



THE UNIVERSITY OF TEXAS AT AUSTIN
RADIONAVIGATION LABORATORY



Precise Positioning for the Mass Market

Todd Humphreys^{1,2}, Ken Pesyna², Daniel Shepard^{1,2}, Matthew Murrian¹, Collin Gonzalez¹, Tom Novlan³

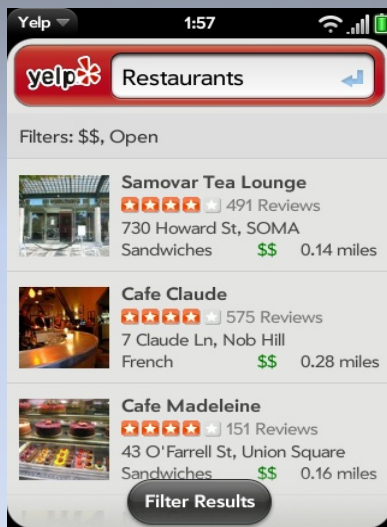
¹Department of Aerospace Engineering and Engineering Mechanics, The University of Texas at Austin

²Radiosense LLC

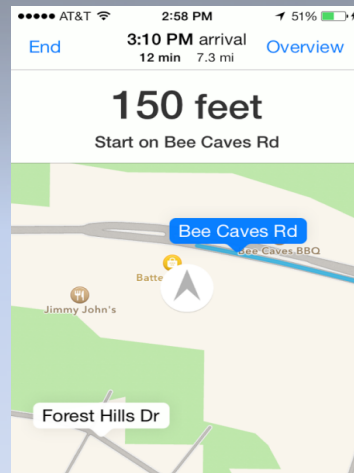
³Samsung Research America

GNSS Futures IGS Workshop | February 9, 2016

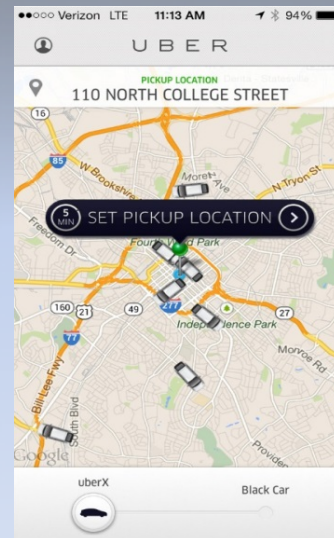
Mass-Market GNSS Positioning Today



Location-based Searches



Driving Directions



Location Sharing



Fitness Tracking

Where It's Going



Virtual Reality



Augmented Reality

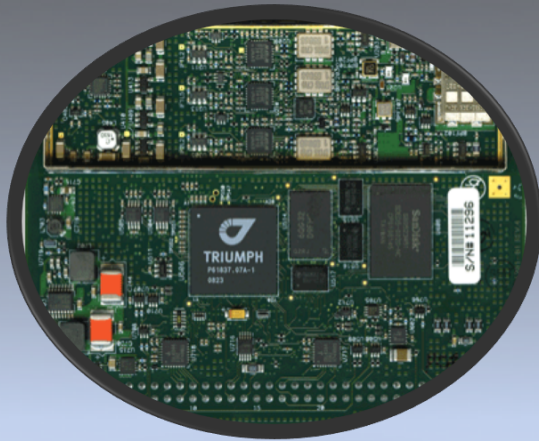


Large-scale Mapping



Autonomous Driving

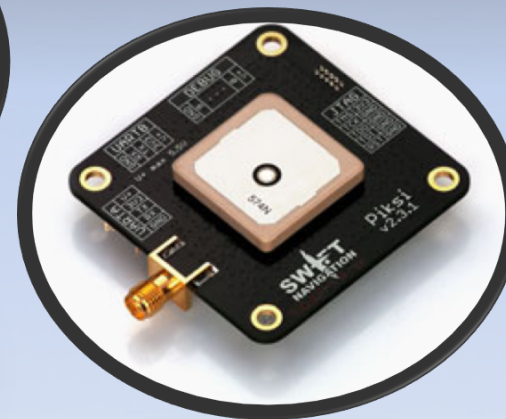
Disruption of the RTK-Capable RX Market



~\$13k



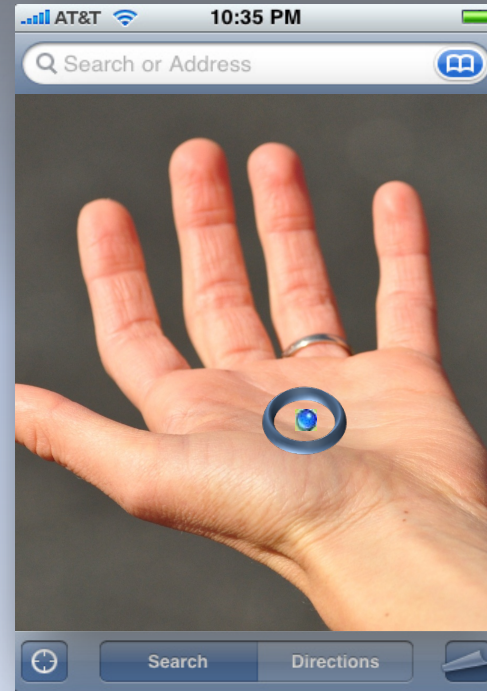
~\$600

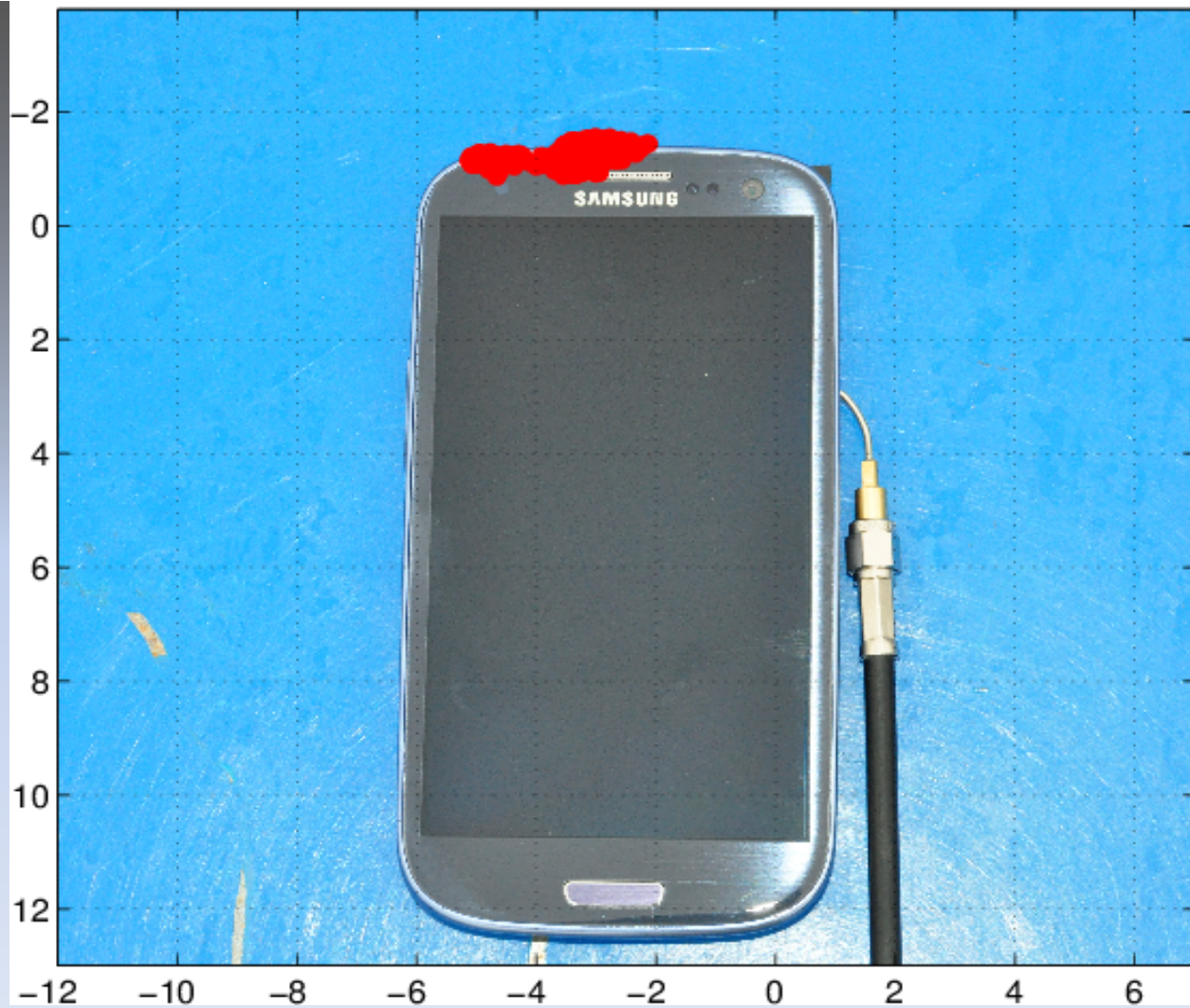


~\$500

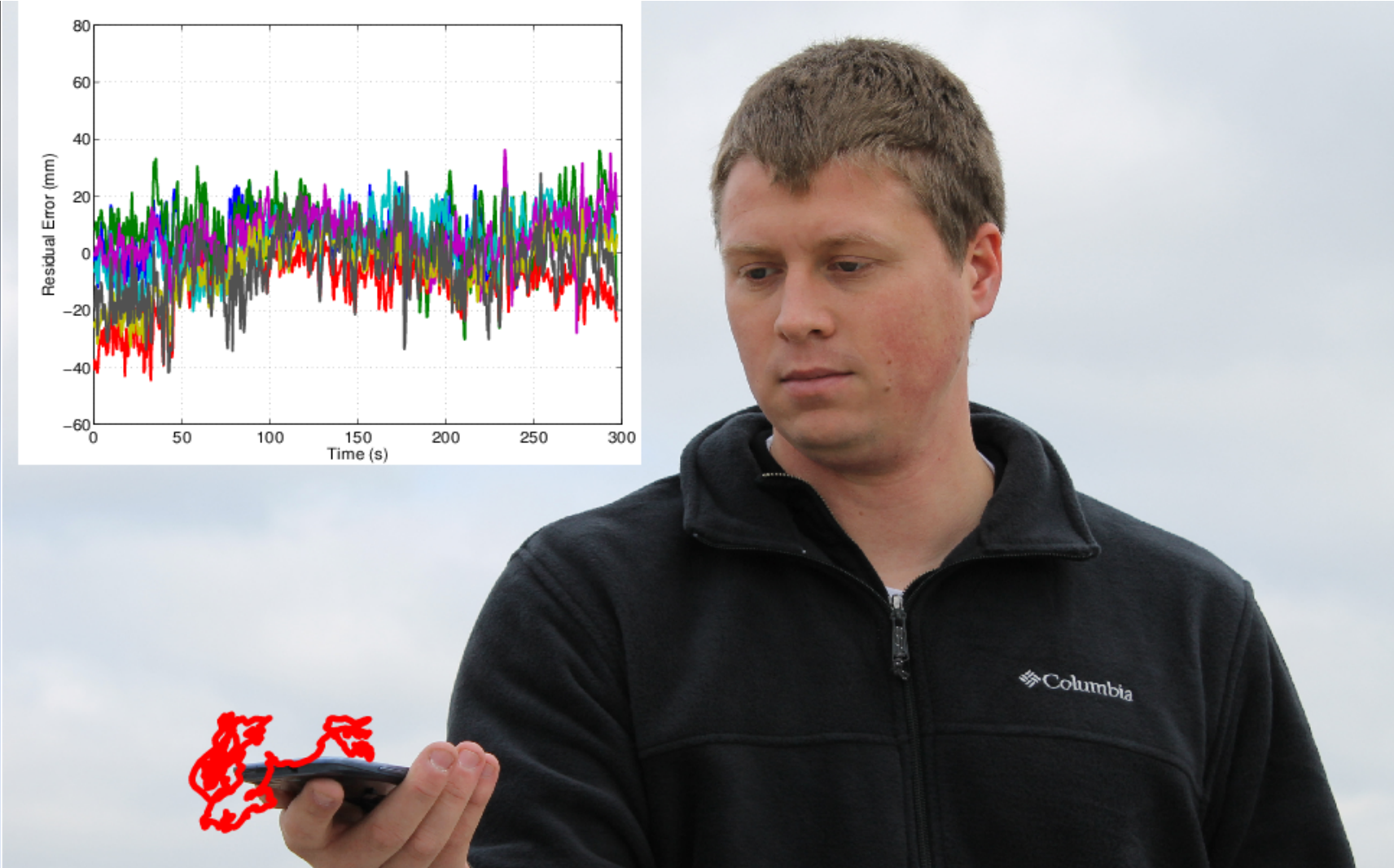
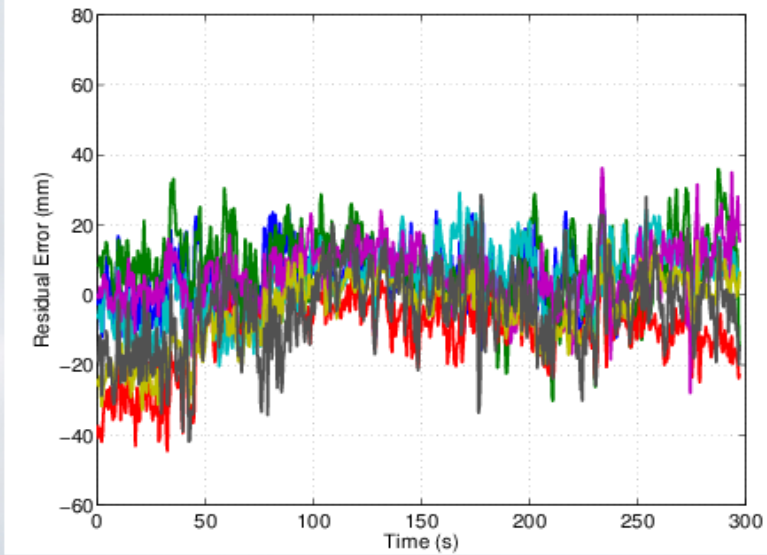


