

Monte Carlo Simulations of Gravimetric Terrain Corrections Using LIDAR Data

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Outline

- **Overview of Gravimetric Terrain Corrections**
- **Example of Current Application with Airborne Gravimetry**
- **Computation Approaches for Gravimetric Terrain Corrections**
- **Airborne LIDAR Dense Grids of Accurate Terrain Data**
- **Simulations for Gravimetric Terrain Corrections**
- **Accuracy of Simulated Terrain Corrections**
- **Concluding Remarks**

Gravimetric Terrain Correction

Newtonian Potential $U(\mathbf{P})$ at some point $\mathbf{P} = (x, y, z)$:

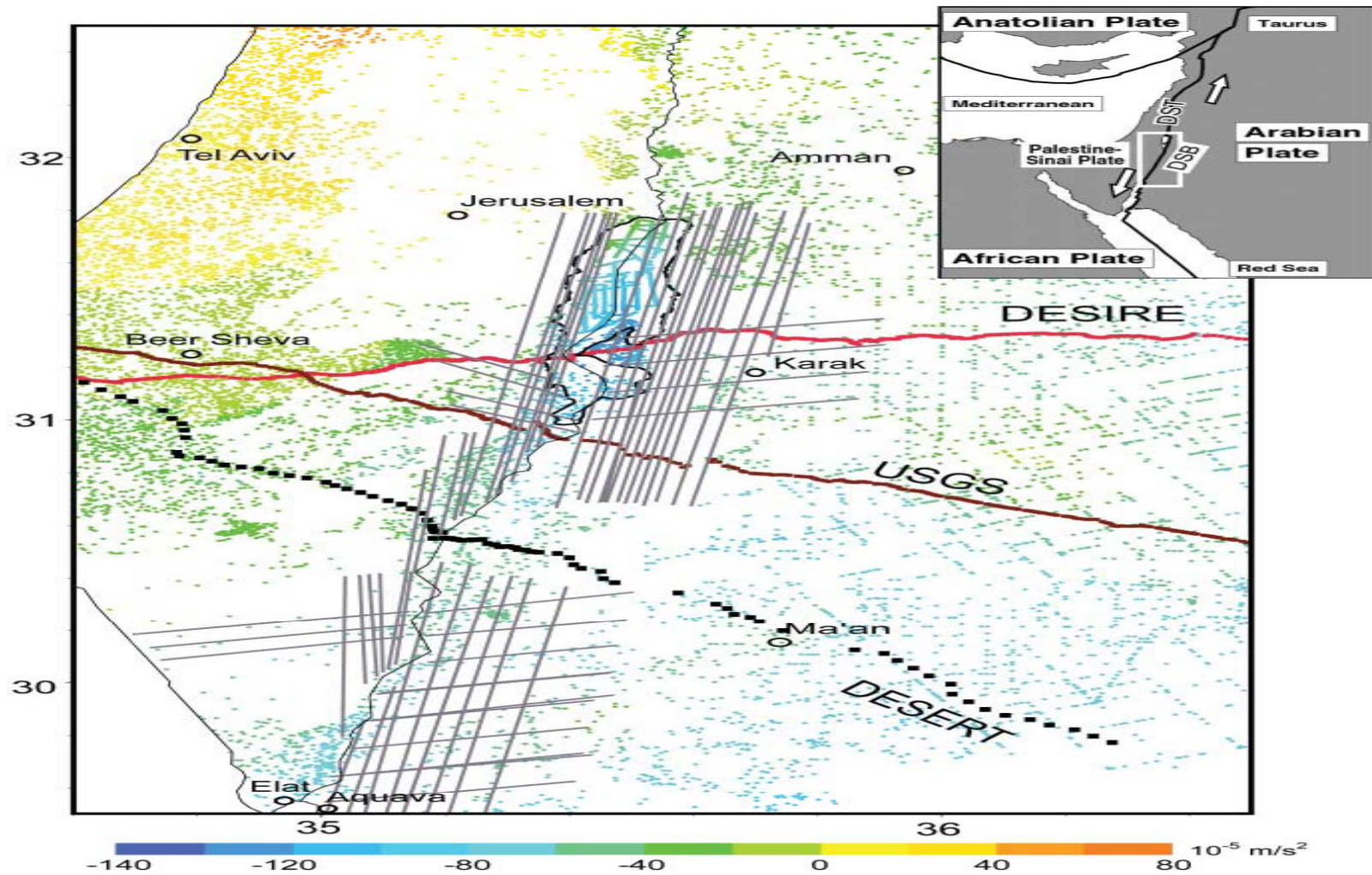
$$U(\mathbf{P}) = G \iiint_E \frac{\rho(\mathbf{Q})}{|\mathbf{P} - \mathbf{Q}|} d\sigma(\mathbf{Q})$$

