



# Surface Water and Ocean Topography (SWOT) Mission

## Science Team Meeting

Pasadena, June 13-16, 2016

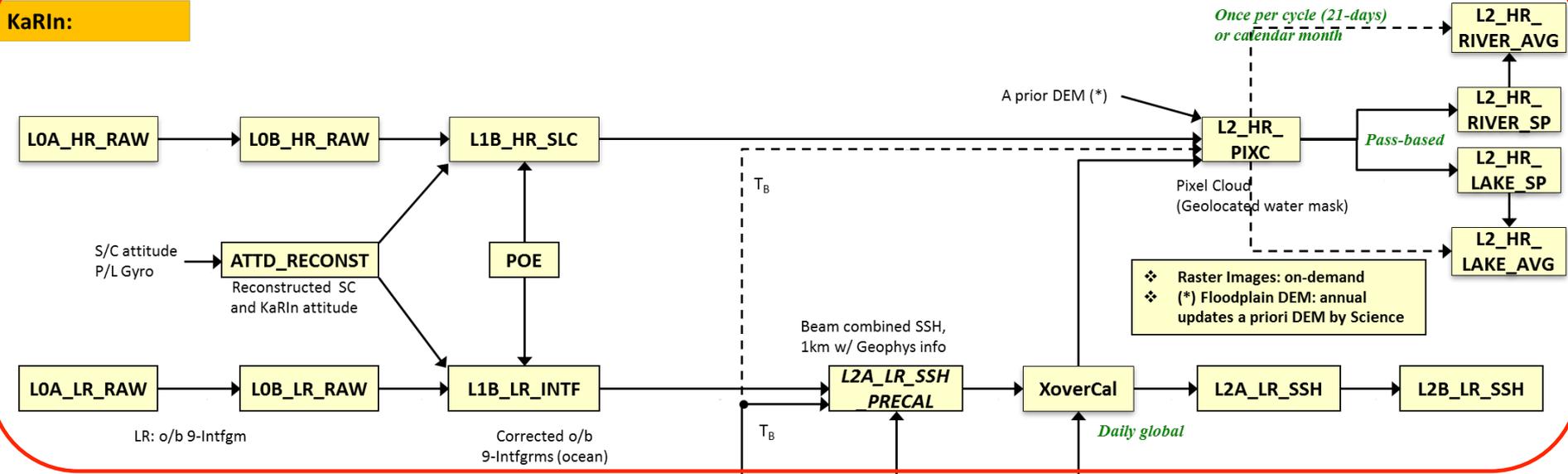
## Algorithms

Roger Fjørtoft, CNES  
Algorithm Project Representative  
Phil Callahan, JPL  
Algorithm Project Representative  
On behalf of the Algorithm  
Development Team

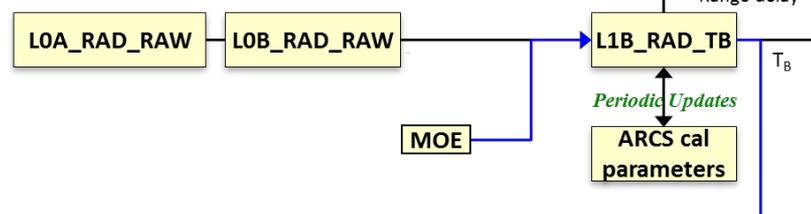
SWOT DocuShare Collection: <https://charlie-lib.jpl.nasa.gov/docushare/xxx>

# SWOT Science Product Flow

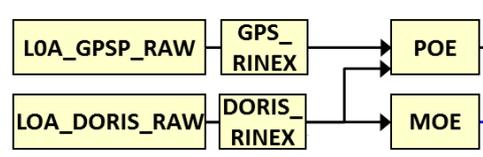
## KaRIn:



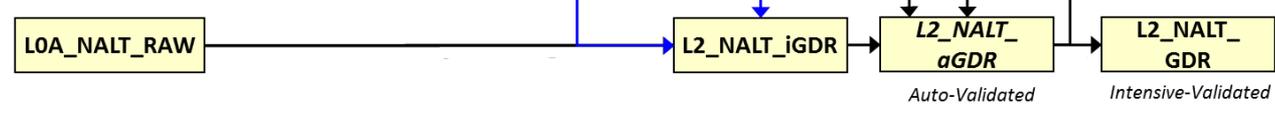
## Radiometer:



## DORIS/GPSP:

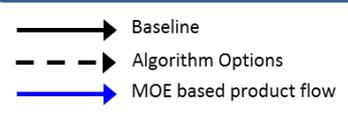


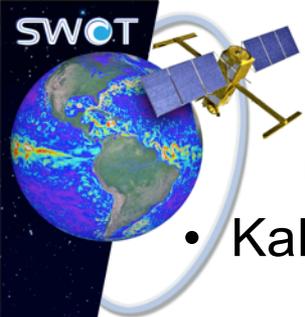
## Nadir Altimeter:



**Auxiliary data for Product Generation:**

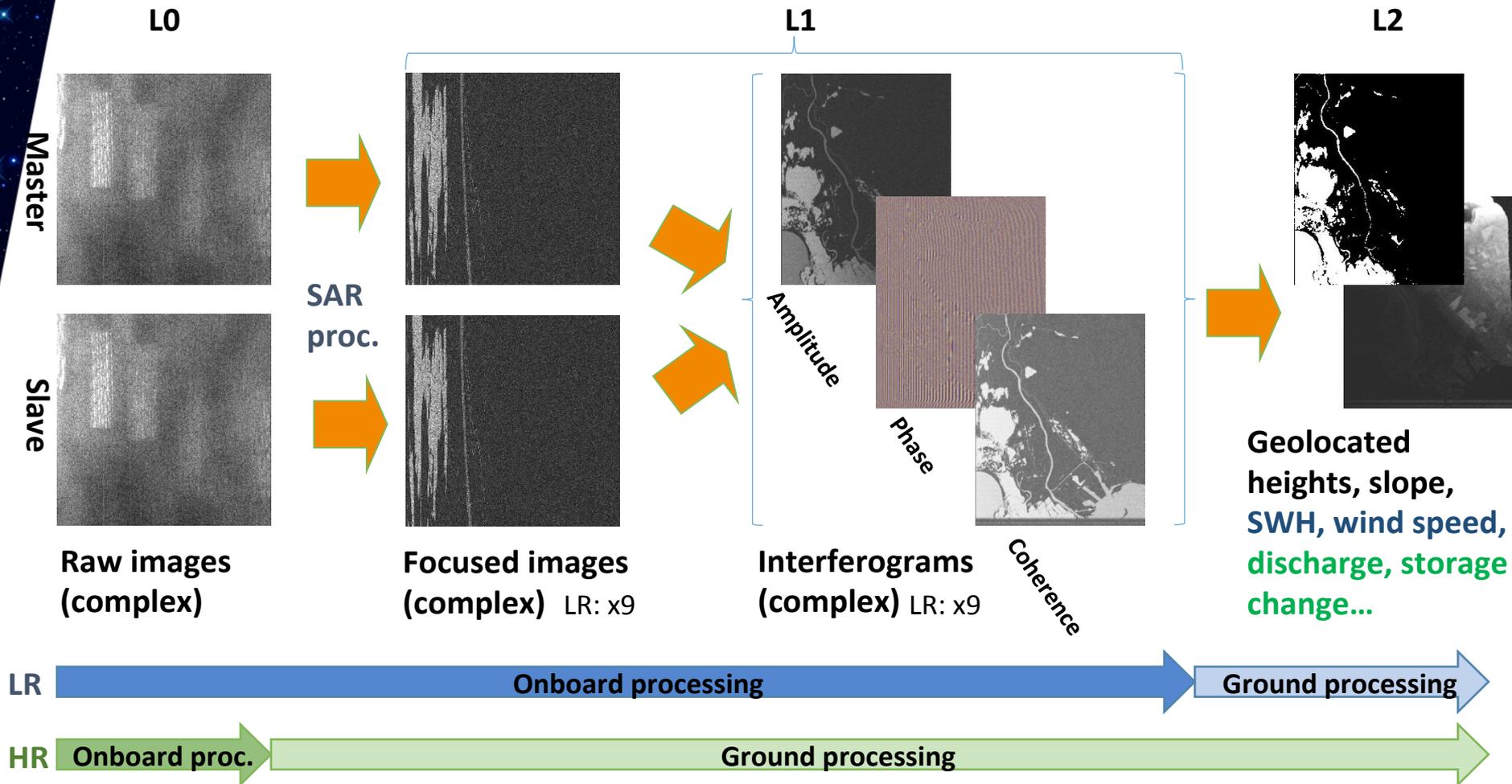
- *A priori* data (static): DEM, Static water mask, river DB/Lake DB, Geophysical Model Fct, etc.
- Quasi-static data: Radiometer calibr. Parameters (ARCS), etc.
- Dynamic data: ECMWF, Ionospheric data (IGNSS), etc.

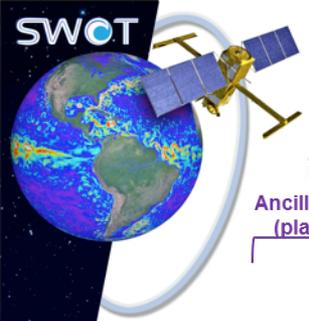




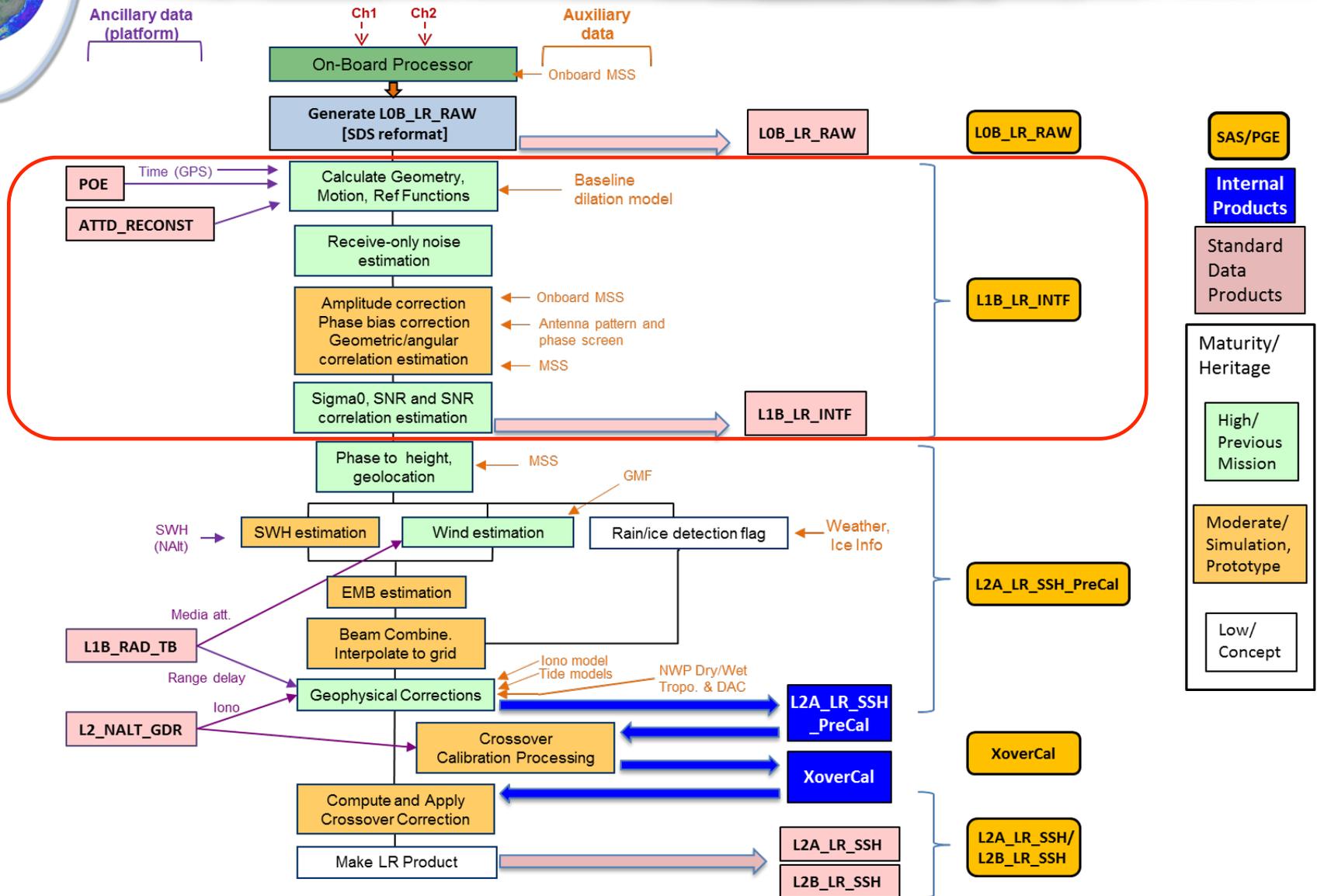
# KaRIn LR and HR Processing: Onboard vs. Ground

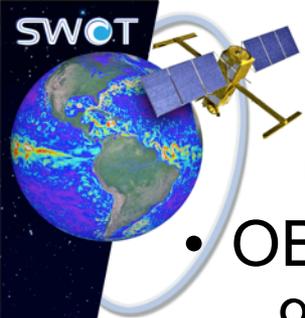
- KaRIn/SWOT Processing and Product Levels (illustrated with HR images below)





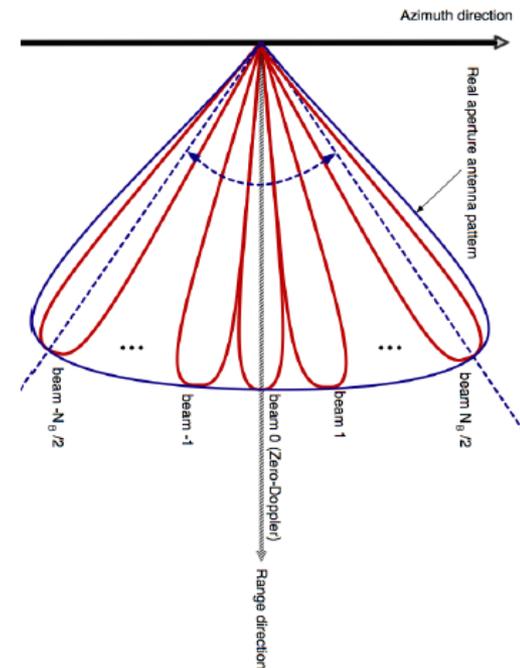
# KaRIn LR Ground Processing Flow Diagram