~\$150





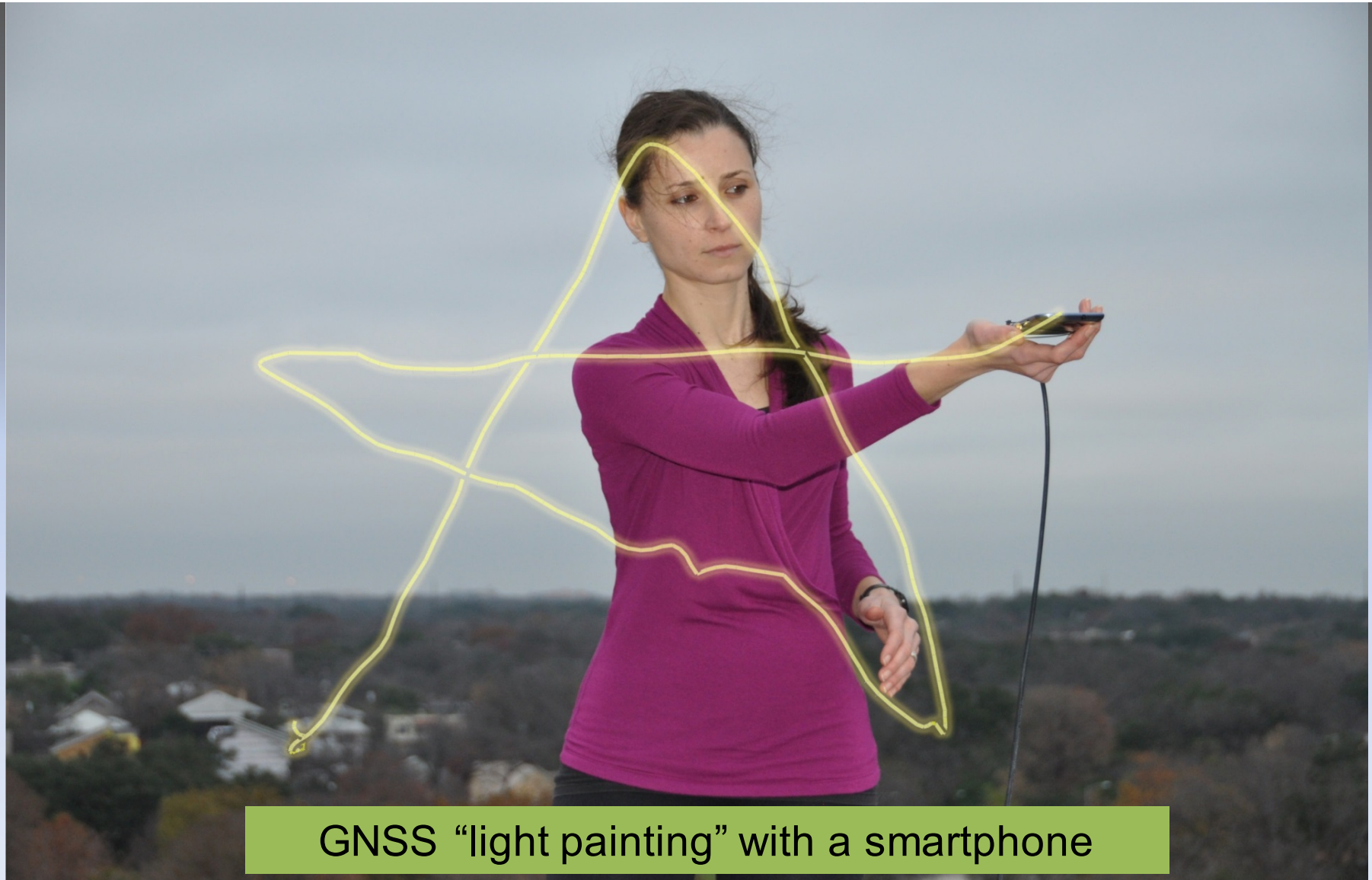
Dec. 2014: First successful RTK positioning solution with a smartphone antenna



Handheld RTK result with some signals passing through Ken's body



One of Picasso's famous light paintings



GNSS “light painting” with a smartphone

GPS World

THE BUSINESS & TECHNOLOGY OF GNSS

WWW.GPSWORLD.COM

FEBRUARY 2015

CENTIMETER ACCURACY

with a
SMARTPHONE ANTENNA

+

2015 GNSS ANTENNA SURVEY

BEIDOU SIGNAL
CHANGES SIGNALLED

GLOBAL ASSET
TRACKING

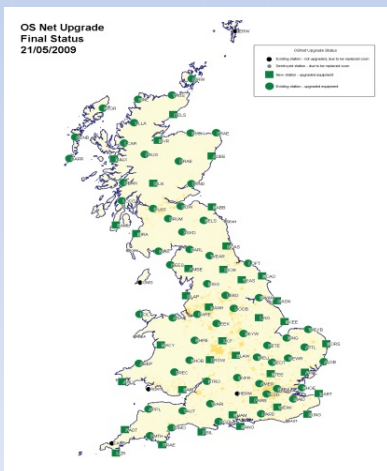
PYTHON GNSS
RECEIVER



Work Proceeding on Two Fronts

Reference Network

Q: If we shift focus from network cost to end-user performance, i.e., time to reliable fix despite significant blockage and multipath at mobile device, how does this alter network layout?



Existing permanent reference network: 70-100 km inter-station spacing

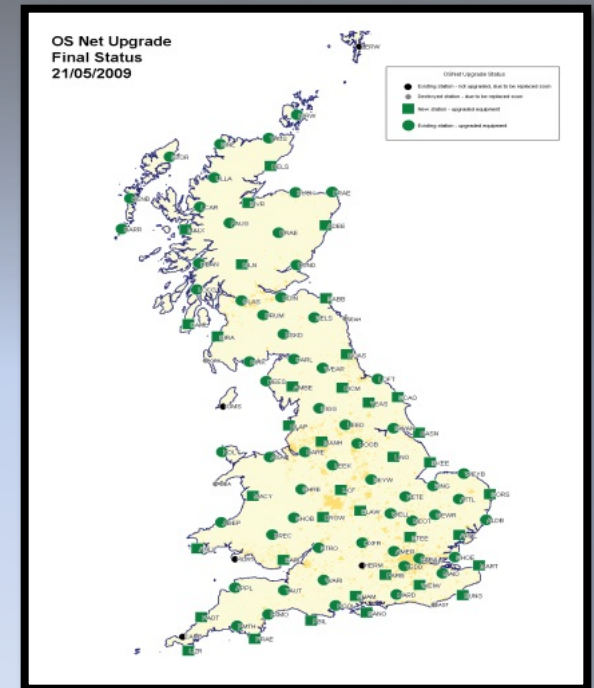
Mobile Device

Q: How must we modify existing low-cost mobile devices – handsets, VR headsets, intelligent vehicle sensors – to enable these to achieve cm-accurate positioning?



Samsung Galaxy phone with internal <\$1 Broadcom GNSS chip

Mass market (MM) use of cm-accurate positioning
upends the conventional wisdom (CW) on network design



CW: Permanent reference stations cost \$50k for initial equipage+install and \$1k/yr to maintain, so network must be sparse.

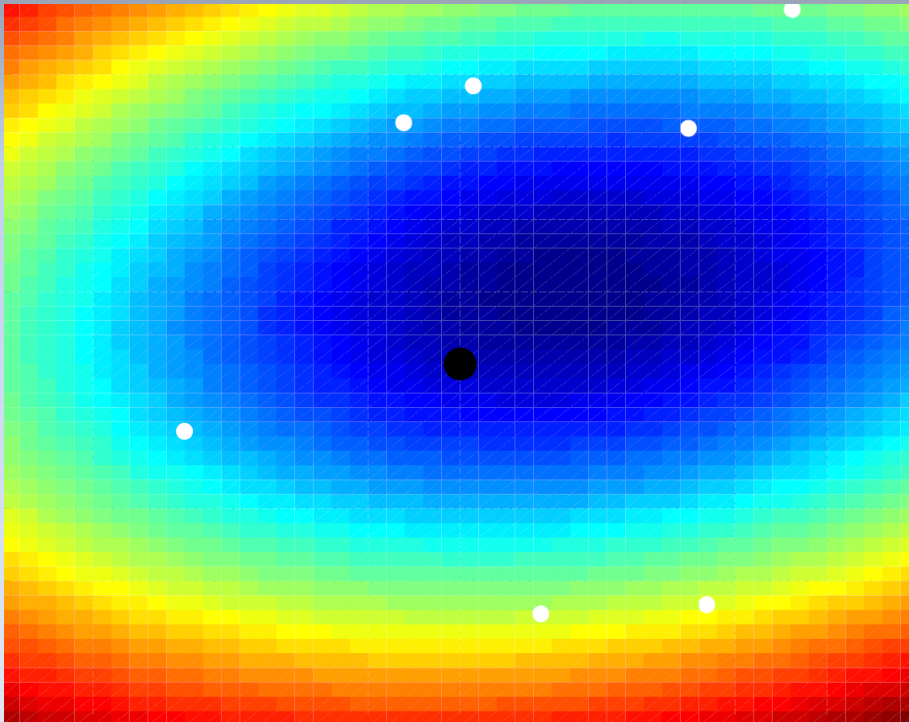
MM: Cost of network is negligible when amortized across millions of users; performance is key, so network must be dense. Besides, adequate-quality reference stations can cost less than \$1k for equipage+install, \$100/yr maintenance.



University of Texas & Samsung
*Centimeter-Accurate
Positioning System (CAMPs)*
Dual-Frequency GPS/Galileo
Reference Station
Parts and assembly: ~\$1k

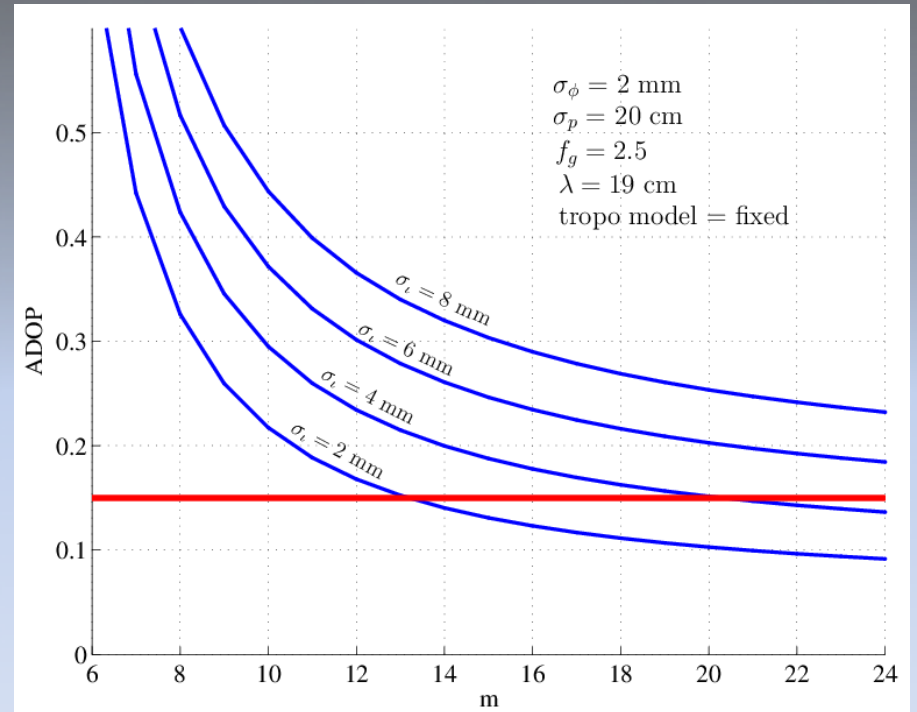
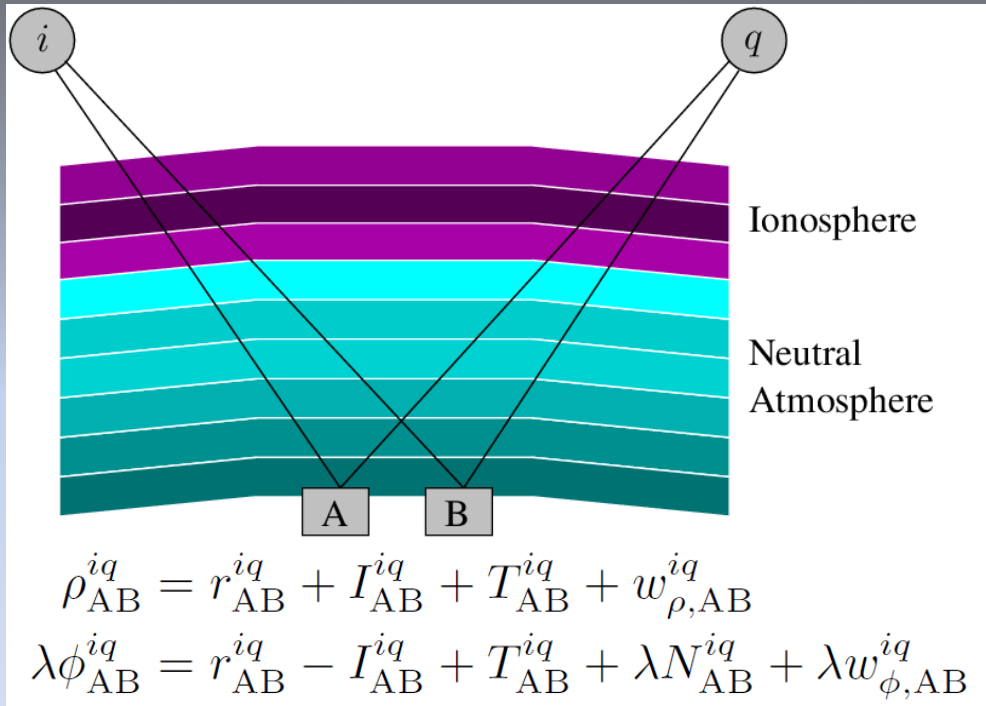
CW: Minimize number of stations while ensuring every user is within R km of a station; results in uniformly-distributed network.

