x) = 0\}$$
- "Distance" function  $f$  by Weighted Least Squares:

$f(x) = n(x) \cdot (x - a(x))$

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- Cause and solution:

$d_{geo}$  proximity graph

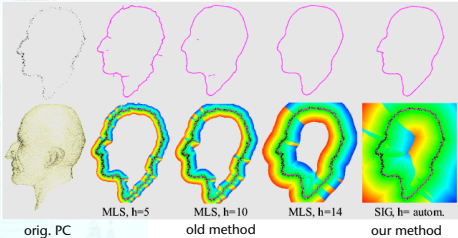
$d_{eucl}$   $p_i$   $x$

- Which neighborhood graph?
  - k-SIG (sphere-of-influence graph)

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## Benefits

- Much less artifacts
- Automatic, sampling-density independent detection of boundaries
- Automatic kernel bandwidth selection → handles different sampling densities automatically




orig. PC    MLS, h=5    MLS, h=10    MLS, h=14    SIG, h= autom.    our method

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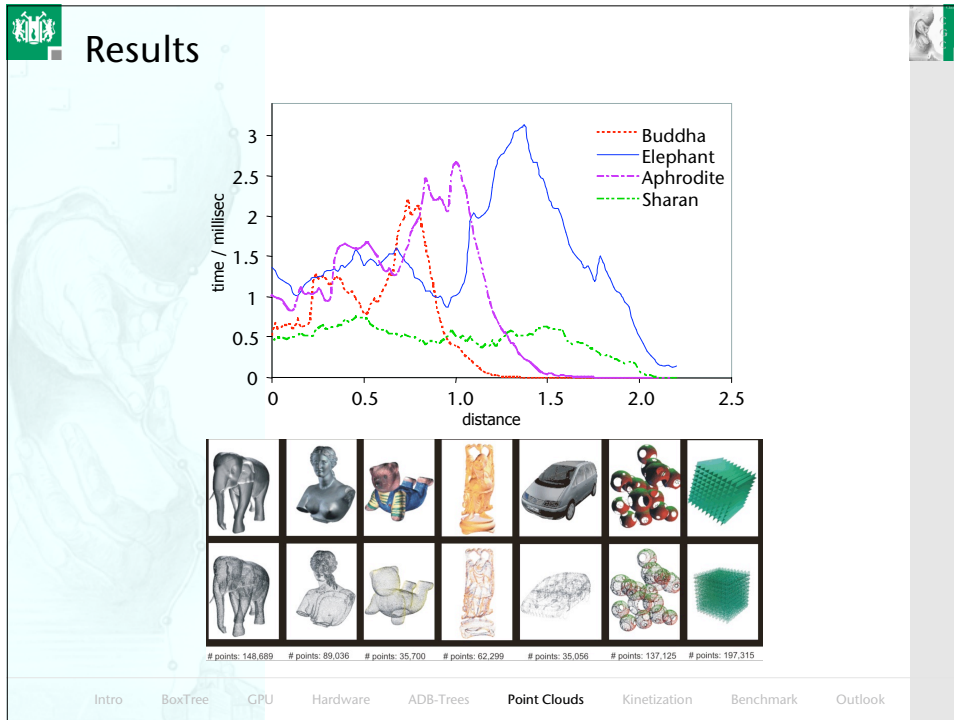
## CD using Point Cloud Hierarchies

### Point Cloud Collision Detection



Jan Klein, Gabriel Zachmann  
Eurographics 2004 – Grenoble, France

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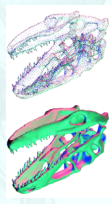
### Coll.Det. of PCs using Stochastic Sampling

- Given two point clouds A and B (or subsets thereof), construct a sampling of
 
$$\mathcal{Z} = \{x \mid f_A(x) = f_B(x) = 0\}$$
- Overall method:

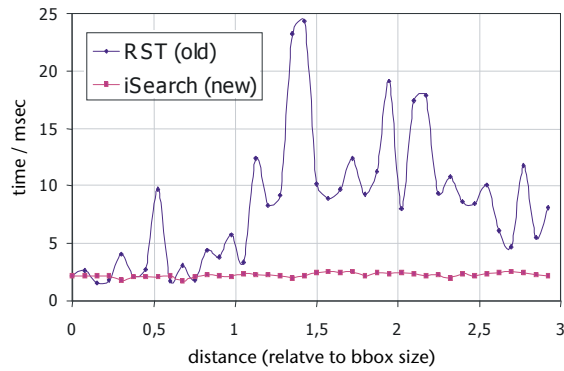
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## Results



