

ACCURACY ASPECTS OF PROCESSING AND FILTERING OF MULTIBEAM DATA: GRID modeling VERSUS TIN BASED modeling

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1. Introduction

2. Grid modeling

3. TIN based modeling

4. Grid versus TIN

5. Accuracy Aspects of TIN & grid models

6. Conclusions



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1. Introduction

Requirements for hydrographical Digital Terrain modeling processing:

1. **“Fast”** modeling (real-time and/or post-processing)
2. Allow **“Editing”** (manual and/or automatic, target: spike removal and/or update of models)
3. Give the option of **“Intelligent”** filtering (reduction) of data
4. **“Accurate”** volume computation => **“accountability”**

=> **GRID and TIN (triangular irregular network) modeling**



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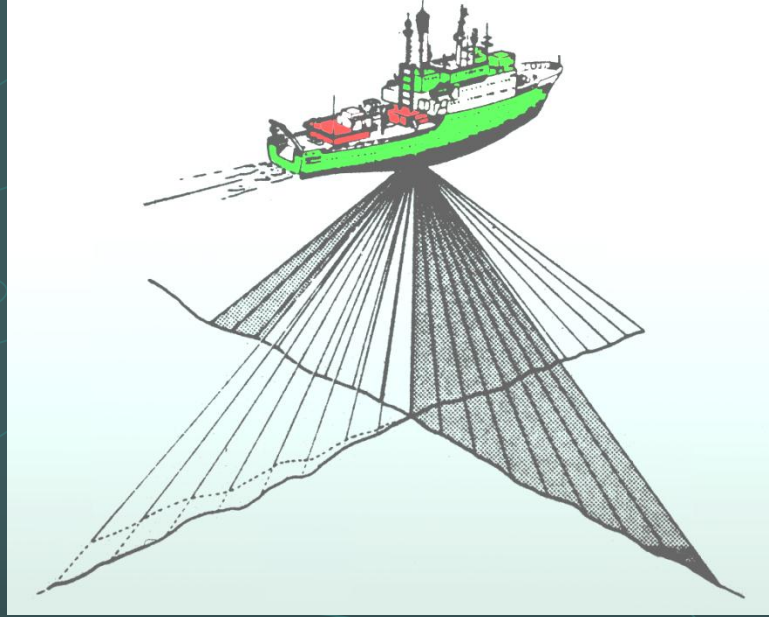
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2. Grid modeling: Principle

- Multibeam =>
 - Equidistant coordinates in **international grid** system
 - Geodetic datum
 - Projection system (UTM,...)
 - Conventional reference plane (LAT, CD, GRS80 ellipsoid) with z from GNSS or tide gauges
 - Output = **equidistant** grid data (E, N axis) =>
 - **Store only Depth** values (typically 2 byte/point: 65536 depth values)
 - **Grid interval distance** is decisive parameter





2. Grid modeling: Filtering

- Huge amount of points (e.g. Kongsberg EM3002)
 - 40 Hz
 - 500 pts./swap
- ⇒ 20.000 points/sec. or 72 million/hour or > 1 billion/day

For **Quality Control**: multiple points/cell needed

But for other applications (volumes, GIS, ...): Less points needed => grid interval distance should be chosen carefully

2. Grid modeling: Filtering: How ?

- **Increase grid interval** distance

e.g. 1 by 1 m \Rightarrow 5 by 5 m

\Rightarrow Reduction by 96 %

\Rightarrow Loss of resolution can cause loss of seabottom details

- Use of “**smarter**” algorithms

- Depth is weighted average of all depths of initial cells

- Weighting factor = inverse distance to power n (2 ?)

