



# From field data to source parameters (volume): uncertainty in pyroclastic eruptions

Confession time

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# Tutorial Outline



## Uncertainty of Eruption Magnitude (volume) estimates

- Background & research questions
- Experiment
- Results and conclusions

# Confession 2



Physical volcanologists are non-conformists and nihilists....

..... *“all values are baseless and nothing can be known or communicated, .... often associated with extreme pessimism and a radical skepticism”*

Protocols and standardized practices are an abomination to them, to be avoided at all costs

# Thickness to volume



When estimating eruptive volume individuals make four sets of independent and subjective choices

- The spacing of thickness sites
- The selection and number of constraining contours
- The hand or machine contouring of thickness
- The choice of functions to fit to derive tephra volumes

What uncertainties are associated with these practices?



## ***Paper 1: Reproducibility of Eruption Volume Estimates***

*Klawonn, M.; Houghton, B.F.; Swanson, D.A.; Fagents, S.A.; Wessel, P.; Wolfe, C.J. 2014. Constraining explosive volcanism: Subjective choices during estimates of eruption magnitude. Bulletin of Volcanology, 76: 793-798. doi:10.1007/s00445-013-0793-3*

## ***Paper 2: From Field Data to Volumes: Constraining Uncertainties in Pyroclastic Eruption Parameters***

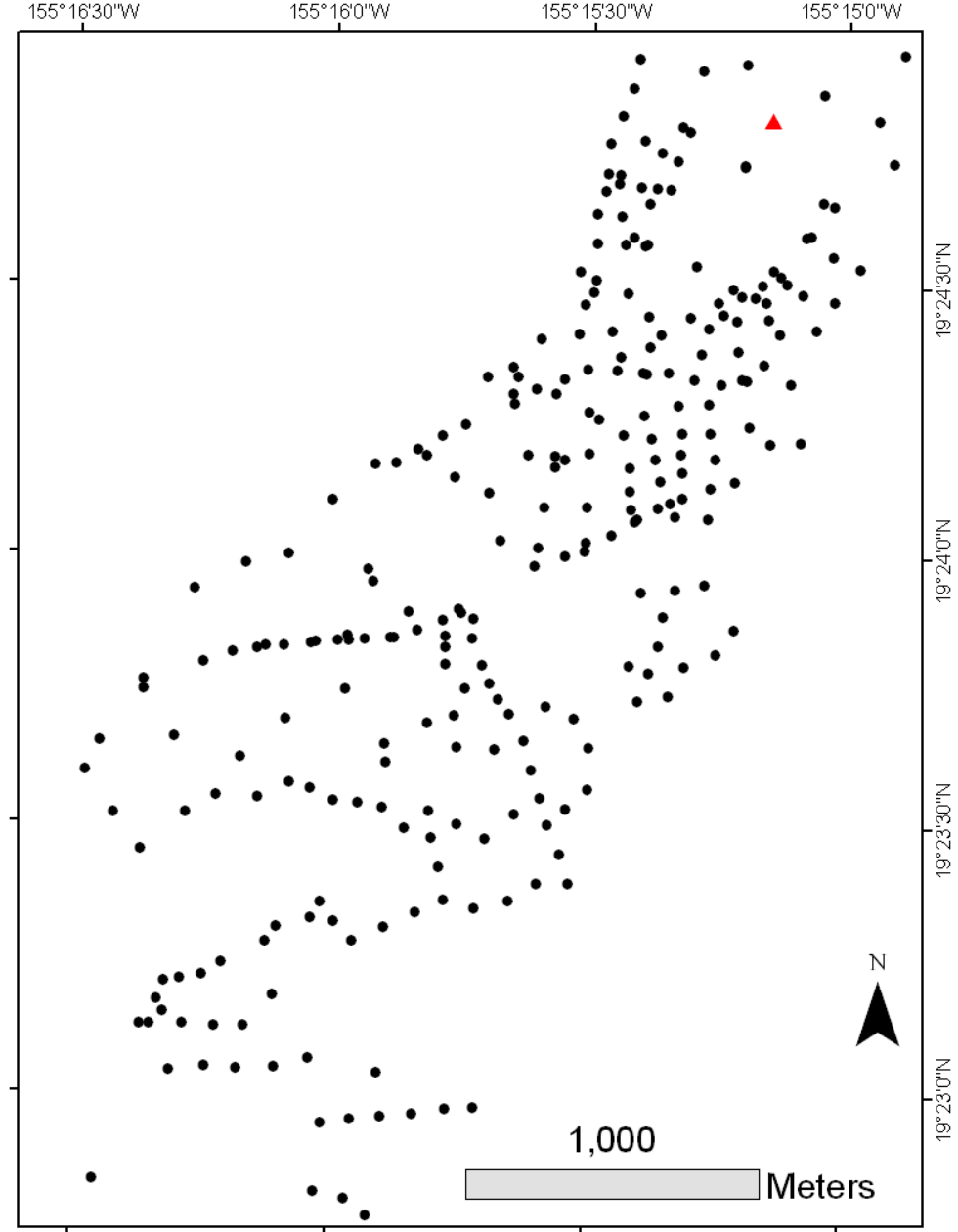
*Klawonn, M.; Houghton, B.F.; Swanson, D.A.; Fagents, S.A.; Wessel, P.; Wolfe, C.J. 2014. From field data to volumes: Constraining uncertainties in pyroclastic eruption parameters. Bulletin of Volcanology, 76: 839. doi:10.1007/s00445-014-0839-1*

# Sources of Uncertainty

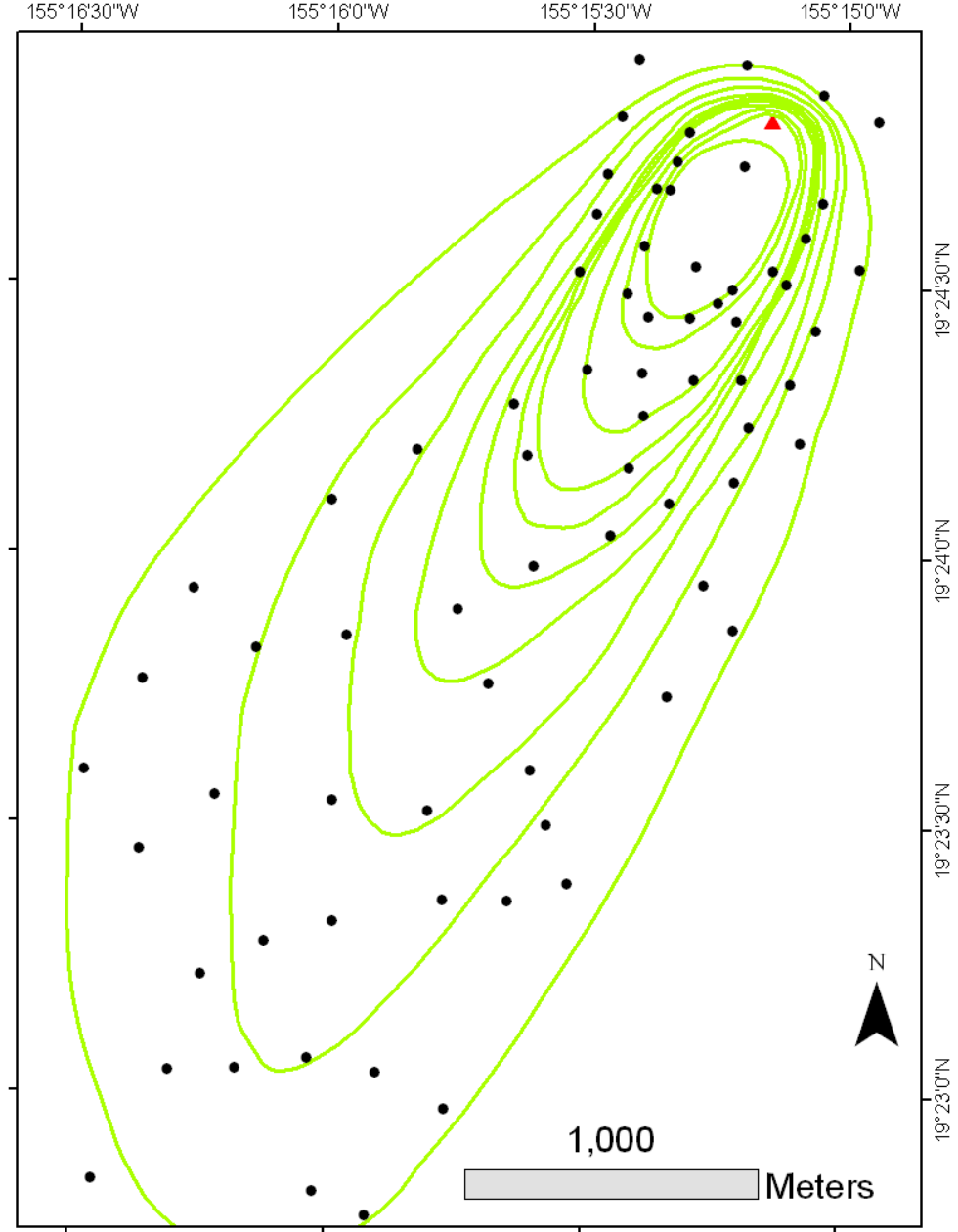
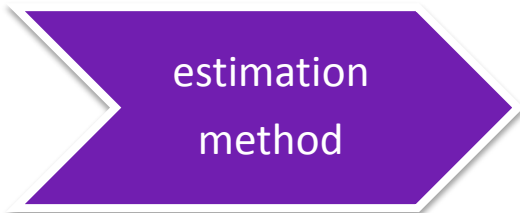
density of sites

