



Improved GPS Carrier Phase Tracking in Difficult Environments Using Vector Tracking Approach

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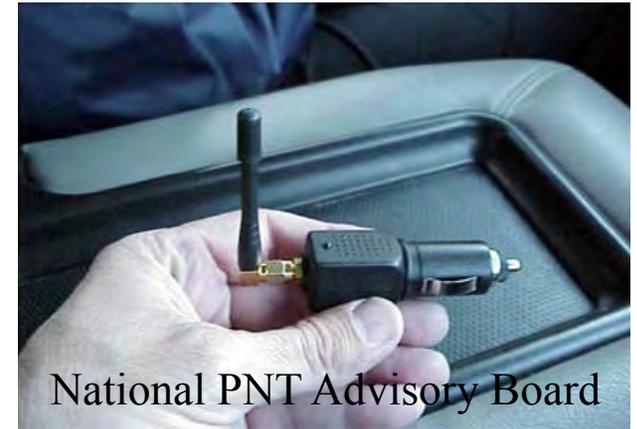
Presentation Overview

- Introduction
 - Motivation
 - Prior Art
- Software Receiver Architecture
 - Scalar and Vector Tracking
 - Vector Aided Phase Lock Loops
- Experimental Setup
 - GPS Front End
 - Data Collection Environments
- Results
 - Tracking Performance
 - Carrier Phase Accuracy
 - Comparison to COTS Receiver
- Conclusion and Future Work



Motivation

- Provide accurate and reliable carrier phase measurements in difficult environments
- Environmental Factors
 - Low power jamming
 - Heavy foliage
 - Urban canyons
- Applications
 - Any scenario requiring high accuracy positioning in environments where GPS carrier phase tracking is difficult
 - Precision mapping unexploded ordnance
 - Autonomous vehicle operation
 - Precision agriculture





Prior Art

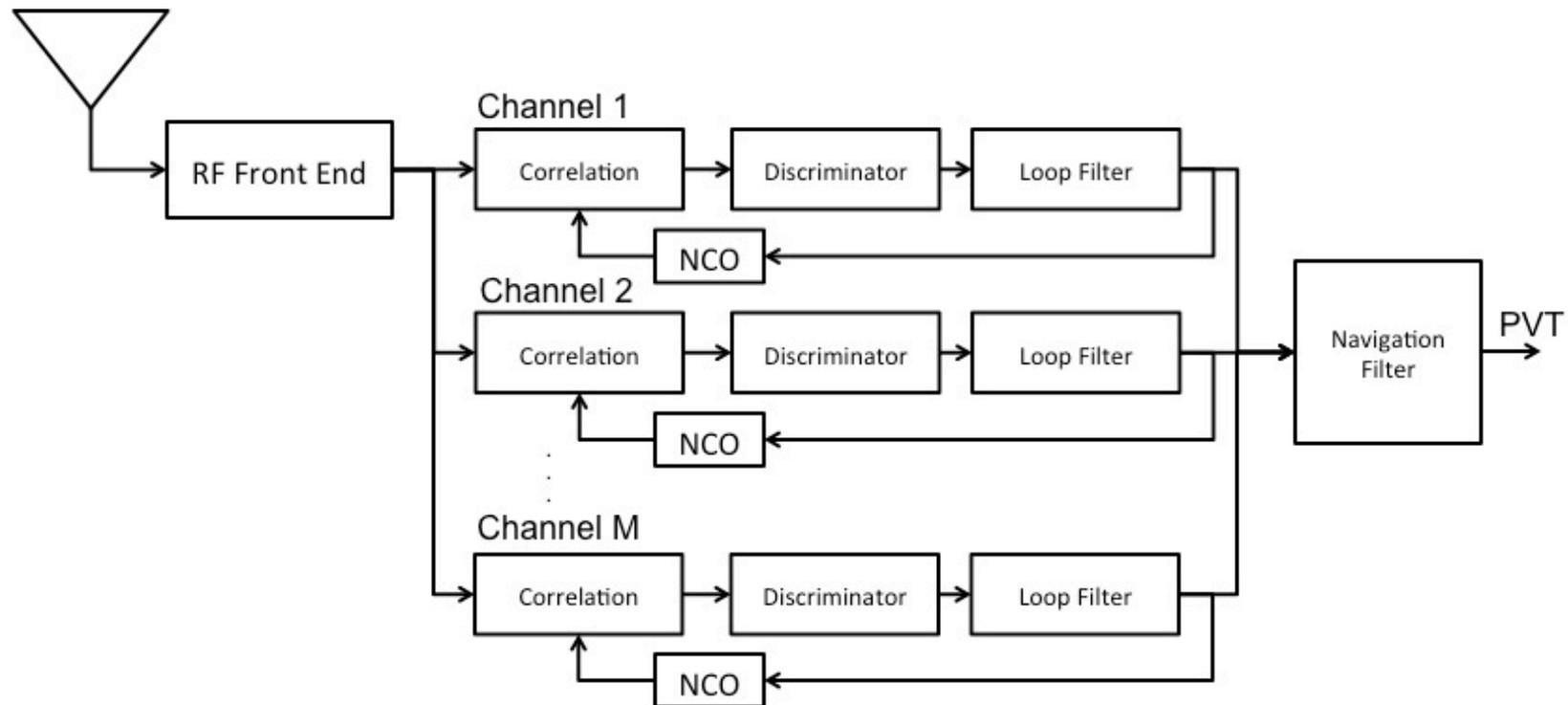
Previous Improved Tracking Approaches

- Vector delay lock loop – Spilker 1996
- Vector delay and frequency lock loop – Pany 2006, Lashley 2010
- Carrier phase tracking in weak signals – Petovello, Driscoll, Lachapelle 2008
- Deep Integration – Crane 2007, Soloviev 2007, Groves 2007
- Vector FLL Aided Carrier Tracking – Kiesel 2008



Traditional Scalar Receiver

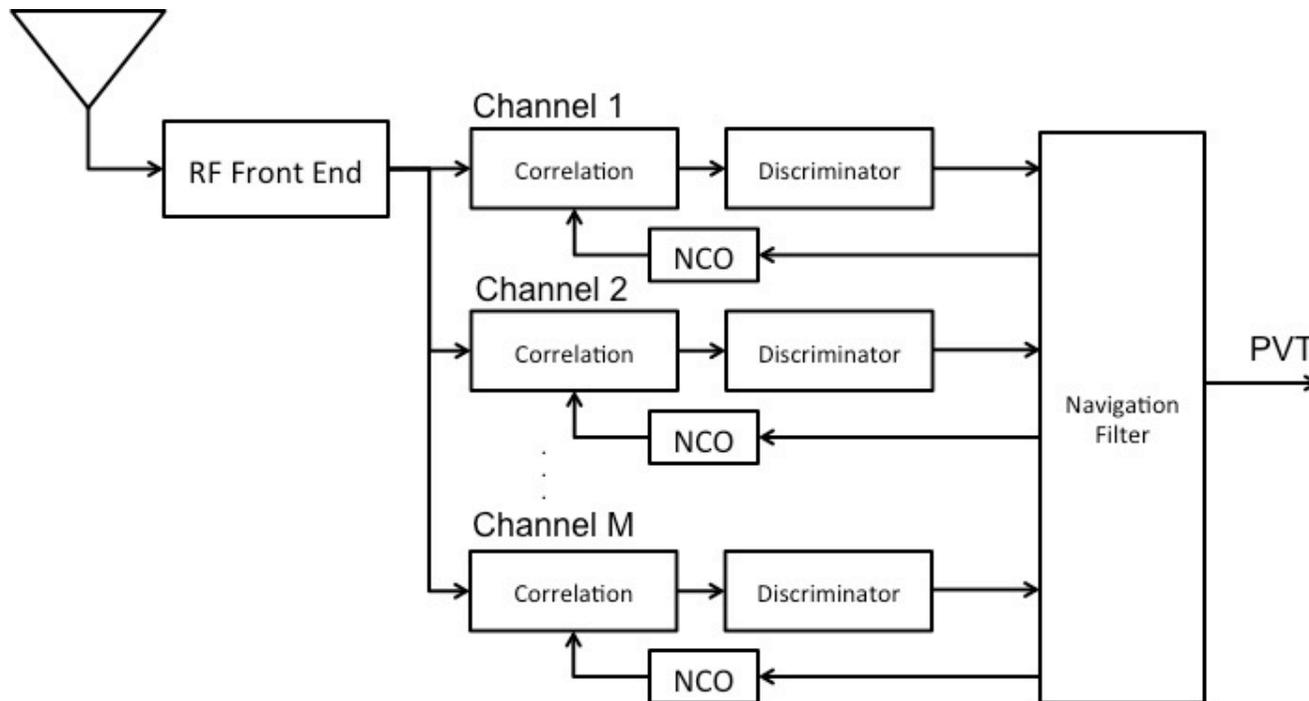
- Each channel code and carrier NCO controlled by individual loop filter
- No feedback from the navigation processor