Vertical gradient assuming $z \sim$ height:

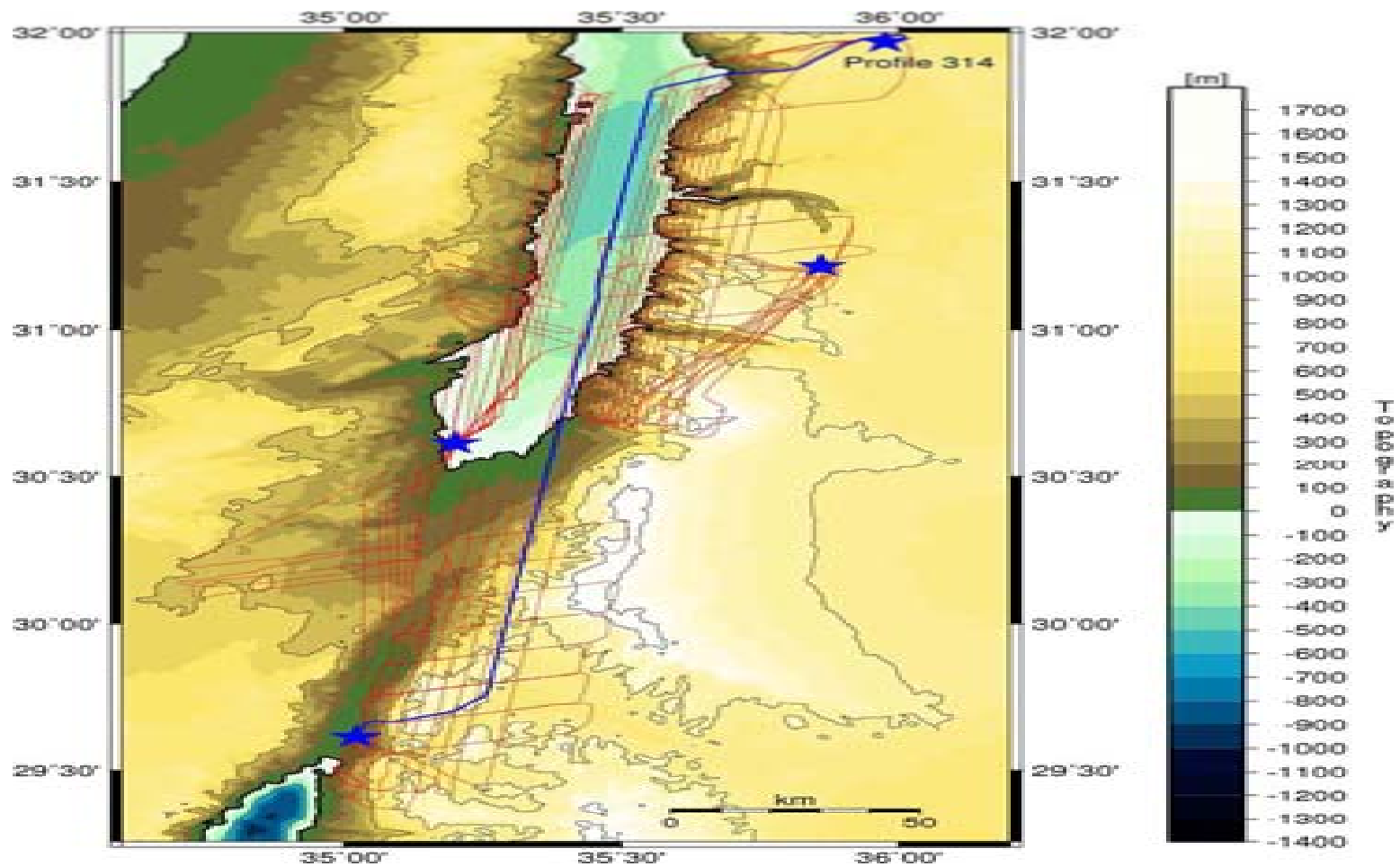
$$\frac{\partial}{\partial z} U(\mathbf{P}) = -G \iiint_E \frac{\rho(\mathbf{Q})z(\mathbf{Q})}{|\mathbf{P} - \mathbf{Q}|^3} d\sigma(\mathbf{Q})$$