isopach  
choices

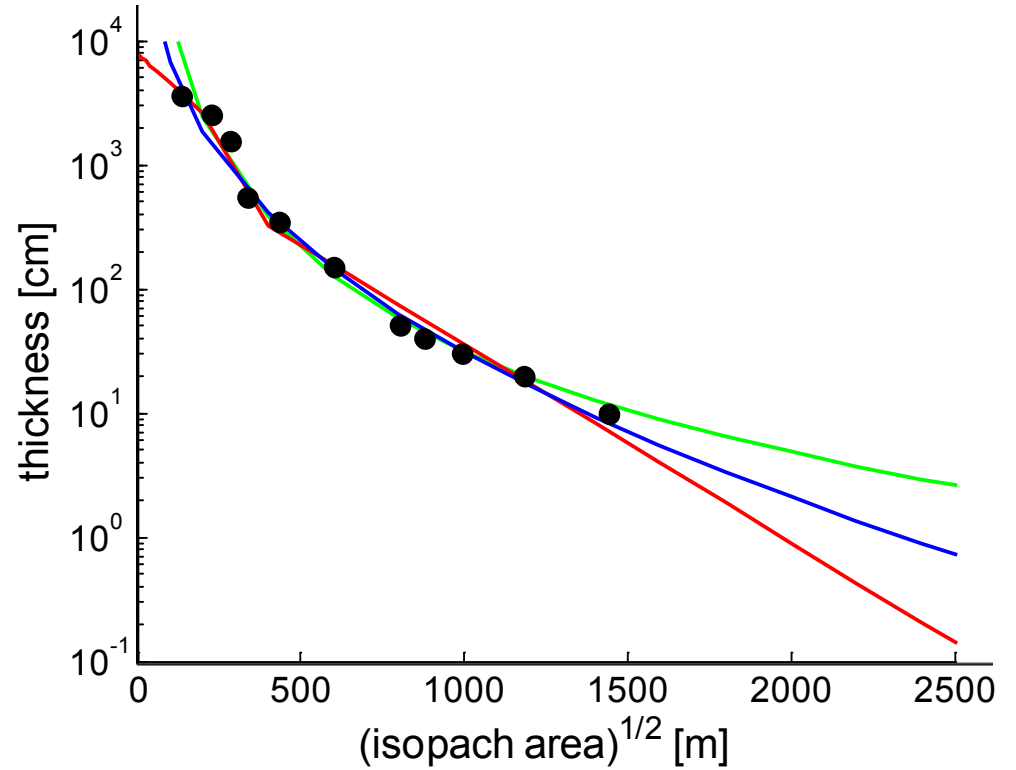
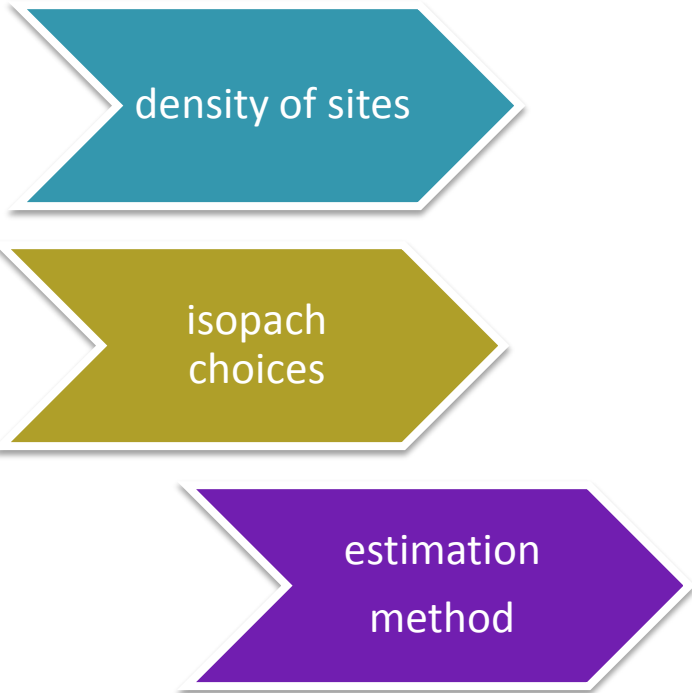
estimation  
method



# Sources of Uncertainty



# Sources of Uncertainty





# Estimation of Eruption Magnitude (Volume)



density of sites

I. How does sampling density affect volume estimates?

isopach choices

II. What is the uncertainty due to different hand-drawn contours?

estimation method

III. How do these methods affect volume estimates?

# Background & Methodology



The eruption

Experiment setup

Processing of data

Deposit  
Measurements

Isopachs

Estimation  
Method

Kīlauea Iki 1959 deposit  
Wind-advected Hawaiian  
fountaining eruption  
273 thicknesses  
measured over 11 km<sup>2</sup>



Deposit  
Measurements

Isopachs

Estimation  
Method

Kīlauea Iki 1959  
deposit

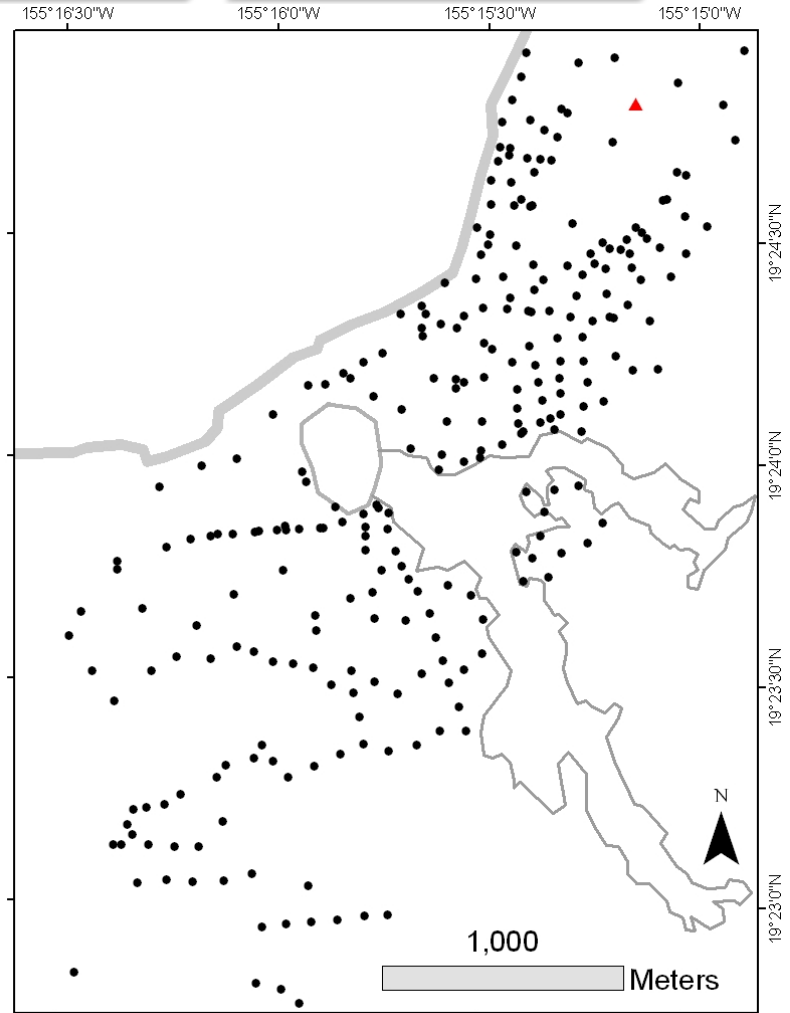
$0.1 \text{ km}^3$

$4 \times 10^5 \text{ kg s}^{-1}$

16 episodes

fountaining to  
580 m

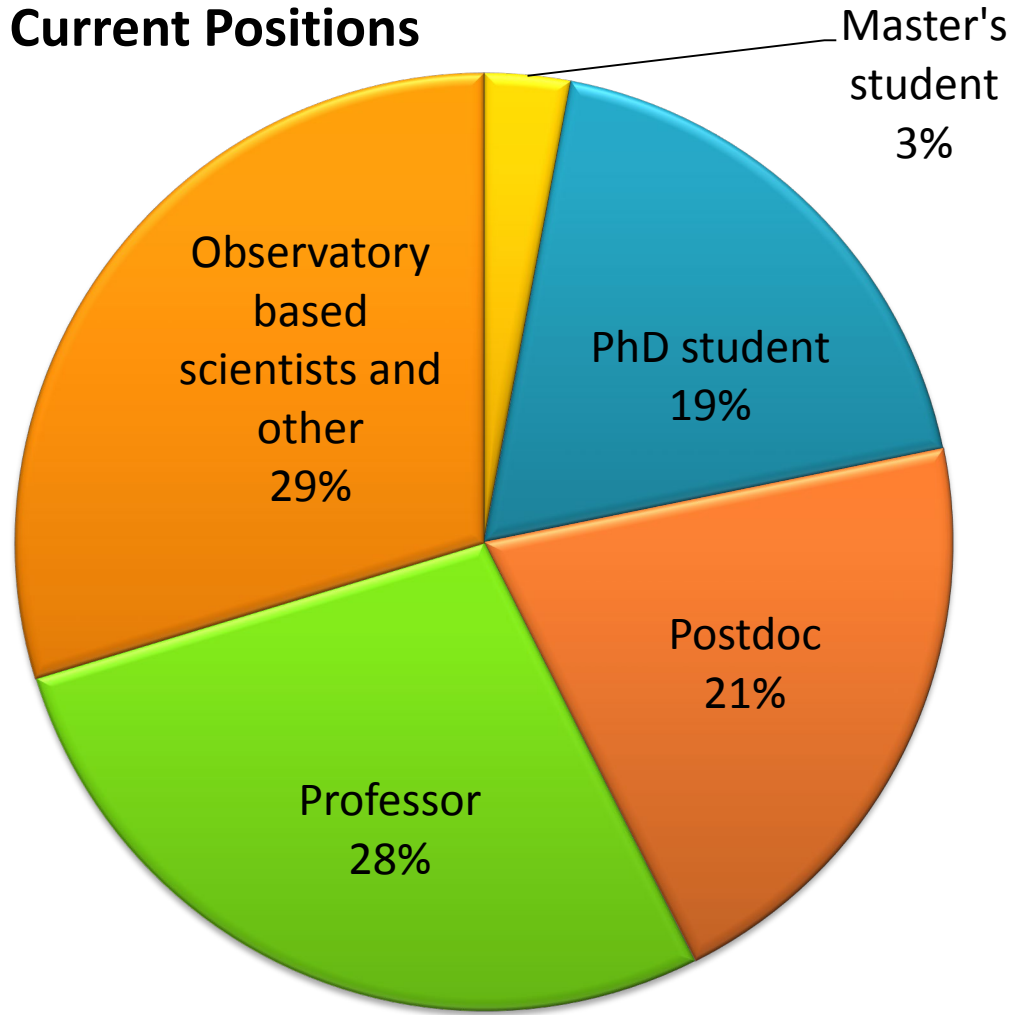
lapilli to +16 km





### Current Positions

Worldwide 101 geologists  
Hand-drawn contours  
Free choice of contours values

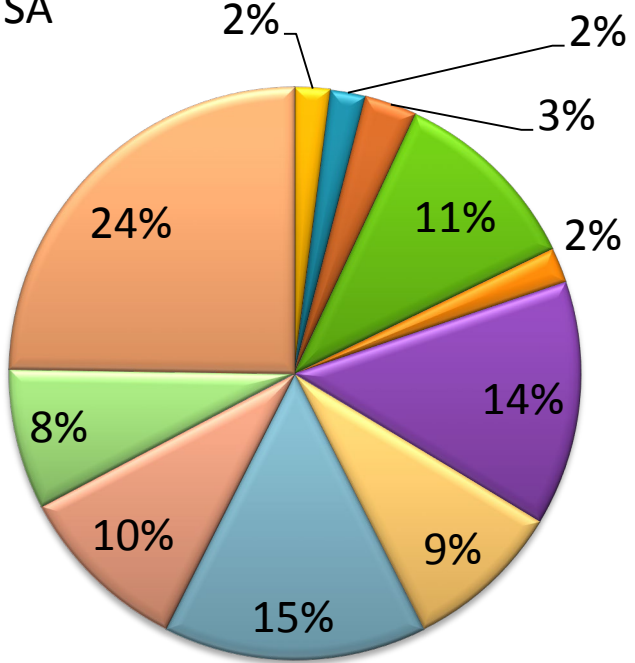




Worldwide 101 geologists  
 Hand-drawn contours  
 Free choice of contours levels