Vector Tracking Receiver

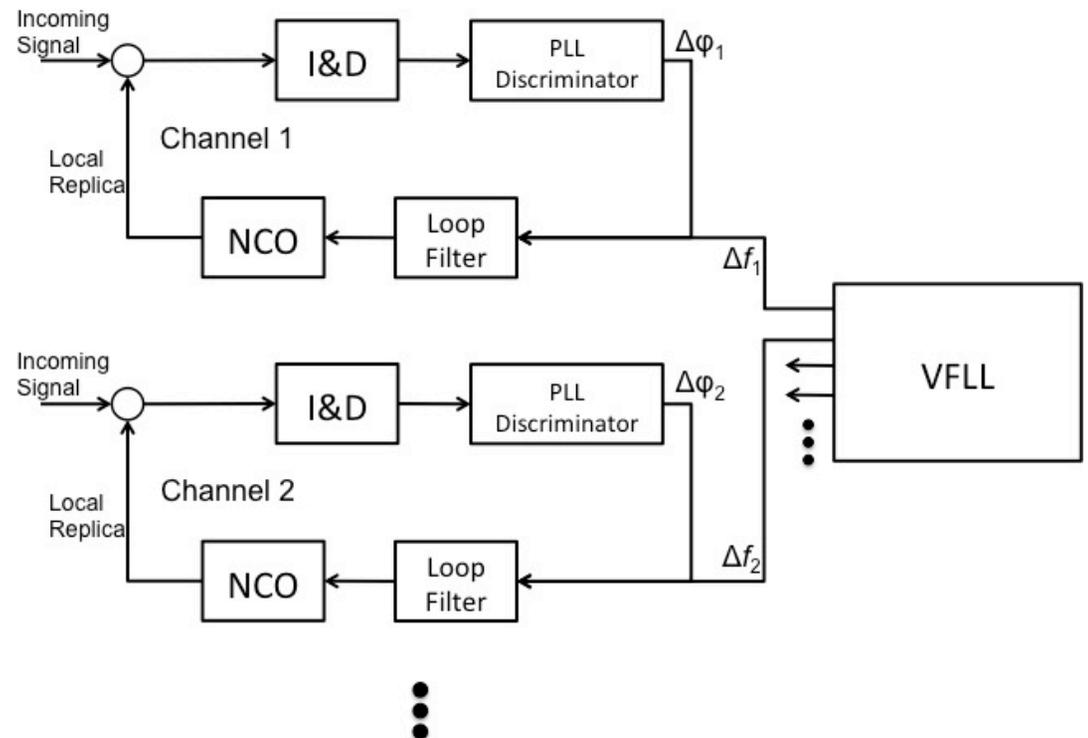
- Individual loop filters replaced by feedback from navigation processor
- Position, Velocity, and Clock estimates used to predict code phase and carrier frequency
- Estimates updated with discriminator outputs





Vector FLL Aiding

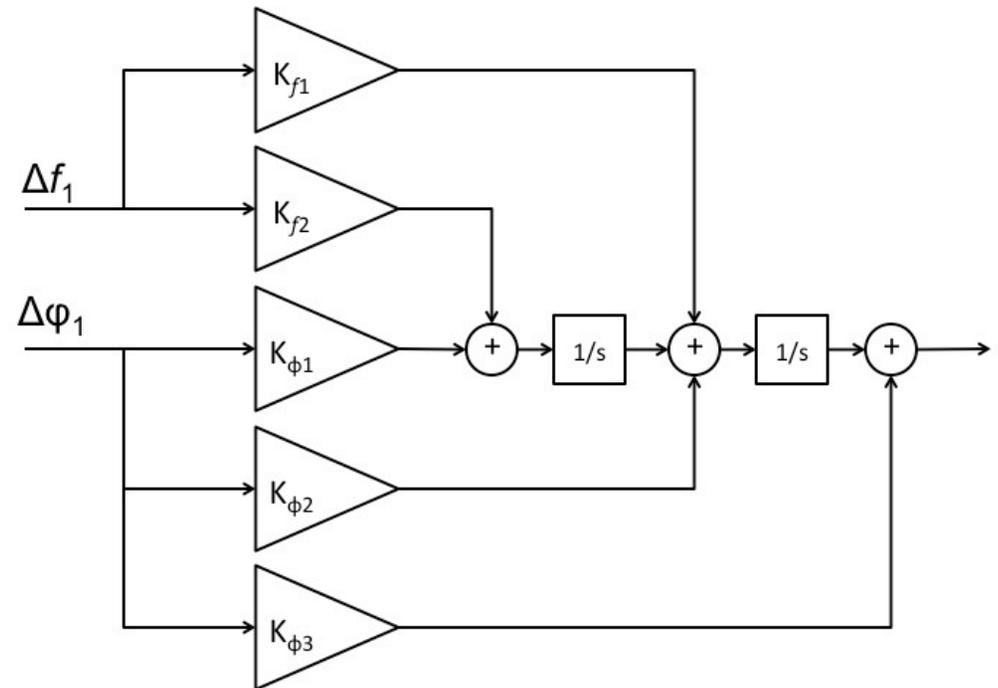
- Combine robustness of VPLL with accuracy of PLL
- Velocities estimates from navigation Kalman filter estimate carrier frequency
- Feedback estimated carrier frequency discriminator
- Fused in loop filter with scalar PLL discriminator to update carrier NCO
- VDLL used to drive code NCO for robust code tracking





FLL-Assisted PLL

- Second Order FLL-Assisted PLL Loop Filter [Ward]
- FLL robust to line of sight dynamics, PLL improved accuracy
- PLL discriminator two quadrant arc tangent
- VFLL discriminator estimates using state estimates
- Gains are a function of loop bandwidth
 - $Bn_f = 4$ Hz
 - $Bn_p = 18$ Hz
- Longer integration periods cause discrepancy between desired bandwidth and actual bandwidth in digital implementation





Kalman Filter Propagation

- Error state Kalman filter estimating position, velocity, clock bias and drift
- Unmodeled receiver dynamics assumed zero mean tuning parameters ($\sigma^2=2\text{m}^2/\text{s}^4$)
- Clock disturbance model based on [Brown] ($\sigma_b^2=c^2 \times 10^{-19}$, $\sigma_r^2=4\pi c^2 \times 10^{-20}$)

$$\mathbf{X} = [\delta x \quad \delta \dot{x} \quad \delta y \quad \delta \dot{y} \quad \delta z \quad \delta \dot{z} \quad \delta c_b \quad \delta \dot{c}_b]^T$$

$$\mathbf{X}(k+1) = A_d \mathbf{X}(k)$$

$$P(k+1) = A_d P(k) A_d^T + Q_d$$

$$A_d = \begin{bmatrix} \alpha_d & 0_{2 \times 2} & 0_{2 \times 2} & 0_{2 \times 2} \\ 0_{2 \times 2} & \alpha_d & 0_{2 \times 2} & 0_{2 \times 2} \\ 0_{2 \times 2} & 0_{2 \times 2} & \alpha_d & 0_{2 \times 2} \\ 0_{2 \times 2} & 0_{2 \times 2} & 0_{2 \times 2} & \alpha_d \end{bmatrix}$$

$$Q_d = \begin{bmatrix} Q_x & 0_{2 \times 2} & 0_{2 \times 2} & 0_{2 \times 2} \\ 0_{2 \times 2} & Q_y & 0_{2 \times 2} & 0_{2 \times 2} \\ 0_{2 \times 2} & 0_{2 \times 2} & Q_z & 0_{2 \times 2} \\ 0_{2 \times 2} & 0_{2 \times 2} & 0_{2 \times 2} & Q_c \end{bmatrix}$$

$$\alpha_d = \begin{bmatrix} 1 & T \\ 0 & 1 \end{bmatrix} \quad Q_x = Q_y = Q_z = \begin{bmatrix} \sigma^2 \frac{T^3}{3} & \sigma^2 \frac{T^2}{2} \\ \sigma^2 \frac{T^2}{2} & \sigma^2 T \end{bmatrix} \quad Q_c = \begin{bmatrix} \sigma_b^2 T + \sigma_r^2 \frac{T^3}{3} & \sigma_r^2 \frac{T^2}{2} \\ \sigma_r^2 \frac{T^2}{2} & \sigma_r^2 T \end{bmatrix}$$