MM: Deploy stations however necessary to ensure P% of population experiences RMS corrections errors less than 2 mm; must take into account population density and atmospheric spatial statistics.

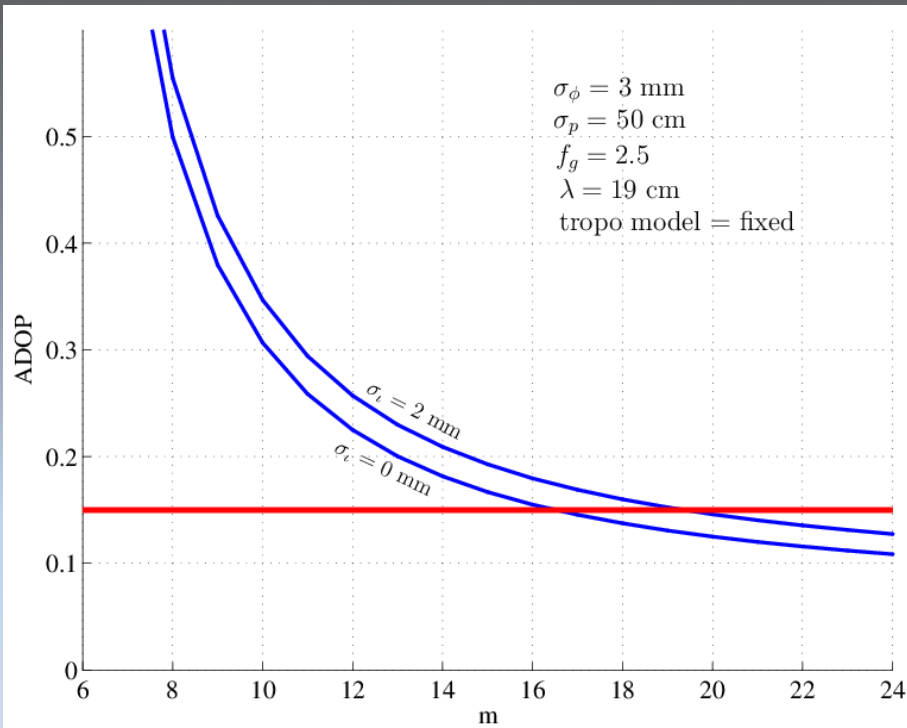


$$\nu = c_x dx + c_y dy + c_z dz + c_0$$

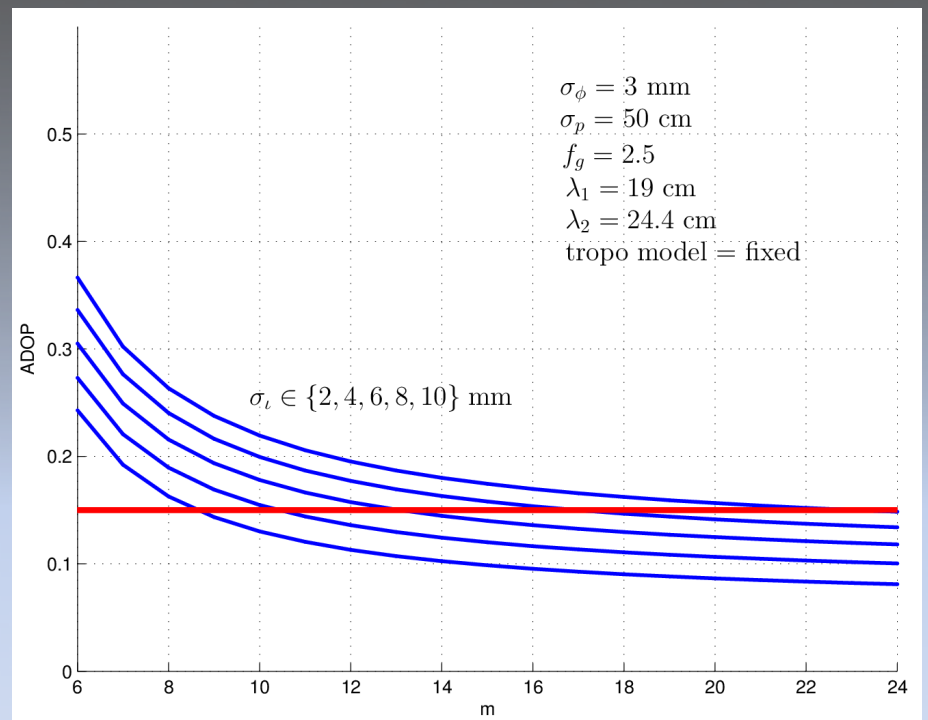
Standard deviation of network corrections for a linear DD iono + tropo model and iid multipath + thermal noise errors at each of 8 reference stations whose locations are known
Red = high, blue = low



Dense network benefits: (1) iono+tropo DD errors can be made negligible, and (2) master station multipath attenuated



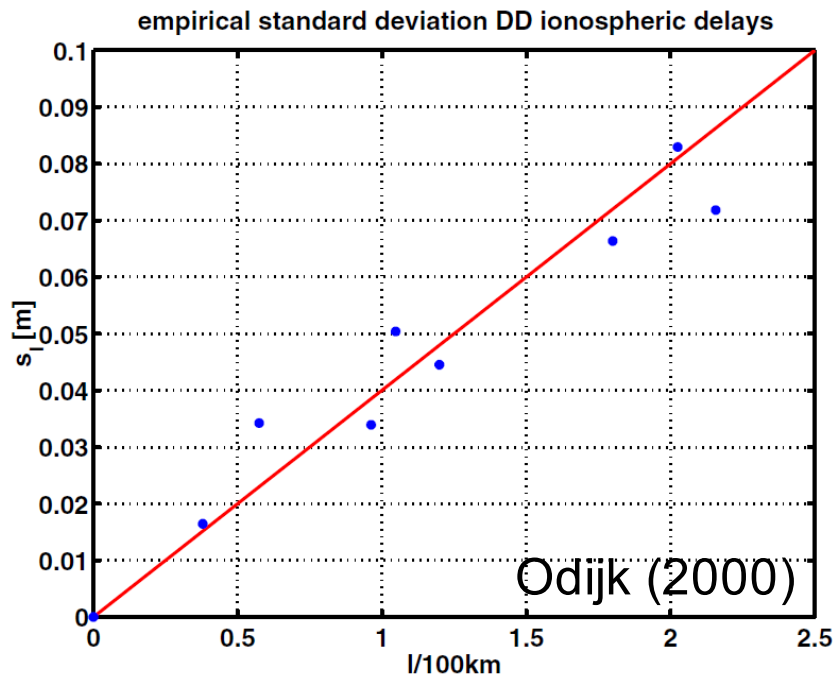
Reality check for single-frequency RTK with network-provided corrections: For low-cost antennas in realistic multipath environments, a dense network can't ensure reliable single-epoch fixing.



Adding a second frequency helps tremendously: for RMS corrections errors of 2 mm (attainable with < 20 km inter-station spacing), reliable single-epoch fixing is possible with only $m = 9$ satellites.

Q: What is functional relationship between network density and the size of RMS errors in the DD iono + tropo corrections?

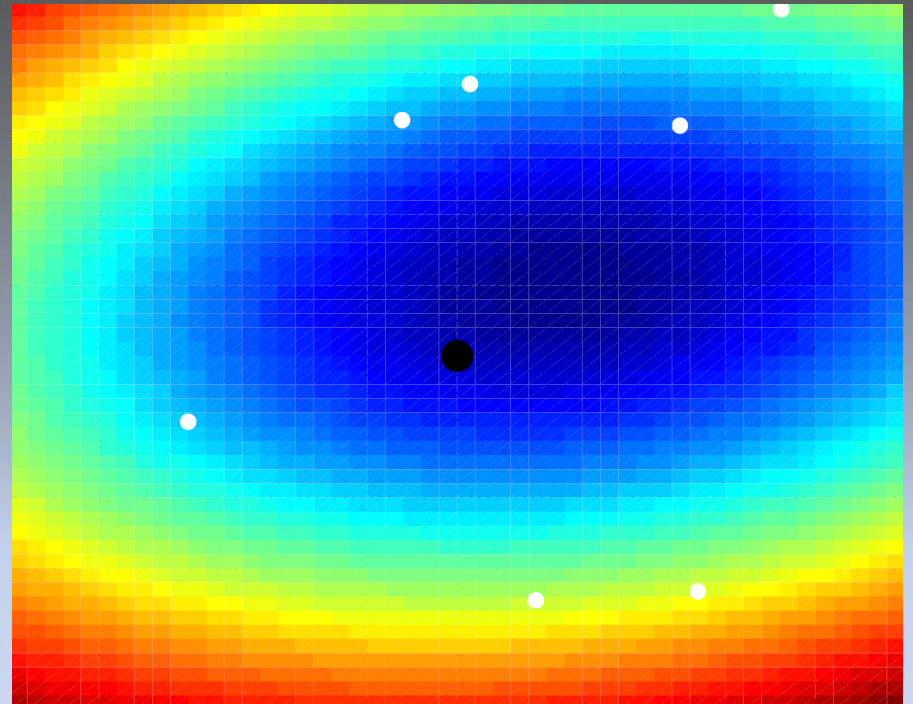
(In other words, how dense must our reference network be to achieve 2 mm RMS corrections errors?)



Single-baseline

$$\sigma_l = l\beta, \quad 0.3 \leq \beta \leq 3 \text{ mm/km}$$

- └── uncertainty scaling factor
- └── distance to reference station
- └── uncertainty in iono correction

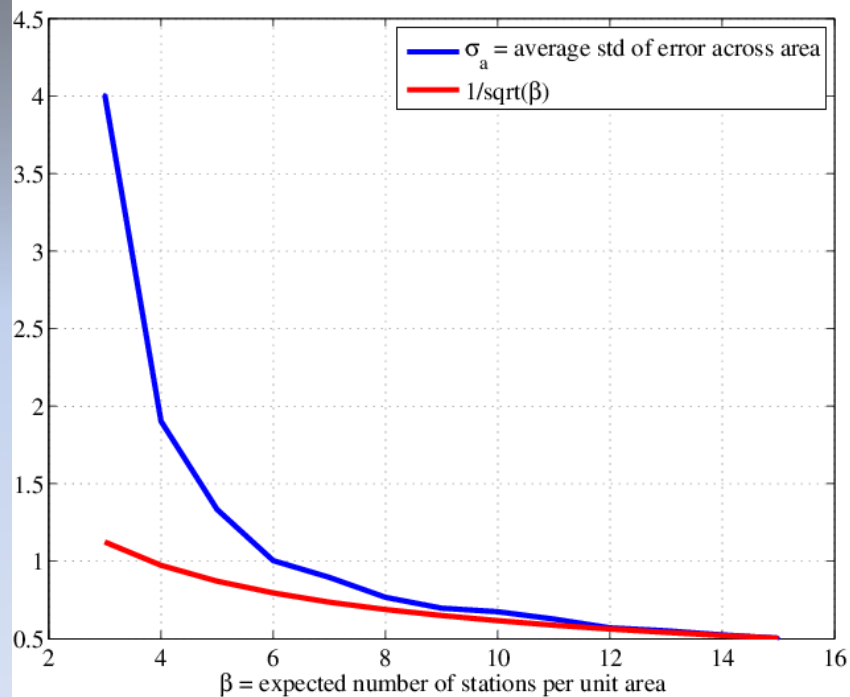


Network

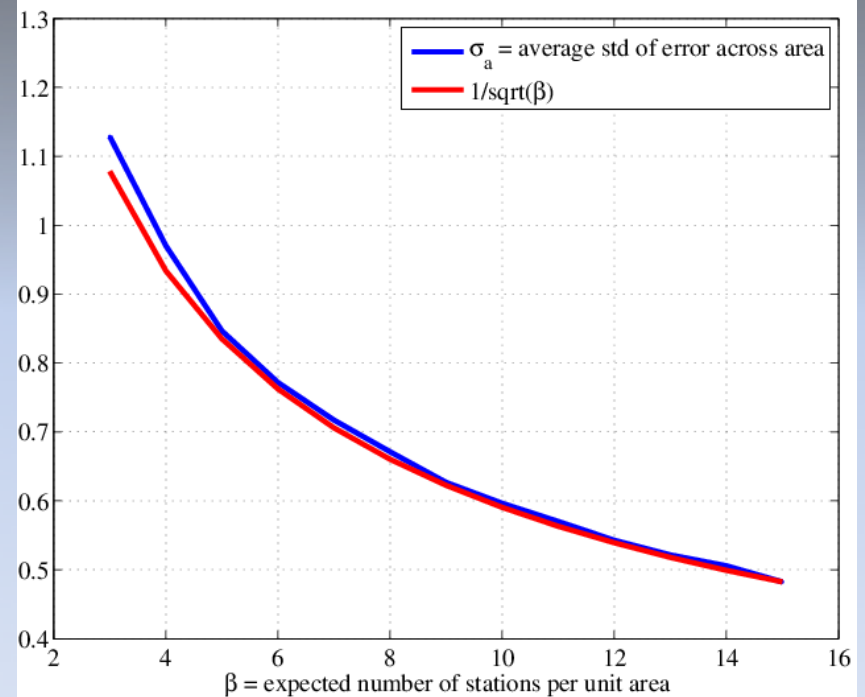
$$v = c_x dx + c_y dy + c_z dz + c_0$$

Uncertainty in DD corrections at any point depends on (1) interpolation model, (2) accuracy of interpolation model, and (3) location of point relative to master