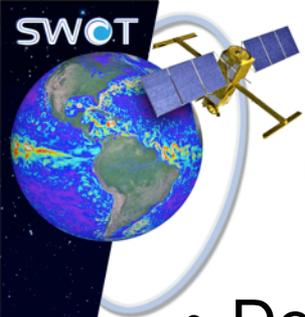




# Starting Point for LR Ground Processing

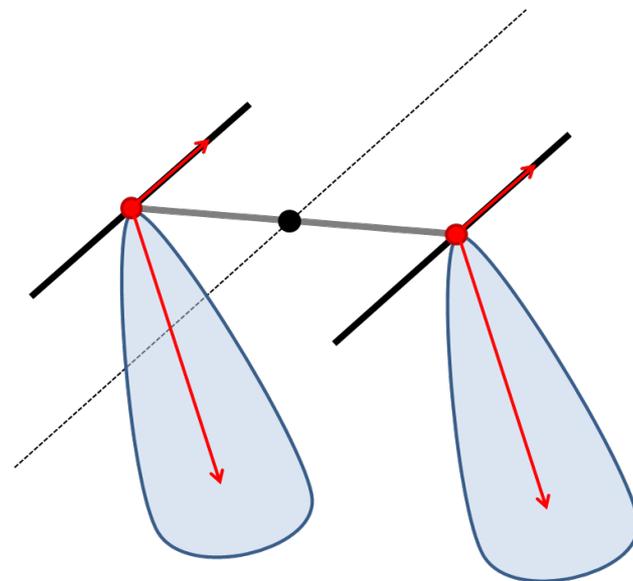
- OBP downlinked inputs (for each swath, left and right):
  - 9 complex interferograms, 500m resolution @ 250m posting
  - Per channel (left and right antenna):
    - 9 power SAR images, 500m@250m
    - Noise and calibration measurements
    - Doppler centroid estimate
- Additional downlinked mitigation inputs:
  - 250m@250 m power and power variance
  - Wave spectra
  - Doppler centroid image
- Ancillary and auxiliary data





# Calculate Geometry, Motion, Ref. Functions

- Determine the precise position and velocity of the phase center of each of the two antennas, as well as their orientation (antenna lobes), as a function of time
- Input:
  - Orbit of the flight system reference center
  - Attitude of the platform and the baseline
  - Flight system and baseline geometry (mechanical) information, including baseline dilatation model





# Amplitude Correction, SNR and $\sigma_0$

- Receive-only noise  $n$  measured regularly, averaged.
- Amplitude correction computed for each power image:

$$A_{corr} = \frac{(4\pi)^3 R^4}{P_{tx} G_{tx} G_{rx} \lambda^2 A_{rc}}$$

- Requires knowledge of range, transmitted power, antenna gains, wavelength, range cell size
- SNR and  $\sigma_0$  (normalized radar cross section, NRCS) computed based on the SAR power images, the receive-only noise power and the amplitude correction:

$$SNR^{(J)} = \frac{P_{rx}^{(J)} - \bar{n}^{(J)}}{\bar{n}^{(J)}}$$

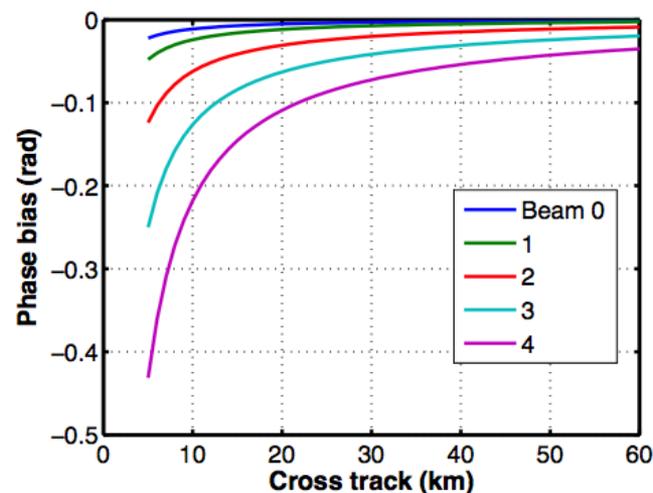
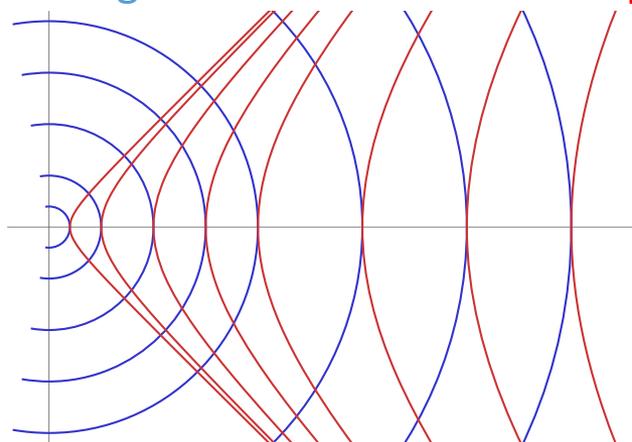
$$\sigma_{0,uncorr}^{(J)} = A_{corr}^{(J)} \cdot (P_{rx}^{(J)} - \bar{n}^{(J)})$$



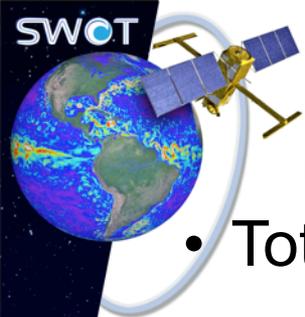
# Phase Bias Correction

- The fact that the iso-interferometric-phase lines and the iso-range lines are not aligned, creates a systematic phase bias.

Iso-range vs. Iso-interferometric-phase



- This phase bias can be compensated for each beam based on knowledge of topography, backscattering ( $\sigma_0$  contrast), antenna pattern, attitude...
- Phase bias equation and further details in the OBP ATBD



# Noise, Geometric/Angular Correlation Estimation

- Total correlation (coherence) measured from interferogram

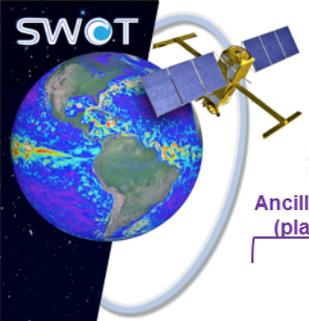
$$\gamma^{(J)} = \gamma_n^{(J)} \gamma_{\varphi,g}^{(J)} \gamma_{vol}^{(J)}$$

noise      angular/geometric      volume

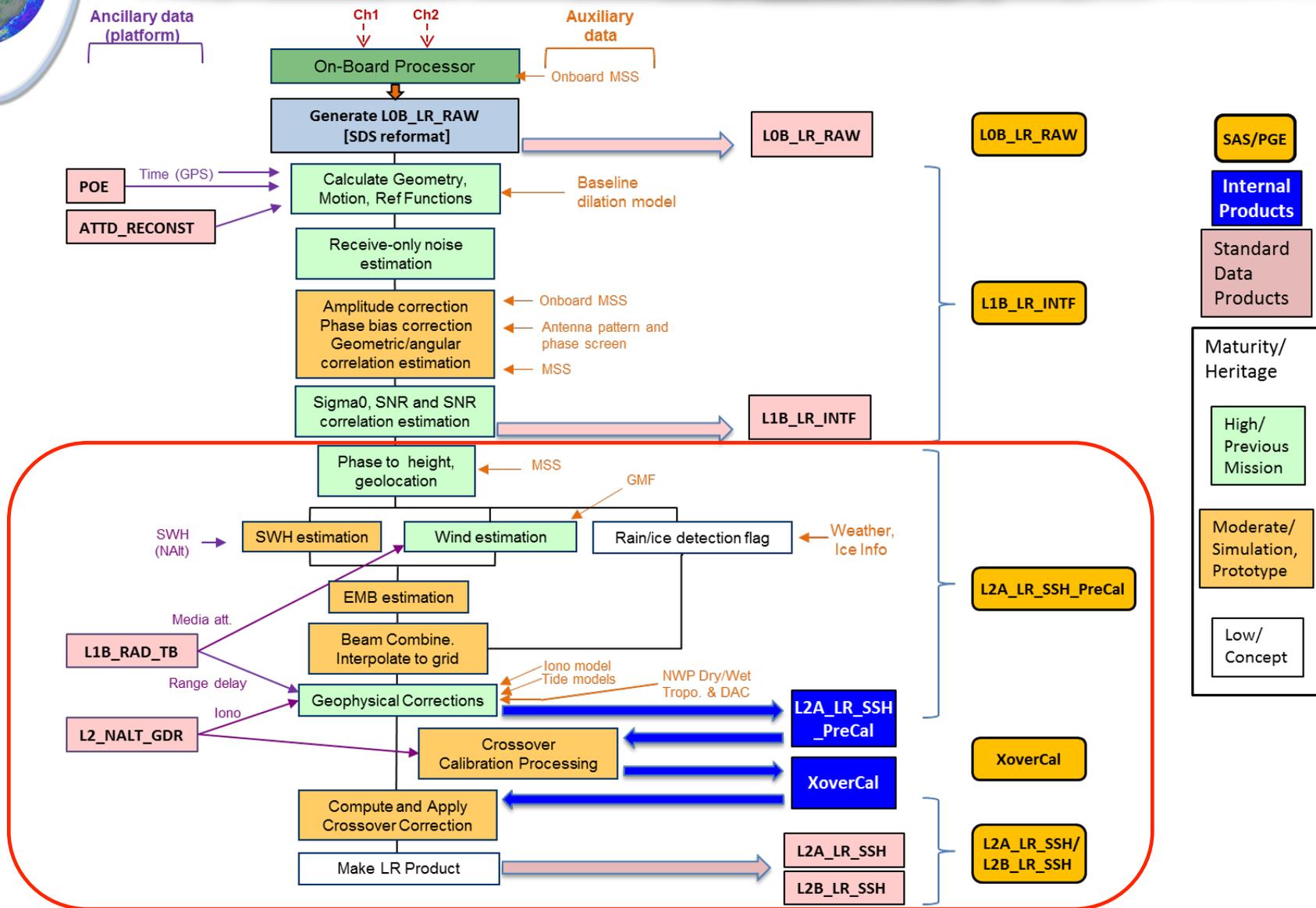
- Noise correlation estimated directly from the SNR of the two channels

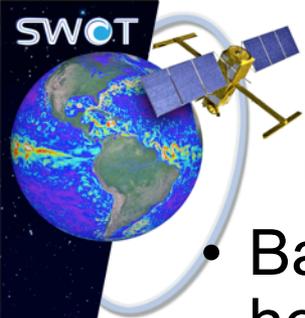
$$\gamma_N^{(J)} = \frac{1}{\sqrt{\left(1 + \frac{1}{SNR_1^{(J)}}\right) \left(1 + \frac{1}{SNR_2^{(J)}}\right)}}$$

- Geometric/angular loss of correlation
  - pixels are not points but surfaces, so that the interferometric phase difference varies throughout the resolution cell,
  - misalignment of iso-range and iso-phase (cfr. phase bias).
  - angular correlation equation specific to SWOT OBP algorithm



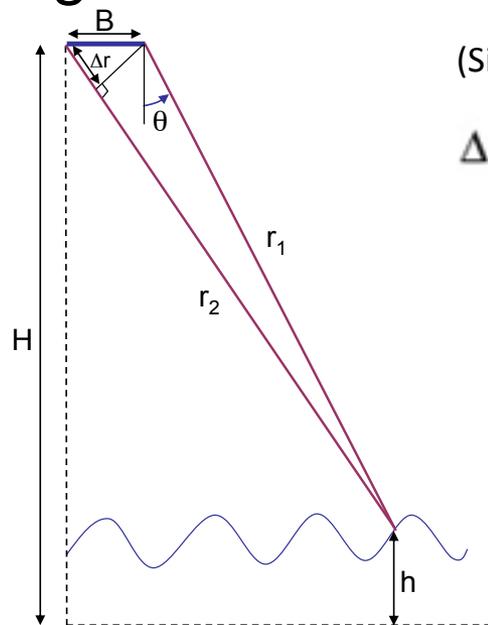
# KaRIn LR Ground Processing Flow Diagram





# Phase-to-Height, Geolocation

- Basic principle: invert phase difference into geolocated heights based on reference surface.



