

**Cours d'Algorithmique Avancée (INFO036), Université de Liège**

**6<sup>th</sup> February 2007**

# **Introduction to Convex Hull Applications**

**Cyril Briquet**

Department of EE & CS  
University of Liège, Belgium

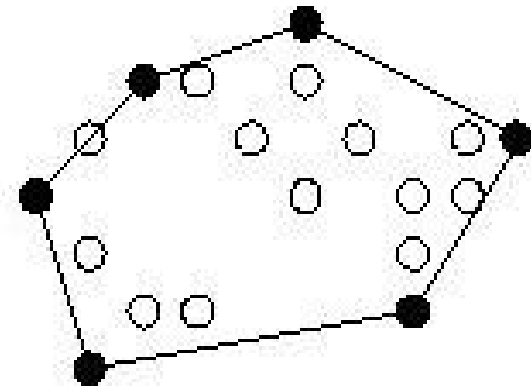
# Overview

- **Convex Hull – basic notions**
- Convex Hull – application domains
- Onion Peeling – basic notions
- Onion Peeling – application domains
- Overview of classic algorithms
- Integration of a Convex Hull algorithm

# Convex Hull - basic notions (I)

- input: set of  $N$  sites  
(i.e. data points in 2, 3,... dimensions)

- Convex Hull (2D):  
smallest enveloping polygon  
of the  $N$  sites



- output: ordered subset of  $h$  sites

# Convex Hull - basic notions (II)

- relationship with sorting
- worst-case computational complexity:
  - output-independent -  $O(N^2)$ ,  $O(N \log N)$
  - output-sensitive -  $O(N \log h)$
- storage requirements:  $O(N)$ , in situ

# Overview

- Convex Hull – basic notions
- **Convex Hull – application domains**
- Onion Peeling – basic notions
- Onion Peeling – application domains
- Overview of classic algorithms
- Integration of a Convex Hull algorithm

# Convex Hull – application domains

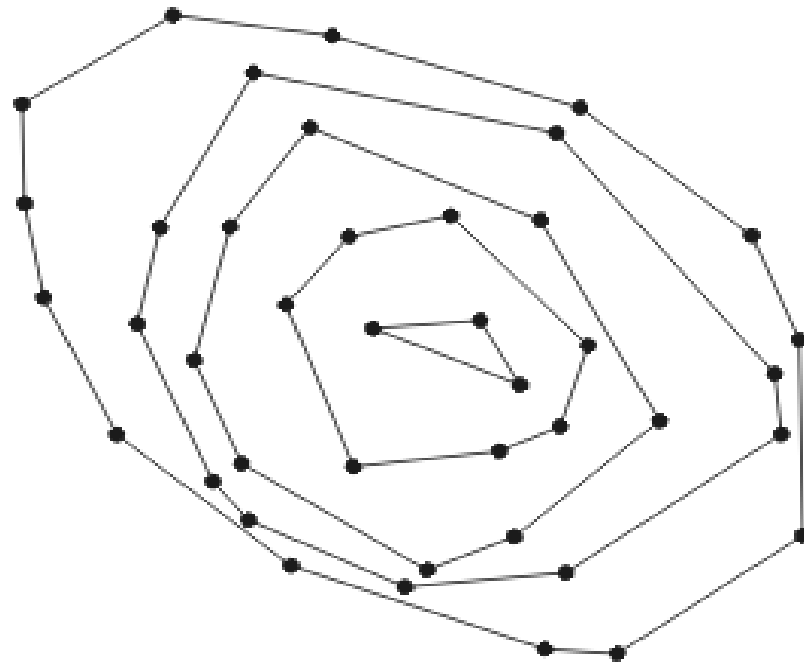
- **computer visualization, ray tracing**  
(e.g. video games, replacement of bounding boxes)
- **path finding**  
(e.g. embedded AI of Mars mission rovers)
- **Geographical Information Systems (GIS)**  
(e.g. computing accessibility maps)
- **visual pattern matching**  
(e.g. detecting car license plates)
- **verification methods**  
(e.g. bounding of Number Decision Diagrams)
- **geometry**  
(e.g. diameter computation)

# Overview

- Convex Hull – basic notions
- Convex Hull – application domains
- **Onion Peeling – basic notions**
- Onion Peeling – application domains
- Overview of classic algorithms
- Integration of a Convex Hull algorithm