in which $\rho(\mathbf{Q})$ denotes the density of the Earth (E) at location $\mathbf{Q}$ and G is Newtonian's gravitational constant, i.e. $G = 6.672 \times 10^{-11} \text{ m}^3 \text{ s}^{-2} \text{ kg}^{-1}$

Note: $\rho(\text{crust}) \approx 2.67 \text{ g cm}^{-3}$ and $1 \text{ mgal} = 10^{-5} \text{ m s}^{-2} = 10^{-8} \text{ km s}^{-2}$

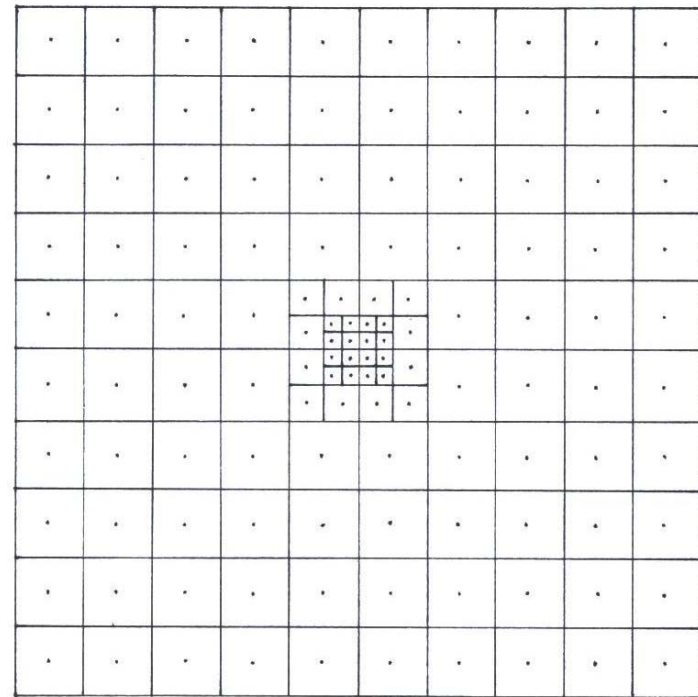
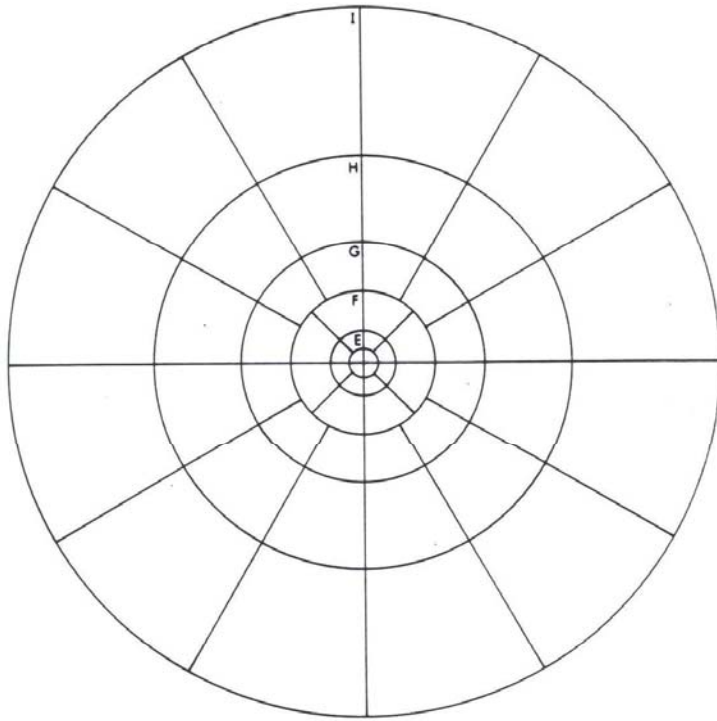