**Country**

- Australia
- Ecuador
- France
- Germany
- Iceland
- Italy
- Japan
- NZ
- Switzerland
- UK
- USA



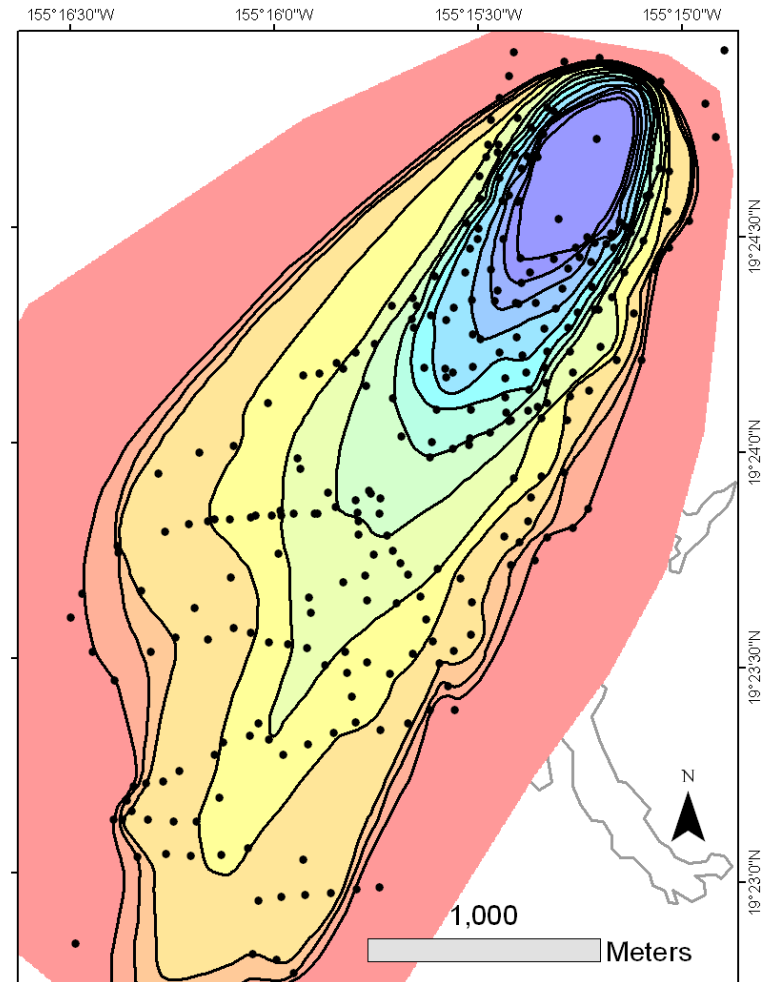


Digitized the contours  
in ArcGIS (ESRI),

- used Topo To Raster tool.

Calculated the volume:

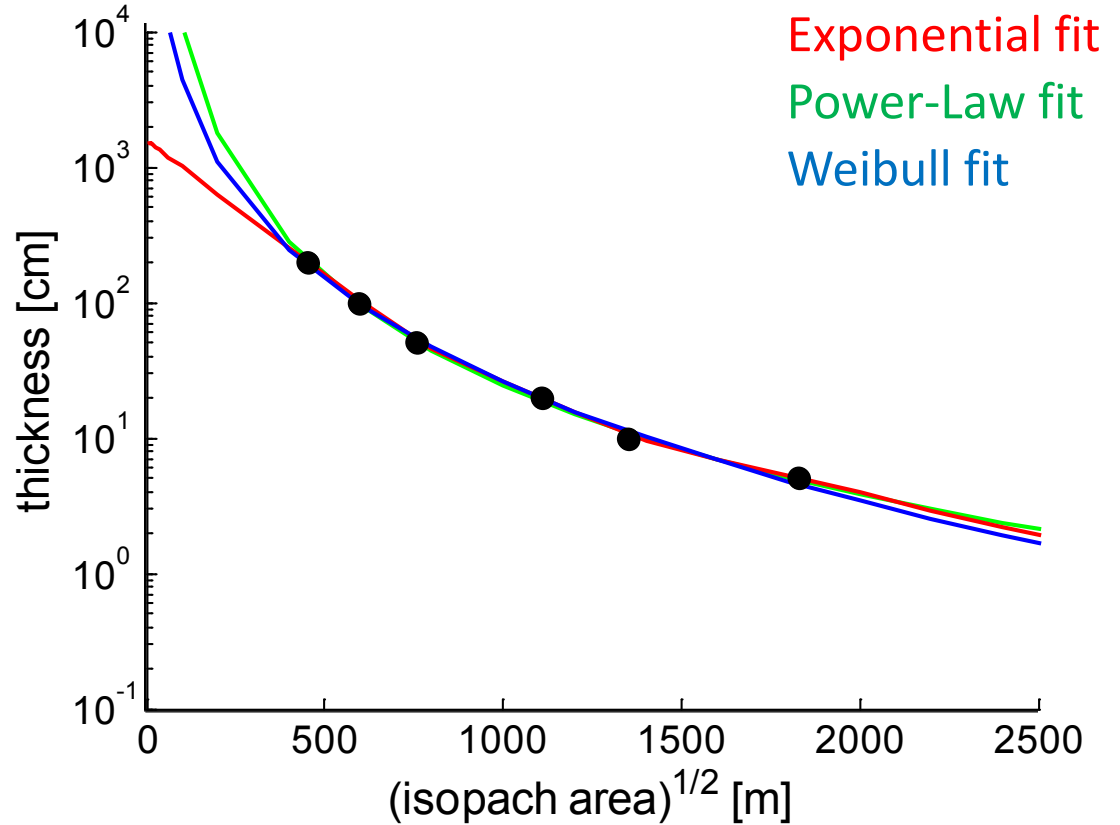
- used 3D Analyst Surface Volume tool,
- summing thickness across the surface.