Kalman Filter Measurements

$$I(k, \tau) = AR(\epsilon + \tau)D(k) \cos(\pi f_{err}T + \theta_{err}) + \eta_{IE}(k)$$
$$Q(k, \tau) = AR(\epsilon + \tau)D(k) \sin(\pi f_{err}T + \theta_{err}) + \eta_{QE}(k)$$

- Range residuals (ϵ_r) calculated using early minus late power discriminator [Crane]
- Range rate residuals (ϵ_{rr}) calculated using carrier frequency and carrier frequency discriminator

$$Y_R = IE^2 + QE^2 - IL^2 - QL^2$$

$$Y_R = \frac{A^2 2\epsilon_r}{\beta} + \eta$$

$$\epsilon_r = \frac{Y_R \beta}{A^2 2}$$

$$\Delta f = \tan^{-1} \left(\frac{IP_1 QP_2 - IP_2 QP_1}{IP_1 IP_2 + QP_1 QP_2} \right)$$

$$\tilde{\rho} = (f_{IF} - f_{carr} - \Delta f) \lambda_{L1}$$

$$\epsilon_{rr} = \tilde{\rho} - \hat{\rho}$$



Kalman Measurement Covariance

- Range and range rate residual covariance is calculated as a function of C/N_0
- C/N_0 estimated by compared amplitude estimates from early and late correlators to noise variance estimates from noise correlators

$$E\{v_r^2\} = \frac{\beta^2 \left(1 + 2T \frac{C}{N_0}\right)}{2T \frac{C}{N_0}} \left(\frac{\rho_e^2}{\beta^2} + \frac{1}{4}\right) \quad E\{v_{rr}^2\} = \frac{2 + 2R^2(\rho_e)T \frac{C}{N_0}}{T \frac{C}{N_0}} \left(\frac{1}{\pi T}\right)^2$$

$$\frac{C}{N_0} = 10 \log_{10} \left(\frac{A^2}{\eta^2}\right)$$

$$\tilde{A}^2 = (IE + IL)^2 + (QE + QL)^2$$

$$A^2 = \tilde{A}^2 - 4\eta^2$$



Kalman Filter Correction

- Measurement vector of range and range rate residuals
- Measurement matrix unit vectors defining satellite geometry
- Diagonal covariance matrix from variance of measurement noise
- Best estimates at the end of a correction step are used to calculate code phase for the code NCO and carrier frequency discriminator for VFLL/PLL loop filter

$$H = \begin{bmatrix} a_{x,1} & 0 & a_{y,1} & 0 & a_{z,1} & 0 & 1 & 0 \\ 0 & a_{x,1} & 0 & a_{y,1} & 0 & a_{z,1} & 0 & 1 \\ \vdots & \vdots \\ a_{x,m} & 0 & a_{x,m} & 0 & a_{x,m} & 0 & 1 & 0 \\ 0 & a_{x,m} & 0 & a_{x,m} & 0 & a_{x,m} & 0 & 1 \end{bmatrix} \quad z = \begin{bmatrix} \epsilon_{r_1} \\ \epsilon_{rr_1} \\ \vdots \\ \epsilon_{r_m} \\ \epsilon_{rr_m} \end{bmatrix}$$

$$\mathbf{X}(k)^+ = \mathbf{X}(k)^- + K(z - H\mathbf{X}(k)^-)$$

$$P(k)^+ = (I - KH)P(k)^-$$

$$R = \begin{bmatrix} E\{v_r^2\} & 0 & 0 \\ 0 & E\{v_{rr}^2\} & 0 \\ 0 & 0 & \ddots \end{bmatrix}$$



Software Receiver Operation

Vector Aided Receiver Architecture implemented in a software receiver for post process testing

- Acquisition
- Scalar Tracking
- Data Decoding and First Position
- Vector Tracking
- Pseudorange, Carrier Phase, C/N_0 , Doppler measurements output at 1 Hz



Experimental Data Collection

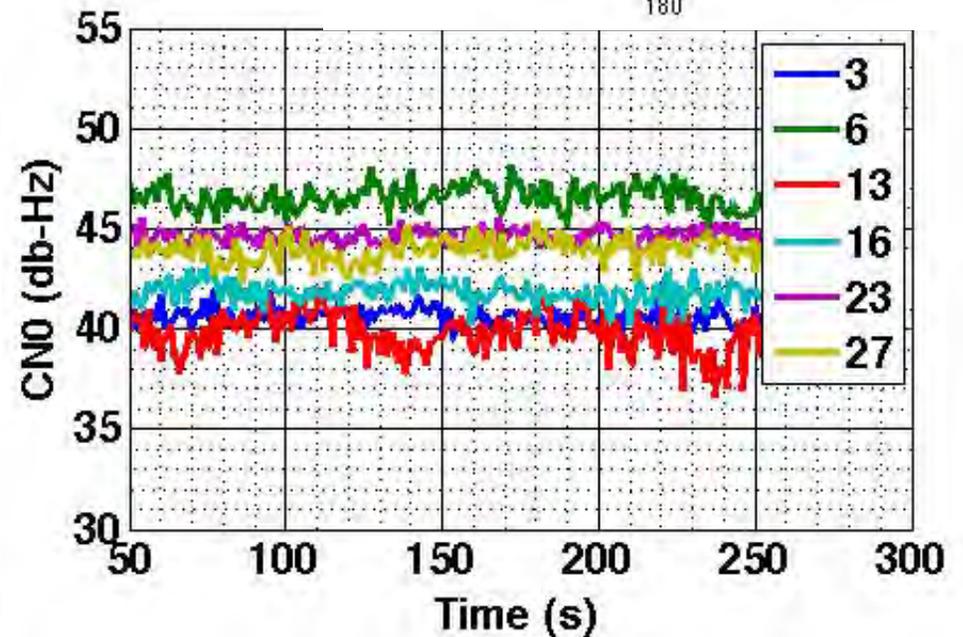
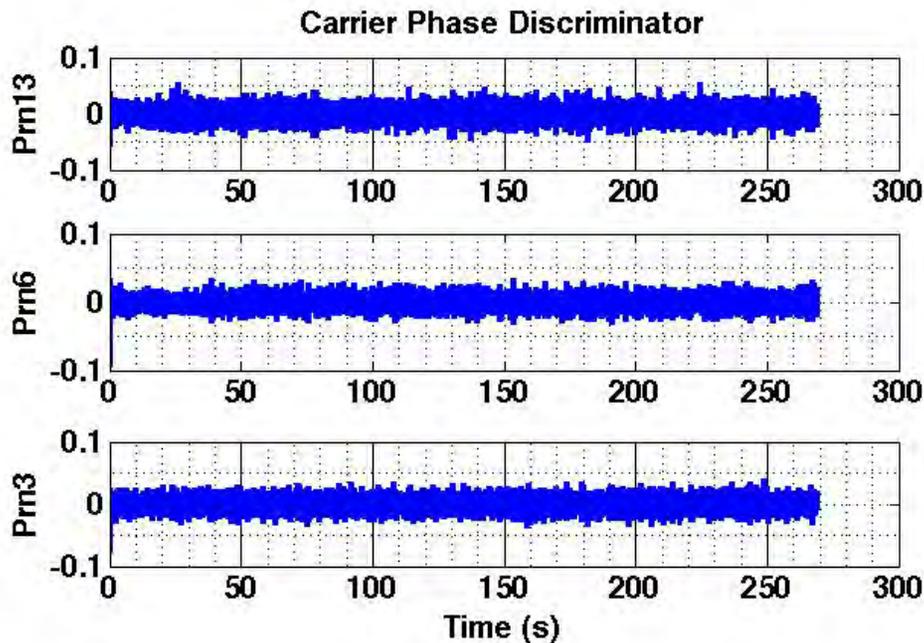
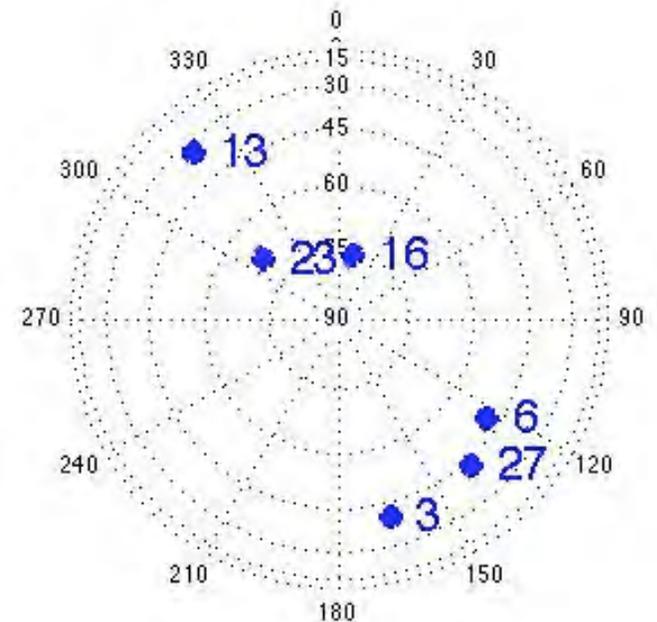
- Nordnav Rxx-2 IF Data Recorder
 - 2 Bit Samples 16.3676 MHz
 - IF Frequency 4.1304 MHz
 - Processed with Software Receiver
- Clear Sky Static and Dynamic Testing
- Dynamic Testing in Moderate and Heavy Foliage
- Reference Receivers
 - Septentrio Pola Rx
 - Novatel Propak V3 receivers