28,000 points



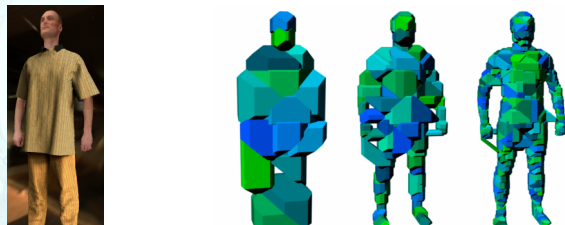
distance (relative to bbox size)	RST (old) time / msec	iSearch (new) time / msec
0.0	2.5	2.0
0.5	10.0	2.0
1.0	5.0	2.0
1.5	24.0	2.0
2.0	18.0	2.0
2.5	10.0	2.0
3.0	8.0	2.0

- Theoretical complexity:  $O(\log \log N)$

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## Kinetic Bounding Volume Hierarchies

- For collision detection of deformable objects ...
- ... but not just for collision detection!
  - Can be applied to ray-tracing, occlusion culling, etc.



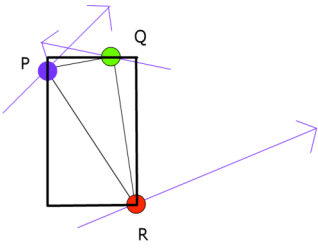
- Pre-processed hierarchy becomes invalid when object deforms
  - BVH must be rebuilt or updated after deformations

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## Our Approach

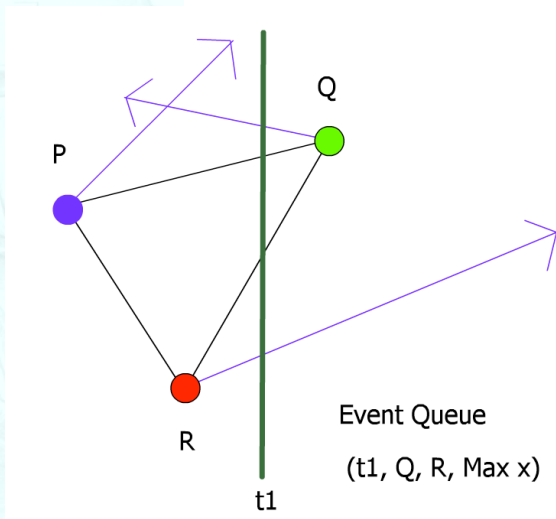
- Observation:
  - Motion in the physical world is normally continuous
  - Changes in the **combinatorial structure** of the BVHs occur only at **discrete** time points

→ We store **only** the combinatorial structure of the BVH and use an event-based approach for updating (kinetization)



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## Kinetic Toy Example



Max  
x Q  
y Q

Min  
x P  
y R

Event Queue  
( $t_1, Q, R, \text{Max } x$ )

