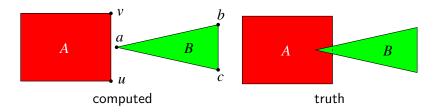
Robustness

Accurate output for all input.

- ► Numerical error (rounding and truncation) is negligible per se.
- ▶ But numerical error can induce structural error.
- ► Controlling structural error is challenging.
- ▶ The problem is ubiquitous in computational geometry.

Structural Error

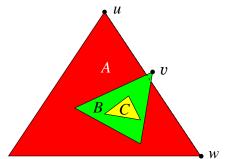


- ▶ Numerical error in line intersection causes structural error in the polygon intersection query (*no* instead of *yes*).
- ▶ Backward error metric: distance from input to alternate input for which computed result is the true result.
 - Norm in scientific computing.
 - ▶ Models numerical and structural error.
 - ▶ Distance from point a to line uv in our example.

Inconsistency

An output is inconsistent if it is not true for any input, so the error is infinite and the output is nonsense.

- ▶ Polygon *P* is inside (outside) polygon *Q* if their edges do not intersect and any vertex *a* of *P* is inside (outside) *Q*.
- ▶ Numerical error: v is above uw.
- ▶ Structural error: *B* is outside *A*.
- ▶ Inconsistency: *C* is inside *A* and *B*.



Robustness Problem 1: Large Errors

- ▶ CG algorithms branch on the signs of predicates.
- ▶ A tiny numerical error can cause a sign error.
- ▶ The sign error can cause a control flow error.
- ▶ The control flow error can cause a structural error.
- ▶ The structural error can be arbitrarily large.
- Errors in the circ predicate cause the example inconsistency.

Robustness Problem 2: Degeneracy

- A predicate is degenerate if its value is zero.
 - circ is degenerate for collinear points.
 - ▶ point-in-circle is degenerate when *a*, *b*, *c* are collinear.
- Degeneracy arises from relations among geometric primitives.
- Degeneracy is common in applications due to design constraints and symmetry.
- Degeneracy adds many special cases to algorithms.
- Challenges: efficient detection and correct handling.

Robustness Strategy 1: Workarounds

- Commercial software contains robustness workarounds.
- Each new problem requires lengthy analysis.
- New workarounds often invalidate old ones.
- Multi-step computations risk garbage-in-garbage-out.
- Robustness must be algorithmic.
- I learned the hard way.

Robustness Strategy 2: Inconsistency Sensitivity

- Evaluate predicates in machine double-float.
- Extend algorithms to handle errors efficiently and accurately.
- No special treatment required for degeneracy.
- Milenkovic and Sacks compute arrangements of algebraic plane curves with small errors.
- We could not extend the paradigm to 3D triangles!

Robustness Strategy 3: Exact Computational Geometry

Prevent structural error by computing predicates exactly.

- ► Yap 2004
 - ▶ Handle easy cases with double-float arithmetic.
 - ▶ Handle hard cases with root separation bounds.
 - ▶ LEDA and Core libraries implement this approach.
 - They are slow and memory bound.
- Shewchuk
 - Adaptive precision predicate evaluation.
 - Fast, but no defined parameters.
- Neither approach addresses degeneracy handling.

Robustness Strategy 4: Controlled Perturbation

Halperin 2010: compute predicates exactly for a perturbed input.

- ► Compute predicates in double-float with a safety check.
- ightharpoonup Determine an input perturbation size δ that makes predicates safe with high probability.
- Apply a δ -perturbation and execute algorithm.
- ▶ If any check fails, restart with a different δ -perturbation.
- lacktriangle Alternately, start with a small δ and double it at each restart.
- ▶ Backward error equals final δ .
- ► Fast: small overhead over pure double-float evaluation.
- No special treatment required for degeneracy.
- ▶ Problem: rare bad cases force large δ .

Adaptive Controlled Perturbation (ACP)

Sacks and Milenkovic 2014: error-bounded perturbation.

- ▶ User-specified error bound δ (typically 10^{-8}).
- Enforced by setting perturbation size to δ .
- Exact predicate evaluation for perturbed input.
 - Initial evaluation in floating point interval arithmetic.
 - ▶ Rare bad cases handled by repeatedly doubling the precision.
 - Extended precision arithmetic uses MPFR library.
 - Object-oriented geometric primitives control memory cost.
- ▶ 10%-20% slower than floating point predicate evaluation.
- Packing polyhedra, free spaces of curved planar bodies, Minkowski sums of polyhedra on the GPU.