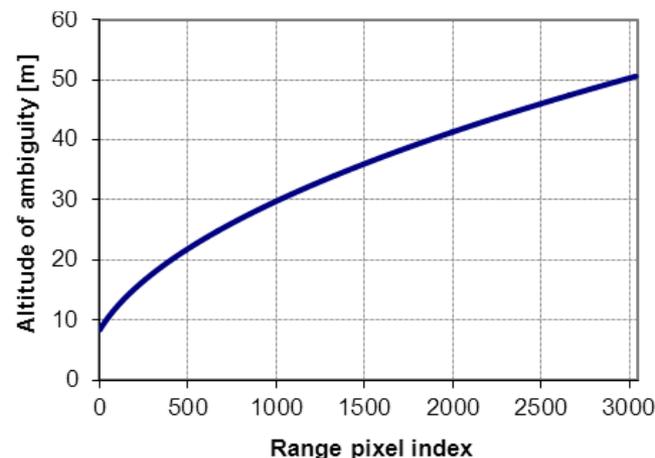
(Simplified illustration and equations)

$$\Delta r = r_2 - r_1 = B \sin(\theta)$$

$$\Delta r = \frac{\lambda}{2\pi} \Phi$$

$$\theta = \arcsin\left(\frac{\Phi \lambda}{B 2\pi}\right)$$

$$h = H - r \cos(\theta)$$



- Textbook inversion based on direct geocoding equations using MSS as reference (+ tide model?)
- Far range unambiguous, near range may require limited phase unwrapping (large unaccounted-for tidal variation)



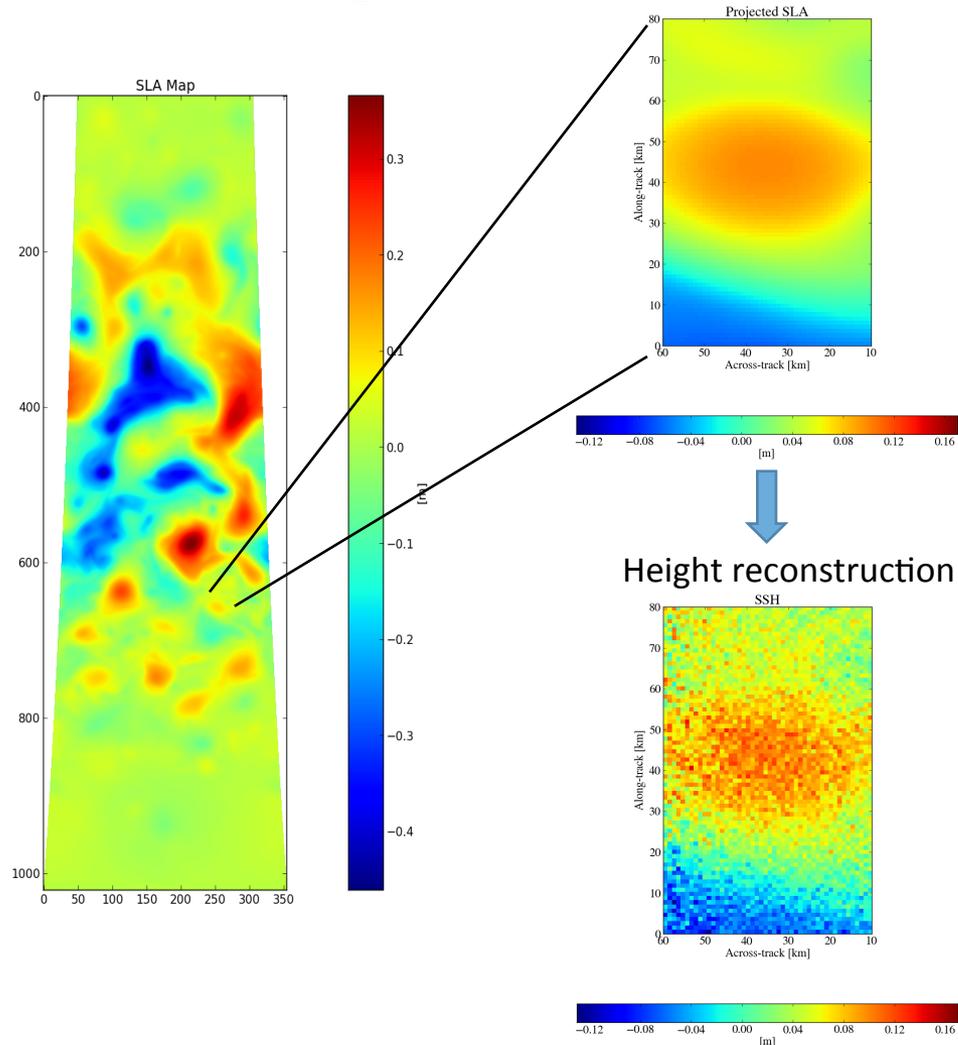
# Phase-to-Height, Geolocation

- Illustration of estimated height based on simulated data

- Ocean scene with realistic MSS, SLA and wave field (e.g., SWH=2m).

- Reference surface is the either the MSS alone, or an ellipsoid at some offset from mean elevation of the MSS.

- 10x50 km<sup>2</sup> simulation tested at several resolutions and postings, with real orbit scenario, but perfect attitude knowledge.





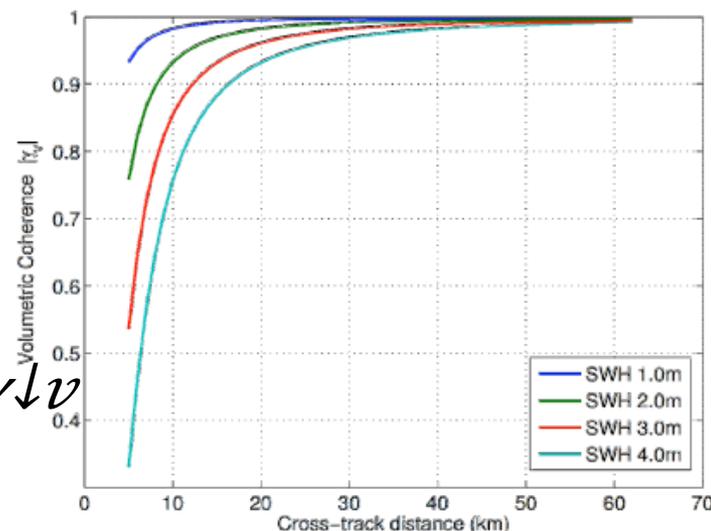
# SWH Estimation

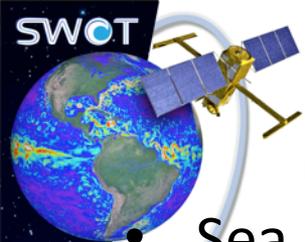
- The basic approach for Significant Wave Height estimation is inversion of the volume correlation, computed from the other correlation terms and the measured total correlation (coherence)

$$\gamma = \gamma_{\downarrow N} \times \gamma_{\downarrow v} \times \gamma_{\downarrow \phi} \quad \Rightarrow \quad \gamma_{\downarrow v} = \gamma / \gamma_{\downarrow N} \times \gamma_{\downarrow \phi}$$

$$SWH = 4\sqrt{2} / \kappa_{\downarrow z} \sqrt{-\ln \gamma_{\downarrow v}} \quad \text{where } \kappa_{\downarrow z} = k B \cos \theta_{\downarrow 0} / r \sin \theta_{\downarrow i 0}$$

- Better accuracy can be achieved by assuming the SWH is approximately constant across the swath, and fitting a curve  $\gamma_{\downarrow v}(\kappa_{\downarrow z}, SWH)$  to the estimated  $\gamma_{\downarrow v}$



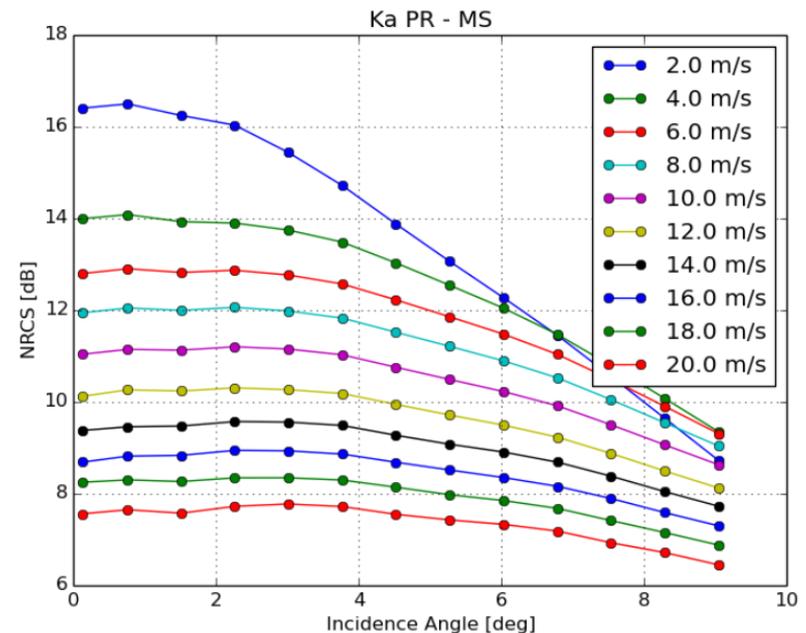


# Wind Estimation

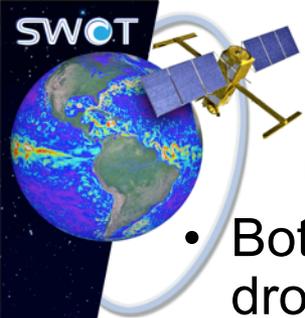
- Sea surface wind speed estimation is based on heritage from Jason and SARAL: inversion of NRCS ( $\sigma_0$ )
- Feasibility in Ka-band observed with AltiKa/SARAL and GPM
  - Relies on a model function relating the ocean surface  $\sigma_0$  to the local near-surface wind speed versus antenna look direction and incidence angle...
  - Pre-launch Geophysical Model Function (GMF) can be built on existing datasets: GPM data analysis show the dependence of Ka-band  $\sigma_0$  to the incidence angle and at different wind conditions

$$\hat{U}_{LS} = \arg \min_U \left( \left\| \sigma^0 - GMF(U, \theta) \right\|^2 \right)_{|\theta}$$

- More sophisticated approaches are also being studied by Science Team (new parameters in the GMF)

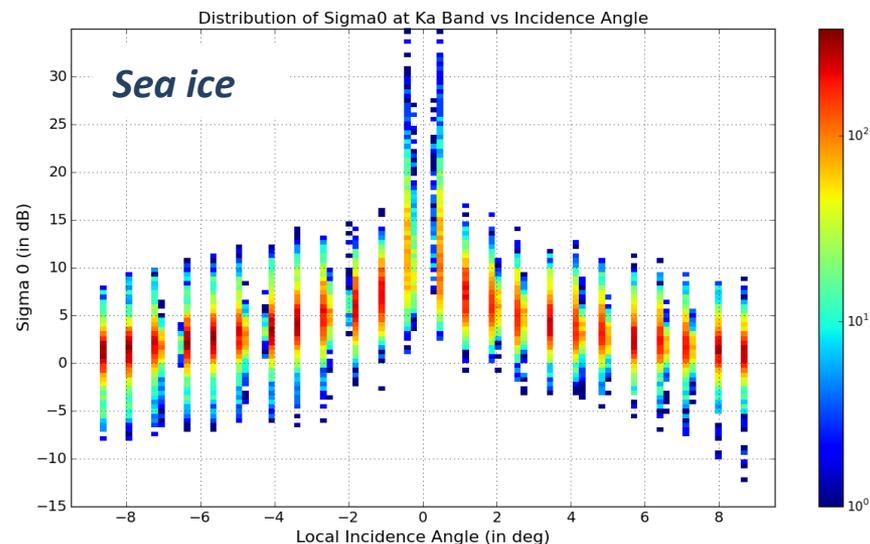
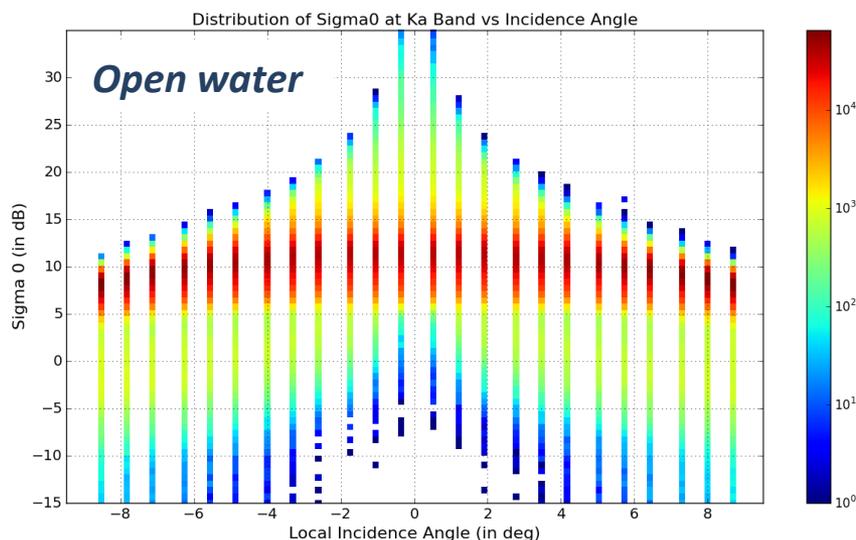


*Ka-band  $\sigma_0$  from GPM mission wrt incidence angle, from Ifremer Science Team members*



# Rain/Ice Detection Flag

- Both rain attenuation and sea ice are expected to cause significant drops in backscattering ( $\sigma_0$ ) and coherence
- Heritage from nadir altimetry. KaRIn algorithms need more work.
- Radiometer, Nadir and KaRIn data can be combined.
- Use of auxiliary data such as *Eumetsat's* OSI-SAF ice concentration
- The high resolution  $\sigma_0$  uncertainty can be used for outlier flagging

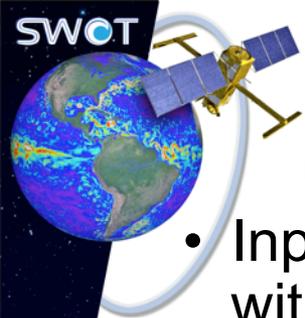


**N. Long  p   et al. "The KaRIN off-nadir ice flag can be based on *rapid increases/drops in radar cross-section* (e.g. the GPM Ka-band mission observes on average a +/-10 dB during ocean to ice transitions) that will be visible in the 250-m sigma0 mean and variance. "**



# EM Bias Estimation

- The electromagnetic (EM) bias is a phenomenon caused by the fact that averaging wave regions with different radar back scatter will bias the height results towards the brighter wave regions (typically, the wave trough).
- This effect is present in traditional altimetry and is usually estimated from cross-over or repeat track data under different SWH conditions, complimented by modeling.
- The AltiKa mission has derived models for the EM bias for Ka band nadir incidence.
  - At this point, this model is the baseline for SWOT corrections.
- For SWOT, additional factors in the EM bias might be caused by changes in incidence angle and/or wave direction and spectrum
  - These points are being addressed pre-launch via direct measurements (AirSWOT) and modeling (France & US)