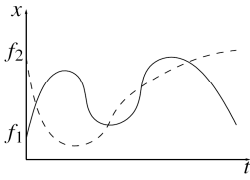
t1

P   Q   R

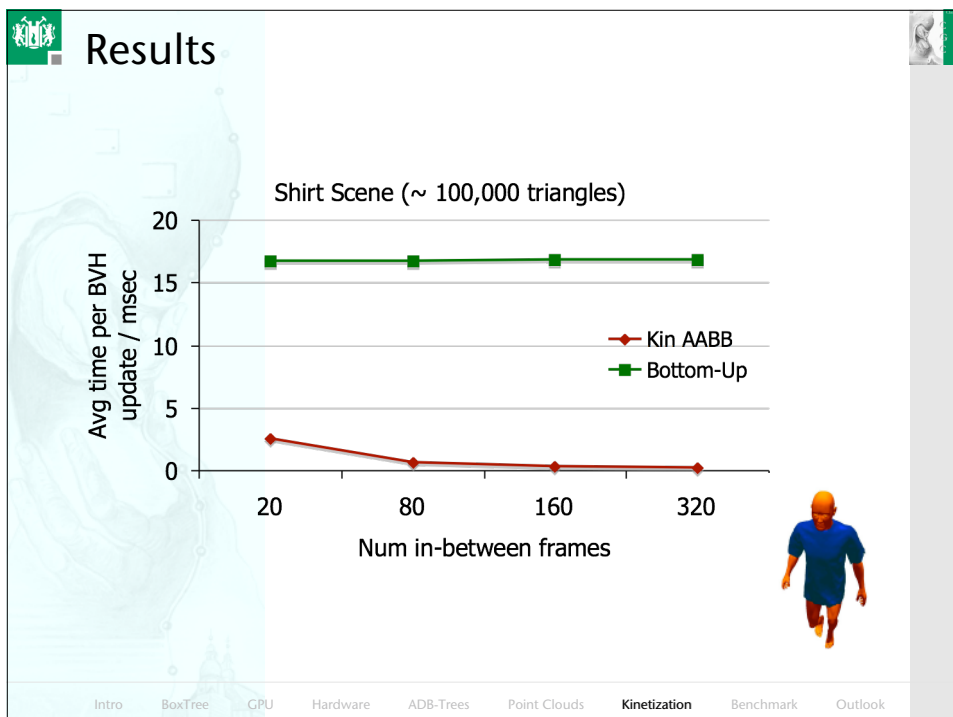
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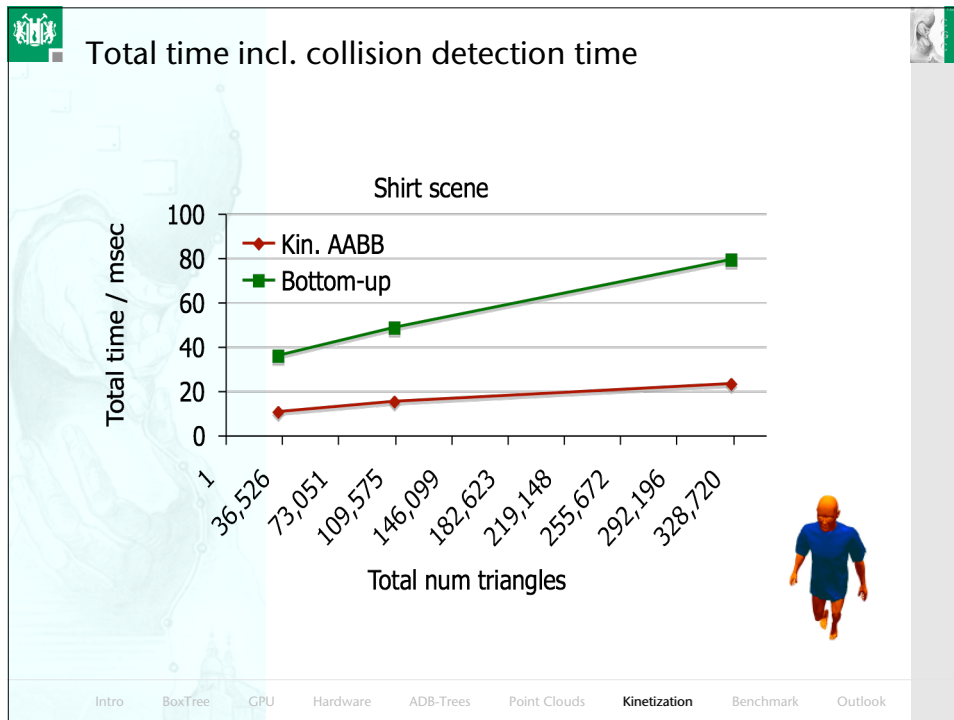
## Theoretical analysis

- Theorem:**  
 Assume the objects have  $n$  vertices,  
 and the number of intersections of each pair of flightplans is  
 bounded from above by a constant for the duration of the  
 animation.  
 Then the total number of events in order to update the BVH is in  
 nearly  $O(n \log n)$ .
- Remark:** this bound is **independent** of the query frequency.



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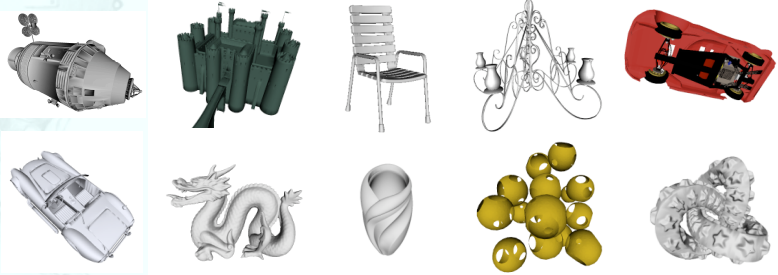
## A Benchmarking Suite

- Goal: provide standard benchmark for existing and future collision detection algorithms
- Running time is very sensitive to
  - object shapes,
  - objects complexity,
  - orientation,
  - distance between the objects.