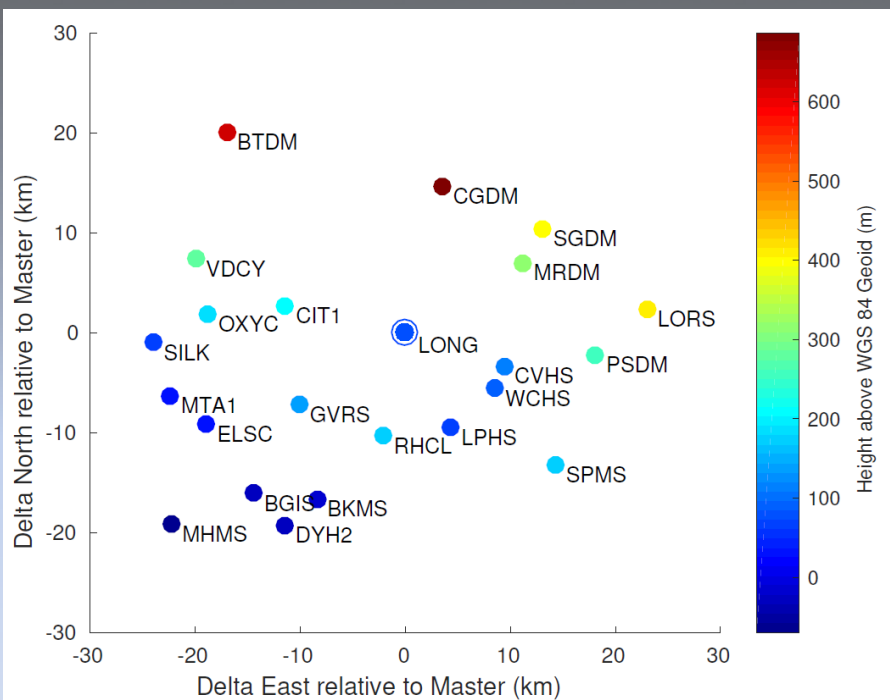
The theory of stochastic geometry shows the way to a closed-form relationship between network density and average uncertainty of corrections



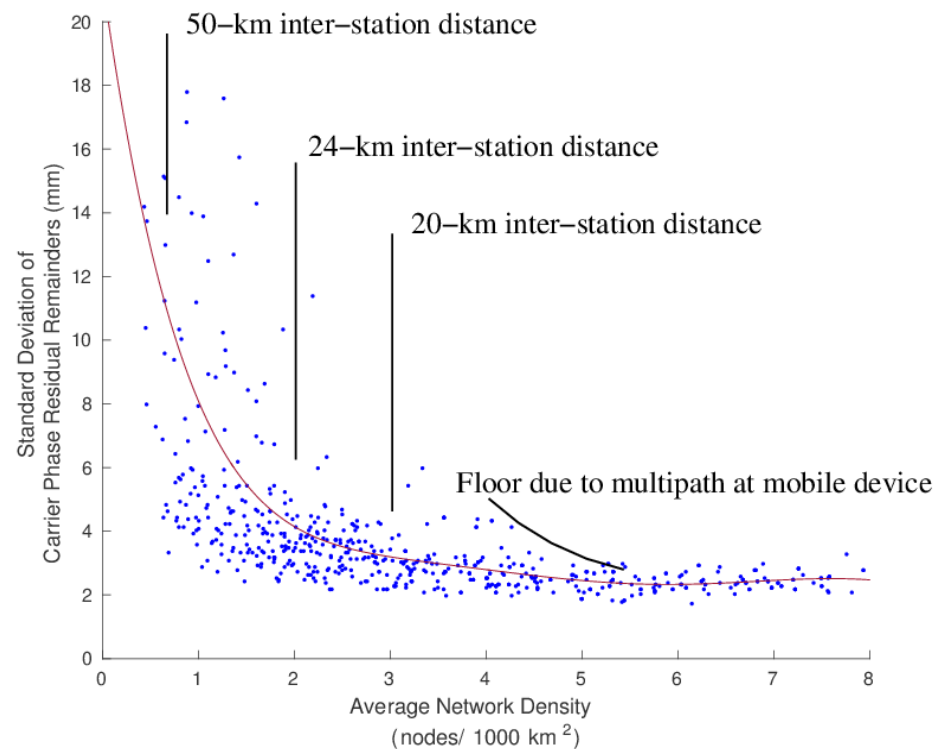
Average correction uncertainty when stations are distributed according to a Poisson point process



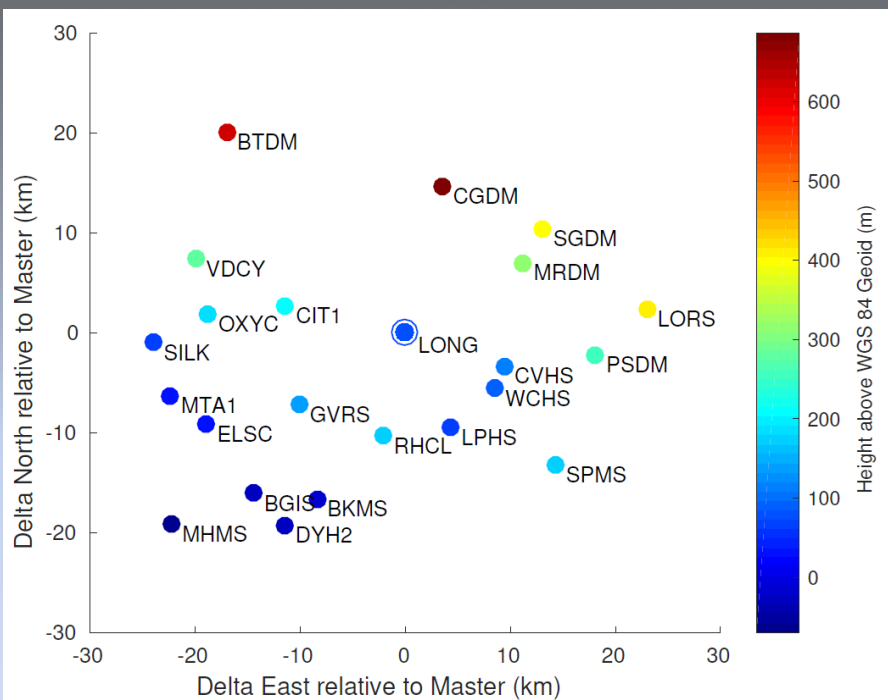
Average correction uncertainty when stations are distributed according to a repelling point process (e.g., determinantal)



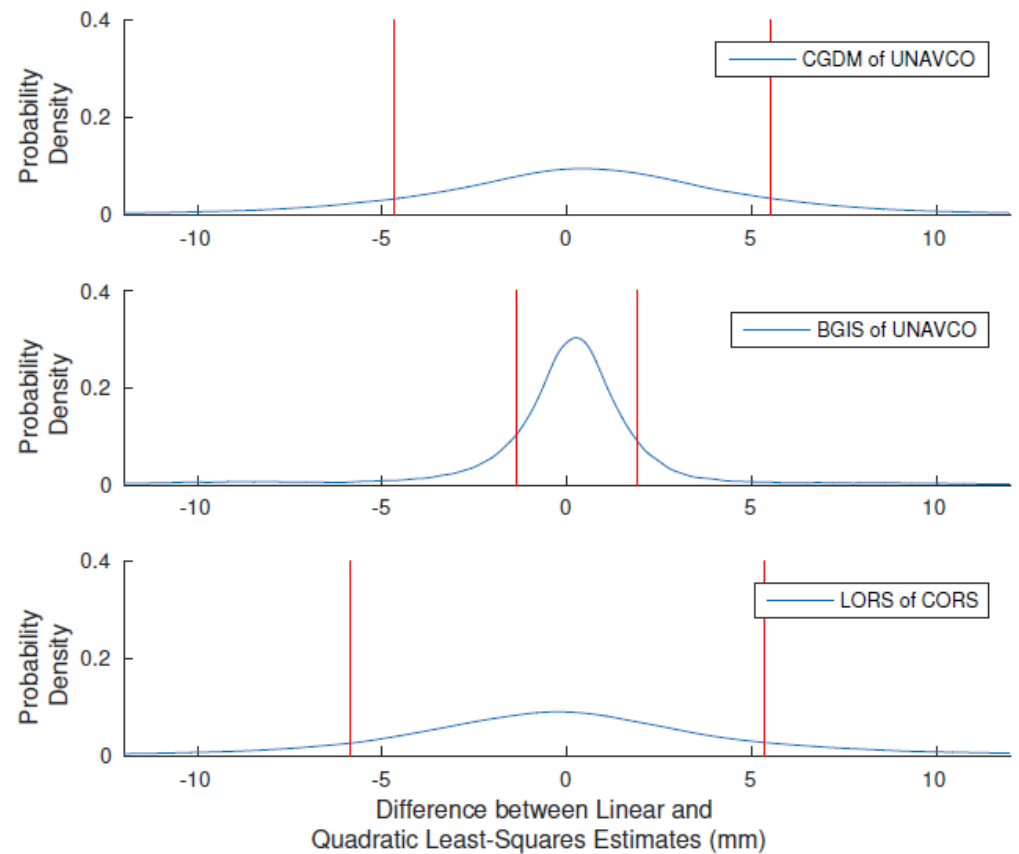
Empirical data drawn from 23 stations in existing high-density public reference network in California



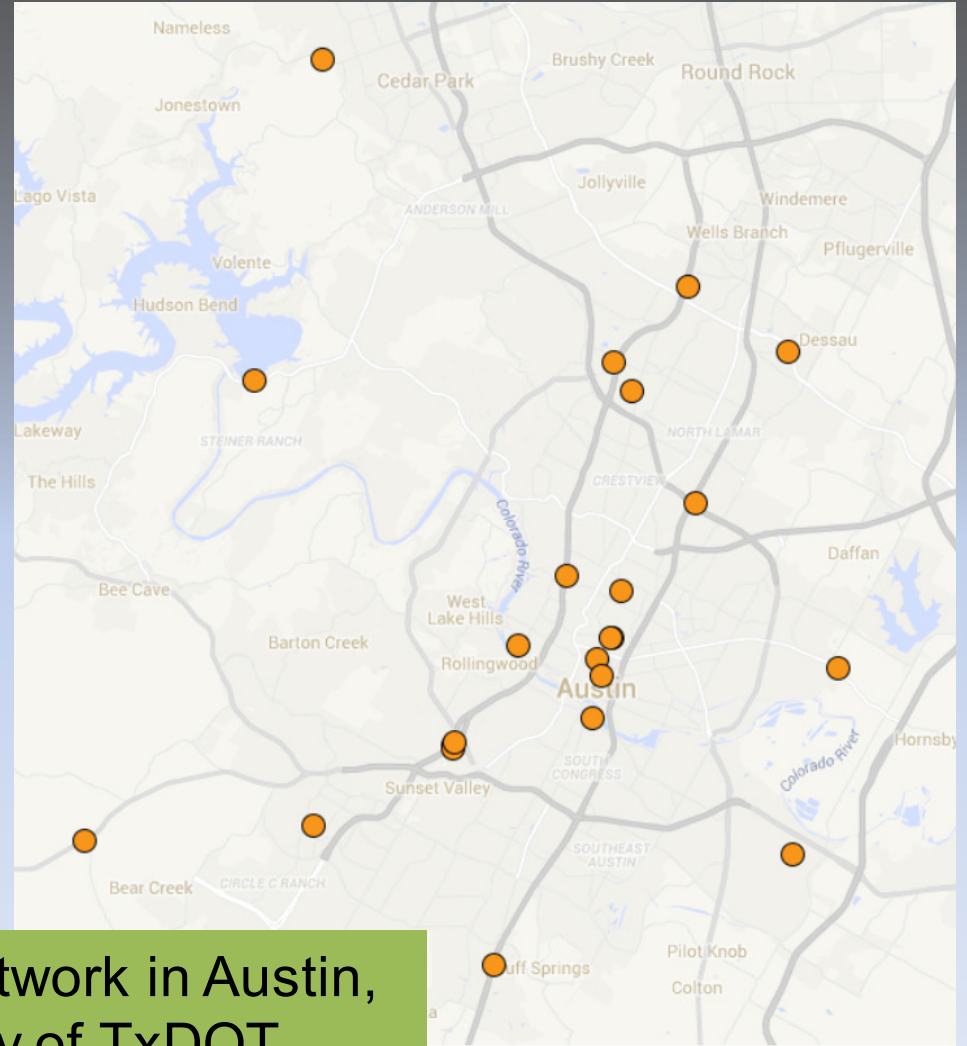
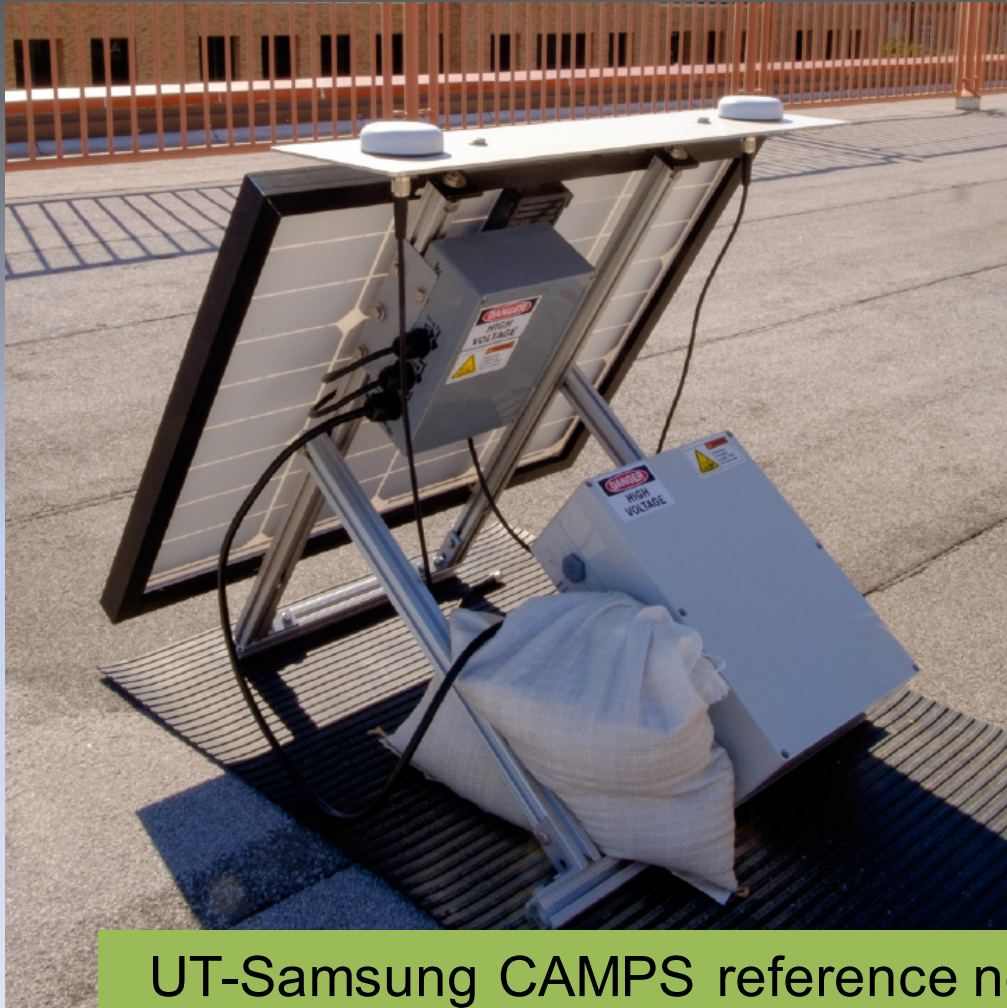
Corrections uncertainty is a highly nonlinear function of density. Floor due to multipath at mobile device reached only with < 20km inter-station distance.