Tracking Static Scenario

- Static clear sky tracking of carrier phase
- Carrier discriminator shows errors less than 0.1 cycle



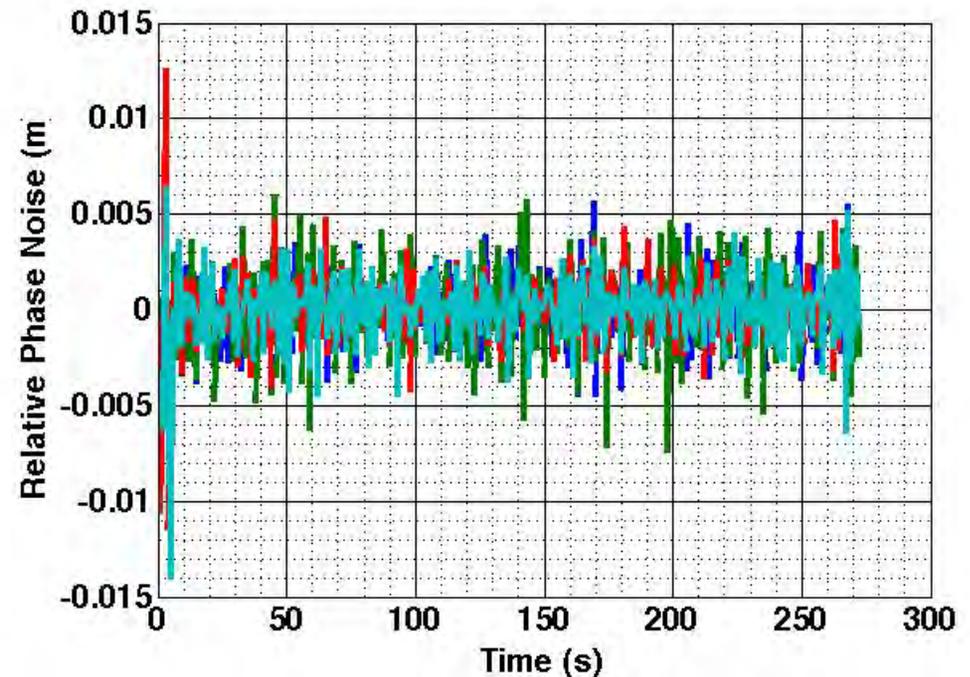
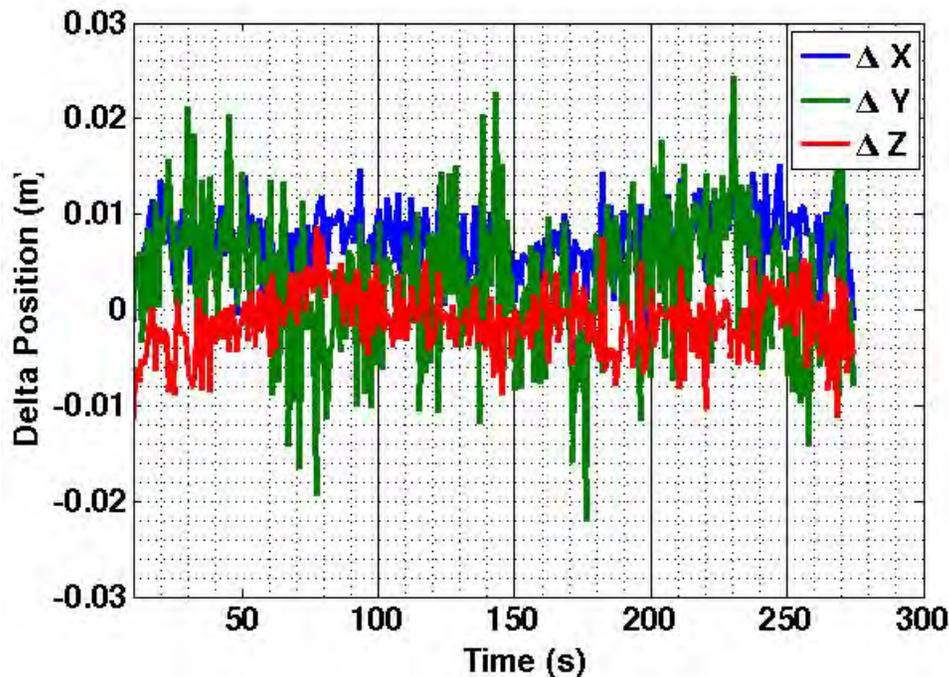


Accuracy Static Scenario

- Delta position estimates using carrier phase measurements millimeter level errors (left)
- Triple Difference [Misra, Enge] with Novatel receiver millimeter level errors (right)

$$\delta\phi_{ur}^{kl} = \phi_{ur}^{kl}(t_{i+1}) - \phi_{ur}^{kl}(t_i)$$

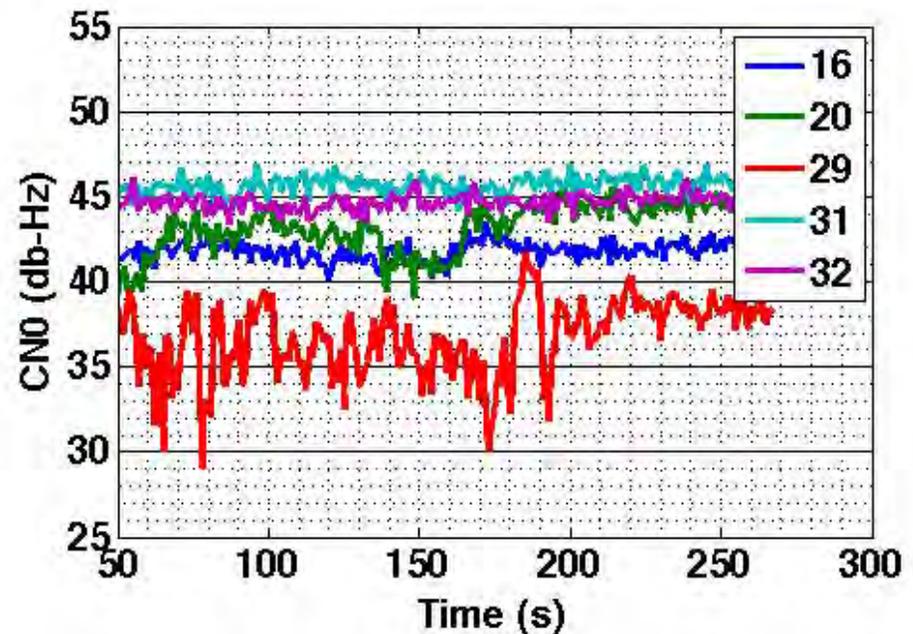
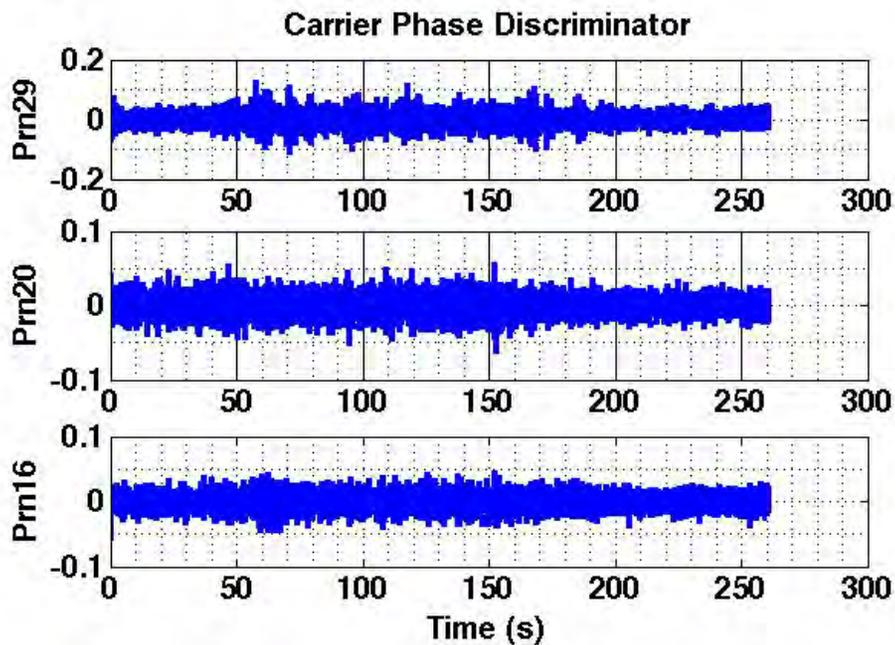
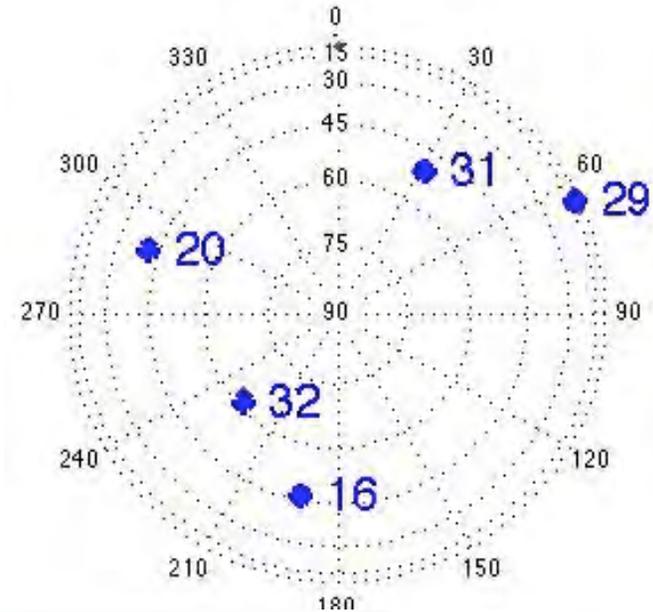
$$\delta\phi_{ur}^{kl} = \lambda^{-1}\delta r_{ur}^{kl} + \delta\varepsilon_{phi,ur}^{kl}$$