## Thickness vs (isopach area)<sup>1/2</sup>

- Exponential fit
- Power-Law fit
- Weibull fit





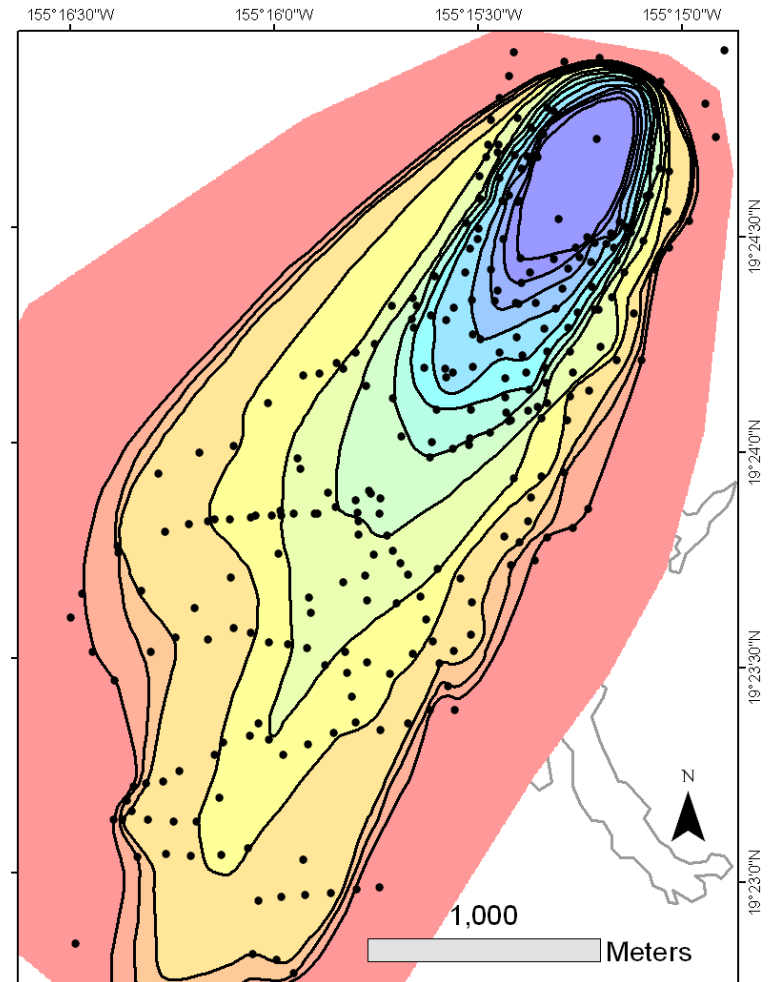


## Thickness vs (isopach area)<sup>1/2</sup>

- Exponential fit
- Power-Law fit
- Weibull fit

## Surface Interpolation

- Remove deposit above 350 cm



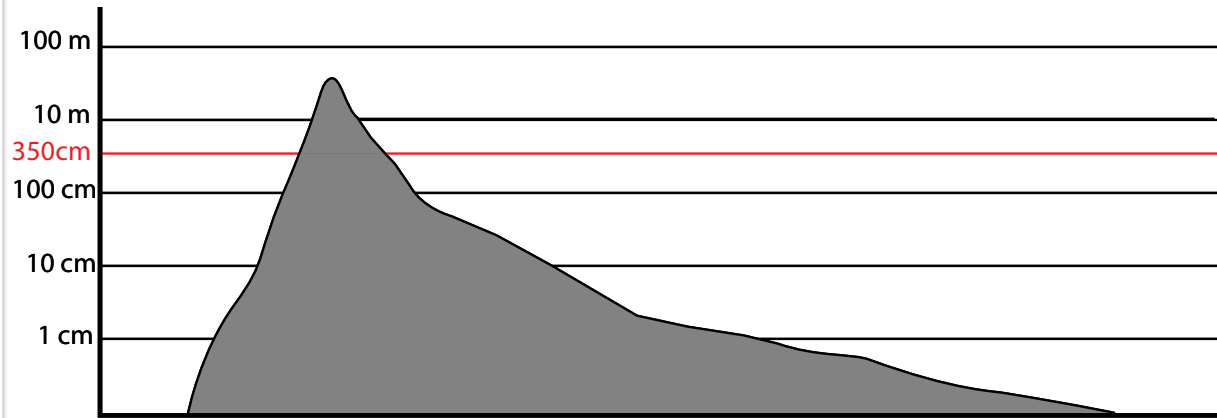


## Thickness vs (isopach area)<sup>1/2</sup>

- Exponential fit
- Power-Law fit
- Weibull fit

## Surface Interpolation

- Remove deposit above 350 cm





# Results

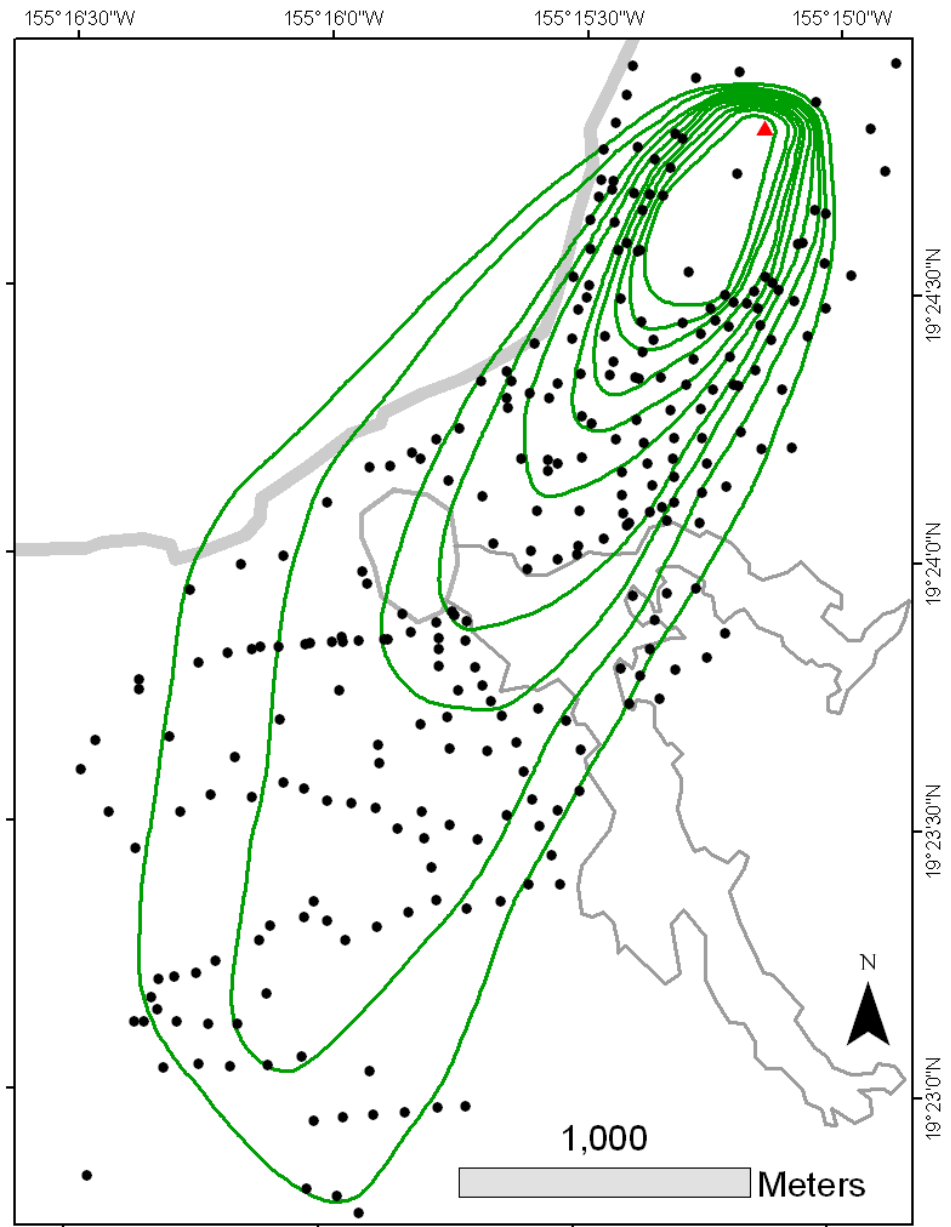