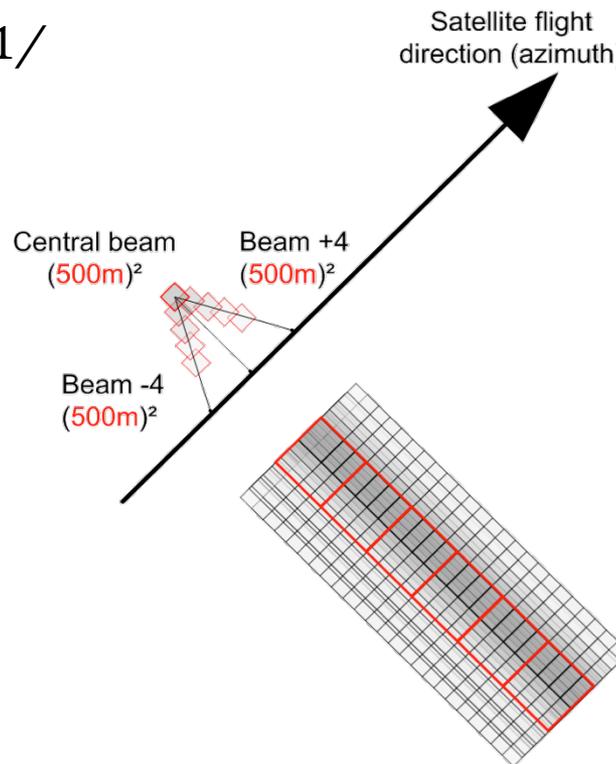


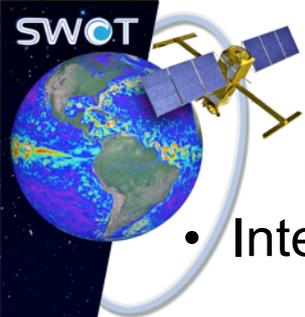
# Beam Combine – Interpolate to Grid

- Input: The 9 beams yield 9 height maps composed of pixels with 500m resolution @ 250m posting, with ~200 m azimuth offset between consecutive beams
- Weighting of the heights according to the height uncertainty of the beams (central beams are less noisy)

$$h = \sum_{i=1}^N \frac{w_i h_i}{\sum_{j=1}^N w_j} \quad \text{with } w_i = 1/\sigma_i^2$$

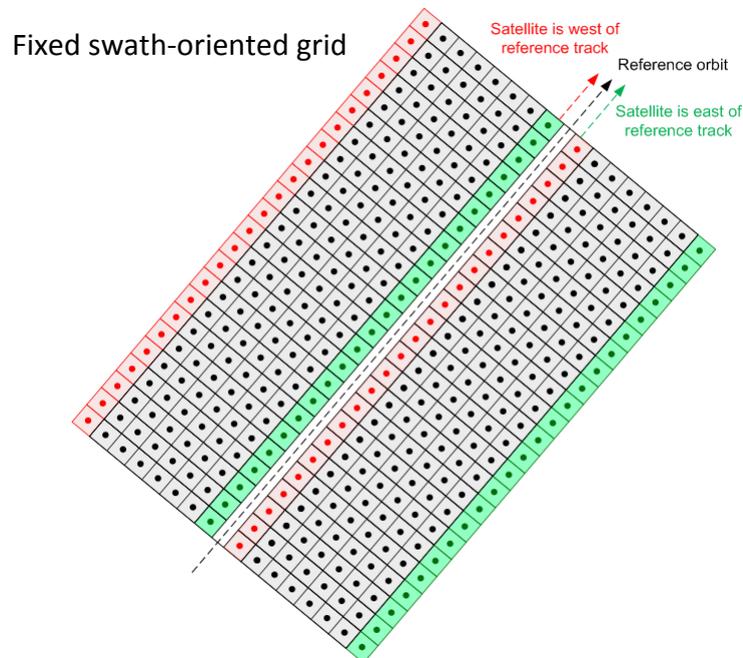
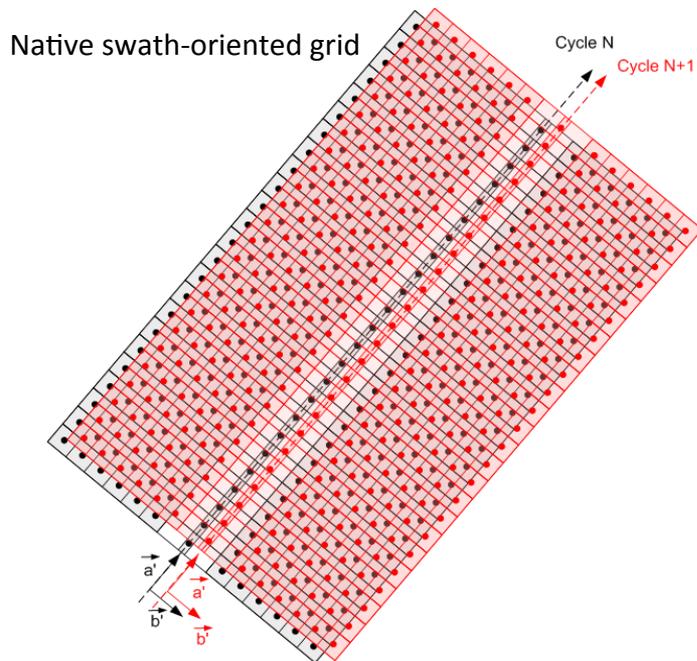
- Combine highly overlapping 500m@250m pixels to create 1 km pixels



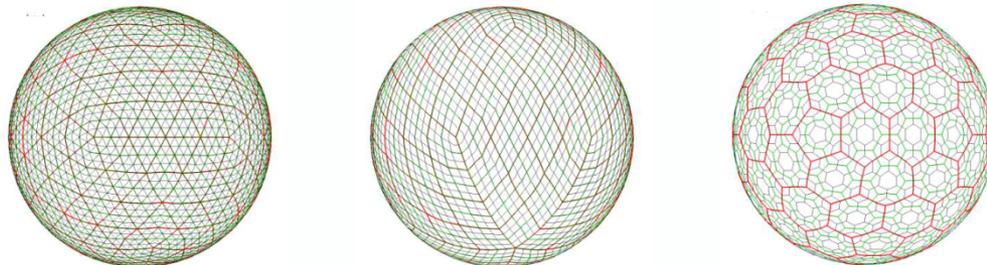


# Beam Combine – Interpolate to Grid

- Interpolation to native grid and fixed swath-oriented (or global) grid



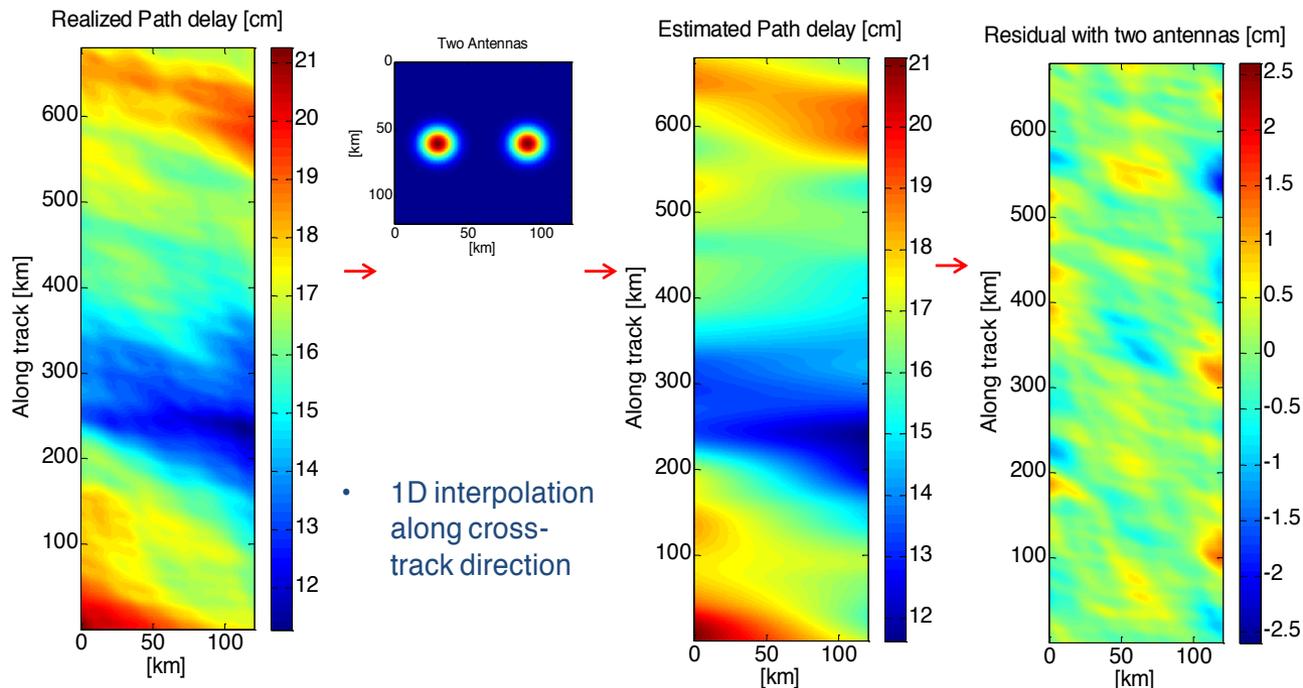
Examples of fixed global grids

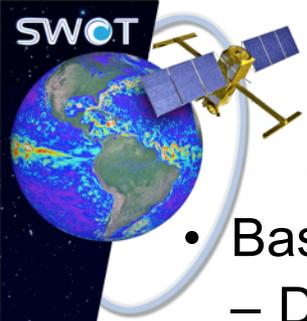




# Wet Troposphere Correction

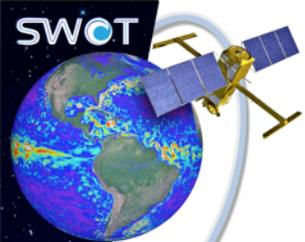
- One radiometer measurement in each KaRIn swath
- Current baseline: Jason heritage path delay algorithm and cross-track linear interpolation on each filtered path delay stream to generate swath path delay
- Provides value at nadir as well as cross-track slope





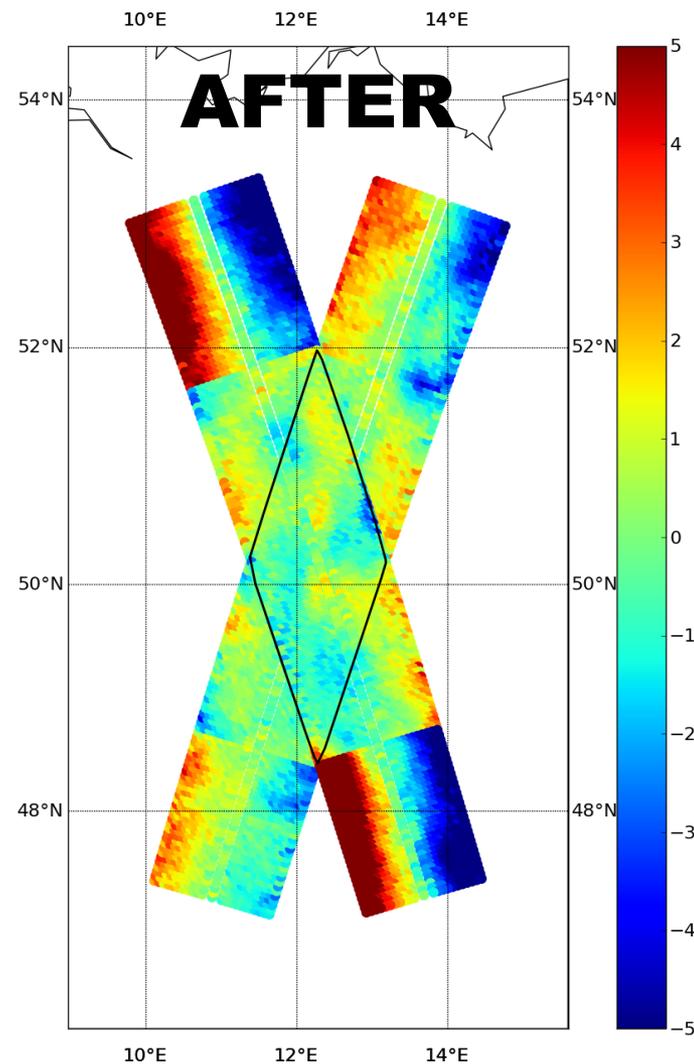
# Geophysical Corrections

- Based mostly on heritage from nadir altimetry, legacy systems
  - Dry (and wet) tropospheric delay correction (model-based):
    - Currently based on European ECMWF model
  - Ionosphere:
    - Correction based on JPL GIM (GPS Ionosphere Model) maps
    - Correction from bi-frequency nadir altimeter (Ku/C)
  - Ocean tides:
    - Provided by Science Team, heritage from Jason OSTST
    - Internal tides: important new development; not applied to SSHA
    - Pressure and wind stress input to Dynamic Atmospheric Correction (DAC - “inverse barometer”).
  - Pole and land tides :
    - Legacy system, heritage from Jason OSTST.
  - MSS, geoid and MDT
    - International collaboration on new models
- Gather output of L2 processing steps to make pre-calibrated L2A\_LR\_SSH\_PreC product (i.e. without cross-over calibration)



# Crossover Calibration

- SWOT ocean (and land) topography is skewed by uncalibrated residual roll.
- For crossovers where both swaths are visible (black diamond), roll is mitigated.
- ~30.000 ocean crossovers every 21 days
- Inland crossovers cannot be used (SNR and topography errors, limited water coverage, layover)
- Interpolation of crossover corrections to obtain height correction for each L2 LR pixel (and phase corrections for each HR pixel).