Tracking Dynamic Clear Sky

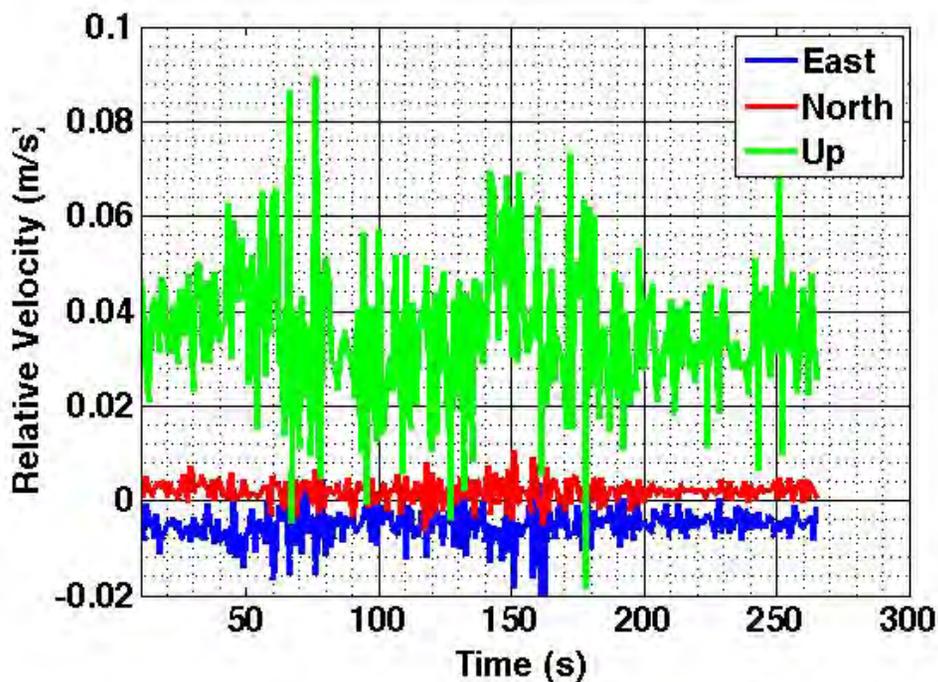
- Dynamic clear sky tracking of carrier phase
- Only 5 SV with one SV near horizon
- Carrier discriminators shows errors less than 0.1 cycle except SV29 which remains less than 0.2 cycle



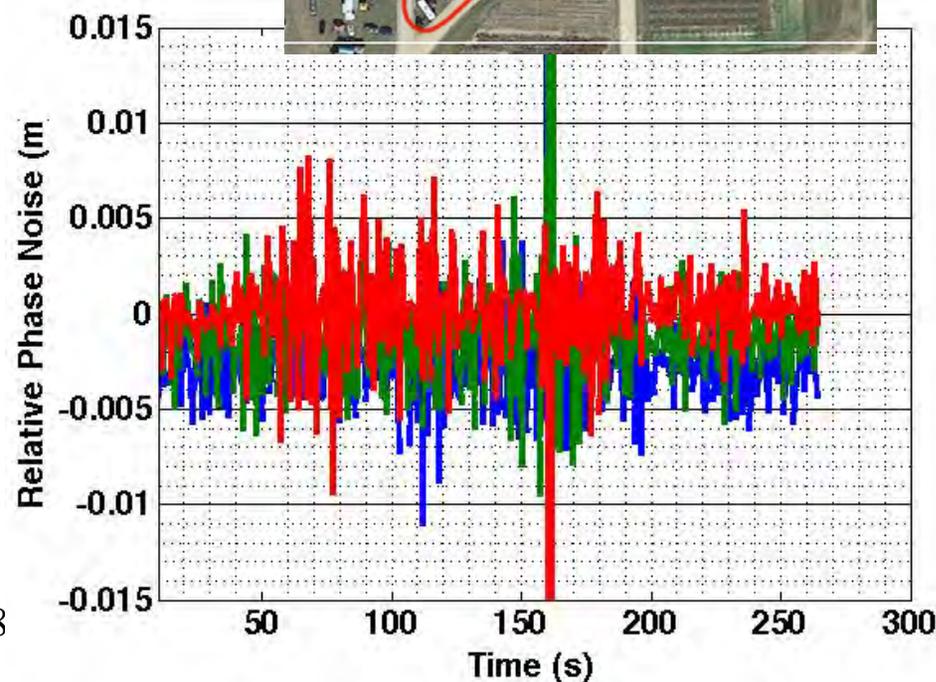


Accuracy Dynamic Clear Sky

- Delta position estimates using carrier phase measurements millimeter level errors (left)
- Time differenced double difference with Septentrio receiver millimeter level errors (right)