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## Approach

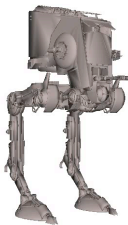
- Collect substantial set of different objects



- Compute several LODs for each
- For every pair of objects, and every distance: pre-compute large set of configurations (rotation / translation)
- Downloadable at [http://cg.in.tu-clausthal.de/research/colldet\\_benchmark/](http://cg.in.tu-clausthal.de/research/colldet_benchmark/)

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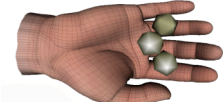

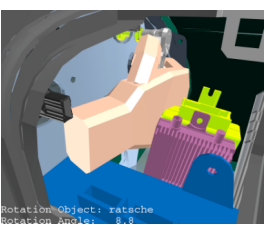
## Benchmark @ Work



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## Natural Interaction

- Direct manipulation is more intuitive and sometimes even more efficient
- Goal:
  - Model and simulate the real human hand
  - Interaction between virtual environment and virtual hand
  - Not necessarily physically correct but physically plausible
- Applications:
  - Virtual assembly Simulation
  - 3D Sketching
  - Medical surgery training

Rotation Object: ratsche  
Rotation Angle: 8.8

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## Implementation

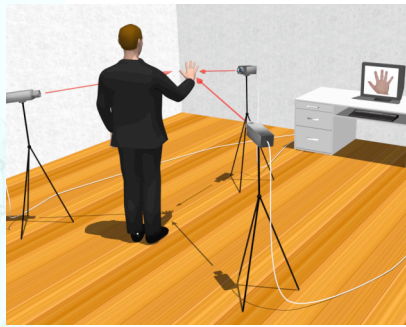

- 17k quad mesh hand model
- Skeletal representation
- OpenSG for visualization
- Data Collection with VRJuggler
- Physical simulation by OpenDE
- Spring model for virtual grasping
- Does not rely on heuristics to estimate user intend or grasp state

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## Real-Time Camera-Based 3D Hand Tracking

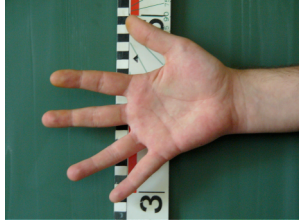
- Goals
  - Observe hand with cameras
  - Determine global hand position and orientation in 3d-space
  - Determine hand state, i.e. angles between fingers

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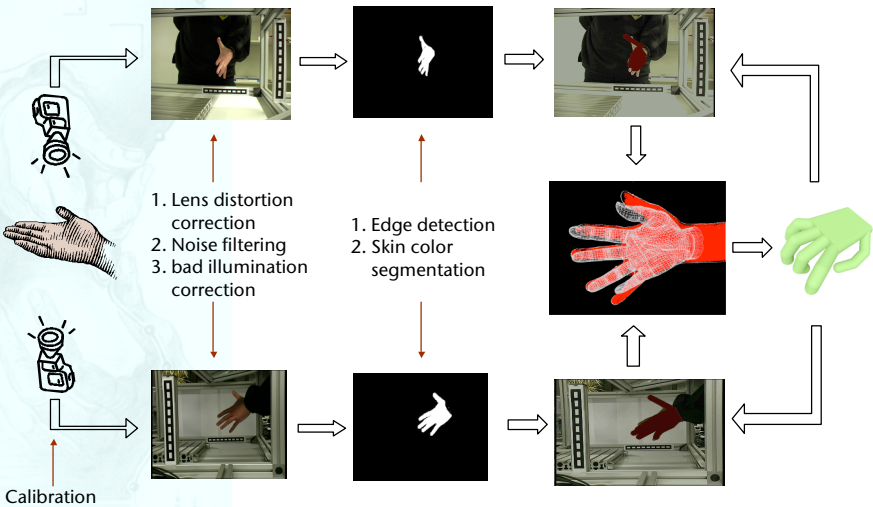
## Challenges

- Measurement noise
- Camera lens distortion
- Uncontrolled illumination
- Mutual occlusions of the hand
- Large working volume
- Fast hand motion
- High problem dimensionality (~ 27 DOFs)



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## Overview of the System



Calibration

1. Lens distortion correction  
2. Noise filtering  
3. bad illumination correction

1. Edge detection  
2. Skin color segmentation

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## Preliminary Results

	Indoor, neon light, white skin	Indoor, daylight, white skin	Indoor, daylight, white skin	Outdoor, daylight, dark skin
Original Image				
Our method				
Jones & Rehg				

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## Summary


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