Contour shapes and density

Sampling density

Estimation methodology

# Contours

- Large variety of contours
  - Different number of contours
  - Different shape



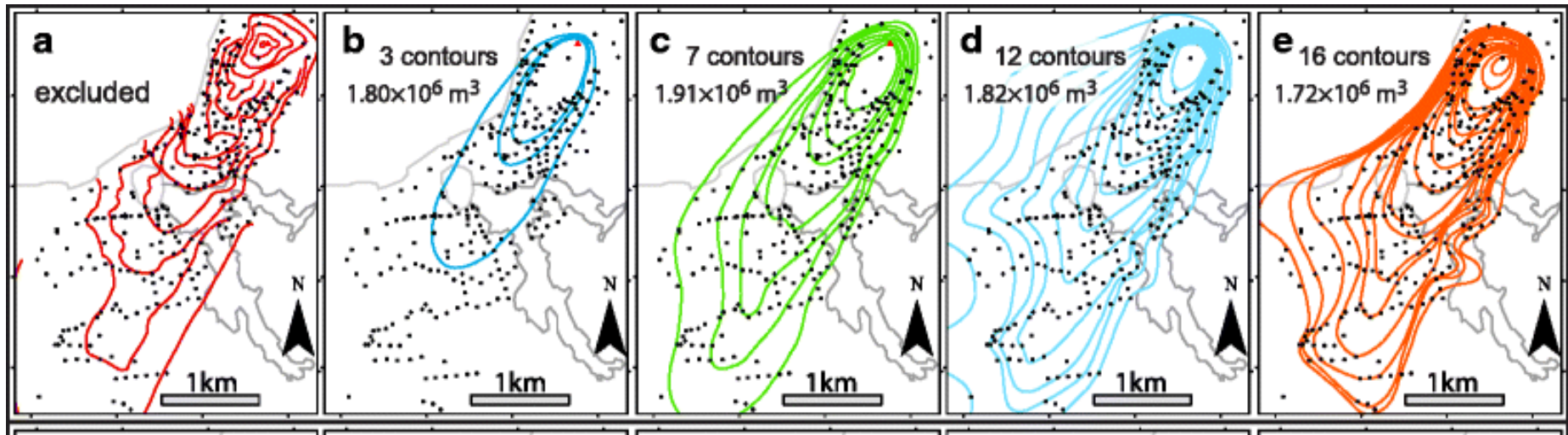
# Contour Number

Number of contours 3 -16. Mode 7

Dense map  $1.82 \times 10^6 \text{ m}^3$

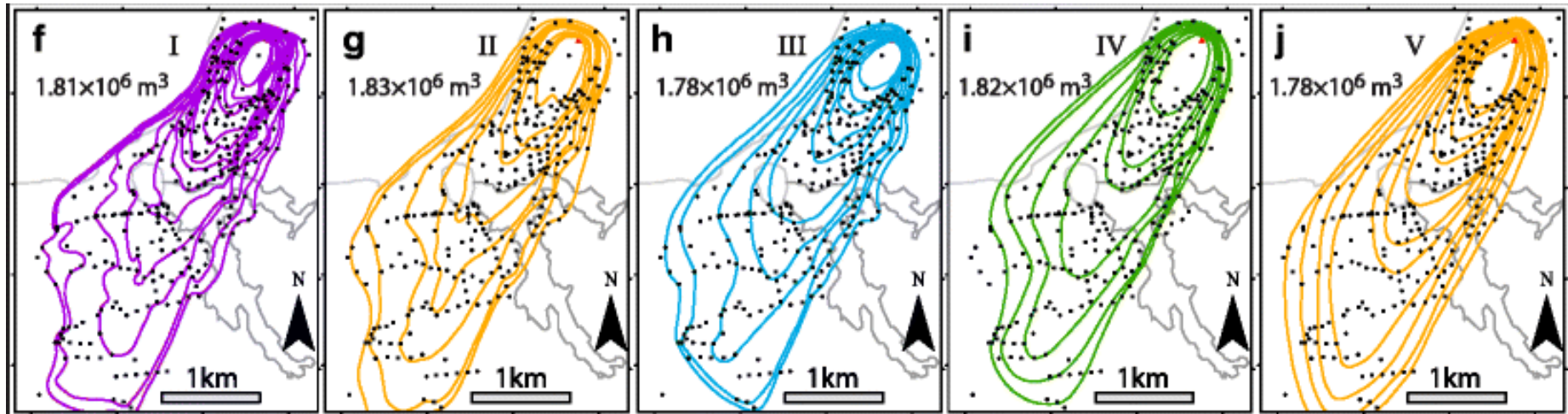
$s = 6.5 \%$

$V = \text{range } 1.5 \text{ to } 2.1 \times 10^6 \text{ m}^3$



# Contour shape

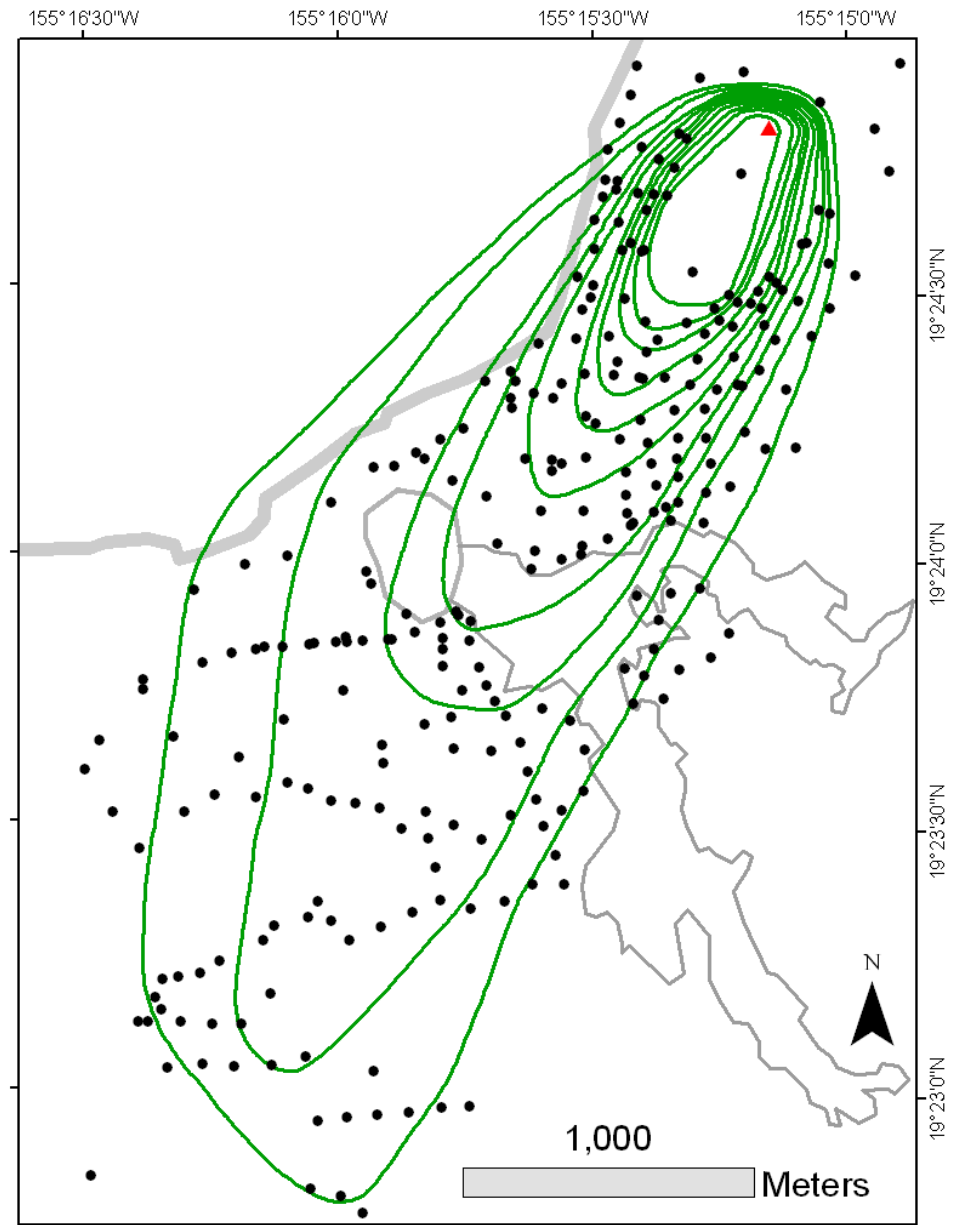
- Divide into 5 classes of decreasing complexity