- Use model with variable grid intervals \Rightarrow complex



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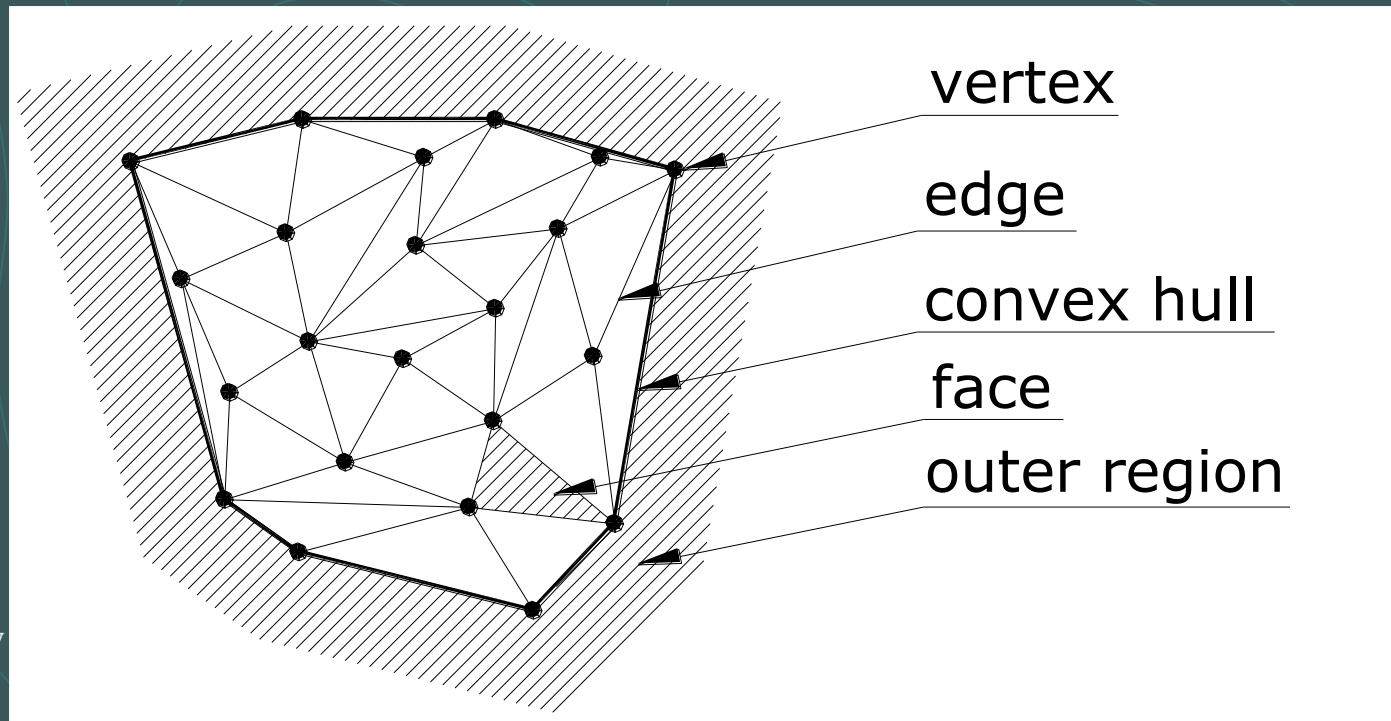
3. TIN based modeling: principle

- What is a triangulation ?
- Why Delaunay is the best triangulation ?
- Property of a Delaunay triangulation
- Different Algorithms



What is a triangulation (TIN) ?

- = network of irregular triangles, created by connecting the points (vertices) of a dataset so that
- no triangle sides are intersecting
 - no triangles are superposed
 - the union of all triangles fill up the hull of the triangulation