**Example of XOVER diamond and local calibration**



# Make LR Product

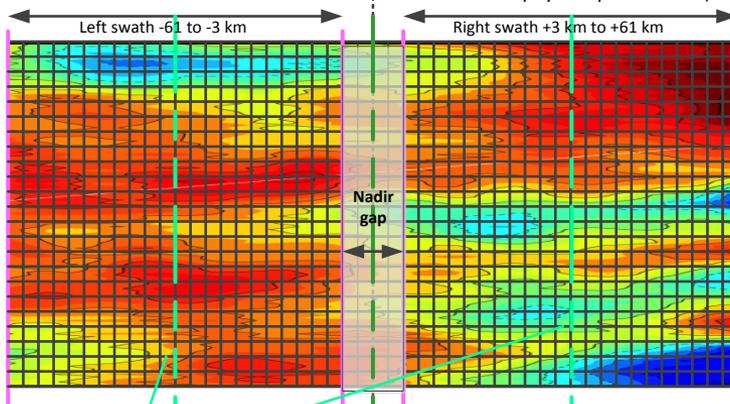
- Update the pre-calibration L2A\_LR\_SSH\_PreC product by adding crossover-correction field.

### 2D data provided in swath

Latitude, Longitude  
 Surface type  
 SSH,  $\sigma_0$ , SWH  
 Associated uncertainties, quality indicators  
 Ice and rain flags  
 Corrections (geophysical and calibration)  
 Geophysical parameters (MSS, tides, ...)

### 2D data provided in swath

Latitude, Longitude  
 Surface type  
 SSH,  $\sigma_0$ , SWH  
 Associated uncertainties, quality indicators  
 Ice and rain flags  
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 Geophysical parameters (MSS, tides, ...)



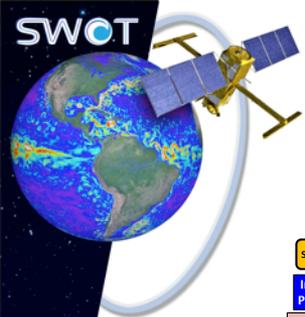
### 1 value per swath

Radiometer BT measurement in their geometry (at TBD° in the swath)  
 Other radiometer parameters

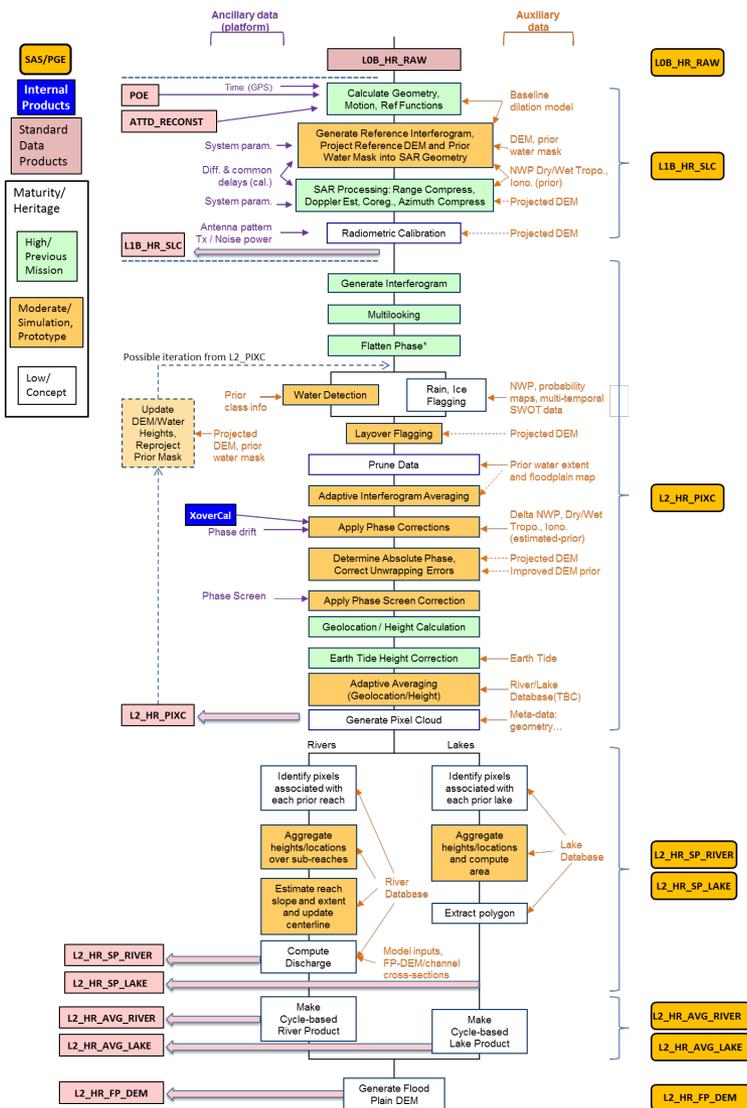
### 1 value at nadir along track

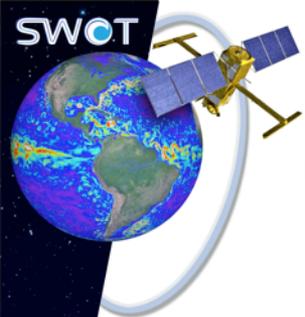
Time tag  
 Orbit data  
 Nadir altimeter measurement (Jason like product in a separate file)  
 TBD: some of the geophysical corrections or parameter and an associated algorithm to propagate across the swath  
 KNC data  
 NNI data (within a short swath over TBD km)

More details on L2 LR products on Wednesday (Nathalie Steunou et al.)