# Contour shape

- Divide into 5 classes of increasing complexity
- Smoothness does not affect area enclosed by an isopach or volume

I	$1.9 \times 10^6 \text{ m}^3$	$s = 6.9 \%$
II	$1.8 \times 10^6 \text{ m}^3$	$s = 4.9 \%$
III	$1.8 \times 10^6 \text{ m}^3$	$s = 1.9 \%$
IV	$1.8 \times 10^6 \text{ m}^3$	$s = 7.6 \%$
V	$1.9 \times 10^6 \text{ m}^3$	$s = 5.9 \%$





Results

Contours

Sampling density

Estimation methodology



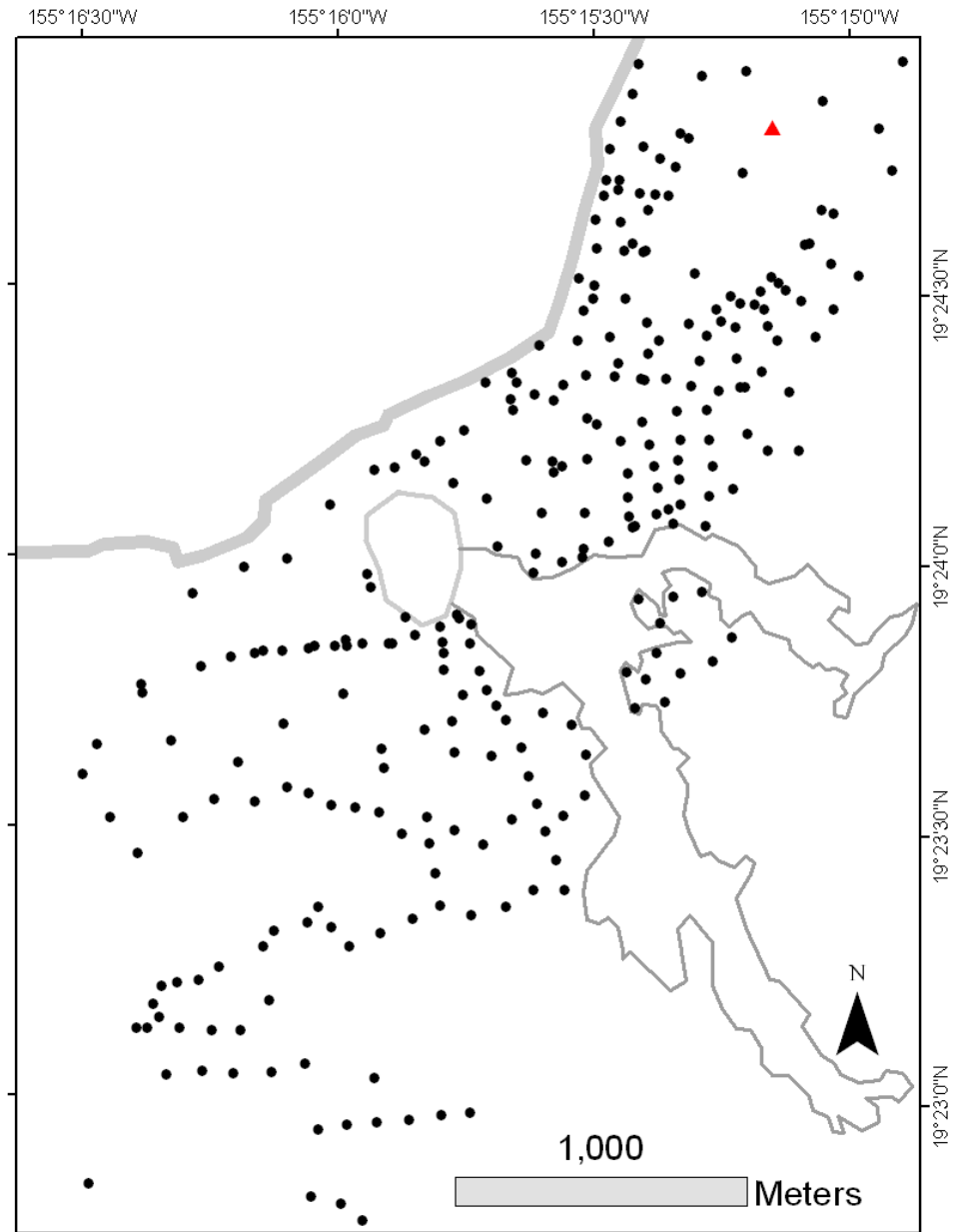
# Different sampling density

Dense map  $1.82 \times 10^6 \text{ m}^3$

- 273 measurements

$V = \text{range } 1.5 \text{ to } 2.1 \times 10^6 \text{ m}^3$

$s = 6.5 \%$



# Different sampling density

Dense map  $1.82 \times 10^6 \text{ m}^3$

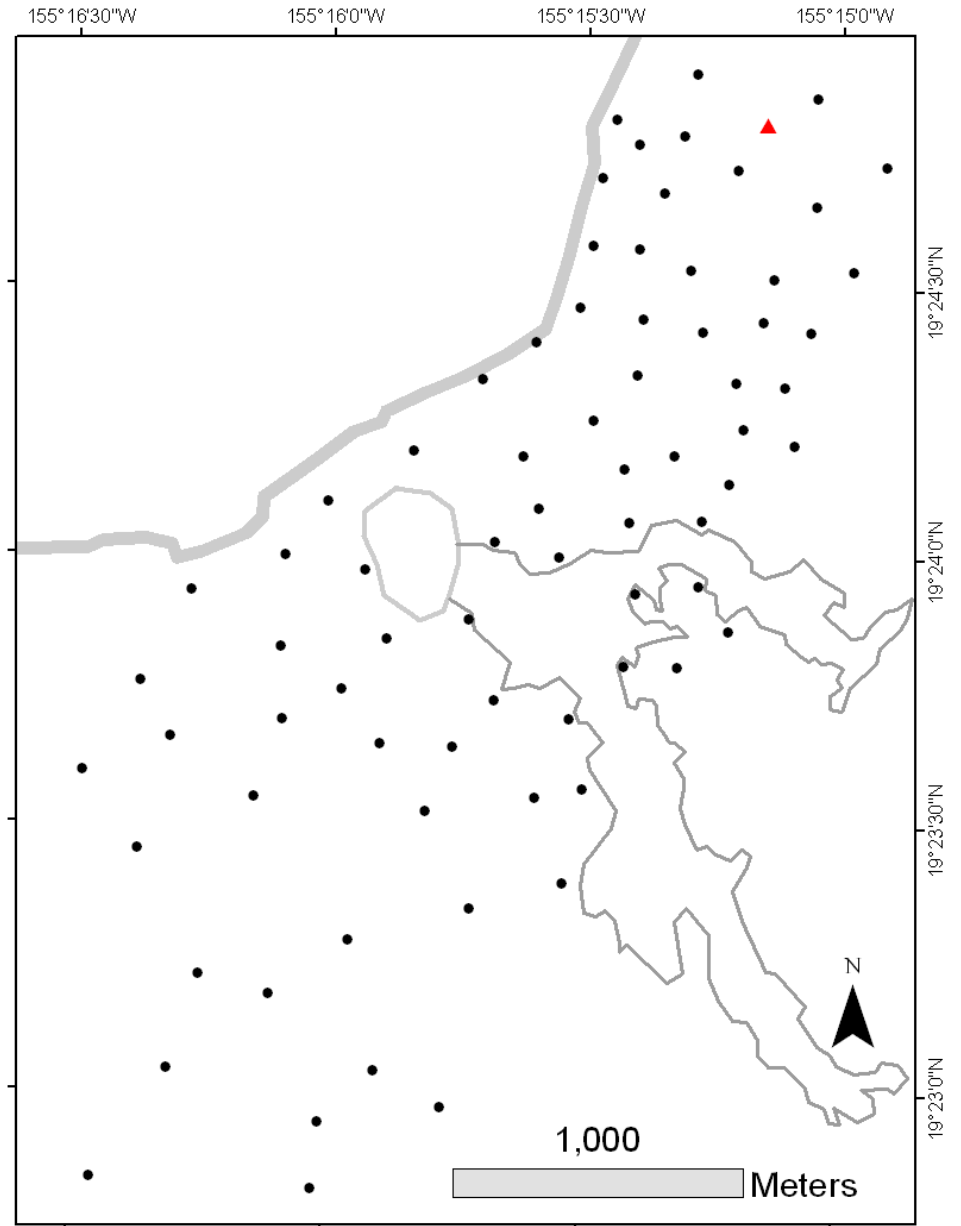
- 273 measurements

$V = \text{range } 1.5 \text{ to } 2.1 \times 10^6 \text{ m}^3$

$s = 6.5 \%$

Subsample 1

- 75 measurements
- Equal spacing



# Different sampling density

Dense map  $1.82 \times 10^6 \text{ m}^3$

- 273 measurements

$V$  = range  $1.5$  to  $2.1 \times 10^6 \text{ m}^3$

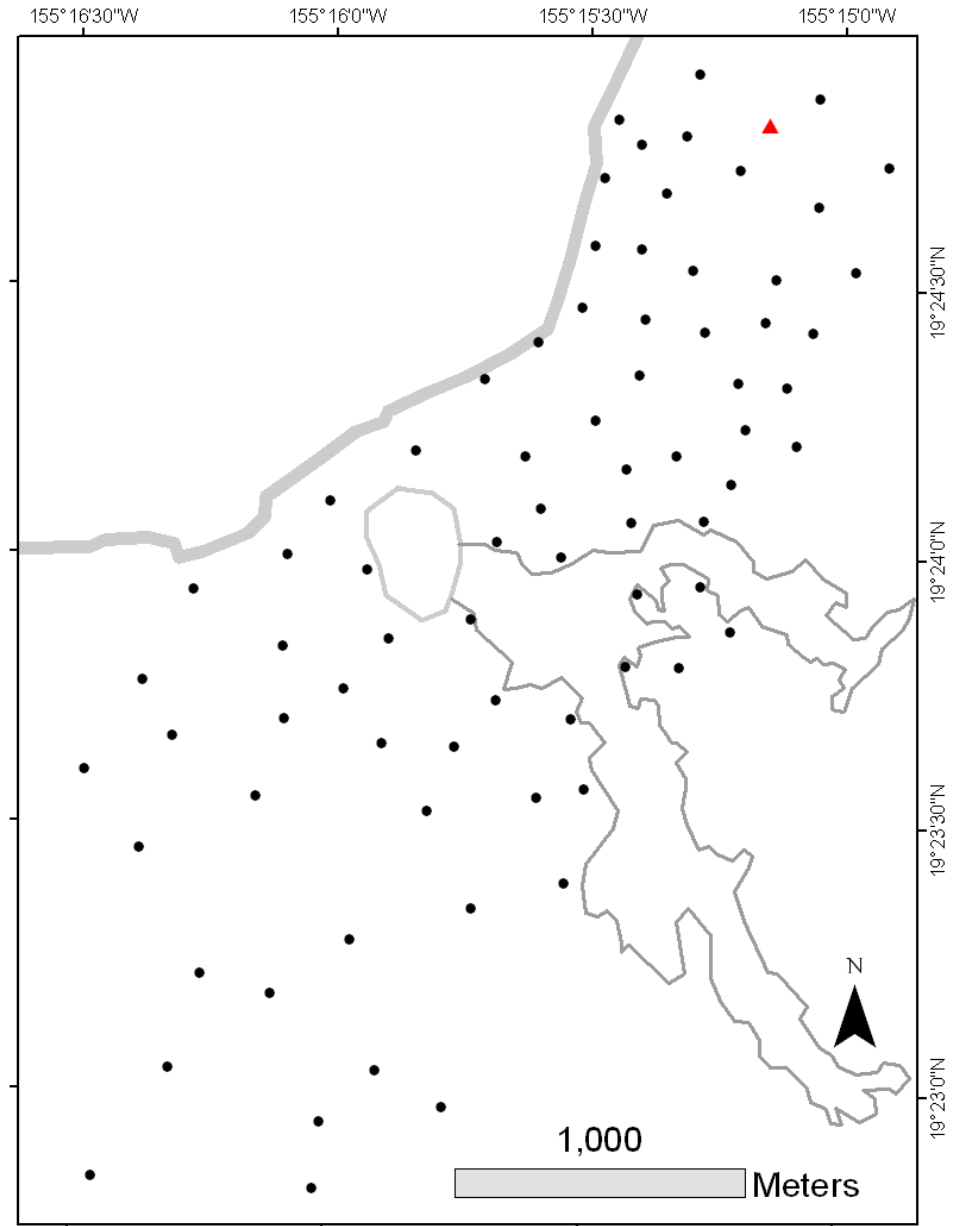
$s$  = 6.5 %

Subsample 1  $1.78 \times 10^6 \text{ m}^3$

- 75 measurements
- Equal spacing

$V_1$  = range  $1.7$  to  $2.1 \times 10^6 \text{ m}^3$

$s_1$  = 8.2%



# Different sampling density

Dense map  $1.82 \times 10^6 \text{ m}^3$

- 273 measurements

$V = \text{range } 1.5 \text{ to } 2.1 \times 10^6 \text{ m}^3$

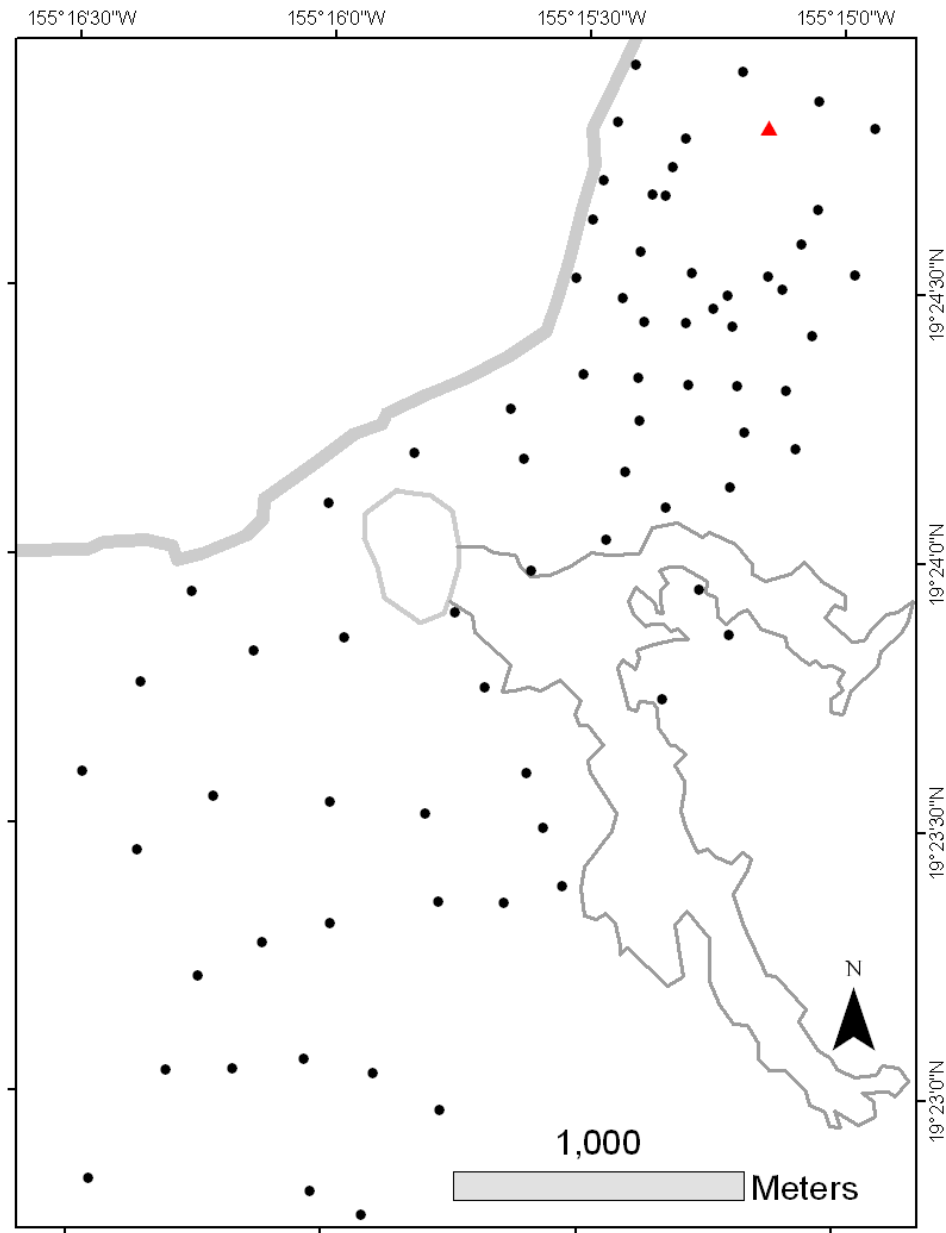