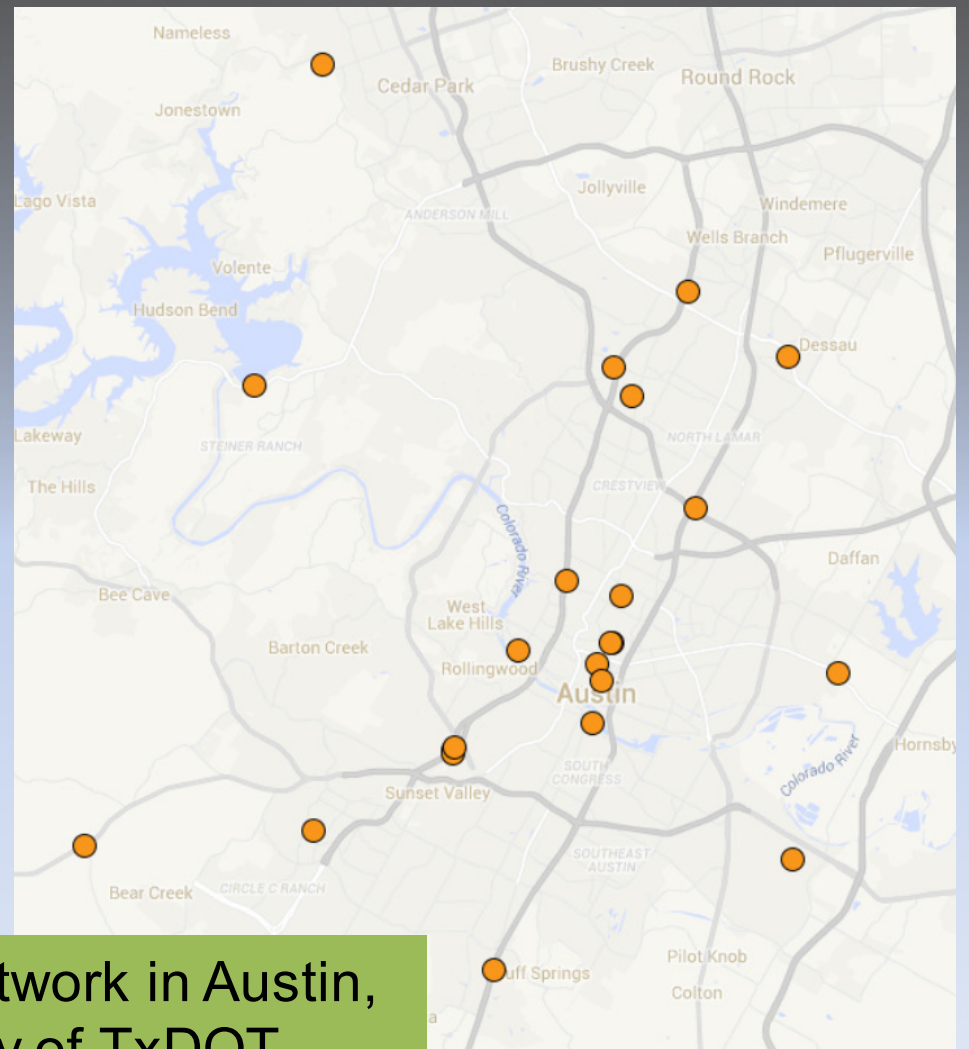
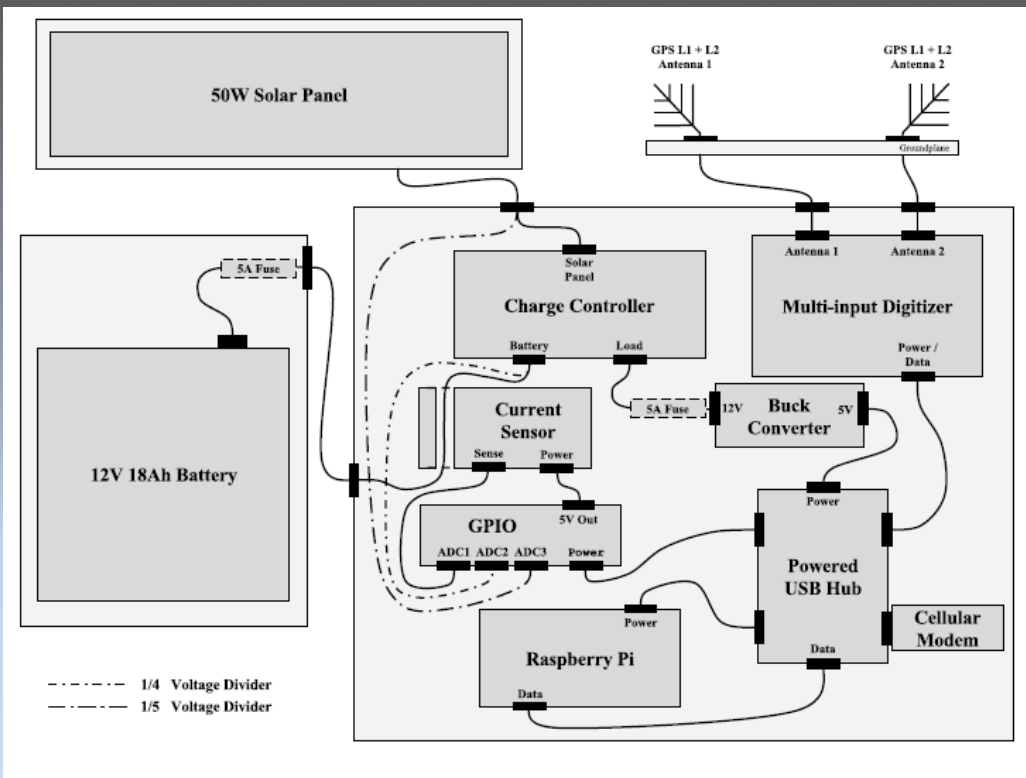
Empirical data drawn from 23 stations in existing high-density public reference network in California.



For the 30-km radius dense network studied, the difference between a linear and a quadratic interpolation model is near the multipath error level. Hence, the linear model is valid.



UT-Samsung CAMPS reference network in Austin, Texas, with site hosting courtesy of TxDOT

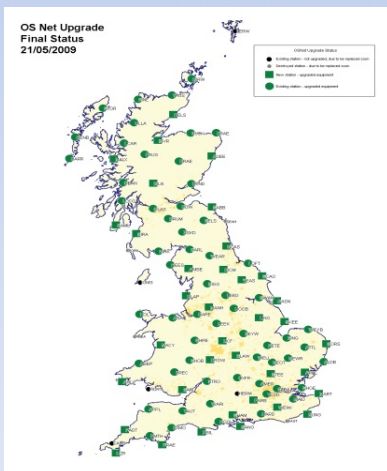


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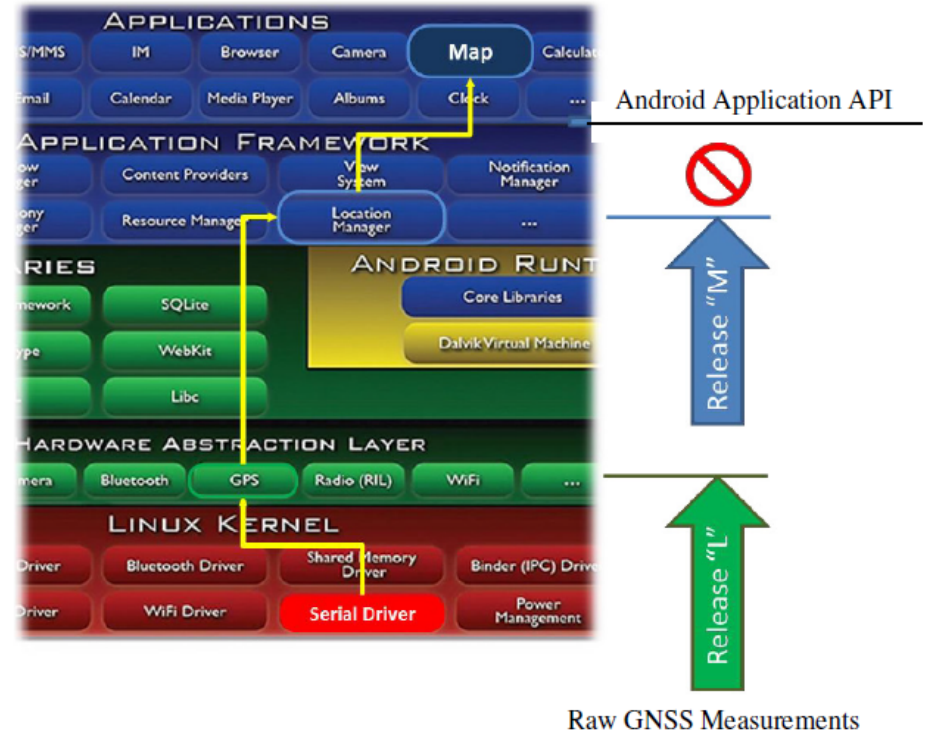
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Samsung Galaxy phone with internal <\$1 Broadcom GNSS chip

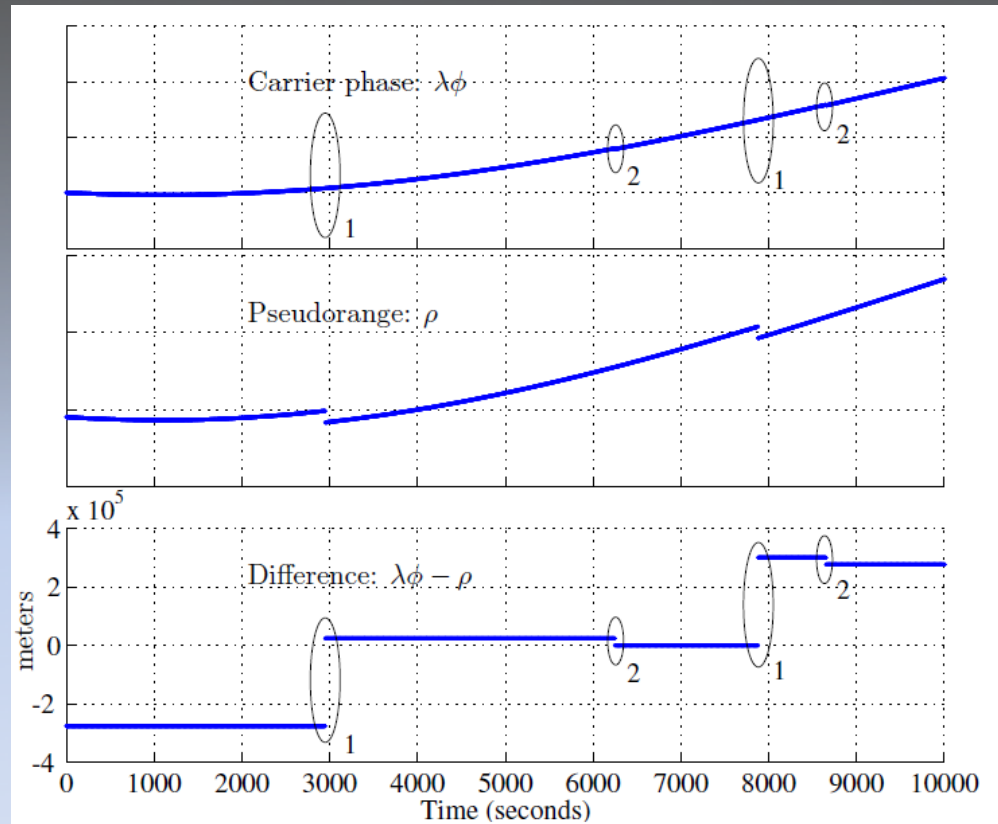
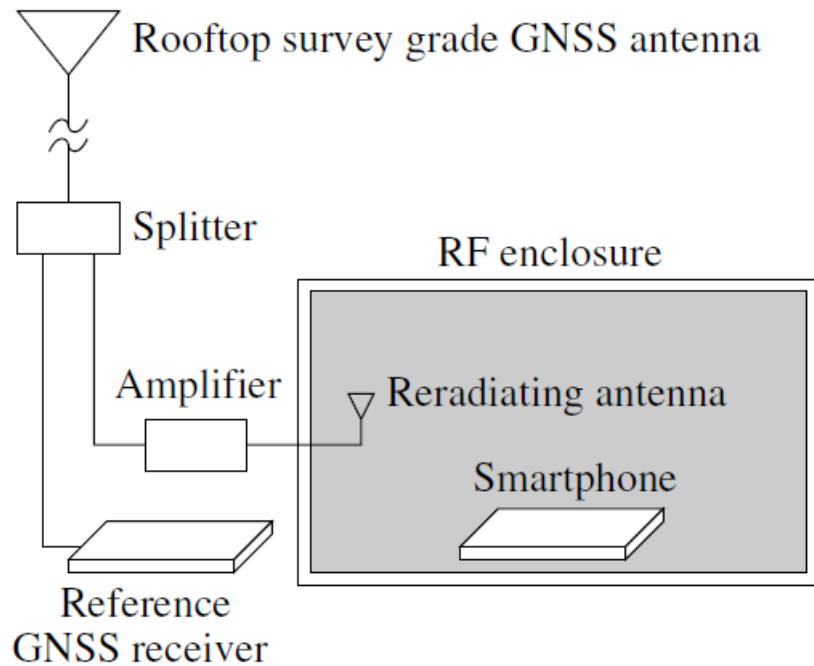
Q: We already know that (fragile) fixed-integer RTK is possible using a smartphone's internal antenna. But what about using its internal GNSS chip (and clock) for this purpose?