# KaRIn HR Ground Processing Flow Diagram





# KaRIn HR Ground Processing Flow Diagram

**SAS/PGE**

**Internal Products**

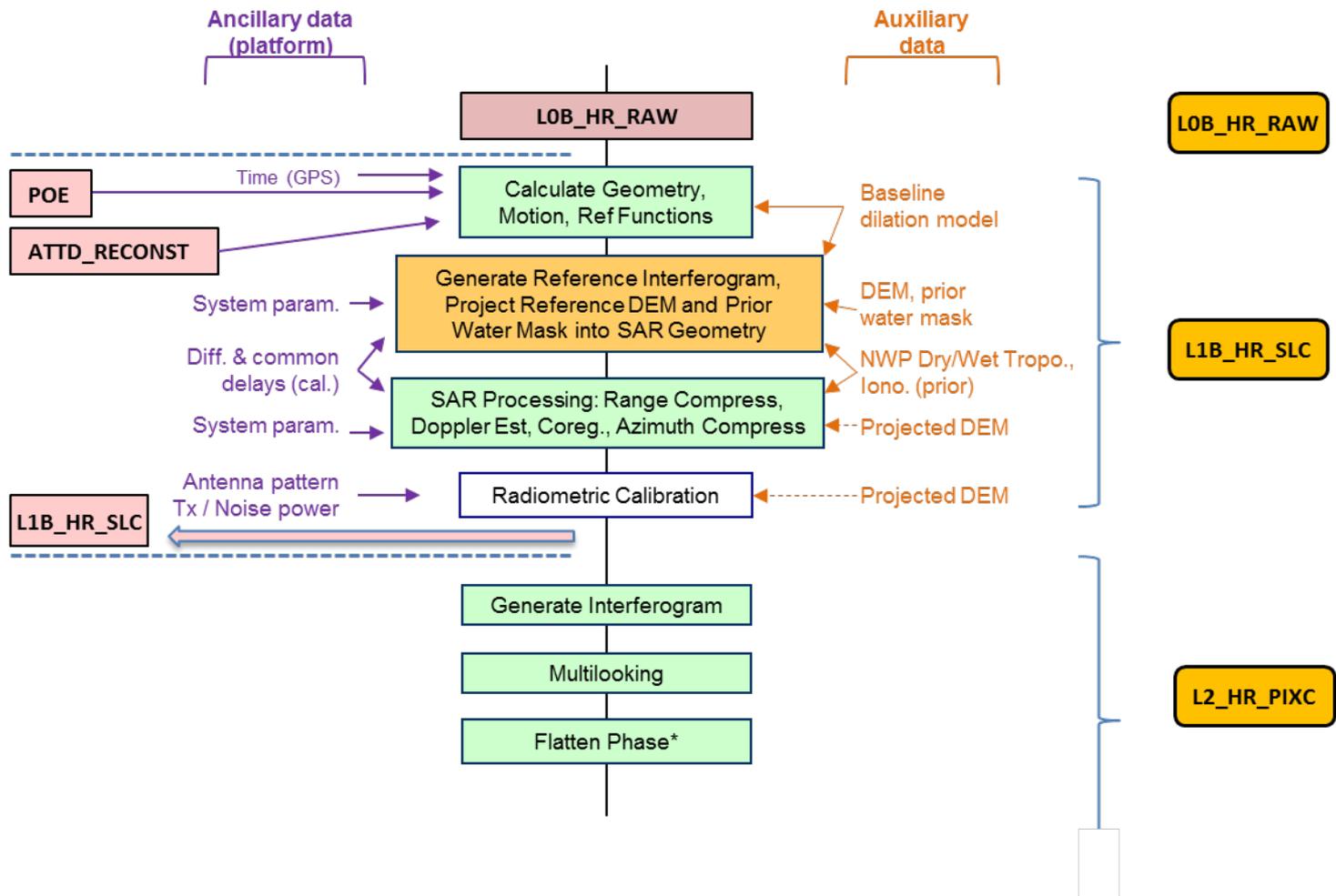
Standard Data Products

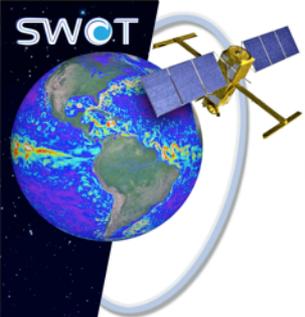
Maturity/Heritage

High/Previous Mission

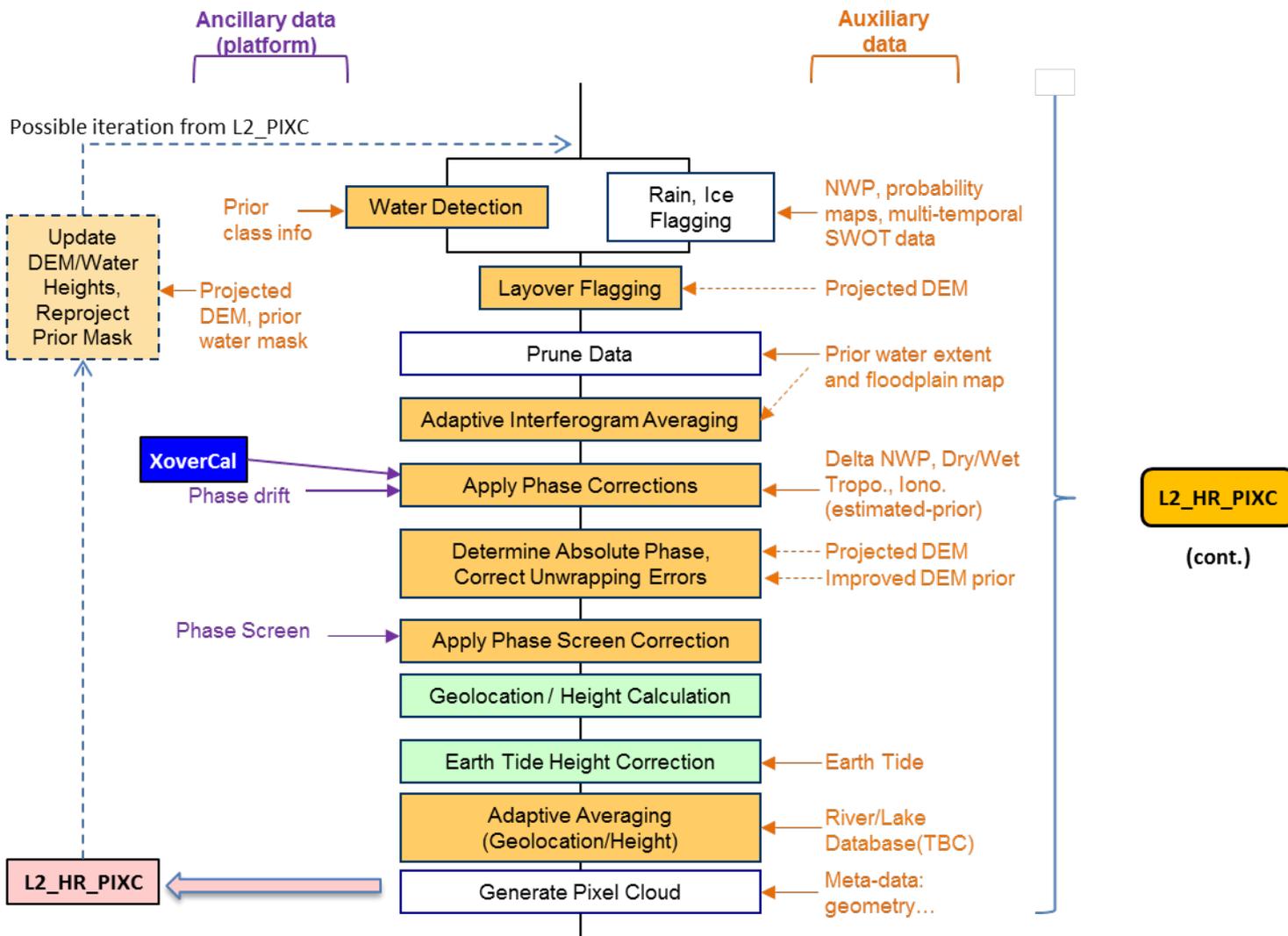
Moderate/Simulation, Prototype

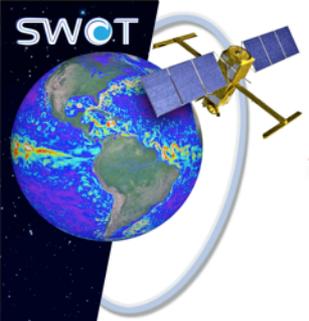
Low/Concept



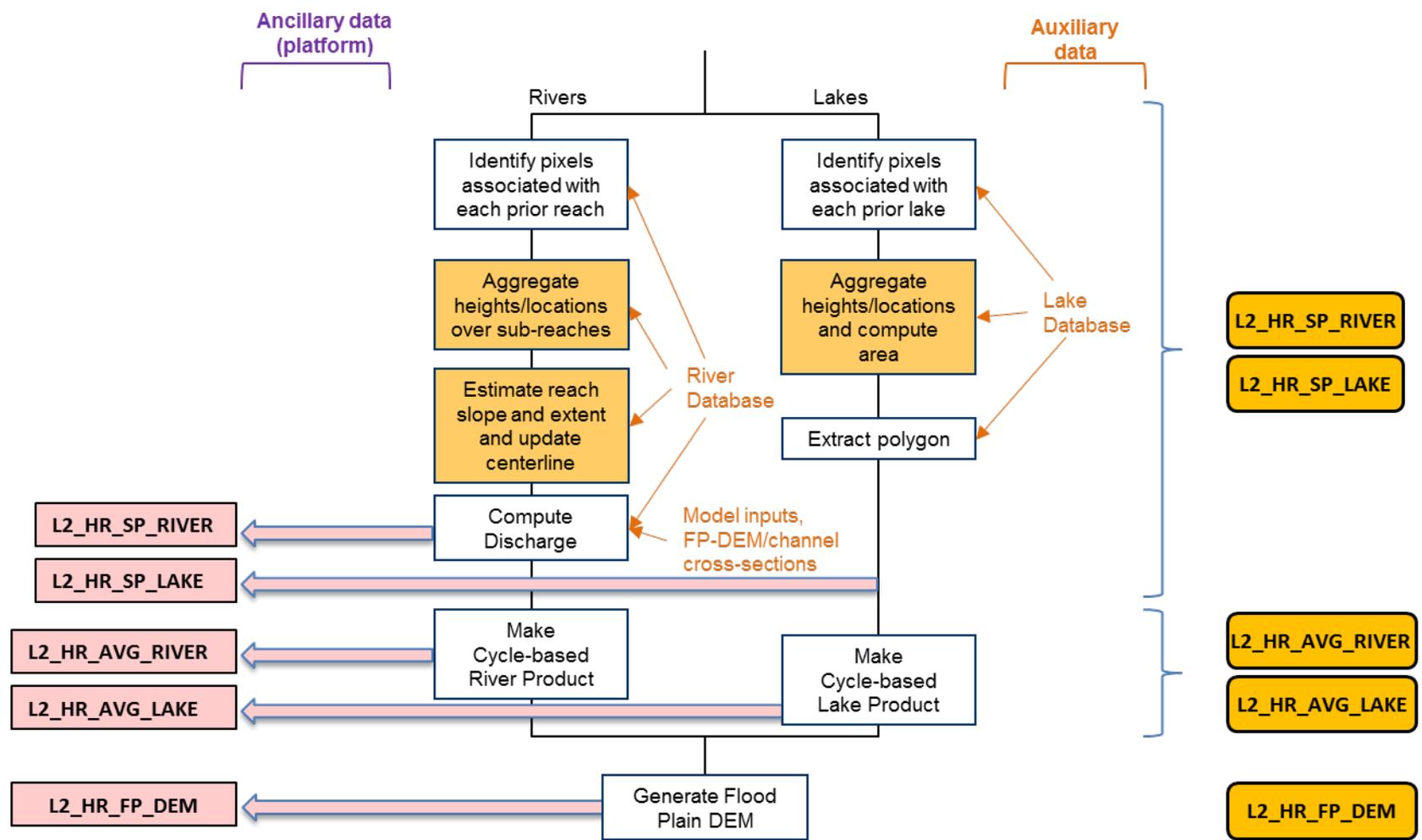


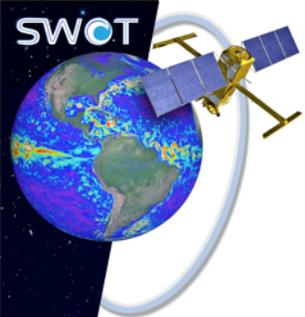
# KaRIn HR Ground Processing Flow Diagram



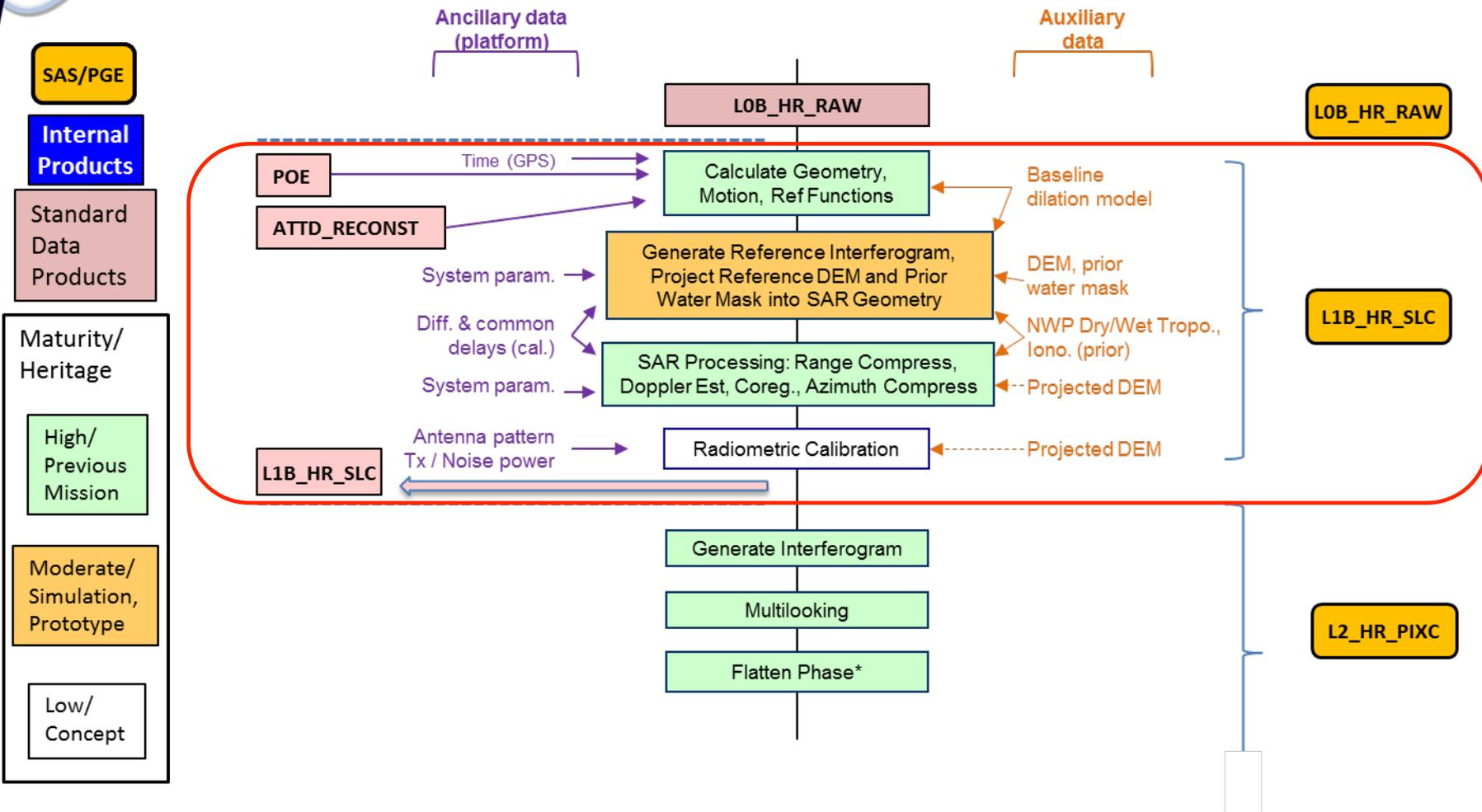


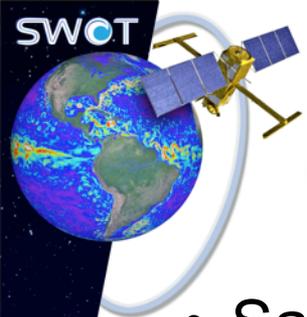
# KaRIn HR Ground Processing Flow Diagram





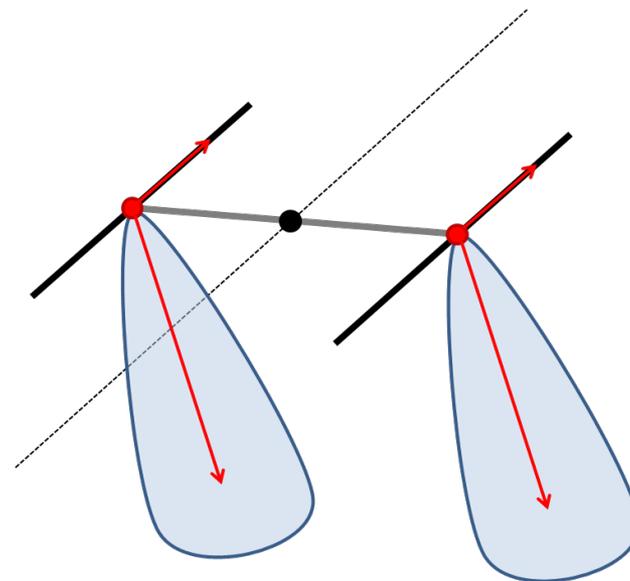
# KaRIn HR Ground Processing Flow Diagram

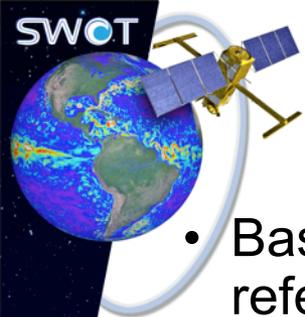




# Calculate Geometry, Motion, Ref. Functions

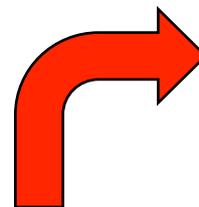
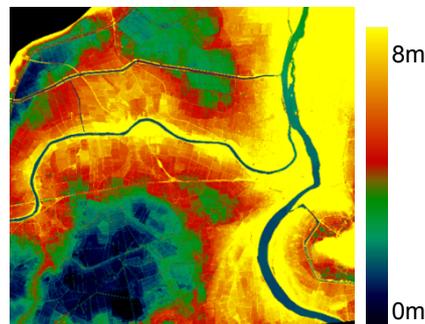
- Same as for LR ground processing: compute the precise position and velocity of the phase center of each of the two antennas, as well as their orientation (antenna lobes), as a function of time (for each pulse).

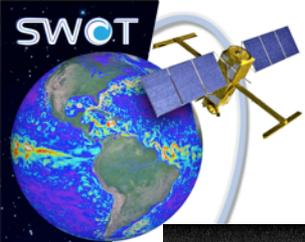




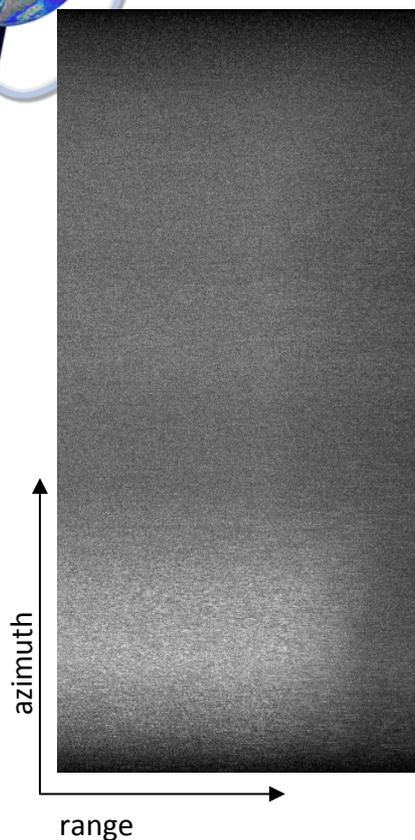
## Project Reference DEM, Prior Water Mask in SAR Geometry

- Based on knowledge of acquisition geometry and timing, project the reference Digital Elevation Model (DEM) and the associated prior water mask (and possibly other spatial auxiliary data) in SAR geometry.
  - The projection of the reference DEM in SAR geometry defines the grid for time-domain SAR processing and can also be used for layover prediction
  - Projected prior water (probability) map is used to improve robustness of water detection and absolute phase determination
  - Possible update of projections after geolocation (iteration)

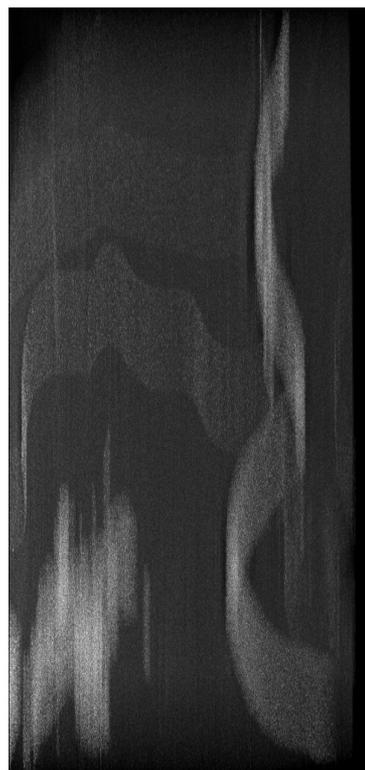




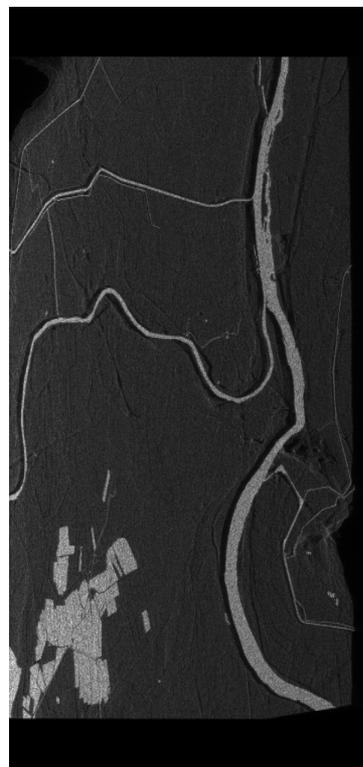
# SAR Processing



Raw data (from telemetry)



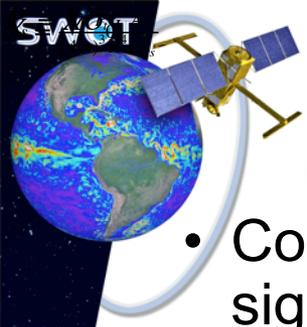
Range compression (improve range resolution)



Azimuth compression  
(improve azimuth resolution)

- Time-domain SAR processing

- Integrates Doppler estimation, co-registration of the two channels, and phase flattening w.r.t. the projected reference DEM (possibly taking also prior ionosphere, wet and dry troposphere delays into account)



# Radiometric Calibration

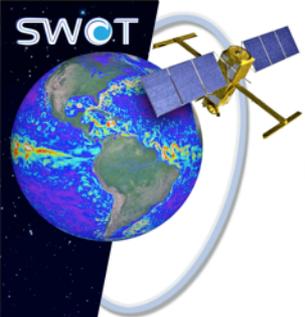
- Compute the so-called X-factor that maps  $\sigma_0$  to noise-free signal power.

$$P_s = X\sigma_0 \quad X = \frac{\lambda^2 P_t G^2 A}{(4\pi)^3 R^4 L_{\text{sys}}}$$

- The transmit power  $P_s$  is obtained from the calibration power measurements that monitor the drift over time, the range and area ( $R$ , and  $A$ ) are computed from geometry, the gain term  $G$  is obtained from prelaunch antenna gain measurements, and the system losses  $L_{\text{sys}}$  are also obtained from calibration measurements.
- Also compute the Noise-equivalent- $\sigma_0$  (NESZ) which is the  $\sigma_0$  that corresponds to a noisy measurement with no signal return.

$$\sigma_{\text{neq}} = \frac{P_N}{X}$$

- The noise power  $P_N$  is obtained from calibration measurements of system noise power (outside signal reception windows).