# Onion Peeling - basic notions (I)

- Onion Peeling: sequence of nested convex hulls



- computational complexity: also  $O(N \log N)$



# Overview

- Convex Hull – basic notions
- Convex Hull – application domains
- Onion Peeling – basic notions
- **Onion Peeling – application domains**
- Overview of classic algorithms
- Integration of a Convex Hull algorithm

# Onion Peeling – application domains (I)

- propagation of chemical events:  
preprocessing to enable *depth retrieval*
- robust statistical estimators:  
detection of *outliers*
- study of Earth atmosphere
- network protocols (CDMA)

# Onion Peeling – application domains (II)

## HALogen Occultation Experiment (HALOE, NASA)

- Earth atmosphere profiling via solar occultation
- « *limb viewing experiment: measurements of the atmosphere from the UARS satellite, along paths tangents to Earth surface* »



(limb = outermost edge of a celestial body)

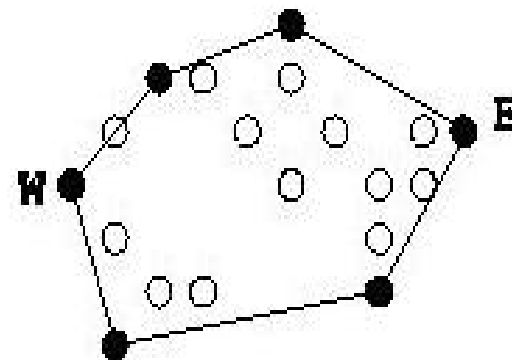
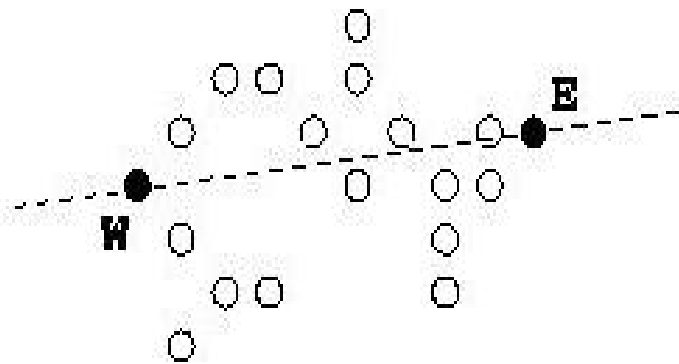
- layers of the atmosphere = Convex Hulls

# Overview

- Convex Hull – basic notions
- Convex Hull – application domains
- Onion Peeling – basic notions
- Onion Peeling – application domains
- **Overview of classic algorithms**
- Integration of a Convex Hull algorithm

# Overview of classic algorithms

- some Convex Hull algorithms require that input data is preprocessed:  
sites are sorted by lexicographical order  
(by X coordinate, then Y coordinate for equal X)
- most Convex Hull algorithms are designed to operate on a half plane



- E, W: extremal sites in lexicographical order

# Overview of classic algorithms

- Sort Hull (*Marche de Graham*) – requires preprocessing
- WrapHull (*Marche de Jarvis*)
- BridgeHull – requires preprocessing
- MergeHull – uses SortHull
- QuickHull