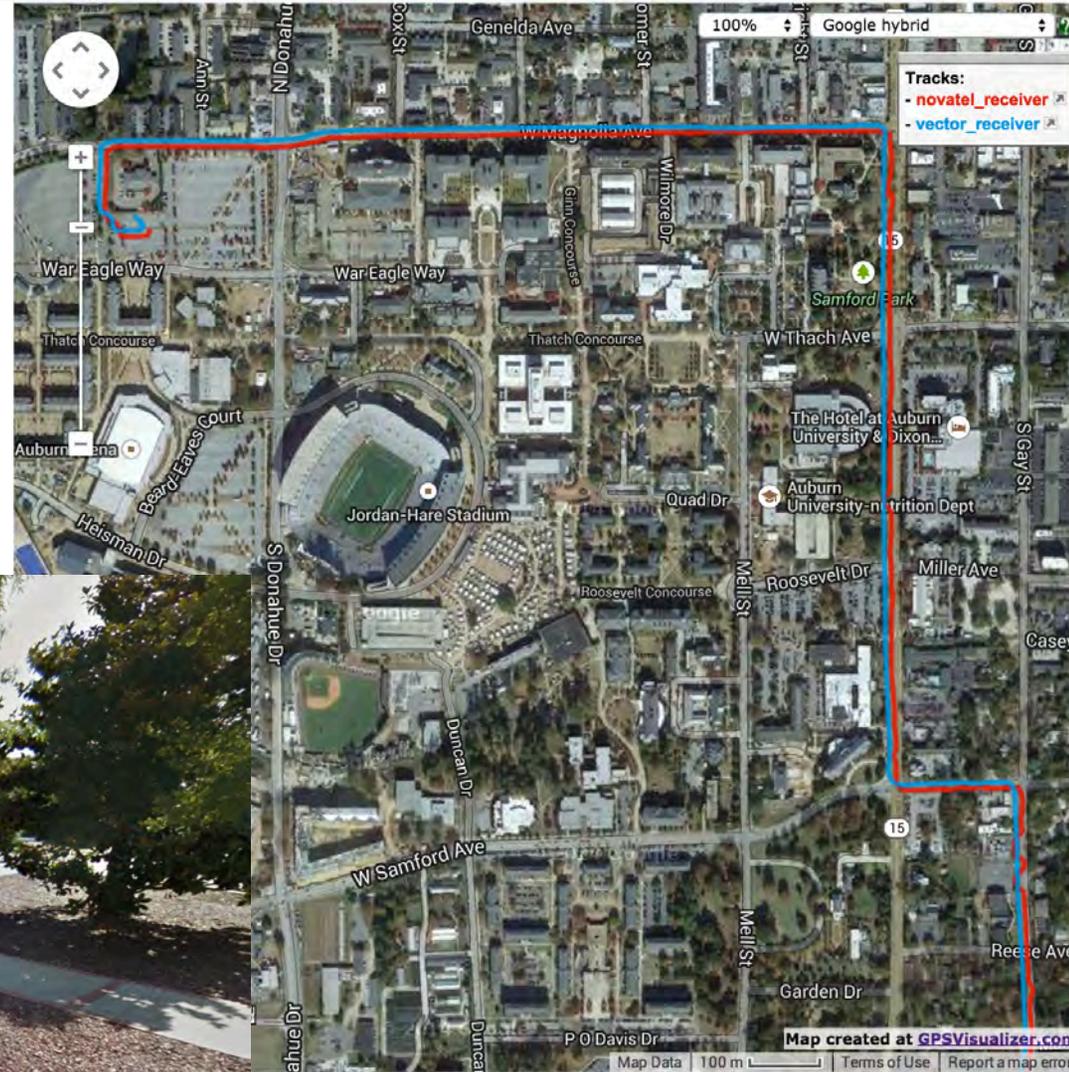
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Results Moderate Foliage

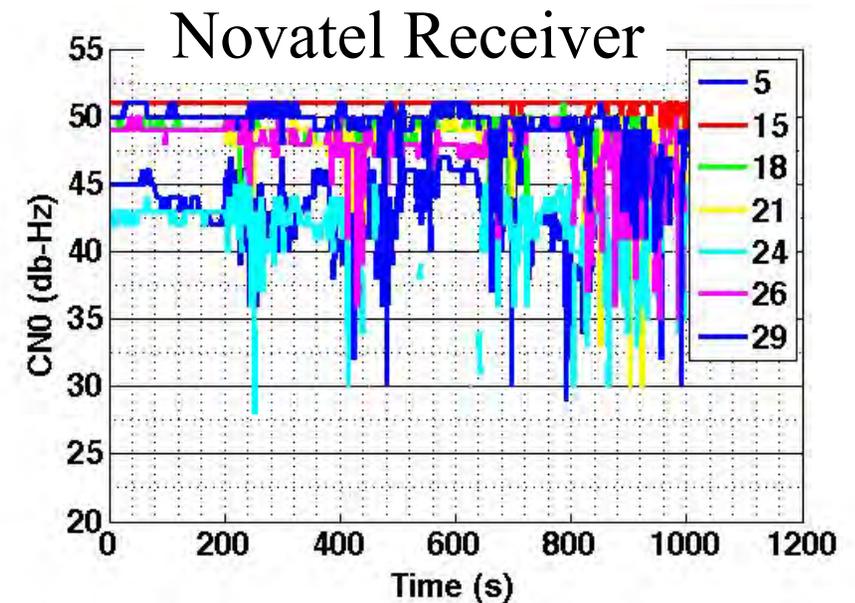
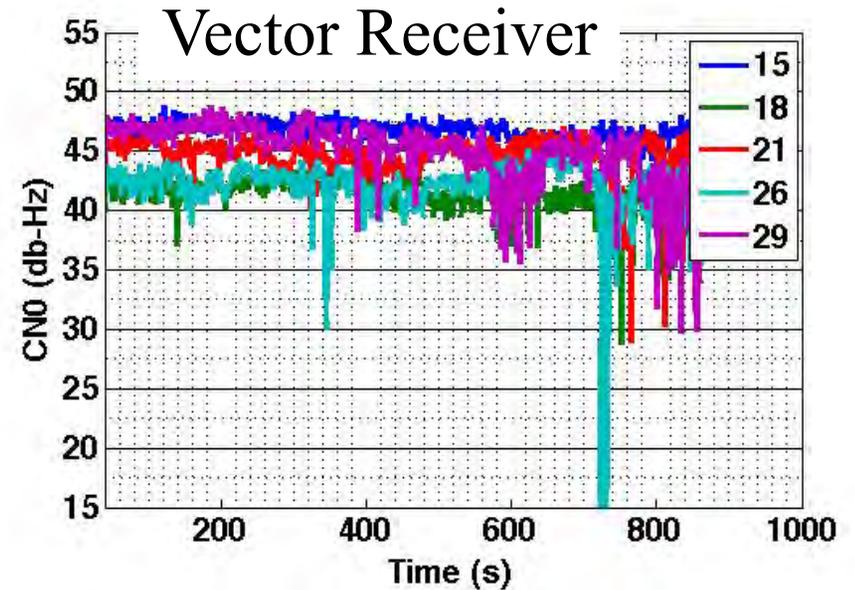
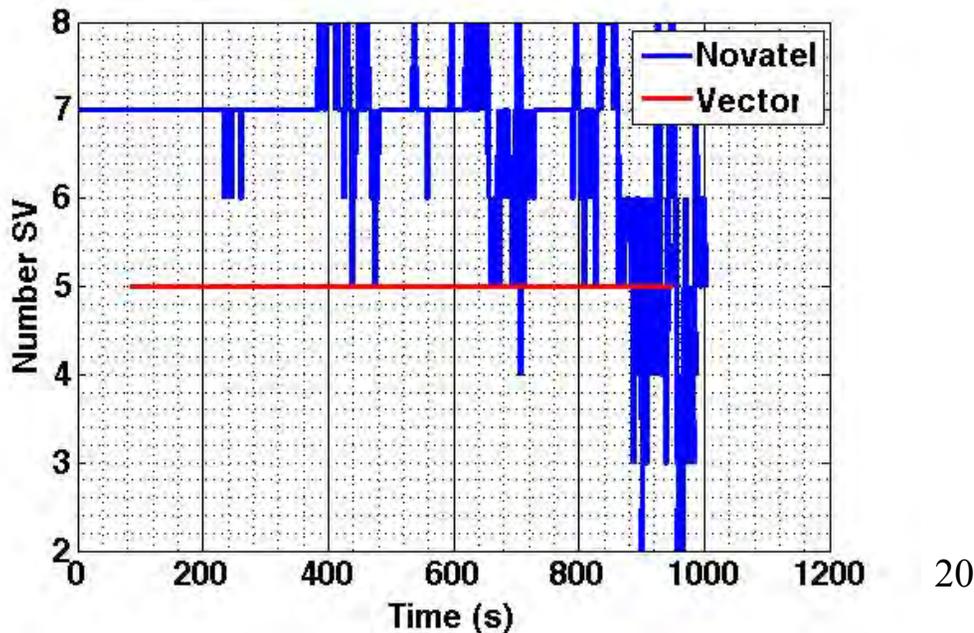
- Moderate foliage data collection
- Nordnav and Novatel Data





Conditions Moderate Foliage

- Novatel – 9 epochs with less than 4 SV
- Novatel – longest period with less than 4 SV 3 seconds