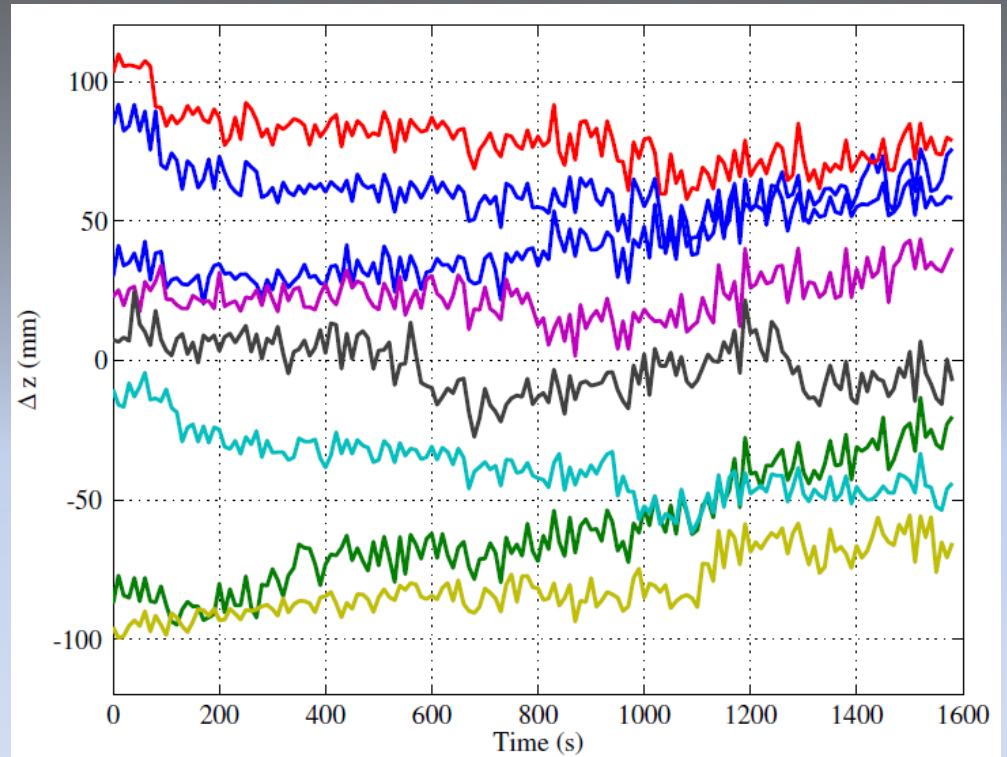
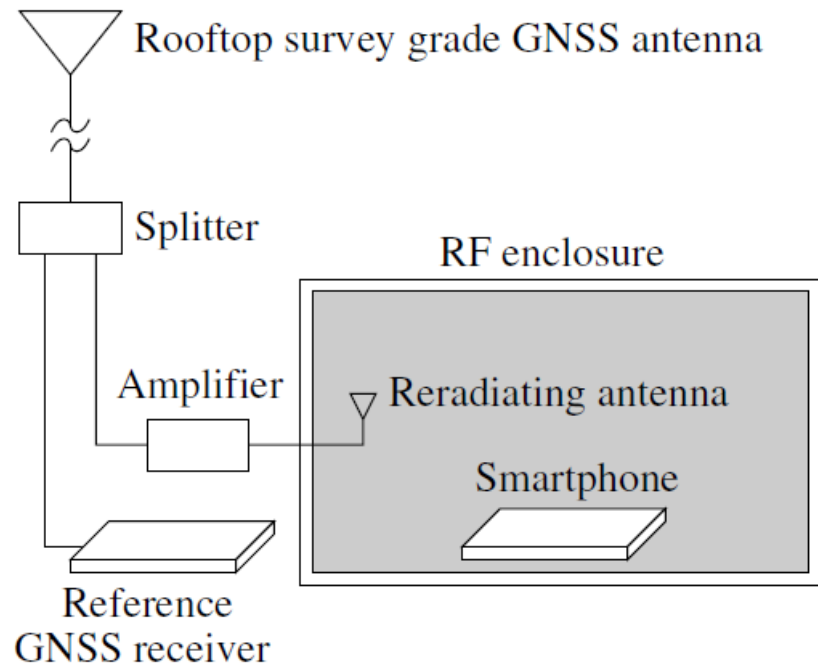
The Broadcom chip inside many smartphones produces pseudorange and carrier phase observables for all signals tracked (multi-constellation), but Android provides no access to these.



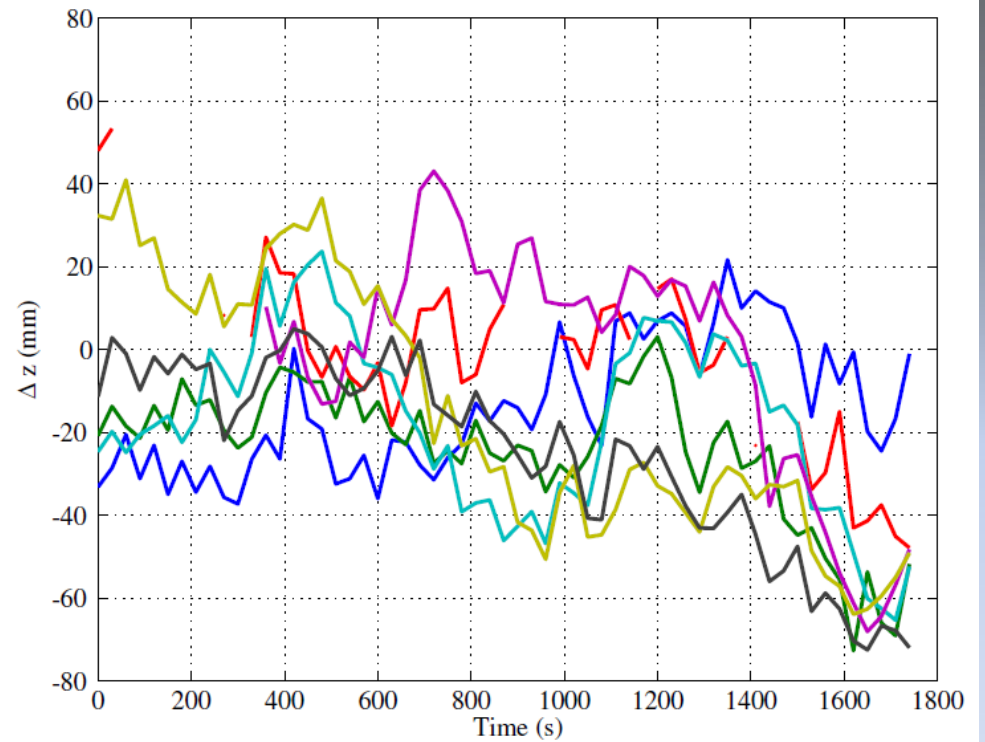
This Galaxy S5 produces RINEX files, thanks to Frank van Diggelen and Sergei Podshivalov (Broadcom).



A zero-baseline test reveals excellent pseudorange but 5 phase anomalies, 4 of which are readily fixed in post-processing.



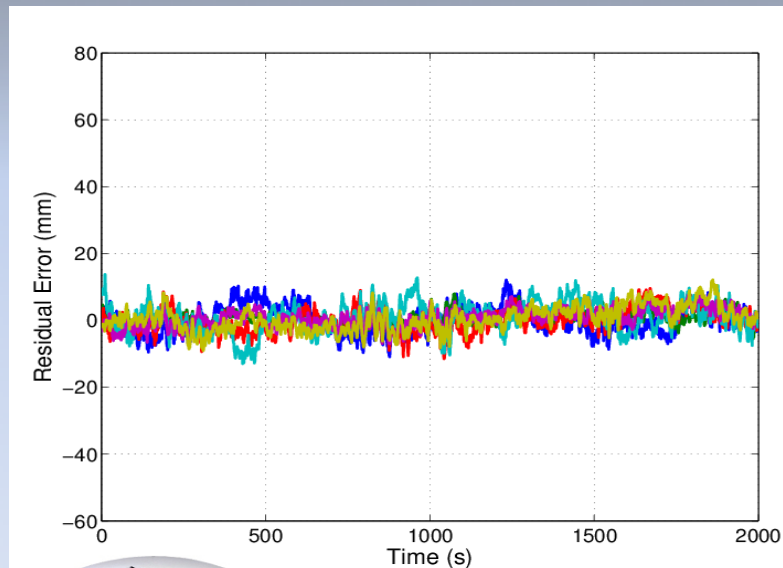
The 5th anomaly is a nonzero and drifting bias in the carrier phase measurements that prevents both float and fixed solutions



Phone produced cycle-slip-free carrier measurements for 9 GPS L1 C/A signals over a half hour interval.

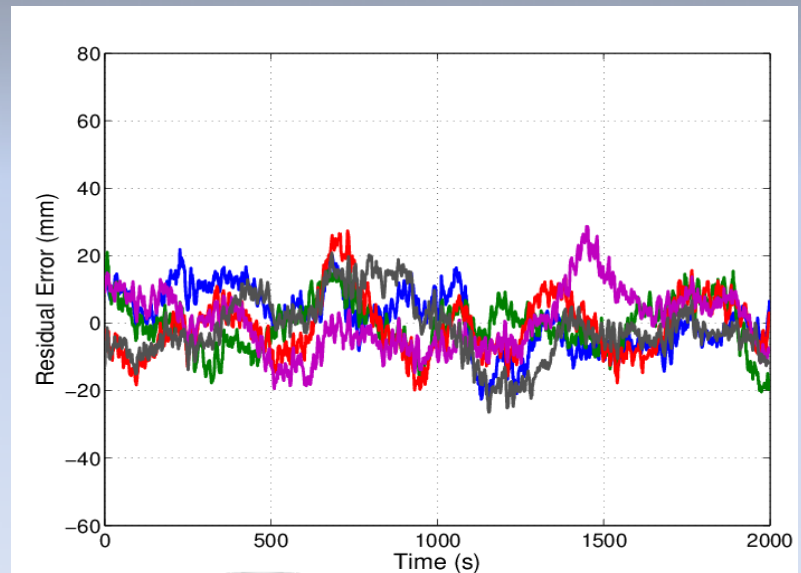
Primary Challenge: Large Time-Correlated Multipath Errors

Phase Residuals
Survey-Grade Antenna



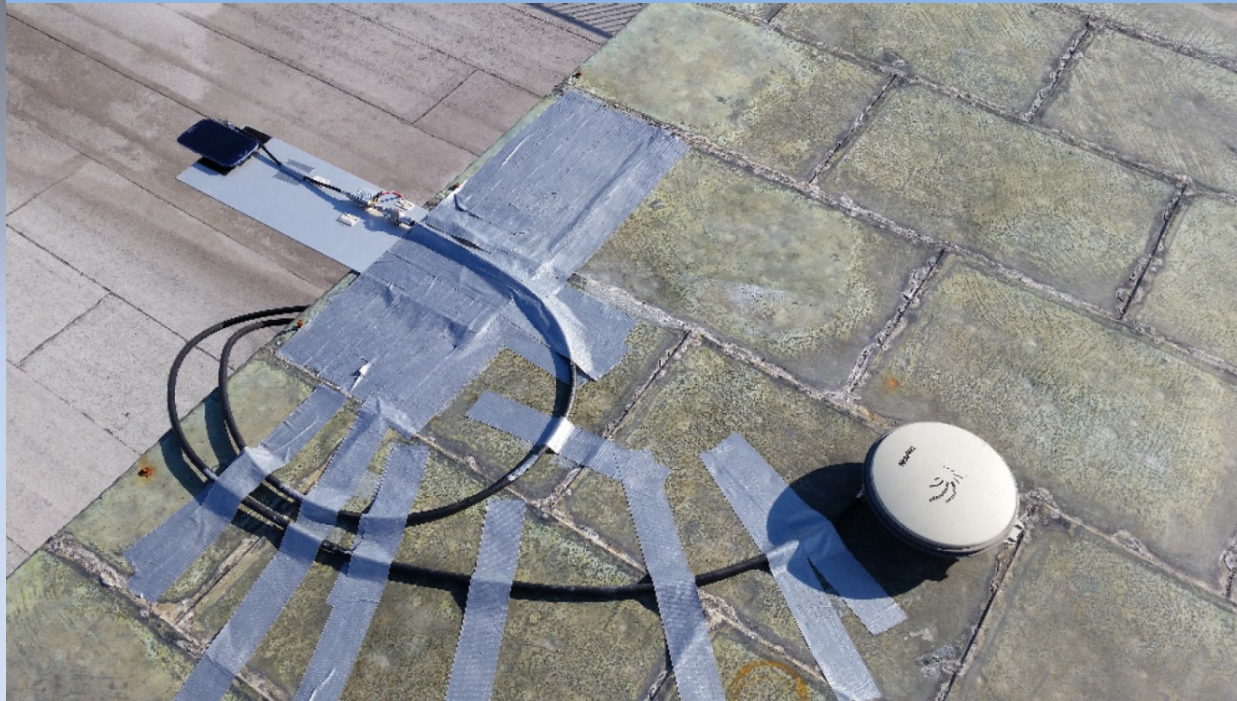
Undifferenced std:
1.7 mm

Phase Residuals
Smartphone Antenna

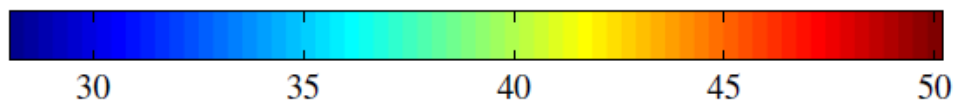
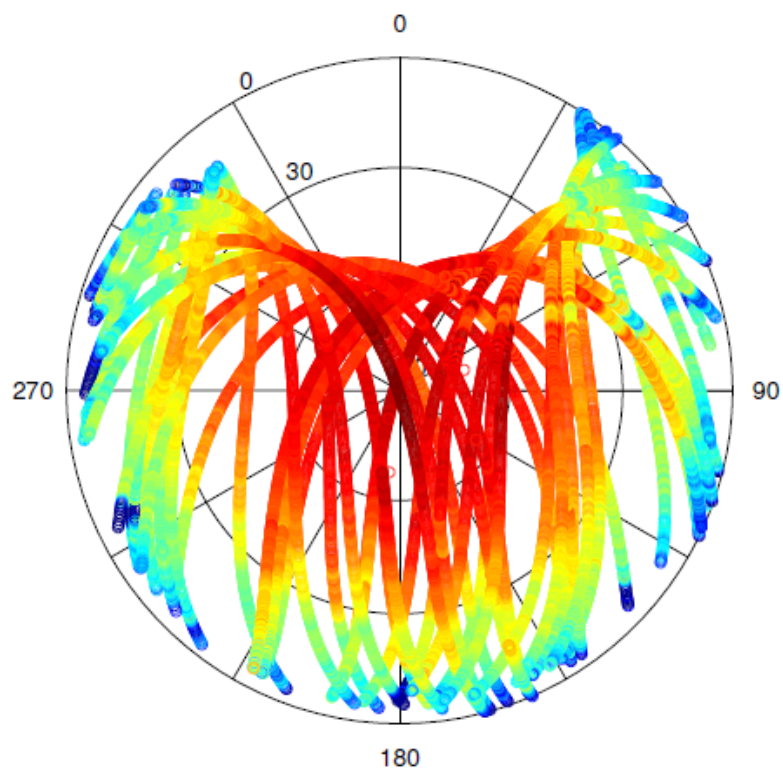