Source: EOS, Vol.91, No.12, 23 March 2010



Source: EOS, Vol.91, No.12, 23 March 2010

Templates for Multigrid Quadratures



Integral Approach

Direct Integration

$$\delta g(x_o, y_o, z_o) = G\bar{\rho} \int_{-L}^L \int_{-L}^L \int_0^{H(x,y)} \frac{z \, dz \, dy \, dx}{((x - x_o)^2 + (y - y_o)^2 + (z - z_o)^2)^{3/2}}$$

or

$$\begin{aligned} \delta g(r_o, \theta_o, h_o) &= G\bar{\rho} \int_0^R \int_0^{2\pi} \int_0^{H(r,\theta)} \frac{r \, h \, dh \, d\theta \, dr}{((r - r_o)^2 + (h - h_o)^2)^{3/2}} \\ &= 2\pi G\bar{\rho} \int_0^R \int_0^{H(r)} \frac{r \, h \, dh \, dr}{((r - r_o)^2 + (h - h_o)^2)^{3/2}} \end{aligned}$$

Cartesian Prism Approach

Direct Integration

$$\delta g = -G\bar{\rho} \left\| \left\| \left\| x \log(y+r) + y \log(x+r) + z \arctan \frac{zr}{xy} \right|_{x_1}^{x_2} \right|_{y_1}^{y_2} \right|_{z_1}^{z_2}$$

or simplifying to a known cross-section s

$$\delta g \approx G\bar{\rho}s \int_0^h \frac{z \, dz}{(d^2 + z^2)^{3/2}} = G\bar{\rho}s \left(\frac{1}{d} - \frac{1}{\sqrt{d^2 + h^2}} \right)$$

which is usually called the line mass formula.