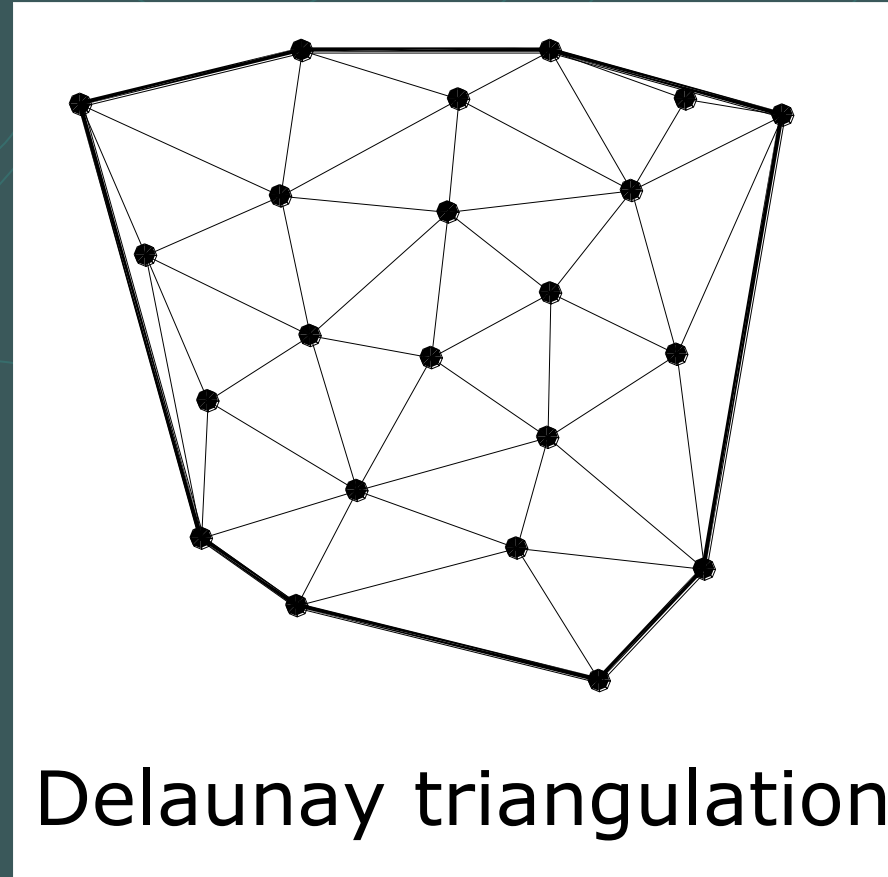
Why Delaunay triangulation ?

Advantages:

- Mathematically well defined
- Unique for a given dataset
- Data-sequence independent
- Independent control possible
- Variable density

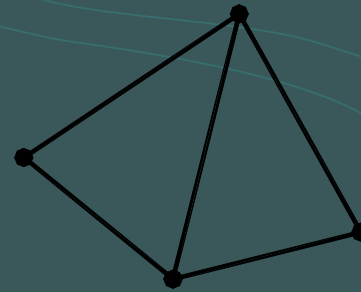
Drawbacks:

- Complexity by storing points (E,N,H) and triangles (\leftrightarrow grid)

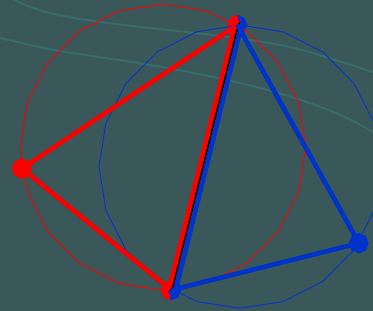
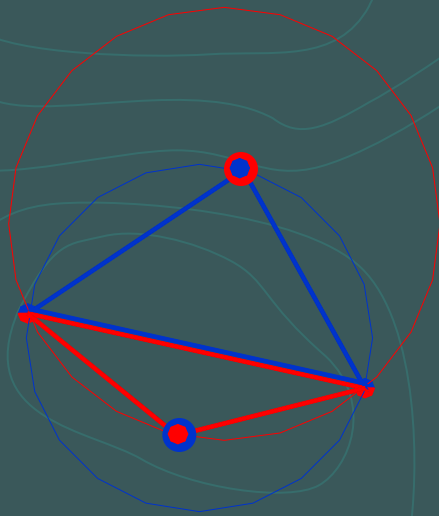