# Overview of classic algorithms

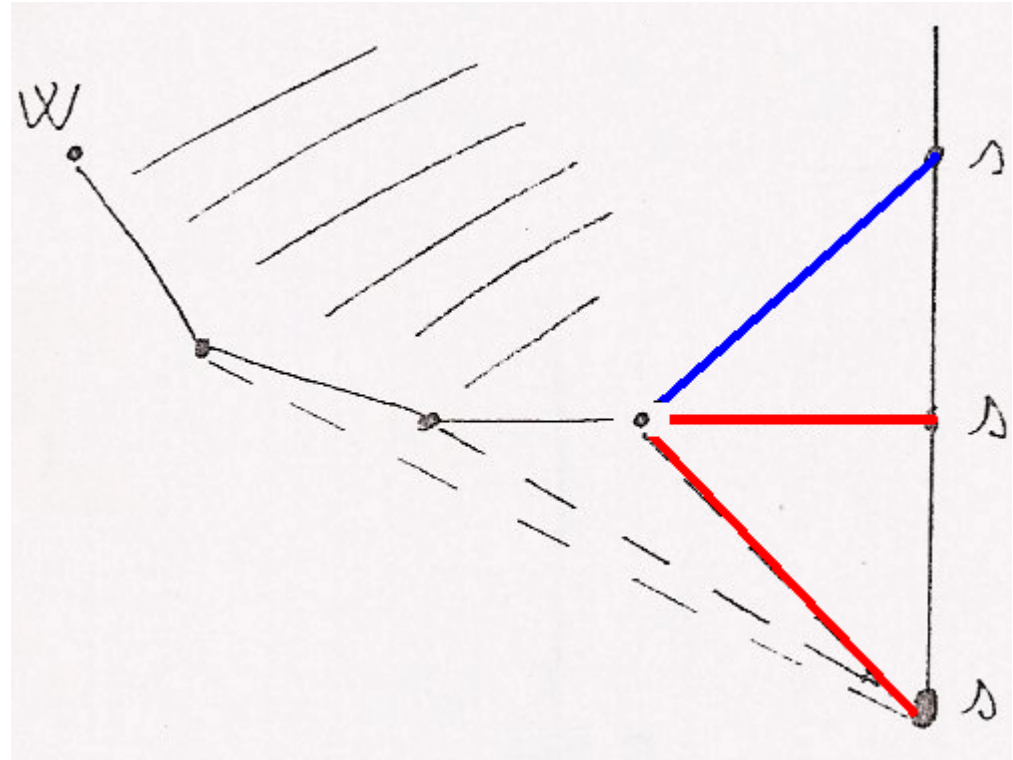
## Sort Hull

- process sites in lexicographical order
- for each site  $s$ , determine if

last site of partial

Convex Hull should be **kept** or **removed**

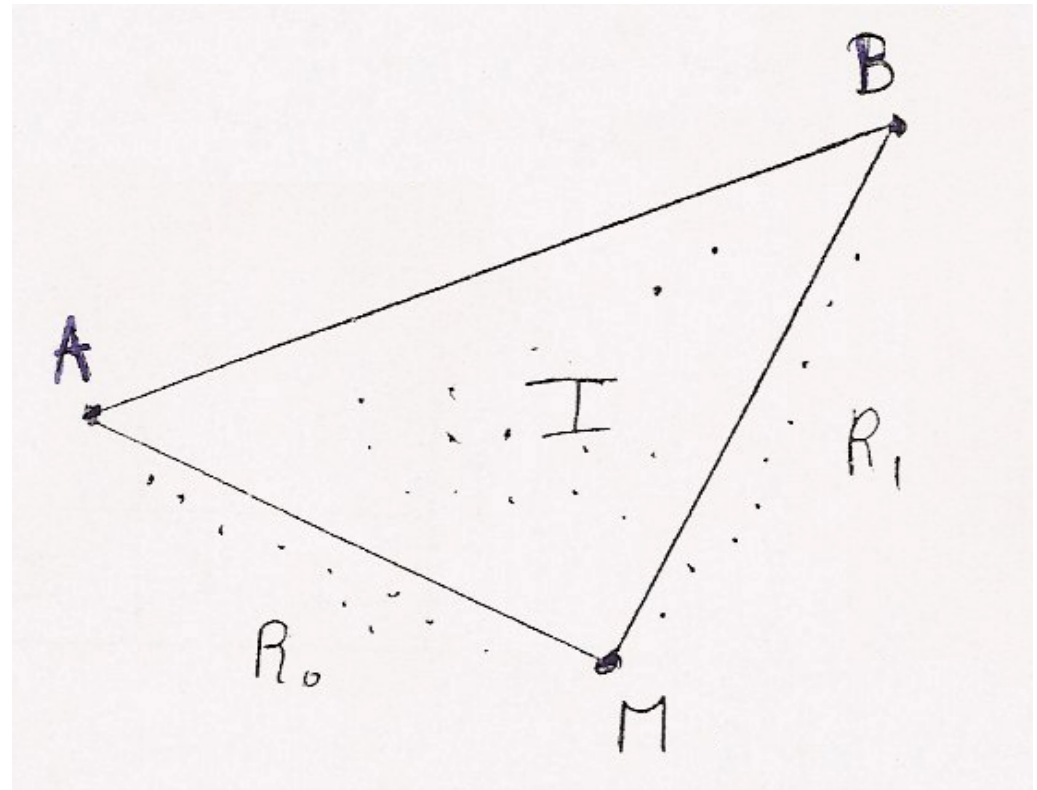
(if removed, reevaluate last site of partial CH)