Airborne LIDAR

Light Detection and Ranging

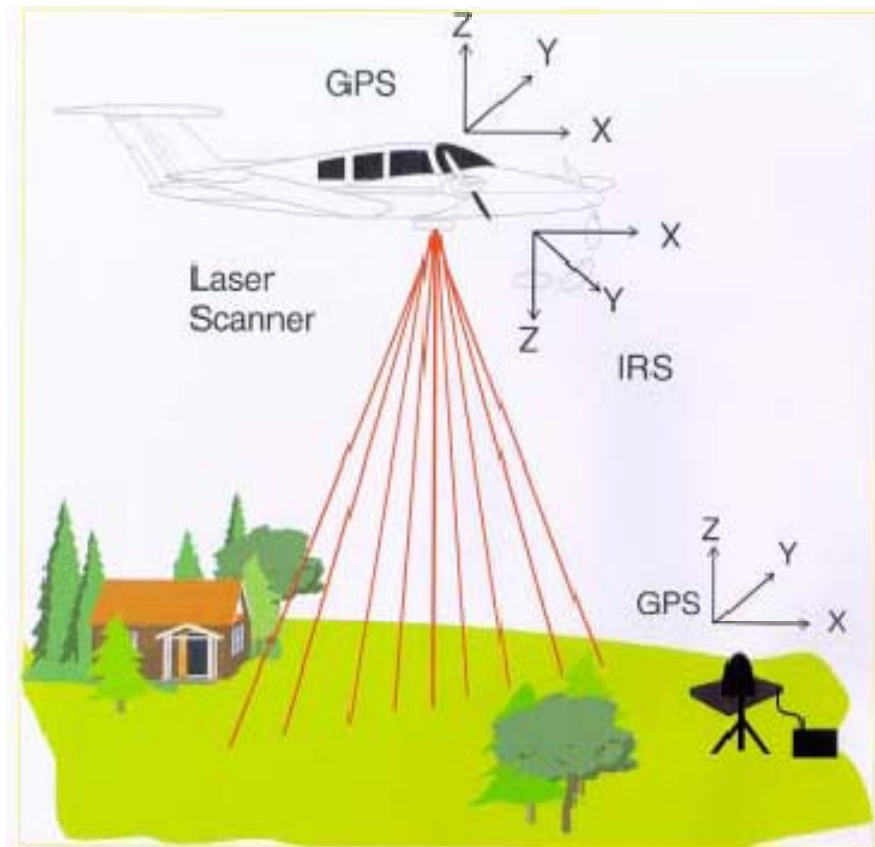
Airborne laser, GPS & INS

DEM rapid data collection

Grid with sub-metre resolution

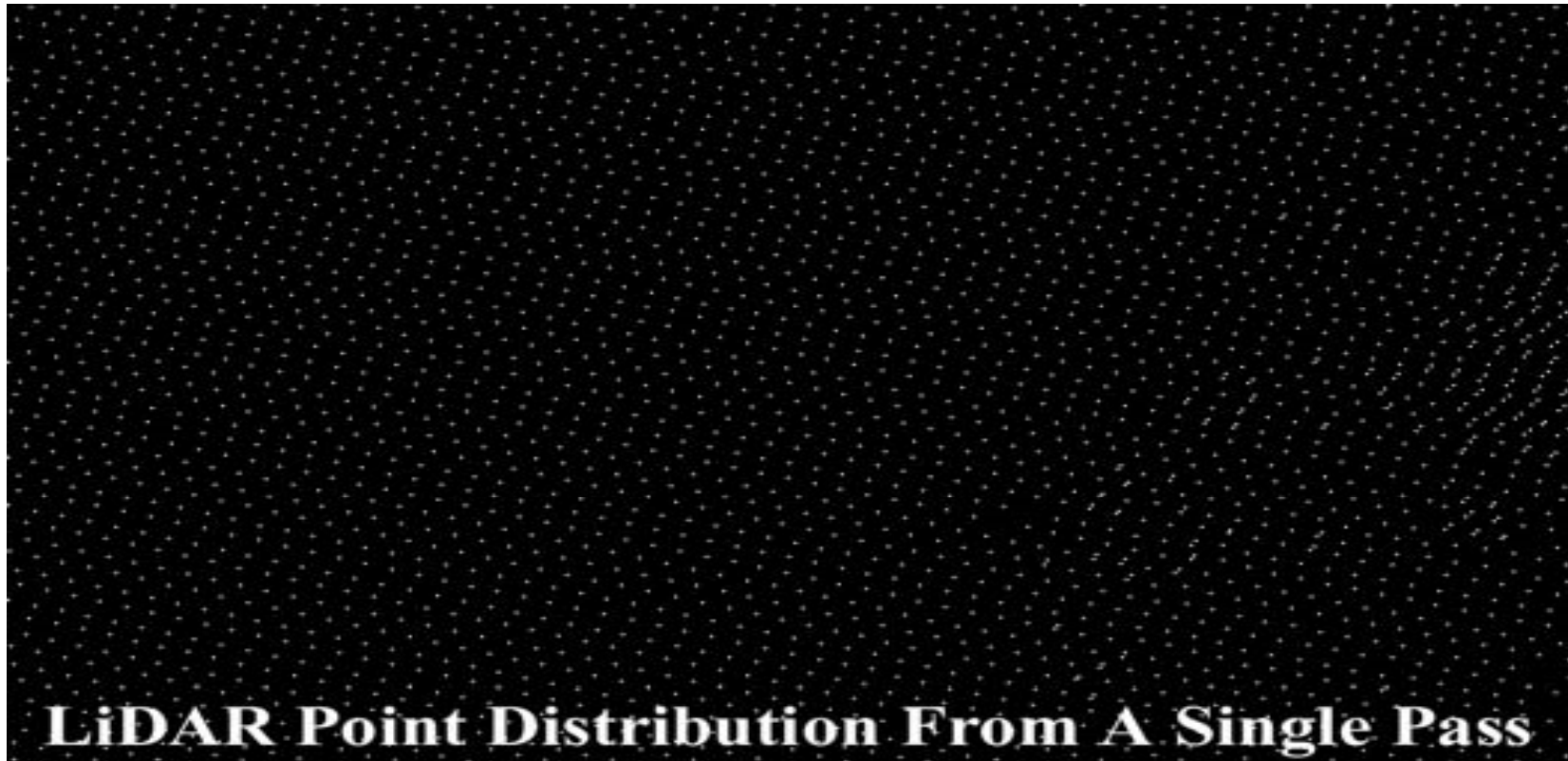
Height accuracy: 15-25 cm

Ideal for special projects
(e.g., www.ambercore.com)