Delaunay triangulation

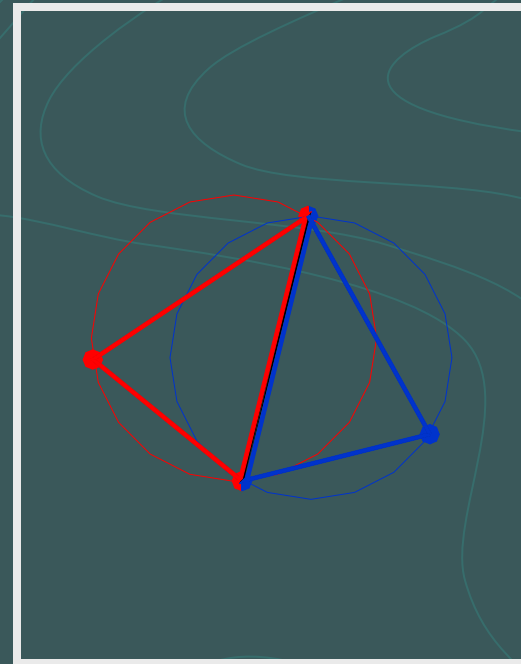
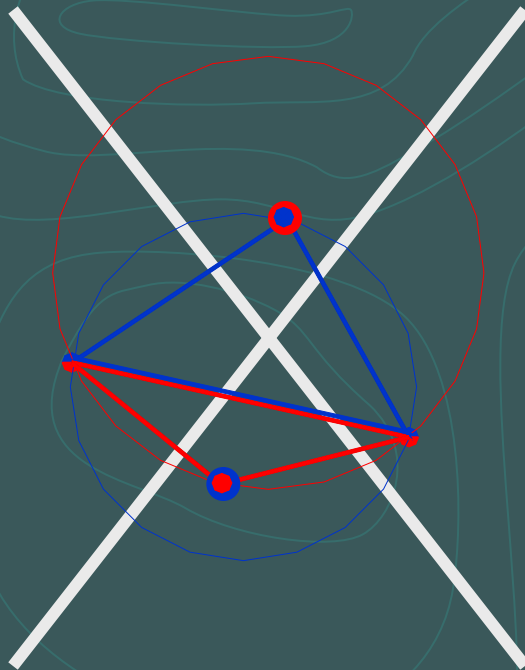
Property of Delaunay triangulation



For each triangle, the
circumscribing circle does not
contain any other vertex.

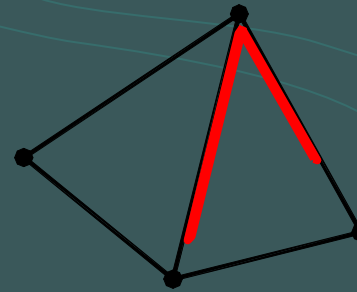
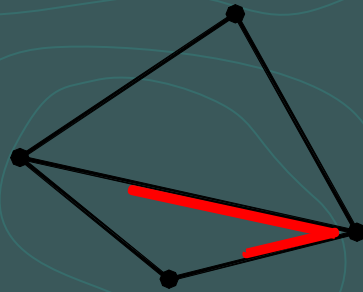


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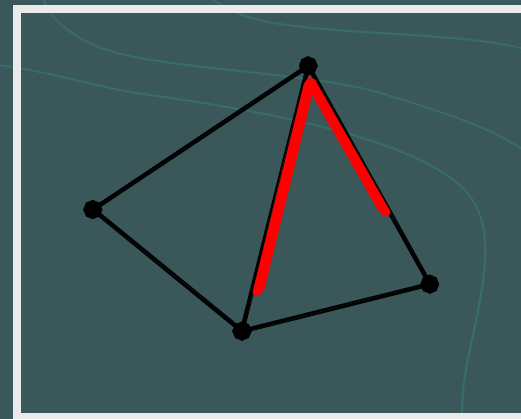
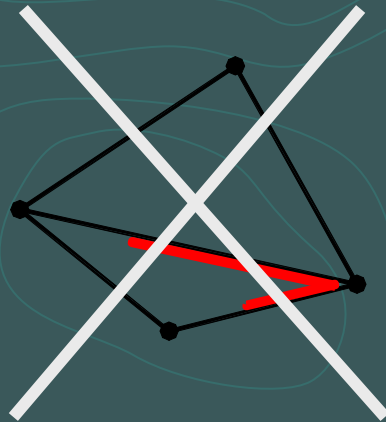


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Circumscribing rule is equivalent to the Min-max rule of Lawson