# Overview of classic algorithms

## QuickHull

- select pivot  $M$ , partition space into 3 sets  $R_0, R_1, I$
- $A, B, M$  included in the Convex Hull
- apply again to  $R_0, R_1$



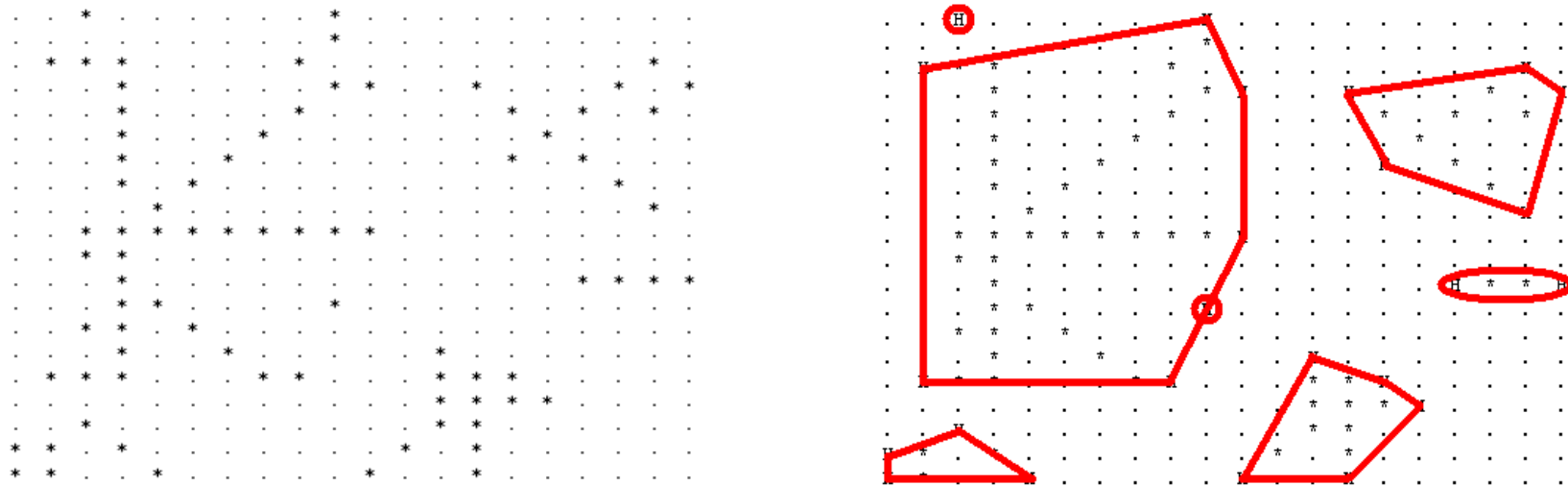


# Overview

- Convex Hull – basic notions
- Convex Hull – application domains
- Onion Peeling – basic notions
- Onion Peeling – application domains
- Overview of classic algorithms
- **Integration of a Convex Hull algorithm**

# Integration of a Convex Hull algorithm

- GIS problem: from satellite imagery, compute the convex hulls of a set of *barriers*
- Input: a matrix of booleans



- Output: 24 sites ordered in 7 Convex Hulls

# Integration of a Convex Hull algorithm

- QuickHull is the fastest Convex Hull algorithm
- ... or is it ?
- it was noticed that in this setup, SortHull is known to perform better
  - small number of sites in each Convex Hull
  - most Convex Hulls are long and thin (e.g. roads, rivers, human-made barriers)

# Integration of a Convex Hull algorithm

- but SortHull requires preprocessing anyways, so all gain over QuickHull would be lost ...

=> considering the Convex Hull algorithm within the context of the chain of algorithms needed to solve this problem led to an efficient solution

# Integration of a Convex Hull algorithm

0, 1, 2, 3, 4, 5, 6 = regions of connected sites

```
. . 0 . . . . . 1 . . . . .
. . . . . 1 . . . . .
. 1 1 1 . . . . 1 . . . . . 2 .
. . . 1 . . . . 1 1 . . 2 . . 2 . 2
. . . 1 . . . . 1 . . . . . 2 . 2 . 2 .
. . . 1 . . . 1 . . . . . . 2 . . .
. . . 1 . . 1 . . . . . . 2 . 2 . .
. . . . 1 . . . . . . . . . . 2 .
. . . . 1 . . . . . . . . . . 2 .
. . 1 1 1 1 1 1 1 1 1 . . . . .
. . 1 1 . . . . . . . . . . .
. . . 1 . . . . . . . . . . 3 3 3 3
. . . 1 1 . . . . 4 . . . . .
. . 1 1 . 1 . . . . . . . . . .
. . . 1 . . 1 . . . . . 5 . . . .
. 1 1 1 . . . 1 1 . . . 5 5 5 . .
. . . . . . . . . . . 5 5 5 5 . .
. . 6 . . . . . . . . . 5 5 . .
6 6 . 6 . . . . . . 5 . 5 . .
6 6 . . 6 . . . . . 5 . . 5 . .
```