Airborne LIDAR System (author unknown)

LIDAR Data Coverage Example



Source: Ohio Dept. of Transportation

Typical LIDAR Sensor Characteristics [USACE, 2002]

Parameter	Typical Value(s)
Vertical Accuracy	15 cm
Horizontal Accuracy	0.2 – 1 m
Flying Height	200 – 6000 m
Scan Angle	1 – 75 deg
Scan Rate	0 – 40 Hz
Beam Divergence	0.3 – 2 mrads
Pulse Rate	05 – 33 KHz
Footprint Diameter from 1000 m	0.25 – 2 m
Spot Density	0.25 – 12 m

Monte Carlo Simulations

Numerical Recipes [Press et al, 1986] state:

$$\int_V \mathbf{f} \, dV \approx V \langle \mathbf{f} \rangle \pm \sqrt{\left(\langle \mathbf{f}^2 \rangle - \langle \mathbf{f} \rangle^2 \right) / N}$$

where

$$\langle \mathbf{f} \rangle = N^{-1} \sum_{n=1}^N \mathbf{f}(\mathbf{n})$$

and

$$\text{Var}(\mathbf{f}) = \left\langle (\mathbf{f} - \langle \mathbf{f} \rangle)^2 \right\rangle = \langle \mathbf{f}^2 \rangle - \langle \mathbf{f} \rangle^2$$

implying a standard error of $O(1/\sqrt{N})$ or a variance of $O(1/N)$

Random Numbers

- **Pseudorandom** (PRN) sequences are commonly generated using some linear congruential model applied recursively, such as

$$x_n \equiv c \odot x_{n-1} \text{ modulo } \pi \quad (\text{for large prime } \pi \text{ and constant } c)$$

or lagged Fibonacci congruential sequence, such as

$$x_n \equiv x_{n-p} \odot x_{n-q} \text{ modulo } \pi \quad (\text{for large primes } \pi \text{ and } p, q)$$

in which $\odot$ usually stands for ordinary multiplication

- **Chaotic-random** (CRN) sequences generated by e.g.

$$x_n = 4 x_{n-1} (1-x_{n-1}), \quad n = 1, 2, \dots, \quad (\text{Logistic equation})$$

for some seed x_0 , over $(0, 1)$, exhibits randomness with a density

$$\rho(x) = 1 / \pi [x (1 - x)]^{1/2} \quad (\text{correction needed})$$

- **Quasi-random** (QRN) sequences are ‘equidistributed’ sequences

Numerical Experimentation

PMC / QMC / CMC	N = 10	N = 10 ²	N = 10 ³	N = 10 ⁴
$\int_0^1 e^x dx$ $\cong 1.718281828459045$	1.56693421	1.63679860	1.70388586	1.71894429
	1.56693421	1.71939163	1.71994453	1.71812988
	1.67154678	1.73855363	1.76401394	1.72791977
$\int_0^1 \int_0^1 e^{xy} dx dy$ $\cong 1.317902151454404$	1.23409990	1.31809139	1.31787793	1.31790578
	1.23409990	1.31785979	1.31789668	1.31790120
	1.21656321	1.27903348	1.34063983	1.31179521
$\int_0^1 \int_0^1 \int_0^1 e^{xyz} dx dy dz$ $\cong 1.146499072528643$	1.14046759	1.14625944	1.14650287	
	1.14046759	1.14649963	1.14649879	
	0.99503764	1.14428655		

LIDAR Terrain Simulations

Topography:

Cosine Model :

$$H_1(x,y) = k_1[1 - \cos\alpha x \cos\beta y]$$

Exponential Model :