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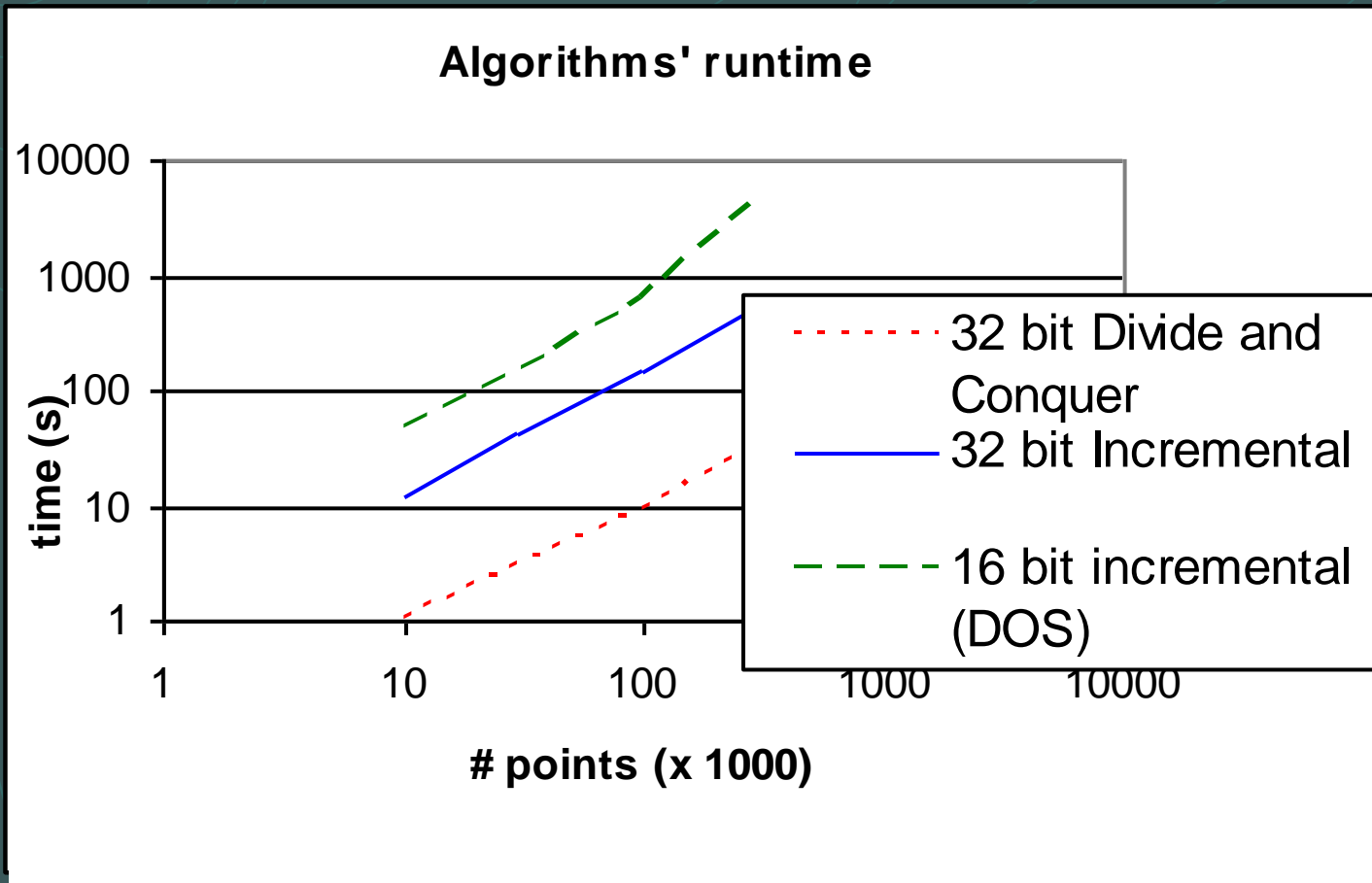
Local optimisation leads to global optimalisation



Delaunay-triangulation-algorithms

- Incremental
- Divide-and-conquer
- Sweepline
- Giftwrapping

Runtime comparison



3. TIN based modeling: Filtering

« Greedy insertion »

- Start situation = convex hull of triangulation
- Selective adding by using a rule (Min. Diff. in Depth or Vol.)

« Vertex decimation »

- Start situation = complete Delaunay triangulation
- Then selective elimination of points





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4. Grid modeling: Advantages

Grid model is more easy to implement (than TIN)

⇒ Higher processing speed

⇒ Higher visualisation speed

Algorithms can be raster based instead of vector based

⇒ Real-time modeling

⇒ Real-time editing

⇒ Higher software developing speed ⇒ lower cost

4. Grid modeling: Drawbacks

Accuracy ?

- **Loss** of the initial measured points
- Choice of **grid interval** distance is of capital importance
 - Too small** => huge amounts of redundant data
 - Too big** => loss of details
- **Variable grid interval model** could solve this, but at the cost of complexity, computer memory and processing time !