# KaRIn HR Ground Processing Flow Diagram

**SAS/PGE**

**Internal Products**

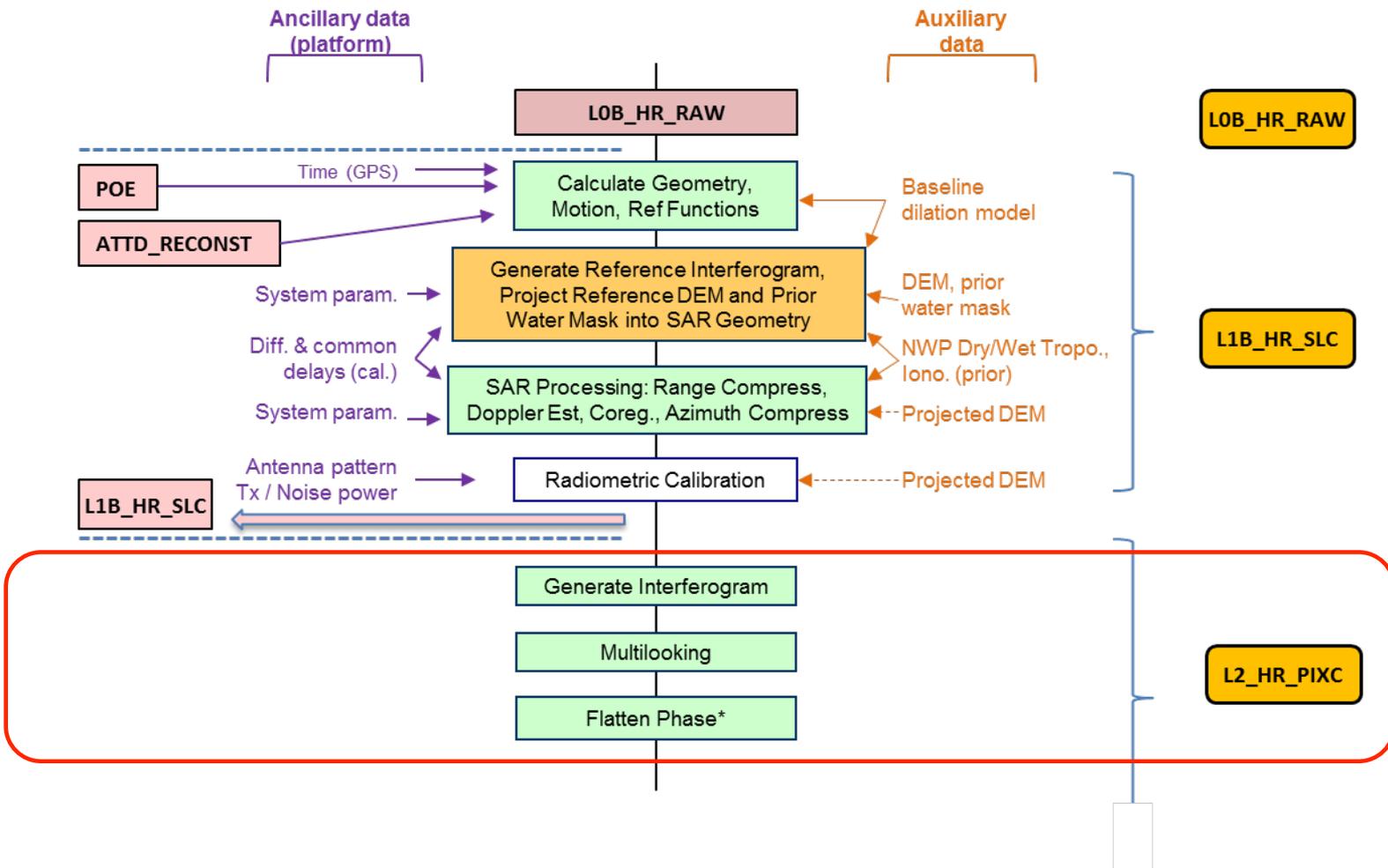
Standard Data Products

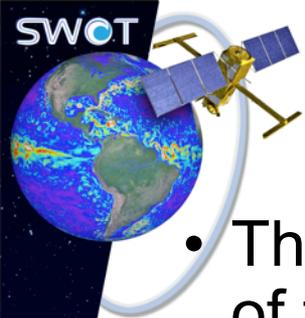
Maturity/Heritage

High/Previous Mission

Moderate/Simulation, Prototype

Low/Concept





# Generate Interferogram, Multilooking

- The raw interferogram is simply the pixel-by-pixel product of the reference SLC  $f_1$  and the complex conjugate of the coregistered secondary SLC  $f_2$ :

$$f_{\text{int}}(x, y) = f_1(x, y)f_2^*(x, y)$$

- Interferometric phase:  $\varphi(x, y) = \arg(f_{\text{int}}(x, y))$
- Multilooking: block averaging of L pixels in the azimuth direction, reducing azimuth posting by L (currently L~4)

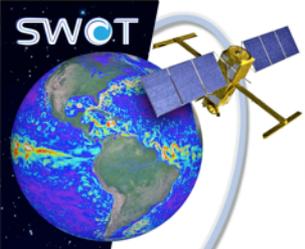
– Interferogram: coherent average of the L complex interferogram pixels

$$f_{\text{int}}^L(x, y') = \sum_{y=Ly'}^{Ly'+L-1} f_1(x, y)f_2^*(x, y)$$

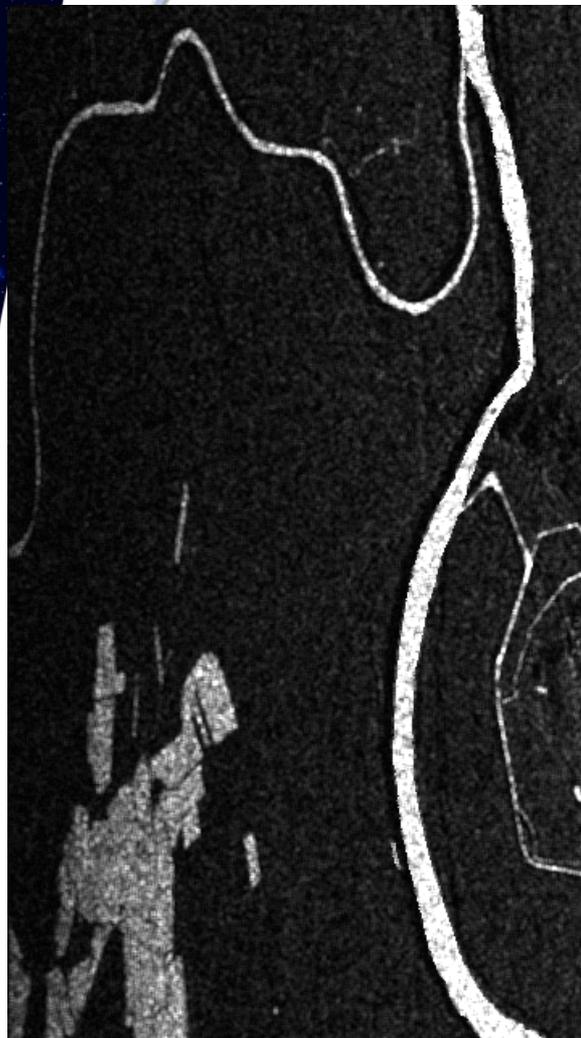
– Power channels: incoherent average of L pixel powers for channel  $i=1, 2$

$$P_i^L(x, y') = \sum_{y=Ly'}^{Ly'+L-1} f_i(x, y)f_i^*(x, y)$$

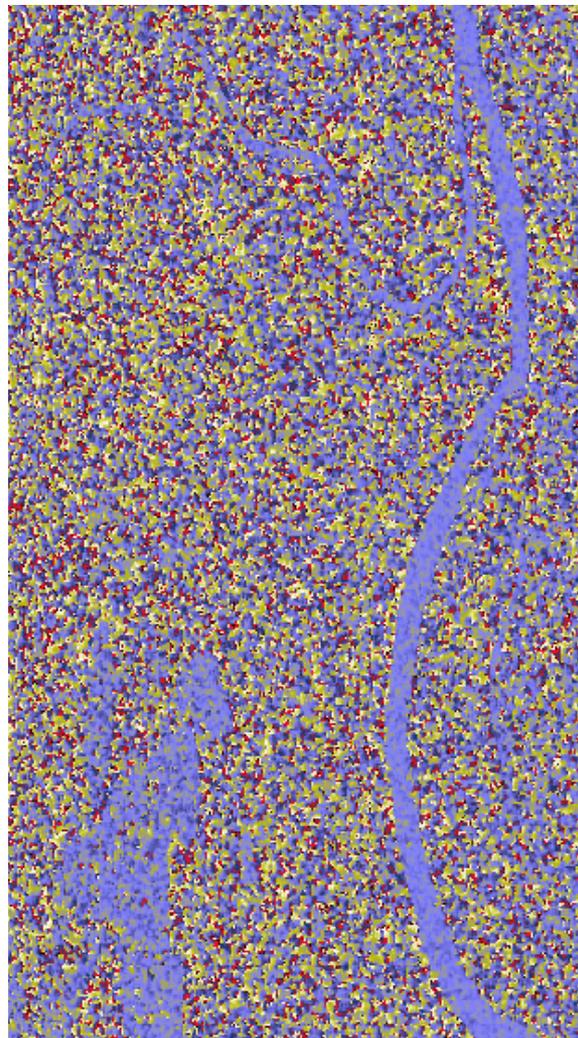
– Coherence (correlation):  $\gamma(x, y') = |f_{\text{int}}^L(x, y')| / \sqrt{P_1^L(x, y')P_2^L(x, y')}$



# Example of Simulated KaRIn HR Interferogram



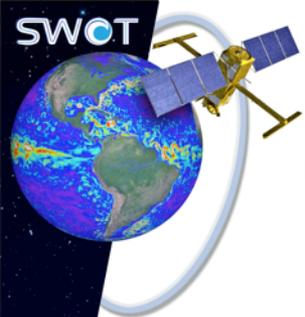
Amplitude (power)