# Integration of a Convex Hull algorithm

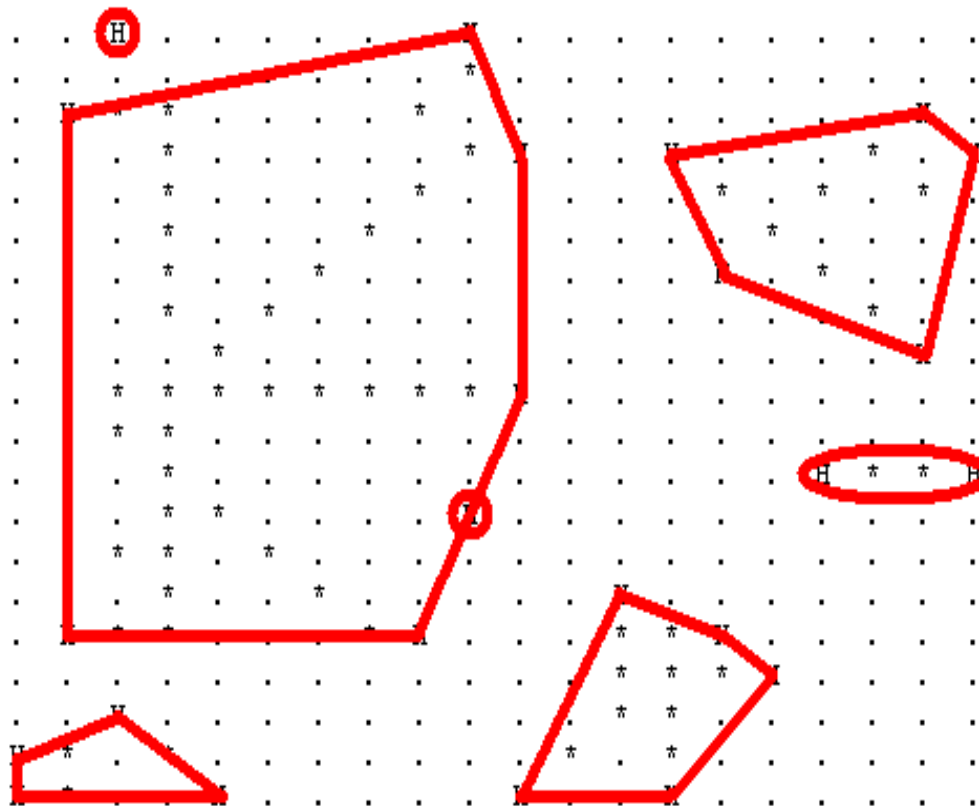
L = Lower, U = Upper, bound of a discrete *bar*

```
. . B . . . . . U . . . . .
. . . . . * . . . . .
. U U U . . . . U . . . . . U .
. . . * . . . . * U . . B . . U . B
. . . * . . . . * . . . . U . U . * .
. . . * . . . . U . . . . . B . . . .
. . . * . . U . . . . . L . L . . .
. . . . U . . . . . . . . L .
. . * * * * * L L . . . . .
. . * * . . . . . . . . B B B B
. . . * L . . . . B . . . . .
. . * * . L . . . . . . . . .
. . . * . . L . . . . U . . . . .
. L L L . . . L L . . * U U . . .
. . . . . . . . . * * L B . . .
. . B . . . . . . . L * . . . .
U U . B . . . . . B . * . . . .
L L . . B . . . . . B . . L . . . .
```

at this point, \* sites can be filtered out

# Integration of a Convex Hull algorithm

Sort Hull is applied and keeps 24 sites



# Integration of a Convex Hull algorithm

- computational complexity is very important
- selecting an algorithm only on its complexity may lead to suboptimal performance of the whole chain of algorithms it belongs to