Undifferenced std:
5.2 mm

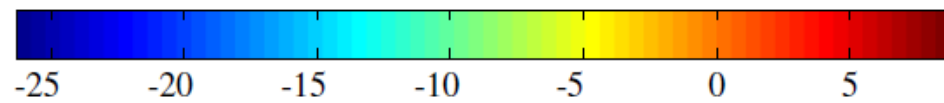
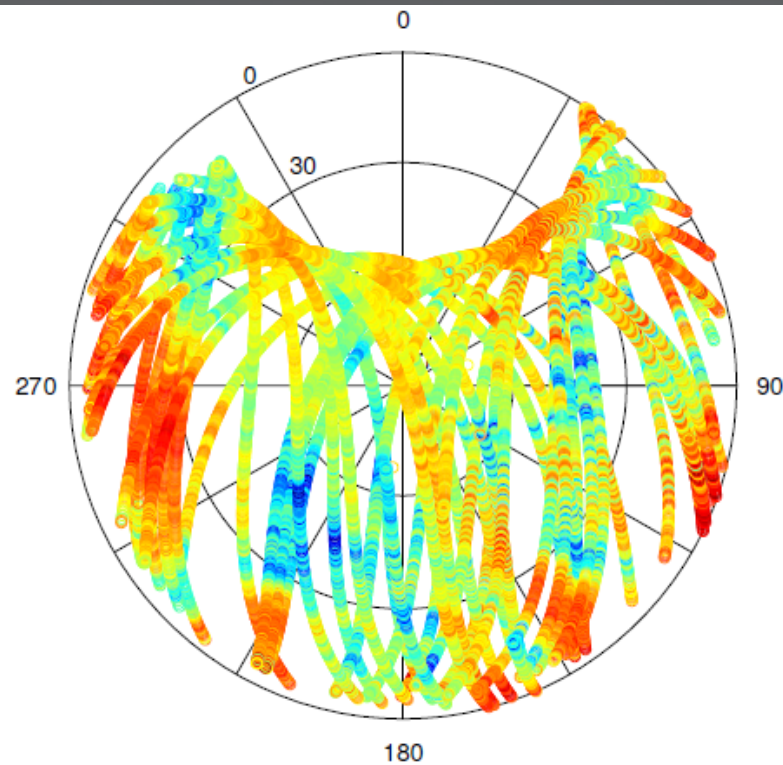
Q: Is the phone antenna's irregular gain pattern to blame for the outlier DD phase measurements?



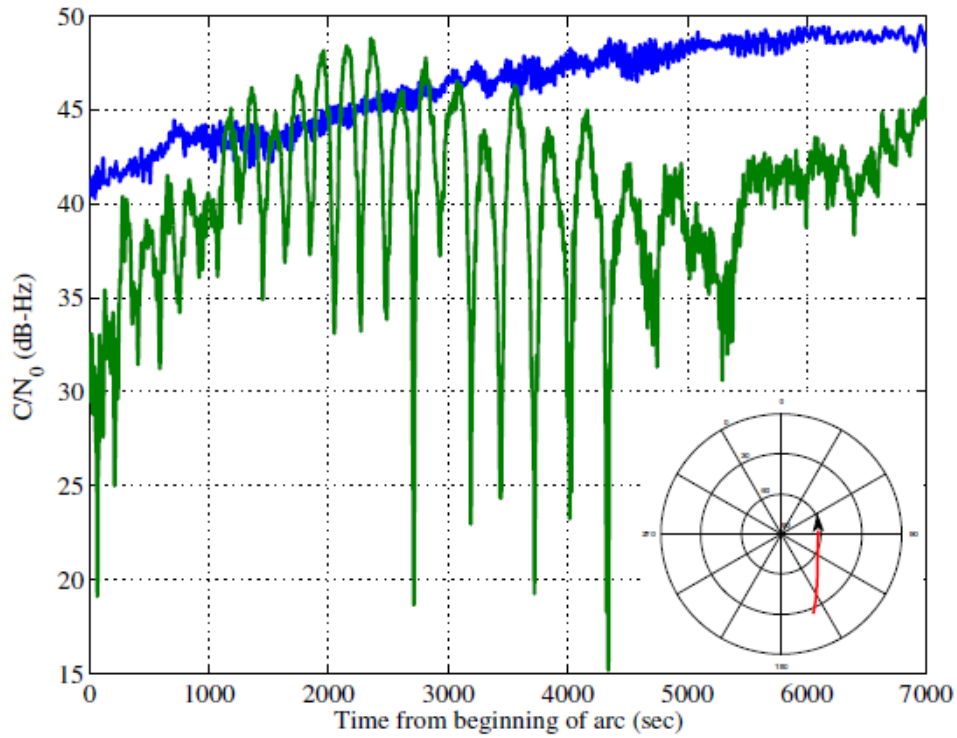
Experimental setup for Galaxy S3 gain pattern analysis



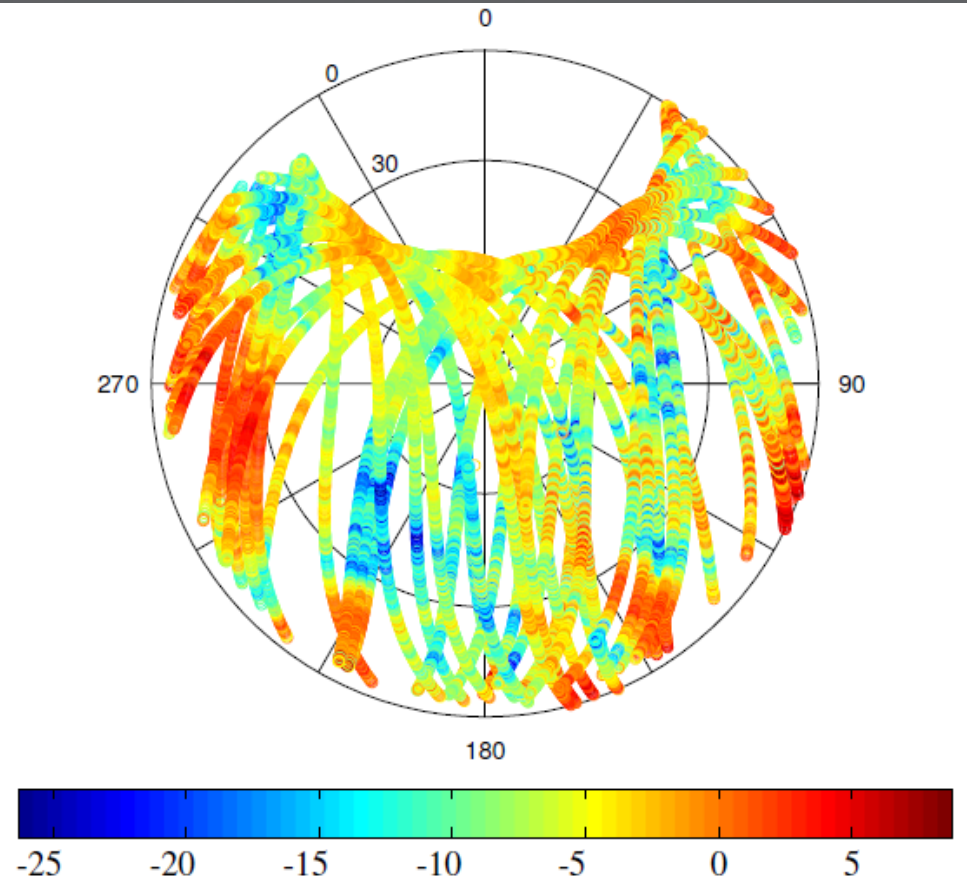
NovAtel Pinwheel C/N0 skyplot



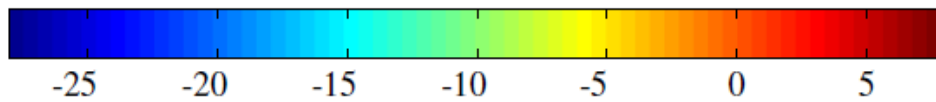
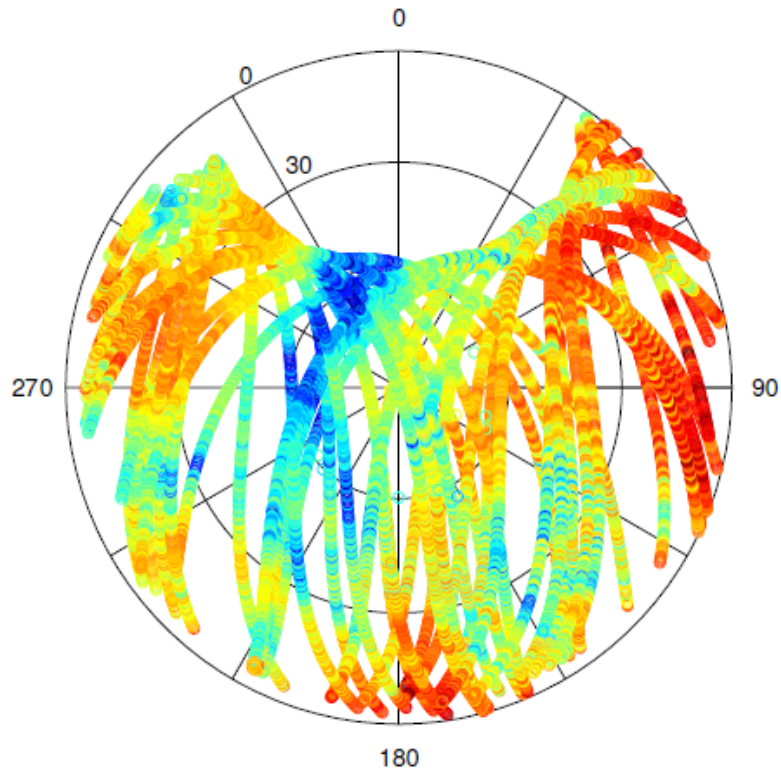
Galaxy S3 relative C/N0 skyplot



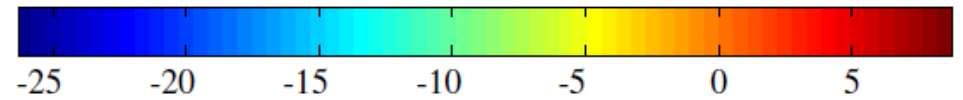
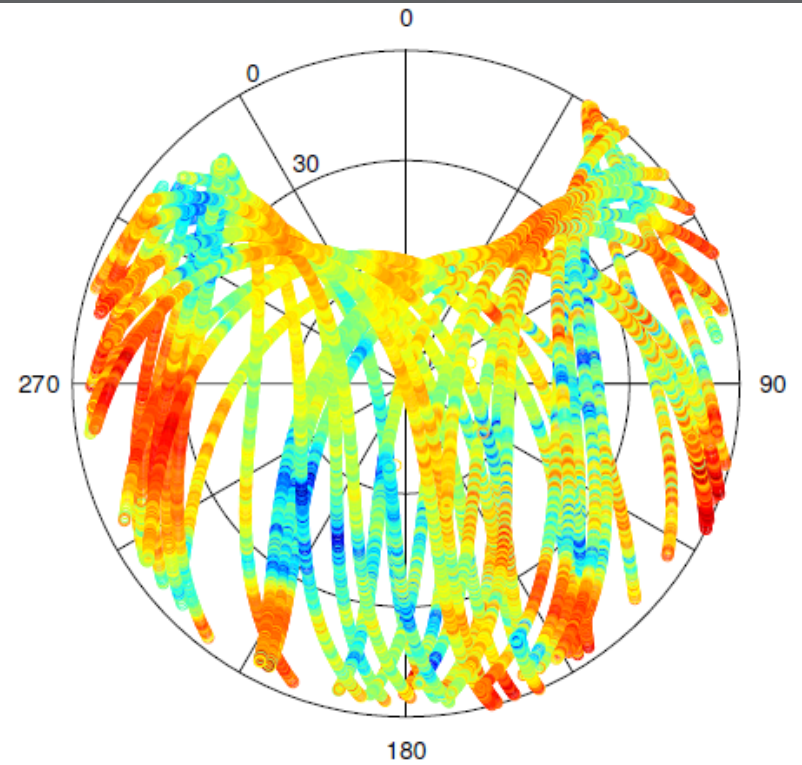
S3 (green) and Pinwheel (blue) C/N₀ traces over the indicated arc