$s = 6.5 \%$

Subsample 1

- 75 measurements
- Equal spacing

Subsample 2

- 75 measurements
- Along roads and trails



# Different sampling density

Dense map  $1.82 \times 10^6 \text{ m}^3$

- 273 measurements

$V$  = range  $1.5$  to  $2.1 \times 10^6 \text{ m}^3$

$s$  = 6.5 %

Subsample 1

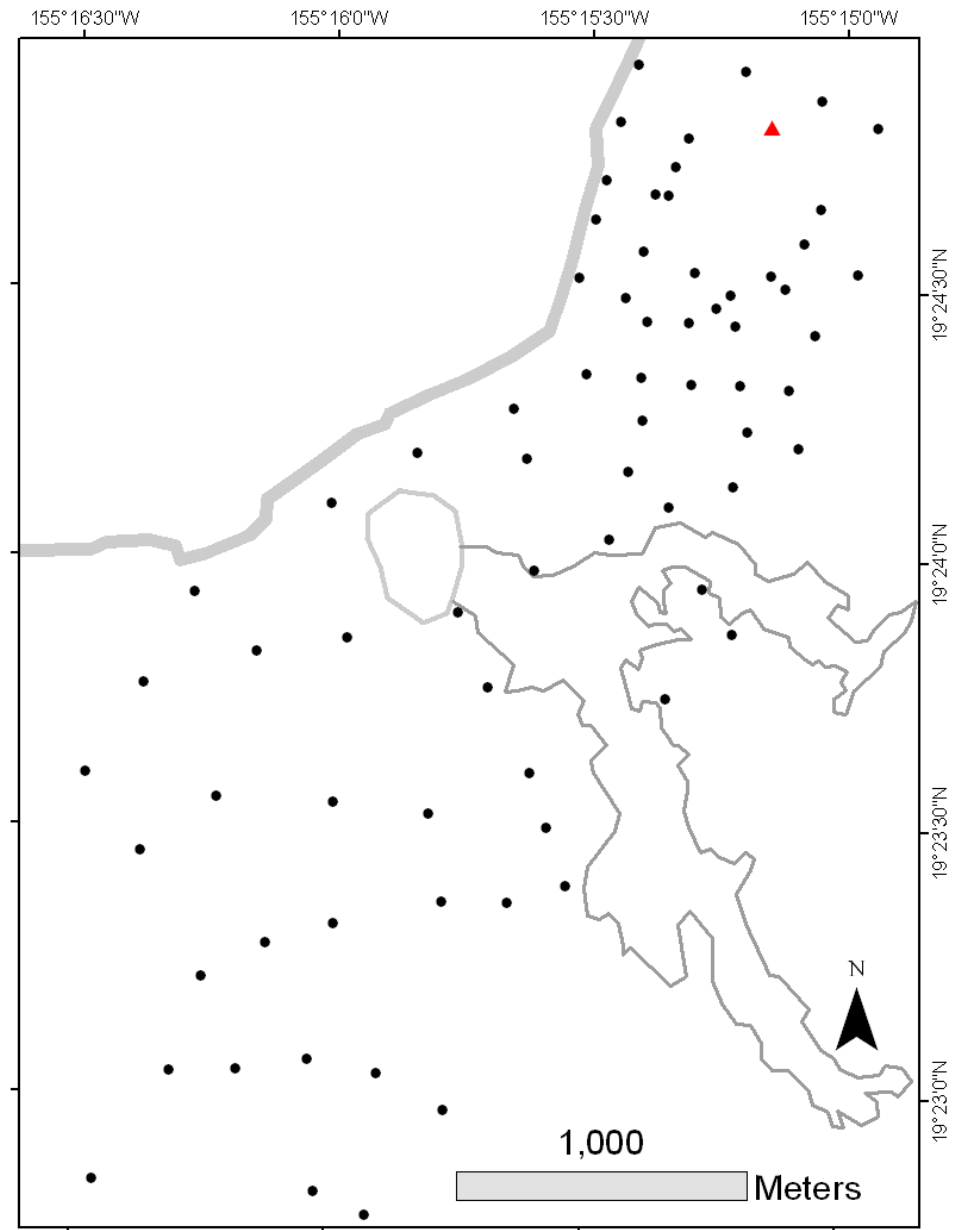
- 75 measurements
- Equal spacing

Subsample 2  $1.89 \times 10^6 \text{ m}^3$

- 75 measurements
- Along roads and trails

$V_2$  = range  $1.6$  to  $2.1 \times 10^6 \text{ m}^3$

$s_2$  = 5.2 %



# Different sampling density

Subsample 1  $1.78 \times 10^6 \text{ m}^3$

- 75 measurements
- Equal spacing

$V_1 = \text{range } 1.7 \text{ to } 2.1 \times 10^6 \text{ m}^3$

$s_1 = 8.2\%$

Dense map  $1.82 \times 10^6 \text{ m}^3$

- 273 measurements

$V = \text{range } 1.5 \text{ to } 2.1 \times 10^6 \text{ m}^3$

$s = 6.5\%$

Subsample 2  $1.89 \times 10^6 \text{ m}^3$

- 75 measurements
- Along roads and trails

$V_2 = \text{range } 1.6 \text{ to } 2.1 \times 10^6 \text{ m}^3$

$s_2 = 5.2\%$



Results

Contours

Sampling density

Estimation methodology

# Estimation Methods

- Single Map Different Methods

- Exponential Fit

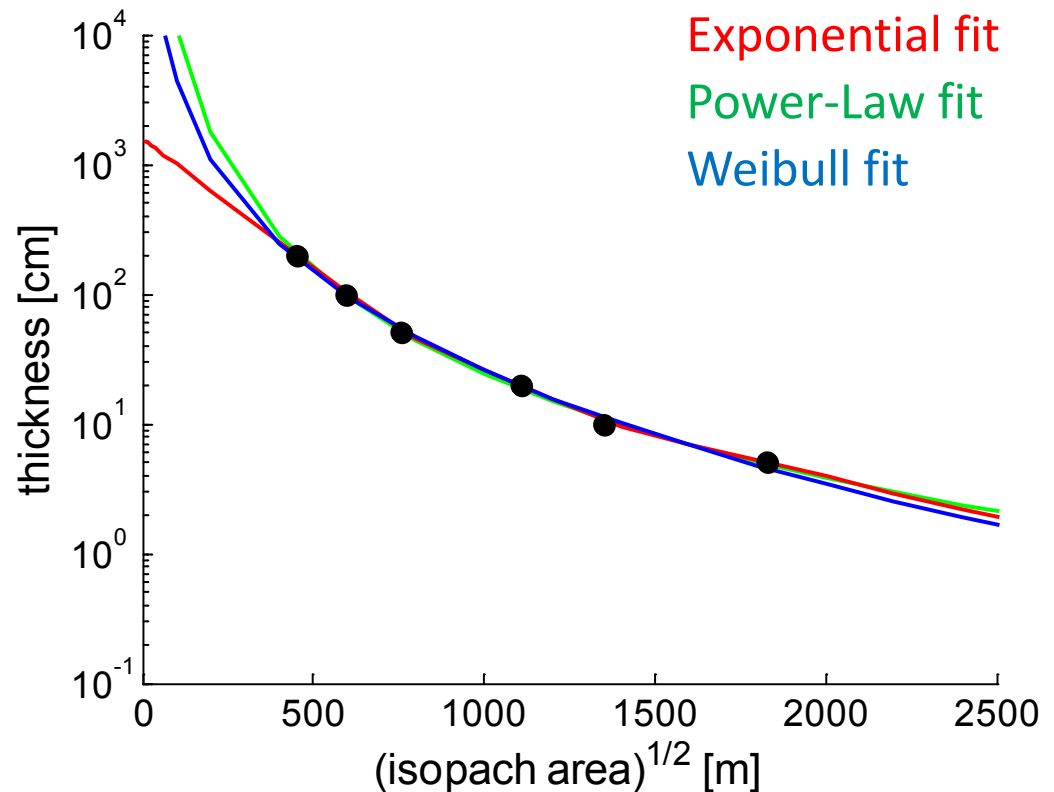
- 1 segment
    - 1-3 segments

- Power-Law Fit

- Weibull Fit

- 3 weighing options

- Surface





# Estimation Methods

- Single Map Different Methods

➤  $s = 11.6\%$  (7 methods)

➤  $s = 5.6\%$  (4 methods)