4. TIN based modeling: Advantages and drawbacks

- **Original measured points** are kept
- **No interpolated** points
- **Adaptive** model
 - Locally higher point density => smaller triangles => more details
 - Locally lower point density => big triangles => saving computer memory
- **More complex** model
 - Higher computer memory requirements
 - Slower in processing
 - Algorithms difficult to implement





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5. Accuracy Aspects of TIN & grid models

- **How to compute a volume in a TIN ?**
- **Standard deviation (σ)/variance of the computed volume**
- **Variance of a volume using interpolated points in a TIN**



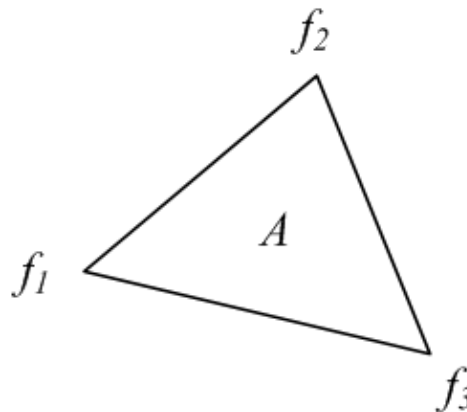
5. Accuracy Aspects of TIN & grid models

- **How to compute a volume in a TIN ?**
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How to compute a volume in a TIN ?

With A_j as the planimetric surface of a triangle j , f_{ref} as the height of the horizontal reference plane and f_i as the elevation of the 3 vertices i of the triangle, the volume V_j generated by one triangle j is equal to

$$\left(\frac{1}{3}(f_1 + f_2 + f_3) - f_{ref}\right) A_j = V_j$$



How to compute a volume in a TIN ?

The total volume V is the sum of the volumes of all individual prisms, thus

$$\frac{1}{3} \sum_i f_i \left(\sum_{f_i \in A_j} A_j \right) - f_{ref} A_{tot} = V$$

If we call B_i the sum of the surfaces of all triangles with point i as vertex or

$$B_i = \left(\sum_{f_i \in A_j} A_j \right)$$

Then we can write

$$\frac{1}{3} \sum_{i=1}^n f_i B_i - f_{ref} A_{tot} = V$$

5. Accuracy Aspects of TIN & grid models

- **How to compute a volume in a TIN ?**
- **Standard deviation (σ)/variance of the computed volume**
- **Variance of a volume using interpolated points in a TIN**



Assuming that all f_i are independent, the variance of the volume can be found

$$\frac{1}{3} \sum_{i=1}^n f_i B_i - f_{ref} A_{tot} = V \quad \Rightarrow \quad Var(V) = \frac{1}{9} \sum_i Var(f_i) B_i^2$$

The standard deviation and variance $Var(f_i)$ of the elevation of a point is usually assumed to be constant so that, with n the total number of points

$$Var(V) = \frac{Var(f)}{9} \sum_i B_i^2$$
$$\sigma(V) = \frac{\sigma(f)}{9} \sum_{i=1}^n B_i^2$$

This form is useful in the case of a TIN model based on non-equidistant points.


$$\sigma(V) = \frac{1}{\sqrt{n}} \cdot \sigma(f) \cdot A_{tot} \cdot \sqrt{1 + \left(\frac{\sigma(B)}{B} \right)^2}$$

The latter form is applicable to TIN's of irregular spaced points but is also particularly suited in the case of a TIN model based on equidistant points.

5. Accuracy Aspects of TIN & grid models

- **How to compute a volume in a TIN ?**
- **Standard deviation (σ)/variance of the computed volume**
- **Variance of a volume using interpolated points in a TIN**





$B_i - f_{ref} A_{tot} = V$
 $B_i - f_{ref} A_{tot} = V$

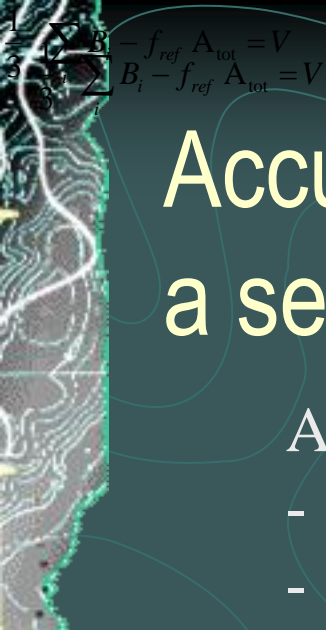
Accuracy of a volume computation using a set of m points interpolated in a TIN