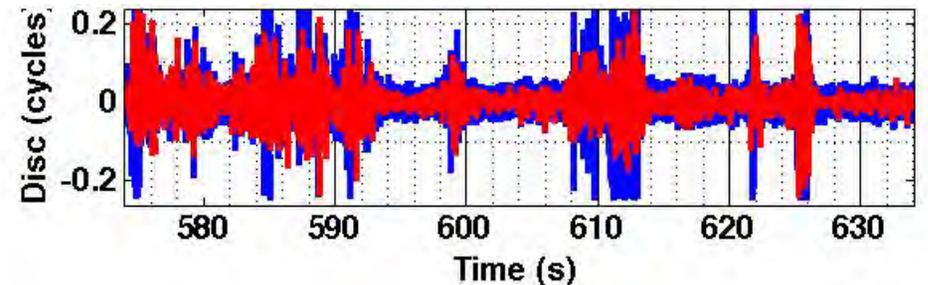
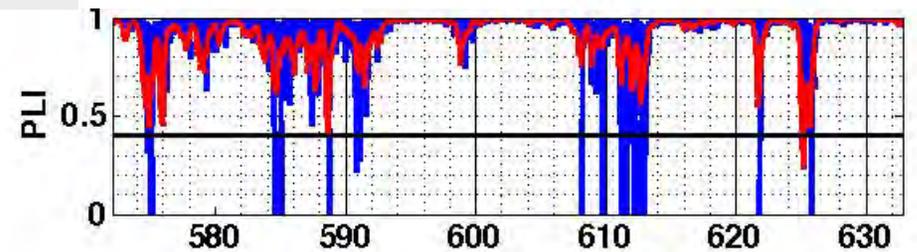
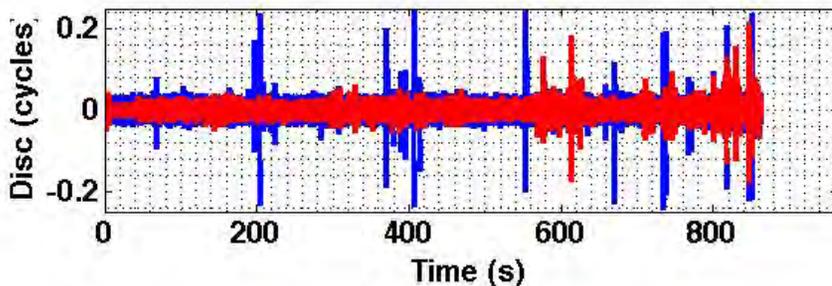
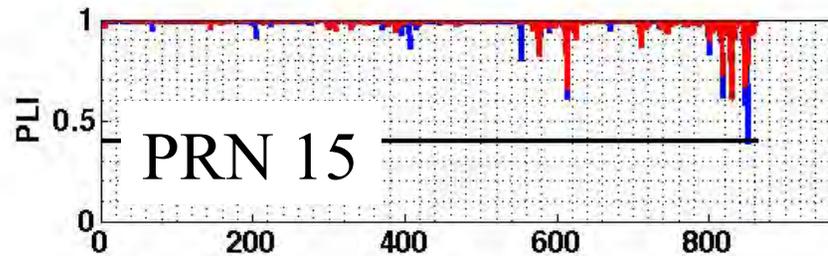
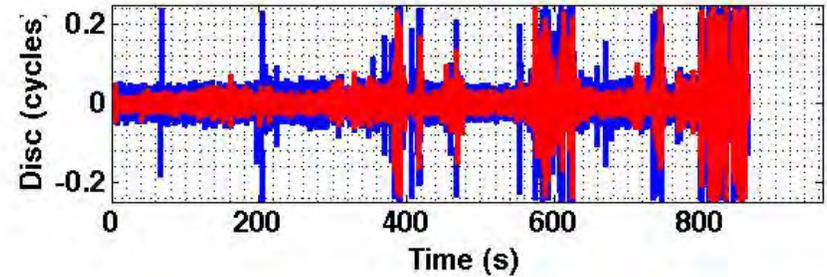
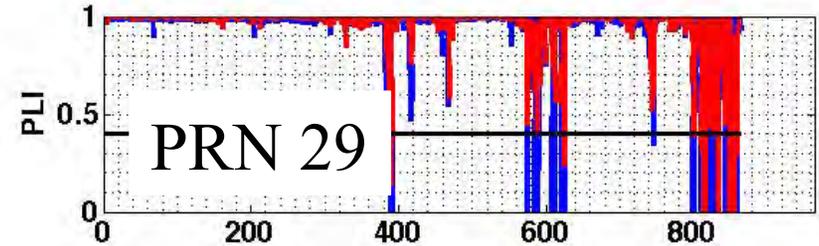


Tracking Moderate Foliage

- Vector tracking software receiver (red) compared to traditional scalar software receiver (blue)

Mean Time To Fault

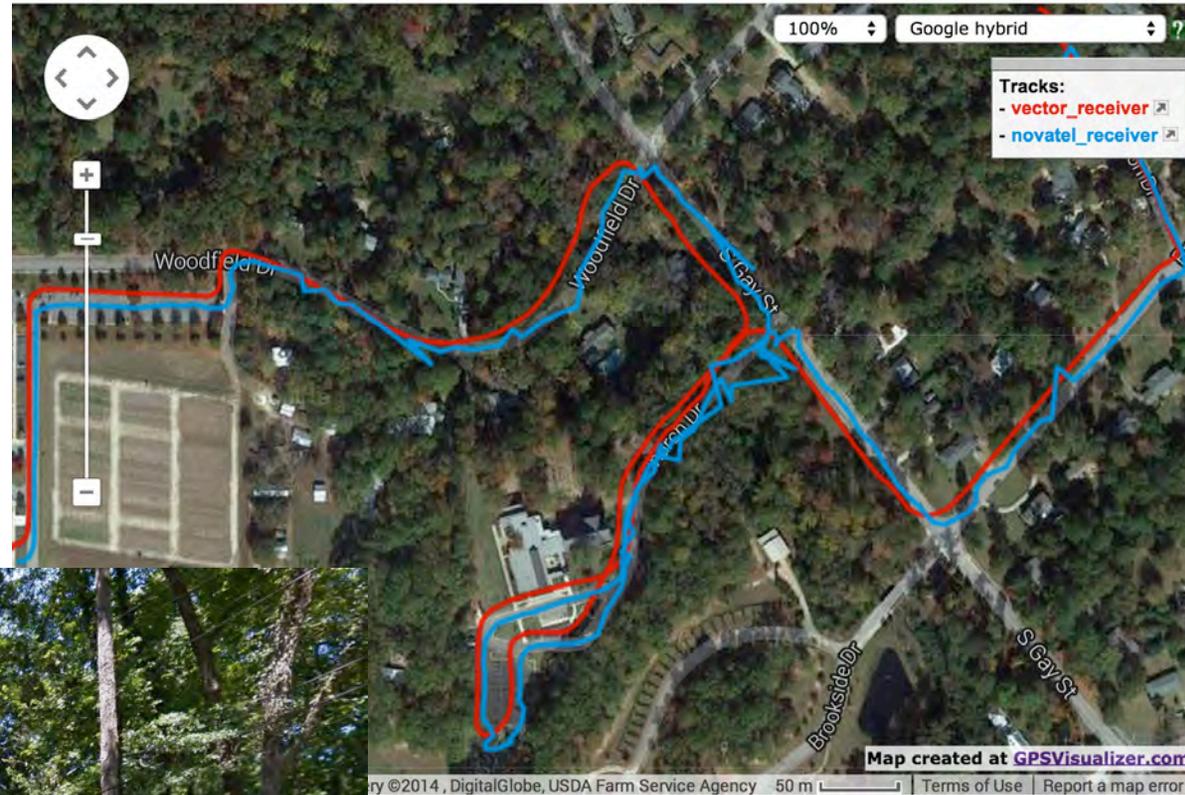
	15	18	21	26	29
Scalar	850 s	6.6 s	4.2 s	5.1 s	8.5 s
Vector	NA	19.4 s	56.8 s	19.4 s	37.5 s





Results Heavy Foliage

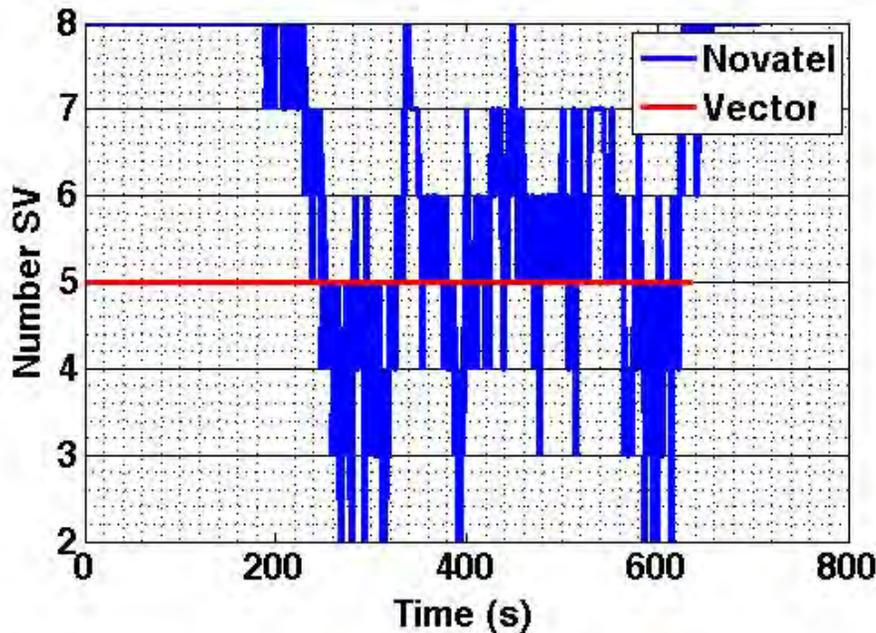
- Heavy foliage data collection
- Nordnav and Novatel Data