- Exponential Fit

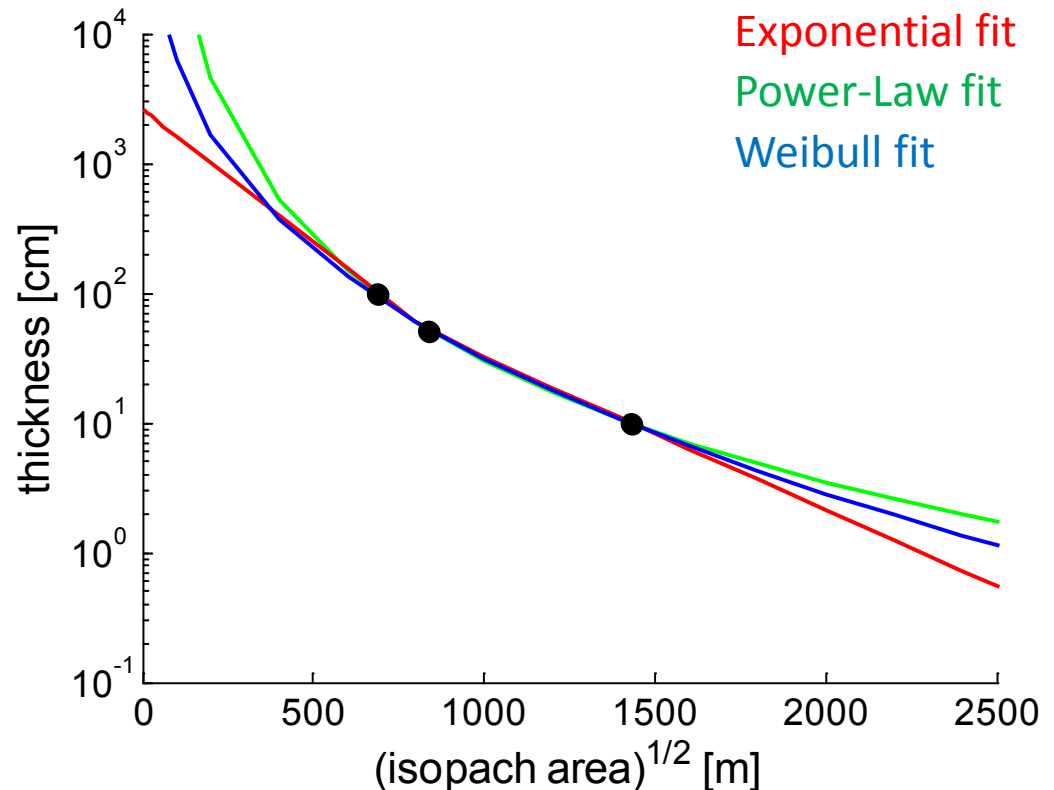
- 1 segment
- 1-3 segments

- Power-Law Fit

- Weibull Fit

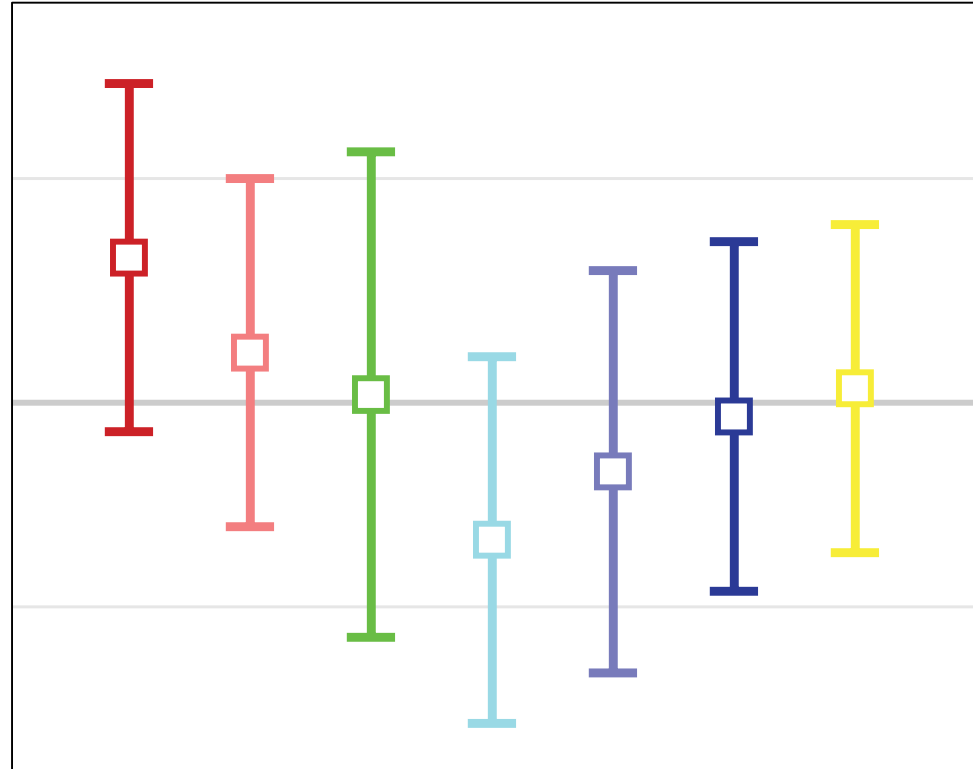
- 3 weighing options

- Surface



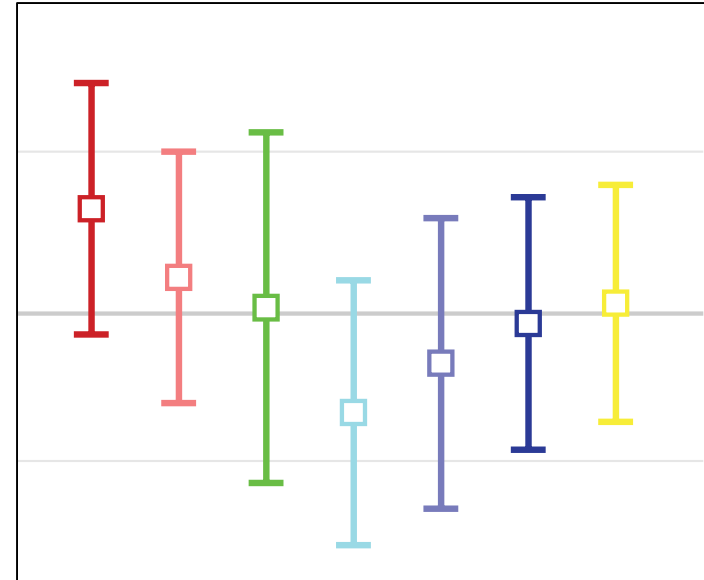
# Estimation Methods

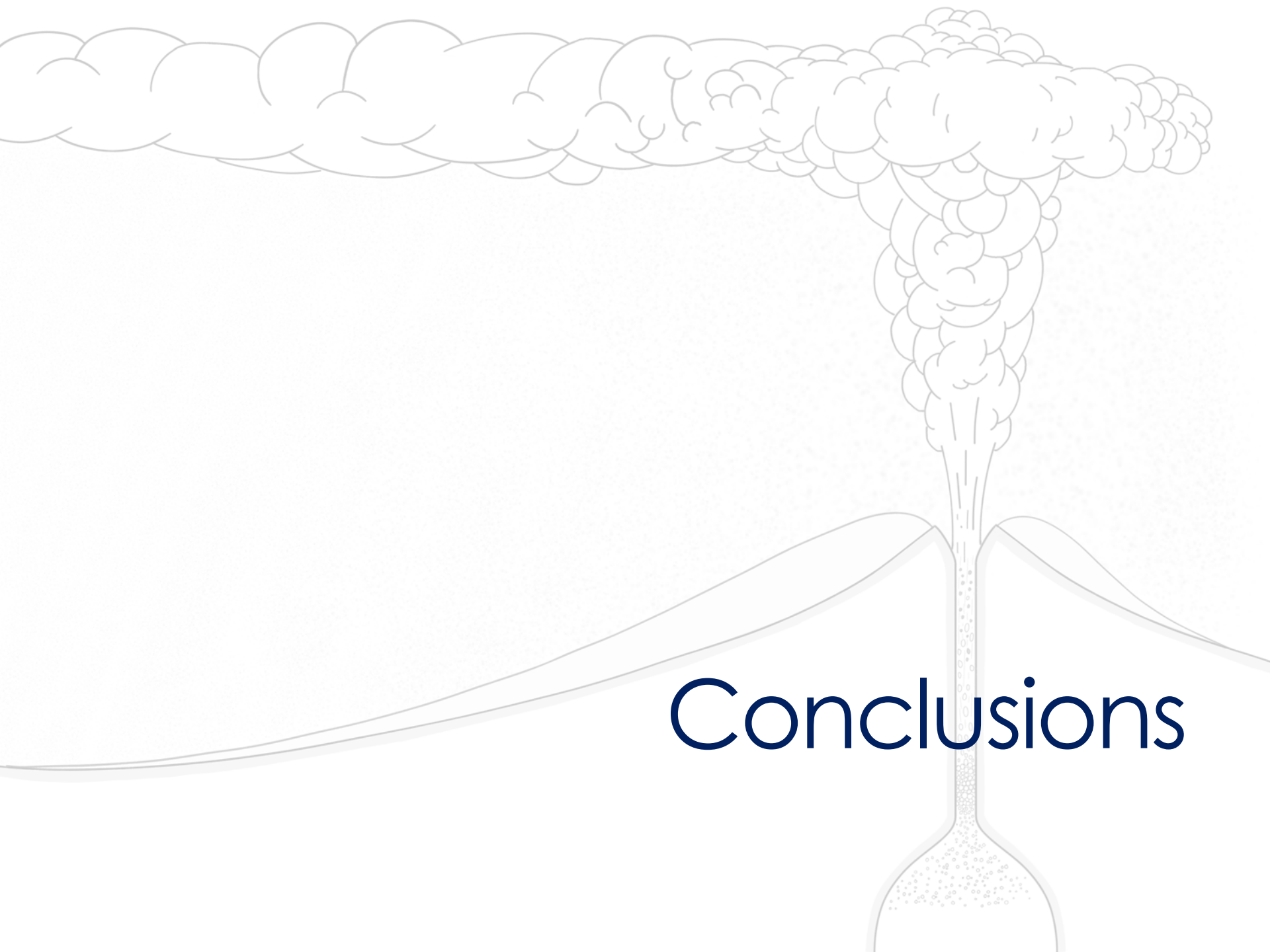
- **Exponential Fit**
  - 1 segment
  - 1 to 3 segments
- **Power-Law Fit**
- **Weibull Fit**
  - 3 weighing options
- **Surface Interpolation**



# Estimation Methods

- **Exponential Fit**
  - $s = 13.5\%$  (1 segment)
  - $s = 7.6\%$  (1-3 segments)
- **Power-Law Fit**
  - $s = 10.8\%$
- **Weibull Fit**
  - $s = 8.7\%$  (no residual weighting)
  - $s = 9.3\%$  (with residual weighting)
  - $s = 7.8\%$  (with strong residual weighting)
- **Surface Interpolation**
  - $s = 7.3\%$





Conclusions

# Uncertainty of eruption volume estimates



Density of  
Measur. sites

I. How does sampling density affect volume estimates?

Isopachs

II. What is the uncertainty due to different hand-drawn contours?

Estimation  
Method

III. How do methods affect volume estimates?

# Uncertainty of eruption volume estimates



Density of  
Measur. sites

Mean volumes very consistent, but may yield a biased mean or larger spread

Isopachs

II. What is the uncertainty due to different hand-drawn contours?

Estimation  
Method

III. How do methods affect volume estimates?

# Uncertainty of eruption volume estimates

Density of  
Measur. sites

Mean volumes very consistent, but may yield a biased mean or larger spread

Isopachs

5% to 12%



Logarithmic scale of  
Volcanic Explosivity Index (VEI)

Estimation  
Method

III. How do methods affect  
volume estimates?

# Uncertainty of eruption volume estimates

Deposit  
Measur. sites

Mean volumes very consistent, but may yield a biased mean or larger spread

Isopachs

5% to 12%



Logarithmic scale of  
Volcanic Explosivity Index (VEI)

Estimation  
Method

Similar to hand-drawn contours

➤  $s = 11.6\%$  (7 methods)

➤  $s = 5.6\%$  (4 methods)



# Conclusions



The biggest constraint is the quality of the data which is excellent in the medial field and poorer closer and further from vent

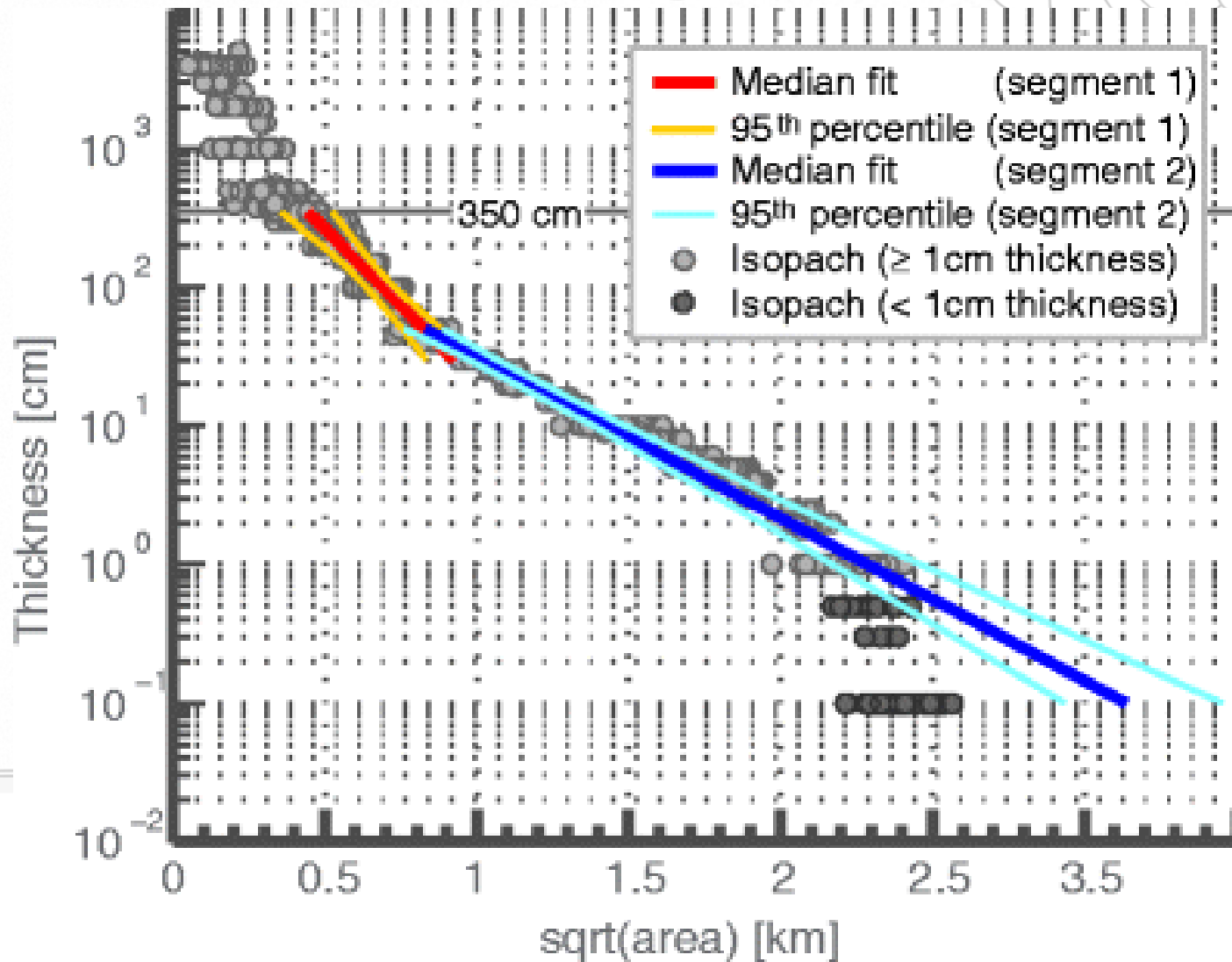
## Proximal issues

- lack of exposure (welding)
- incomplete preservation
- intercalated locally dispersed material

## Distal issues

- thickness modification begins during eruption
- zero cm does not mean no deposition
- isopachs should not be drawn beyond the range of data values

# Conclusions 2





## The way forward?

Digitizing of 2019 data

Spline fits to data

Evaluation of uncertainties in individual isopachs

Evaluation of uncertainties in individual measurements