Galaxy S3 relative C/N₀ skyplot



Phone moved a few cm to the east: relative C/N0 skyplot remarkably different, suggesting it's dominated by multipath



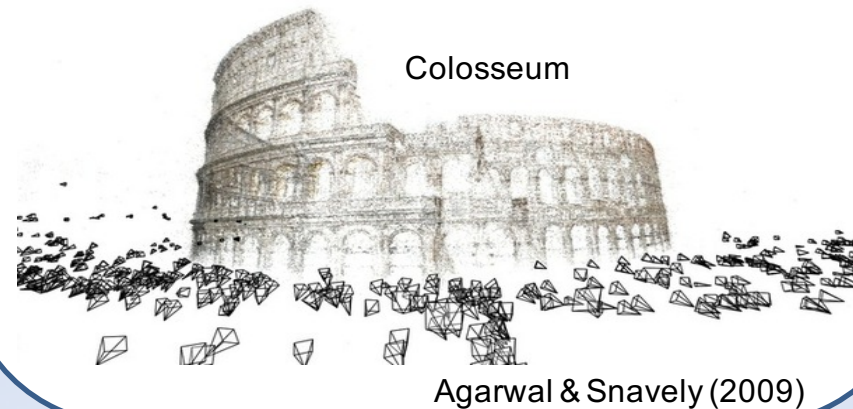
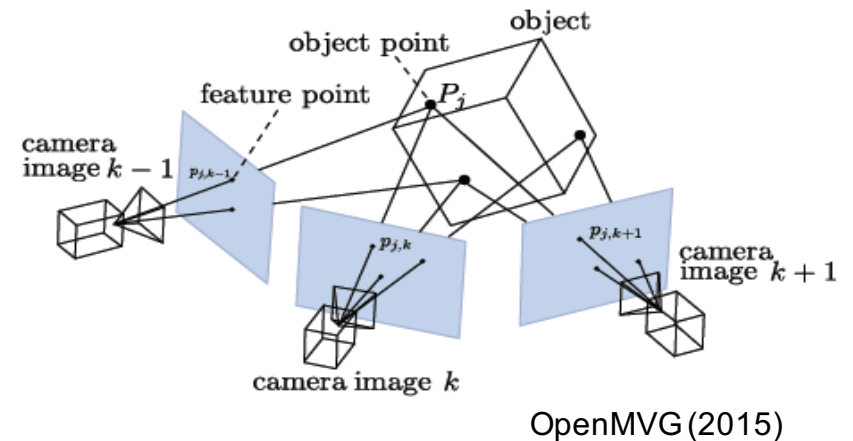
Galaxy S3 relative C/N0 skyplot

But our smartphone also has a camera ...



... what could we do with the camera?

Over the past 15 years, the computer vision community has made stunning advances in what is variously known as structure from motion (SFM), photogrammetry, and Vision-based Simultaneous Localization and mapping (VSLAM)





Extending the SFM technique, we optimally fuse camera images and GNSS phase measurements to shorten time to fix *and* create geo-referenced 3D maps

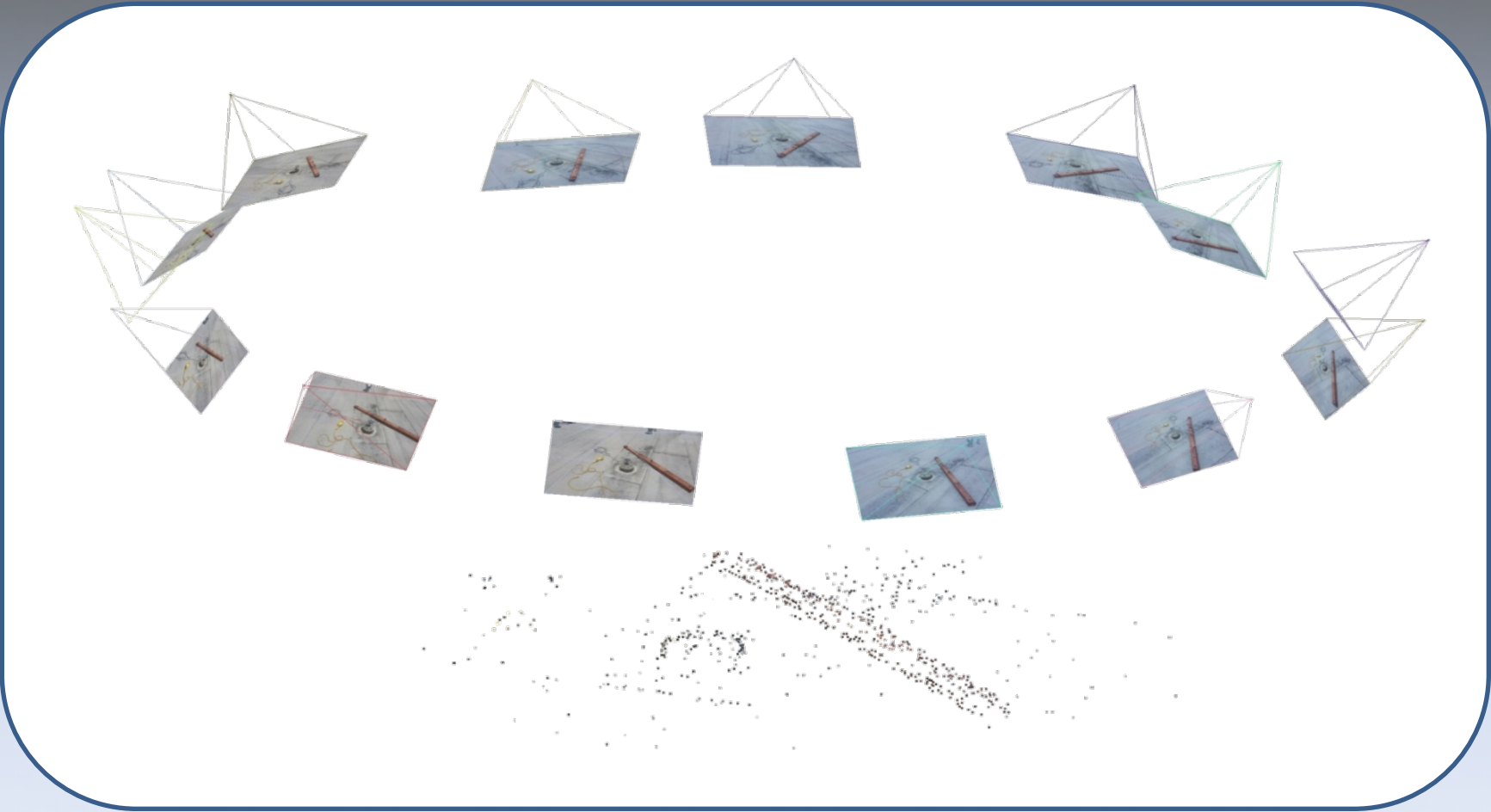




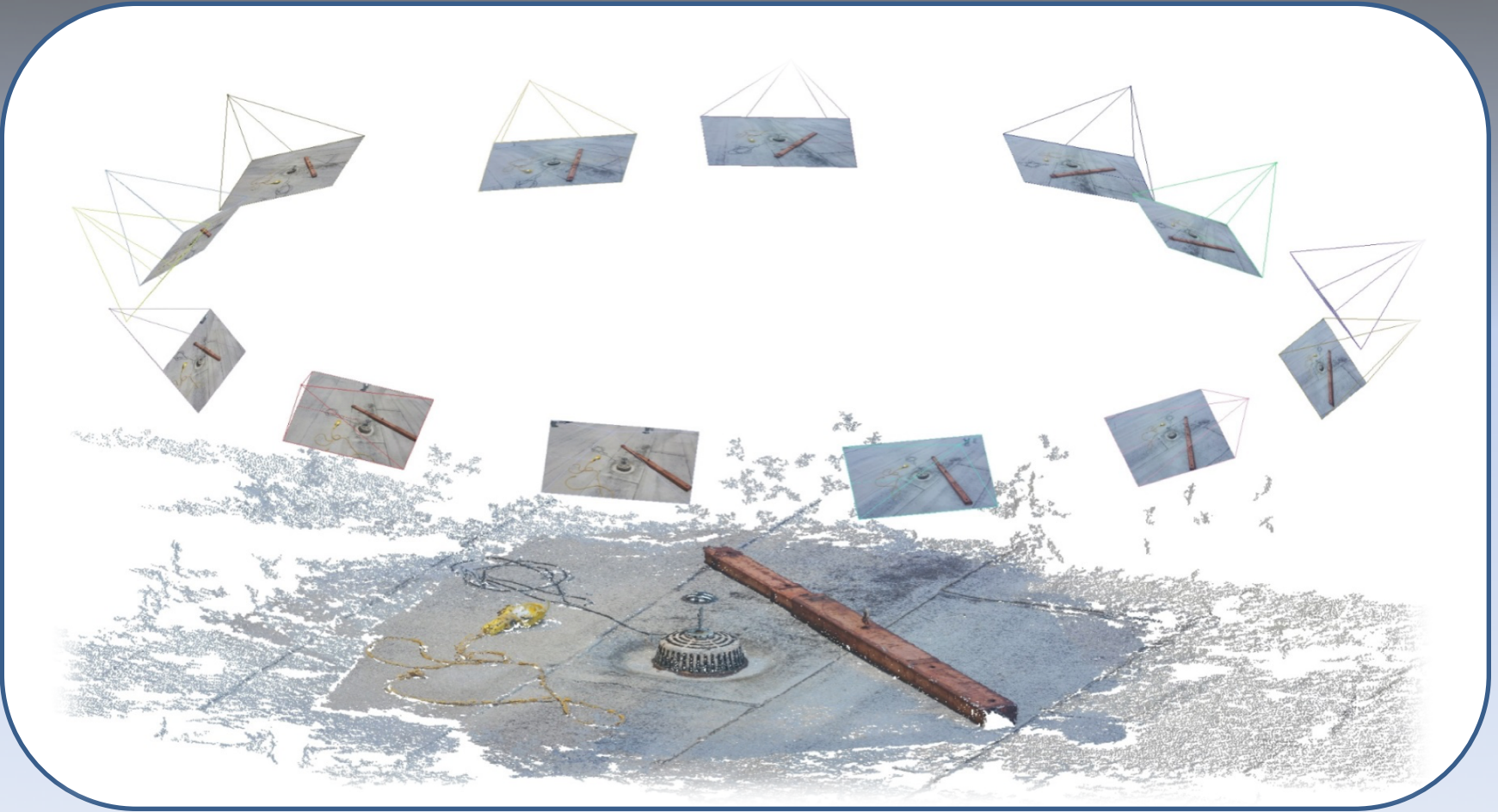


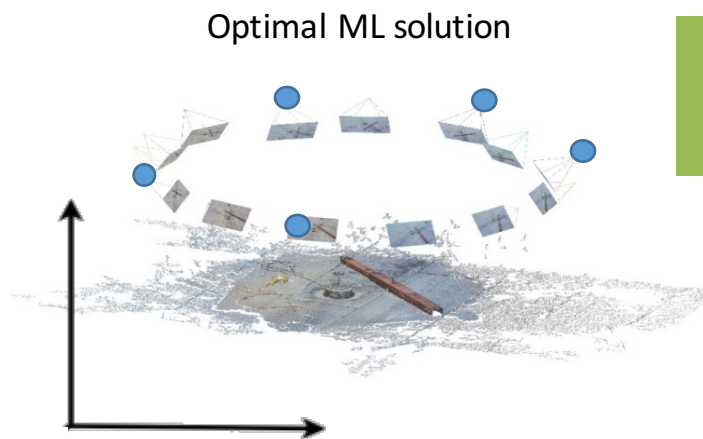


Sparse 3D Reconstruction



Dense 3D Reconstruction





Resulting 3D point cloud is referenced to ITRF

Jointly fuse GNSS carrier phase and vision measurement in the same non-linear estimator:

$$f_{\text{NL}}(\mathbf{X}_{BA}) = \sum_{i=1}^L \left[\left\| R_{y_{\phi,i}^k}^{-1/2} \left(\mathbf{y}_{\phi,i} - \mathbf{h}_{\phi} \left(\mathbf{x}_{\mathcal{G}}^{C_i}, \mathbf{q}_{\mathcal{G}}^{C_i}, \mathbf{N} \right) \right) \right\|^2 + \sum_{j=1}^M \left\| R_{y_i^{P_j}}^{-1/2} \left(\mathbf{y}_i^{P_j} - \mathbf{h}_y \left(\mathbf{x}_{\mathcal{G}}^{C_i}, \mathbf{q}_{\mathcal{G}}^{C_i}, \mathbf{x}_{\mathcal{G}}^{P_j} \right) \right) \right\|^2 \right]$$

Labels and arrows in the diagram:
 - **Phase Measurements**: points to $\mathbf{y}_{\phi,i}$
 - **CDGNSS Integer Ambiguities**: points to \mathbf{N}
 - **Camera Positions**: points to $\mathbf{x}_{\mathcal{G}}^{C_i}$
 - **Camera Orientations**: points to $\mathbf{q}_{\mathcal{G}}^{C_i}$
 - **Vision Measurements**: points to $\mathbf{y}_i^{P_j}$
 - **Point Feature Positions**: points to $\mathbf{x}_{\mathcal{G}}^{P_j}$

Our technique preserves both the *sparsity* of bundle adjustment and the *integerness* of the carrier phase ambiguities



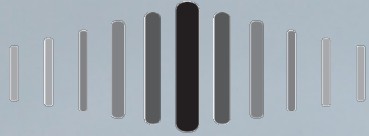


Point #392758

P#392758: (-24.280500;-3.722230;-7.438940)
Normal: (0.460726;0.513380;0.723998)
Color: (94;117;136)

Result: A globally-referenced 3D point cloud accurate to better than 1 cm

Position	East	North	Up
VISRTK+MVS	-24.280	-3.722	-7.438
CDGNSS	-24.278	-3.721	-7.440
Difference	-0.002	-0.001	0.002
Expected Std.	0.004	0.008	0.005



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