Assume:

- n original points => ca. 2n triangles in the TIN
- m points interpolated in this TIN

$$\text{TIN} = \{f_i \in A: A \subset \mathbb{R}^3: i = 0 \dots n\}$$

$$\text{Subset} = \{\tilde{f}_i \in B: B \subset \mathbb{R}^3: i = 0 \dots m\}$$



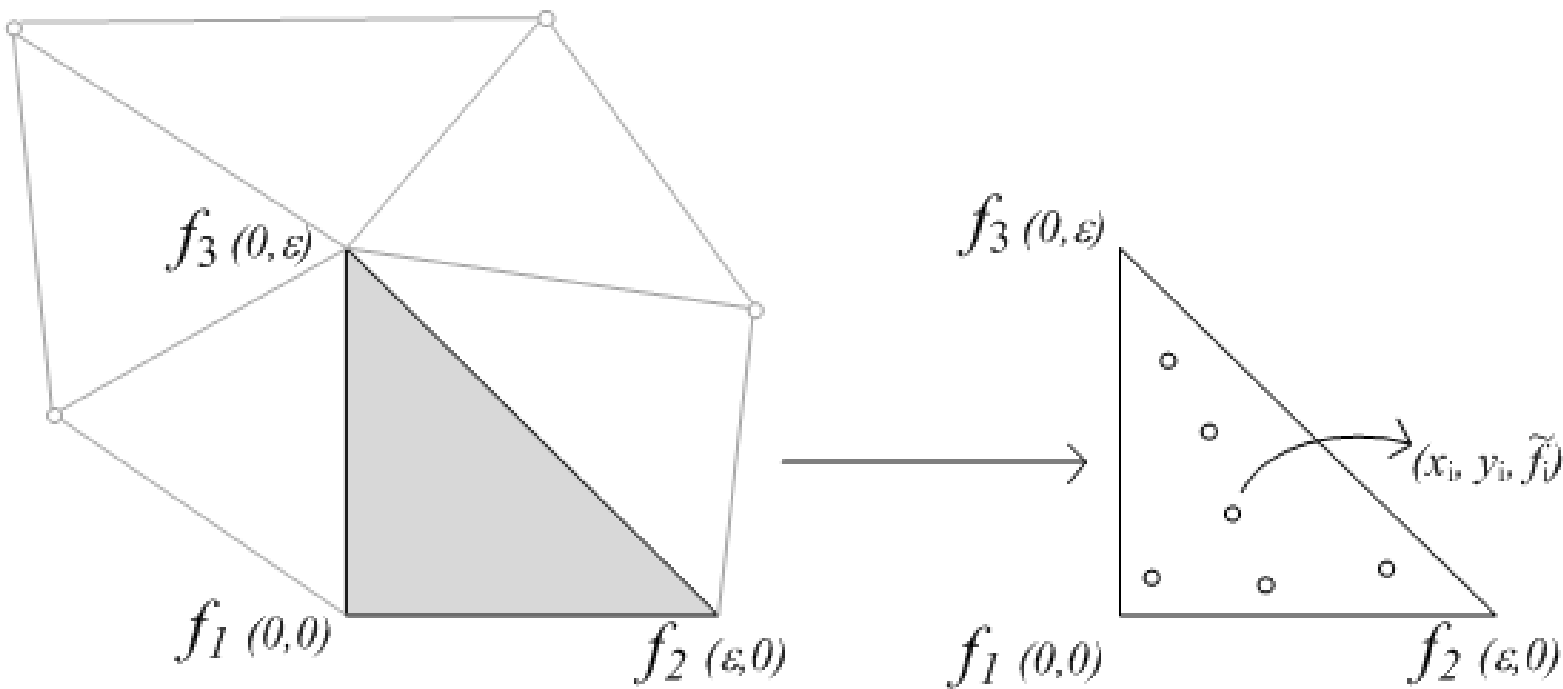
$$-f_{ref} A_{tot} = V$$

$$B_i - f_{ref} A_{tot} = V$$


Accuracy of a volume computation using a set of m points interpolated in a TIN

Assume:

- n original points => ca. 2n triangles in the TIN
- m points interpolated in this TIN



Assumed structure of a triangle with m_{Δ} points, having elevation values \tilde{f}_i



$$\begin{aligned} -f_{ref} A_{tot} &= V \\ B_i - f_{ref} A_{tot} &= V \end{aligned}$$

Accuracy of a volume computation using a set of m points interpolated in a TIN

Mathematical elaboration will be published in the NCG publications (<http://www.ncg.knaw.nl/>)

- Considering random interpolated points
- Knowing that the variance will be smaller for equidistant points
- The formula elaboration gives us the “worst case scenario” and leads to

$$\text{Var}(V) = \sum_{\Delta} \frac{A_{\Delta}^2}{m_{\Delta}} \left(\frac{1}{4} \text{Var}(f_{\Delta}) + \text{Var}(f) \right)$$


A vertical strip on the left side of the slide shows a topographic map with contour lines and a TIN (Triangulated Irregular Network) overlay. The TIN is represented by a series of small triangles and points, with some points highlighted in yellow. The map shows a river and surrounding terrain.
$$\begin{aligned} -f_{ref} A_{tot} &= V \\ B_i - f_{ref} A_{tot} &= V \end{aligned}$$

Accuracy of a volume computation using a set of m points interpolated in a TIN

$$\text{Var}(V) = \sum_{\Delta} \frac{A_{\Delta}^2}{m_{\Delta}} \left(\frac{1}{4} \text{Var}(f_{\Delta}) + \text{Var}(f) \right)$$

The variance is a **sum over all triangles, where within each triangle:**

- m_{Δ} is the number of interpolated points,
- $\text{Var}(f)$ is the a priori assumed stochastic measurement error,
- A_{Δ} is the planimetric surface,
- $\text{Var}(f_{\Delta})$ the variance of the heights of the 3 vertices.


$$\begin{aligned} -f_{ref} A_{tot} &= V \\ B_i - f_{ref} A_{tot} &= V \end{aligned}$$

Accuracy of a volume computation using a set of m points interpolated in a TIN

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- Combining the variance of a TIN
- With the variance of the interpolated points
- Finally results in

$$\text{Var}(V) = \text{Var}(f) \frac{1}{n} A_{total}^2 \cdot \left[1 + \left(\frac{\sigma(B)}{\bar{B}} \right)^2 \right]$$

$$\text{Var}(V) = \sum_{\Delta} \frac{A_{\Delta}^2}{m_{\Delta}} \left(\frac{1}{4} \text{Var}(f_{\Delta}) + \text{Var}(f) \right)$$

$$\text{Var}(V) = \sqrt{\text{Var}(f) \frac{1}{n} A_{total}^2 \cdot \left[1 + \left(\frac{\sigma(B)}{\bar{B}} \right)^2 \right] + \sum_{\Delta} \frac{A_{\Delta}^2}{m_{\Delta}} \left(\frac{1}{4} \text{Var}(f_{\Delta}) + \text{Var}(f) \right)}$$



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- Hydrographic impose **specific requirements** to the processing
- Multibeam or homogeneous data coverage => **Grid** modeling
 - Straightforward (easy implementation) => faster
 - Less flexible (fixed grid interval distance)
- Singlebeam or non-homogeneous data coverage => **TIN**
 - More complex (more difficult implementation) => slower
 - Flexible (variable triangle size)
- **Accuracy** of TIN Volume
 - **Prismatic vol. computation**
 - **Computation using interpolated points**

$$\text{Var}(V) = \text{Var}(f) \frac{1}{n} A_{total}^2 \cdot \left[1 + \left(\frac{\sigma(B)}{\bar{B}} \right)^2 \right]$$

$$\text{Var}(V) = \sqrt{\text{Var}(f) \frac{1}{n} A_{total}^2 \cdot \left[1 + \left(\frac{\sigma(B)}{\bar{B}} \right)^2 \right] + \sum_{\Delta} \frac{A_{\Delta}^2}{m_{\Delta}} \left(\frac{1}{4} \text{Var}(f_{\Delta}) + \text{Var}(f) \right)}$$

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Thank you for your attention !

Questions?