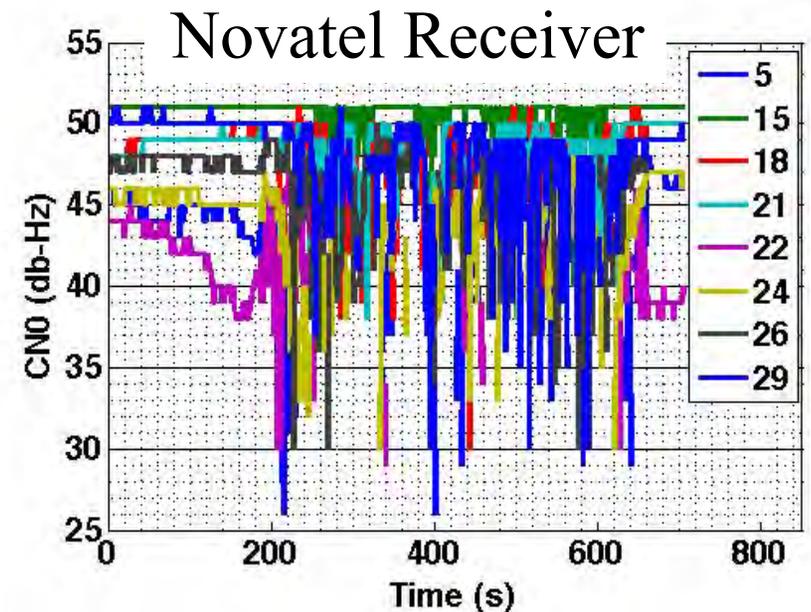
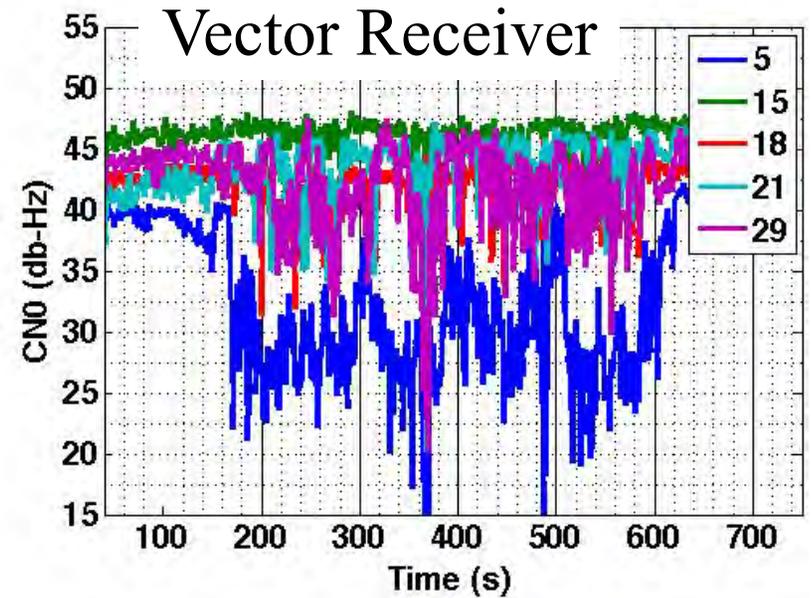


Conditions Heavy Foliage

- Novatel – 55 epochs with less than 4 SV
- Novatel – longest period with less than 4 SV 7 seconds



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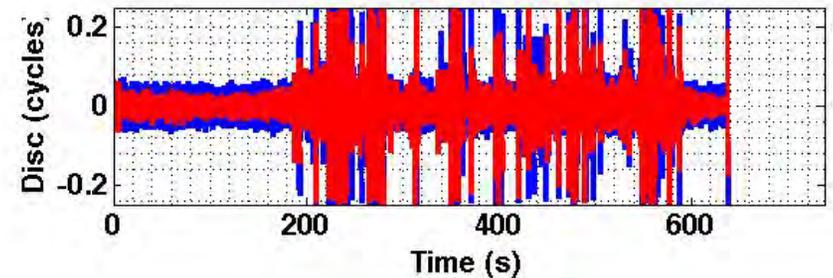
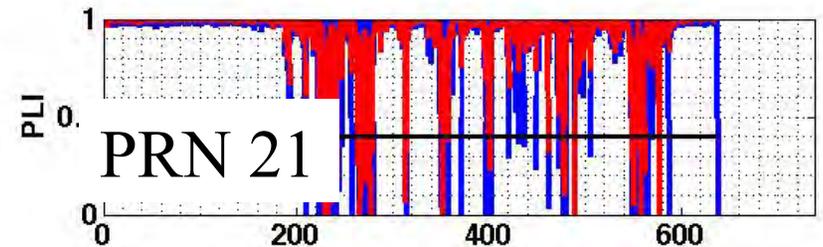
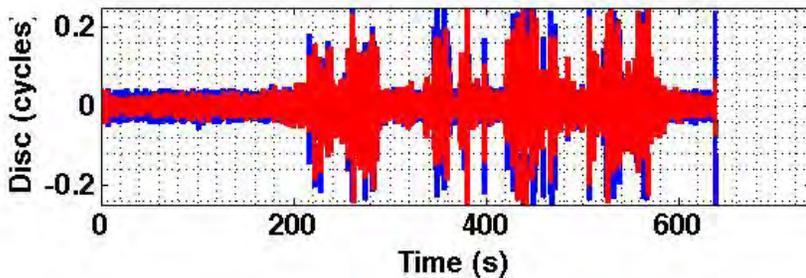
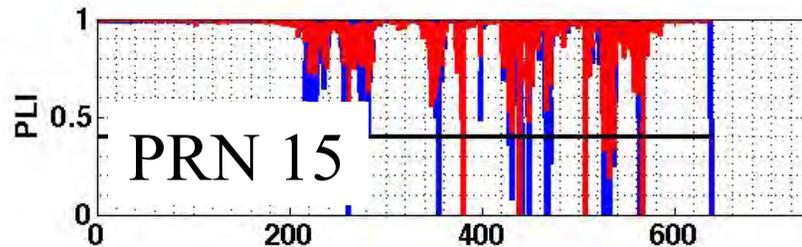
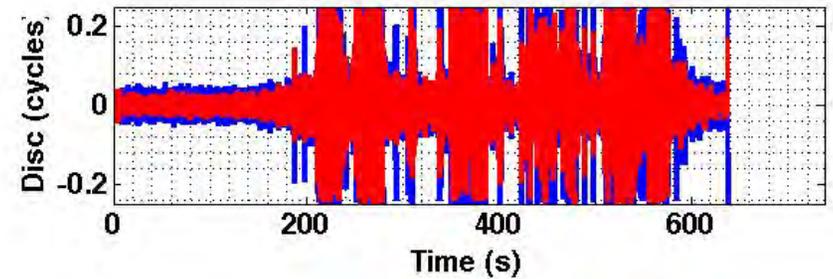
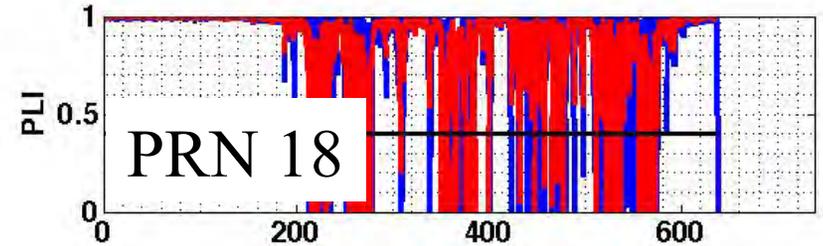


Tracking Heavy Foliage

- Vector tracking software receiver (red) compared to traditional scalar software receiver (blue)

Mean Time To Fault

	5	15	18	21	29
Scalar	0.3 s	3.3 s	0.9 s	1.5 s	0.6 s
Vector	1.5 s	26.9 s	5.7 s	10.9 s	4.9 s





Conclusions

- Described a Vector Frequency Lock Loop aided PLL implementation
- Investigated accuracy of carrier phase measurements by comparing software receiver to COTS receiver in clear sky environments
- Comparison of carrier phase tracking between vector aided PLL and traditional scalar receiver



Future Work

- Performance comparison with scalar FLL aided PLL to isolate improvement due to vector tracking
- Investigate carrier cycle slips in heavy foliage
- Demonstrate ambiguity resolution and RTK positioning with software receiver
- Improve satellite acquisition capability



References

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Questions?