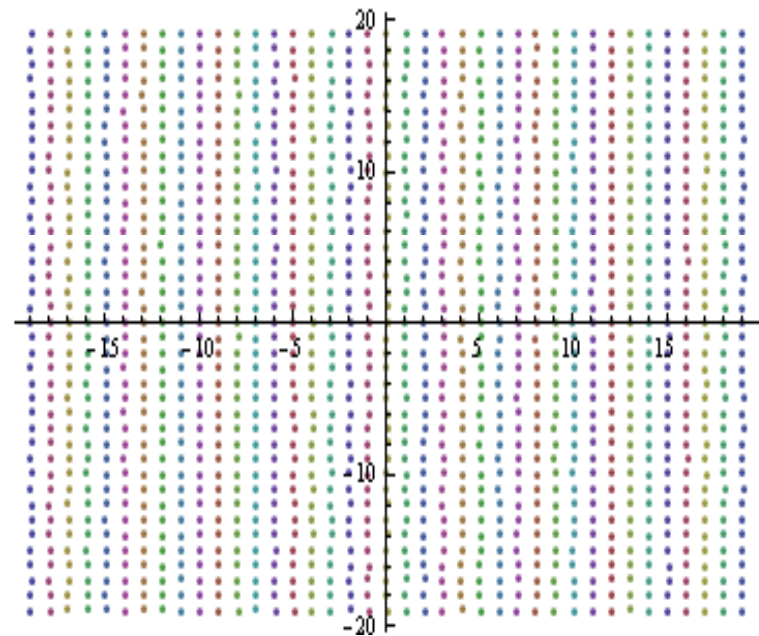
$$H_2(x,y) = k_2[e^{-\alpha x^2 - \beta y^2} - 1]$$

Logarithmic Model :

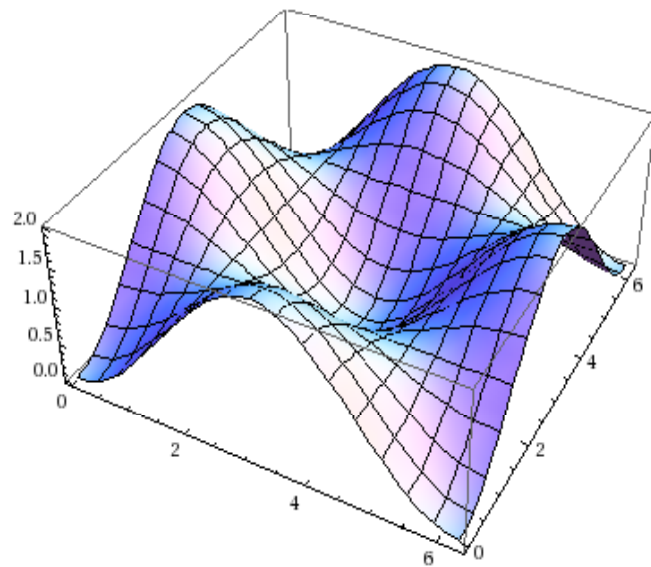
$$H_3(x,y) = k_3 \log[1 + \alpha x^2 + \beta y^2]$$

LIDAR Grid:

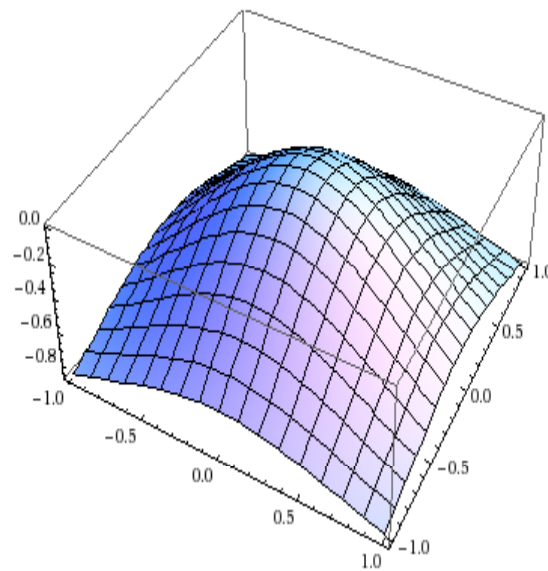
$$(x, y) = (i, j) + k \cdot \text{UniformRandom}(0,1)$$



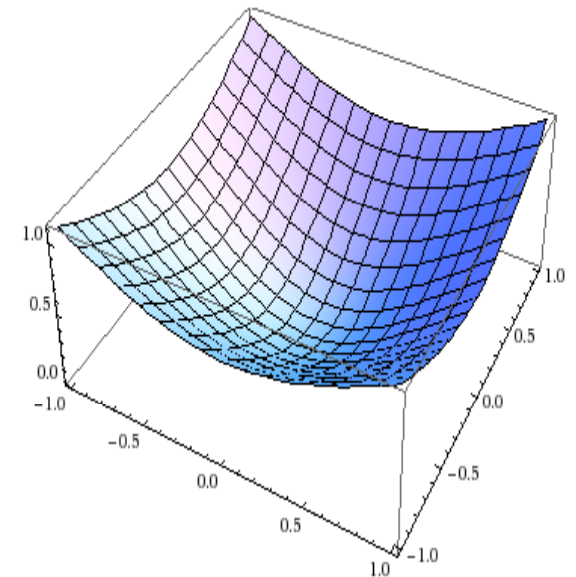
Simulated Terrain Shapes



Cosine Model



Exponential Model



Logarithmic Model

Quasi-Monte Carlo Formulation

For a gravity station at the origin,

$$\delta g(0,0,0) = G\bar{\rho} \int_{-L}^L \int_{-L}^L \int_0^{H(x,y)} \frac{z \, dz \, dy \, dx}{(x^2 + y^2 + z^2)^{3/2}}$$

then for N small prisms over an area A,

$$\begin{aligned} \delta g(0,0,0) &\approx G\bar{\rho}A \left\langle \int_0^h \frac{z \, dz}{(d^2 + z^2)^{3/2}} \right\rangle \\ &\approx G\bar{\rho}A \left\langle \frac{1}{d} - \frac{1}{\sqrt{d^2 + h^2}} \right\rangle \\ &\approx \frac{G\bar{\rho}A}{N} \sum_{i=1}^N \left(\frac{1}{d_i} - \frac{1}{\sqrt{d_i^2 + h_i^2}} \right) \end{aligned}$$

Results of Simulations

GTC in mGal	$k = 10^3$	$k = 2 \cdot 10^3$	$k = 3 \cdot 10^3$	$k = 4 \cdot 10^3$
TERRAIN: Cosine Model* LIDAR: » (i,j) only » (i,j) + URand(0, 0.2) » scale·URand(-0.5, 0.5)	12.7892	47.9520	98.0583	155.4226
	12.7892	47.9520	98.0583	155.4226
	12.7893	47.9503	98.0578	155.4180
TERRAIN: Exponential Model* LIDAR: » (i,j) only » (i,j) + URand(0, 0.2) » scale·URand(-0.5, 0.5)	45.7062	136.4131	229.2257	313.9924
	45.7062	136.4131	229.2257	313.9924
	45.6991	136.4226	229.2030	314.0088
TERRAIN: Logarithmic Model* LIDAR: » (i,j) only » (i,j) + URand(0, 0.2) » scale·URand(-0.5, 0.5)	178.0971	437.7609	623.1184	746.8817
	178.0971	437.7609	623.1184	746.8817
	178.0925	437.7790	623.1178	746.8773

*- All over 10 000 m x 10 000 m with gravity station in centre.

Error Analysis Considerations

- In general, Monte Carlo simulations are known to have a standard error $O(1/N^{1/2})$, or an error variance $O(1/N)$.

- Considering the accuracy of the terrain measurements in

$$\delta g \approx G\bar{\rho}A \left\langle \frac{1}{d} - \frac{1}{\sqrt{d^2 + h^2}} \right\rangle = \frac{G\bar{\rho}A}{N} \sum_{i=1}^N \left(\frac{1}{d_i} - \frac{1}{\sqrt{d_i^2 + h_i^2}} \right)$$

conventional error propagation has to be carried out.

- For comparisons with conventional prism computations, some real field data are needed with gravimetric terrain corrections.

Concluding Remarks

- **Practically all gravity measurements require terrain corrections**
- **Airborne LIDAR gives data with dm accuracy and sub-m resolution**
- **LIDAR terrain data can be considered as quasi-random 2D sequence**
- **Monte Carlo formulation uses the line mass formulation for GTC**
- **Numerical simulations with different terrain models are stable**
- **Simulation results are very convincing and useful for applications**
- **Real field data are needed for more complete analysis**