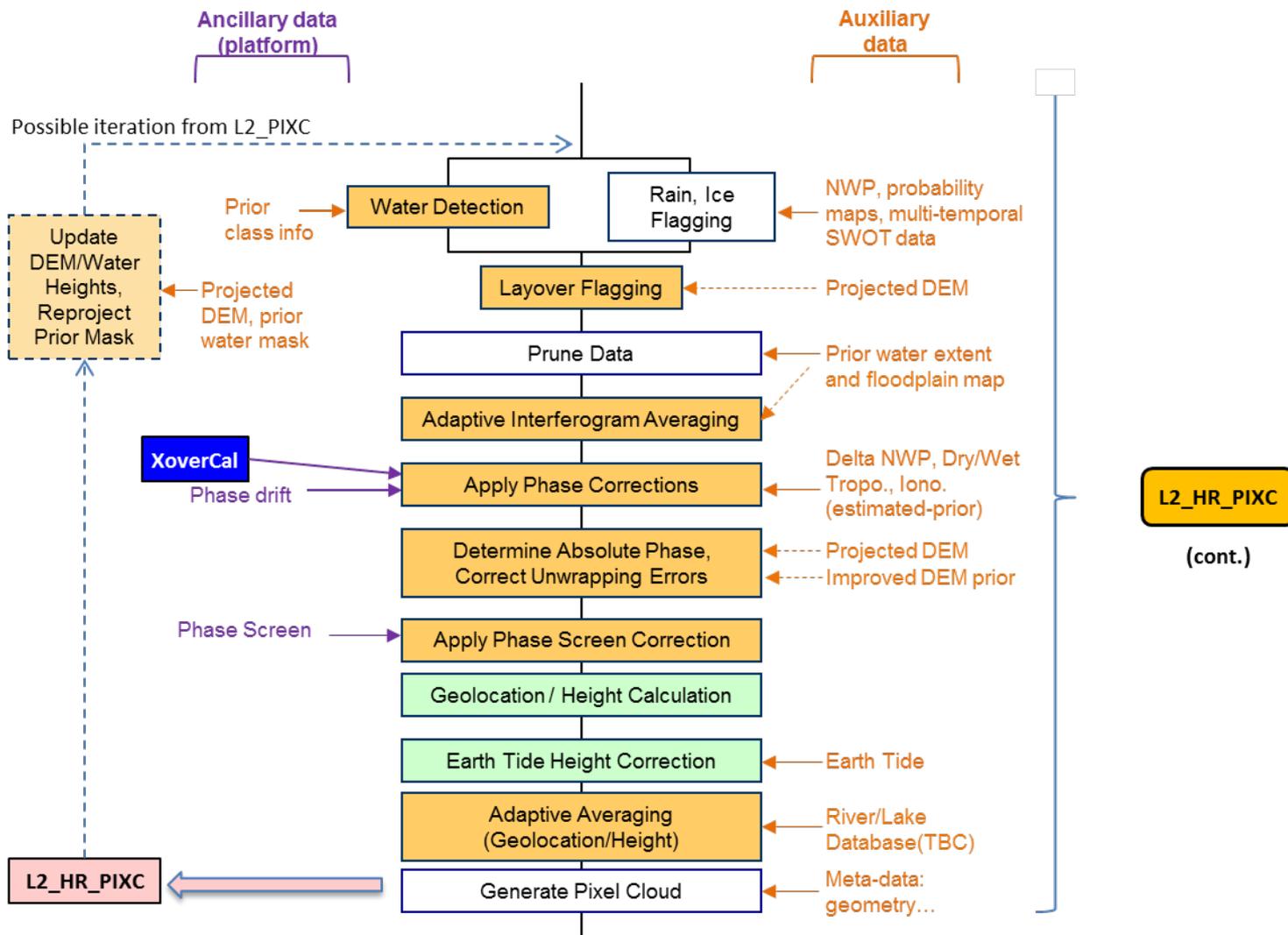
Phase (flattened)  $[0, 2\pi]$

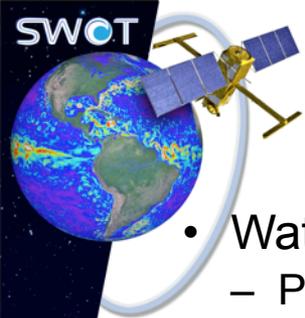


Coherence  $[0, 1]$



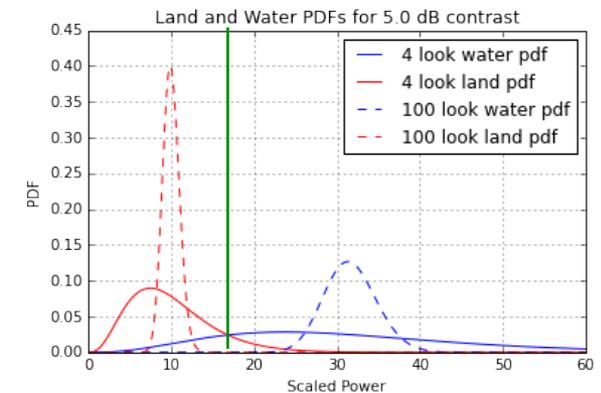
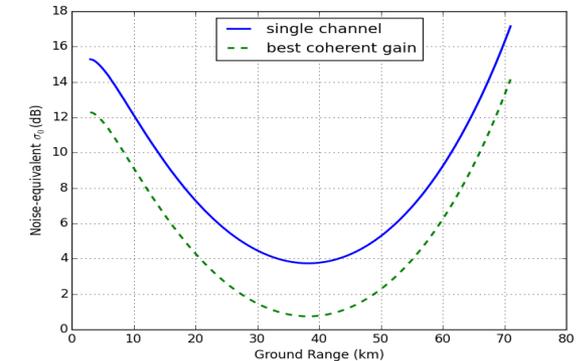
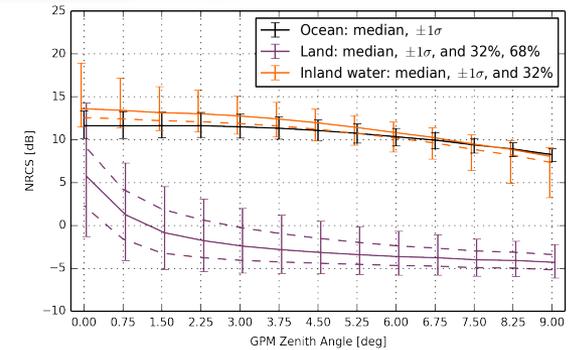
# KaRIn HR Ground Processing Flow Diagram

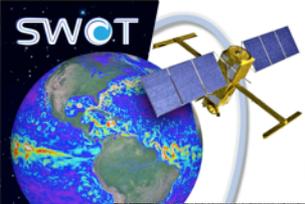




# Water Detection

- Water signal is distinct from land signal
  - Primarily by the power/ $\sigma_0$  (and the coherence)
  - Water is expected to be bright ( $\sigma_0 \sim 10-15$  dB)
  - Most land types are dark ( $\sigma_0 \sim -5$  to 0 dB)
  - But there are exceptions:
    - Dark water at very low wind speed
    - Some bright land types, e.g., roads, urban areas, hills/mountains (layover)
- SWOT has high thermal noise floor
  - $\sim 4$ dB noise-equivalent- $\sigma_0$  in best part of swath for single channel, but up to 3dB SNR gain by combining two channels powers coherently
  - Most land signals below thermal noise floor
- Several water detection algorithms developed
  - Pixel-wise Bayes detection, water fraction estimation
  - Contextual classification methods (MRF, snakes...)
  - Narrow river detection
  - Fusion schemes to combine the results
- Use of prior data for learning or in data fusion
  - Water mask, water probability map, DEM...
- Use of multitemporal data

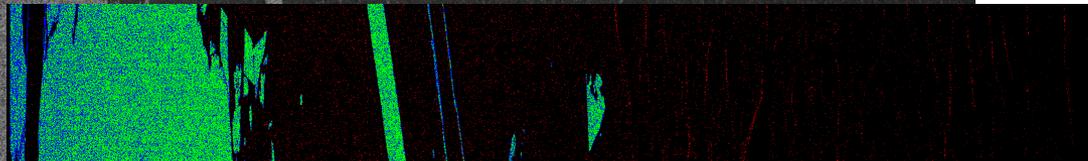




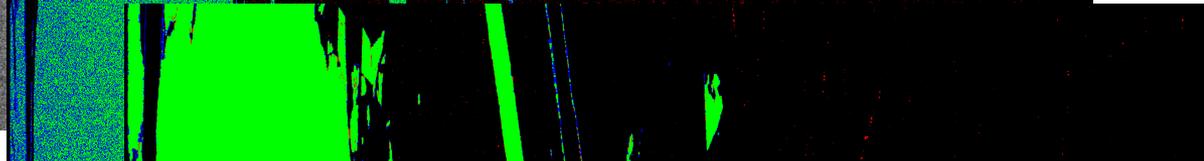
# Classification Results on Simulated KaRIn HR Image



Extract of simulated KaRIn HR amplitude image of the Camargue area (analysis conducted on the entire image)



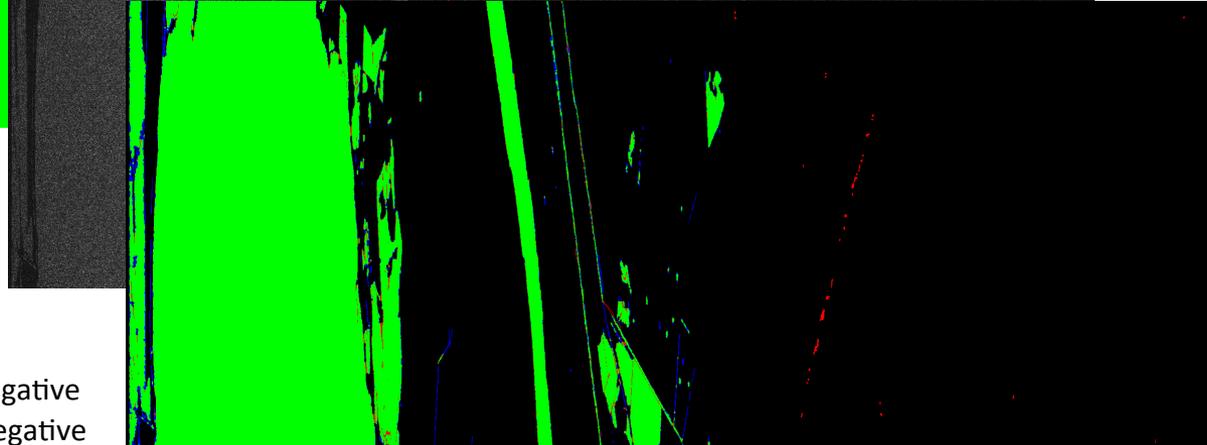
Pixelwise K-means classification (46.9 % error) just to initialize...



MRF (Markov Random Field) classification (5.8 % error)

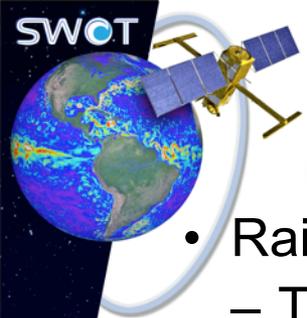


Detection of narrow river networks (in red)



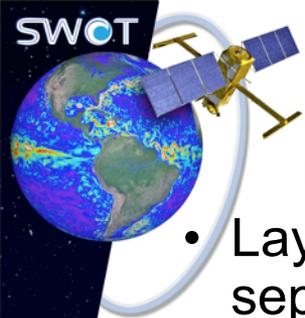
Fusion of MRF and narrow river networks (5.6 % error)

True positive True negative  
False positive False negative



# Rain, Ice Flagging

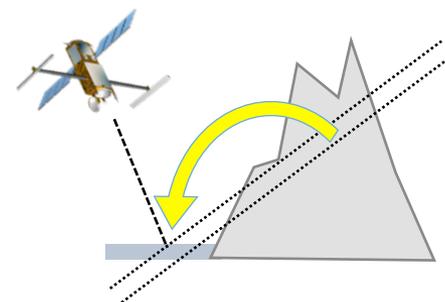
- Rain flagging:
  - The principle impact of rain on KaRIn/SWOT measurements is heavy attenuation (signal drop-out).
  - It is difficult to distinguish the rain signal from other dark classes (e.g., specular/dark water, forest, noise floor).
  - Use of auxiliary data: weather forecast, weather radars (NexRAD), scatterometers (ASCAT), altimeters (Altika), Precipitation Radar (GPM) etc.
- Ice/snow flagging:
  - The signal returning from ice/snow differs from land and water in two major ways: 1) producing a moderate power ( $\sim 0$ dB  $\sigma_0$ , relative to  $\sim -5$ dB land and  $\sim 10$ dB water), and 2) decreased coherence due to increased volume scattering.
  - It may be difficult to distinguish snow/ice from bright land or dark water, from the KaRIn/SWOT measurement alone.
  - Use of auxiliary data: regional/seasonal meteorological prior, data from other satellites (e.g. scatterometers, radiometers...)
  - Multitemporal analysis



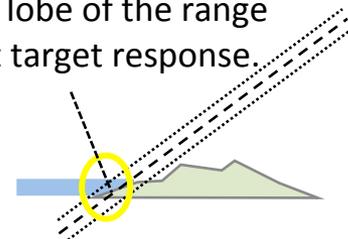
# Layover Flagging

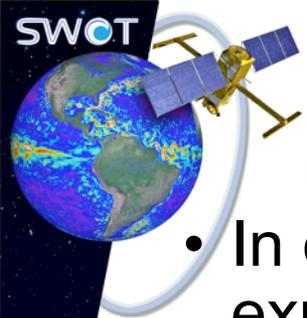
- Layover occurs when, due to topography or vegetation, returns from separate areas on the ground come back at the same time
- When returns from the terrain “lay over” water pixels, the measured water heights will have a bias (and a geolocation error) that is basically proportional to the relative difference in heights, contrast, and illuminated areas.
- Additionally, the boundaries of the water bodies will have “mixed pixels”, which also combine land and water contributions.
- Two approaches for layover flagging:
  - Geometric prediction based on a reference DEM
    - Detection of geometric inversion (slant/ground range)
    - Highly dependent on DEM resolution and accuracy
  - Detection of data anomalies due to layover
    - Coherence (but two opposite effects – may cancel)
    - Phase or height slopes (averaging over large area)
    - Use of multitemporal data to improve resolution

*Layover:* points within the lines produce a return in the same range bin



*Mixed pixel:* land and water inside the same main lobe of the range point target response.





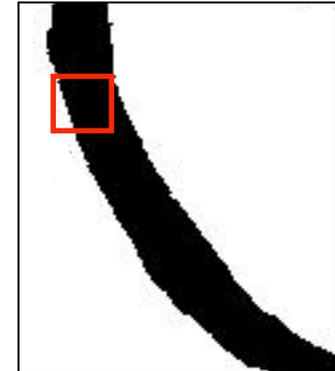
# Prune Data

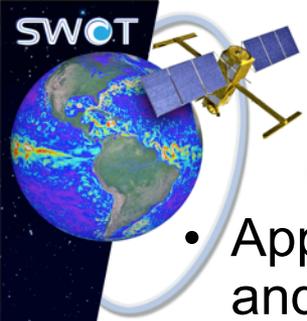
- In order to reduce data volume, only pixels that are expected to be useful in meeting downstream science objectives are preserved.
- These include pixels detected as water, as well as pixels in a buffer zone around all expected surface water given some prior maximum water extent mask.
- The inclusion of this buffer zone enables generation of the floodplain DEM from the pixel cloud and preserves the lowest level data that can be expected to be hydrologically useful.
- The pruning is expected to reduce the number of pixels for further processing and storage by a factor of ~10.



# Adaptive Interferogram Averaging

- Further averaging of the complex interferogram (and channel powers) to reduce phase noise prior to phase-to-height conversion and avoid loss of height precision
- Interferogram averaging is more efficient than averaging of 3D coordinates up to  $\sim 50$  looks
- Realized with a shape-adaptive sliding window (size  $\sim 3 \times 3$ - $5 \times 5$ )
  - Only average pixels within same class (water or land/buffer)
  - Keep the same posting ( $\sim 4$  looks)





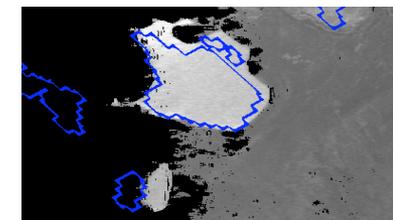
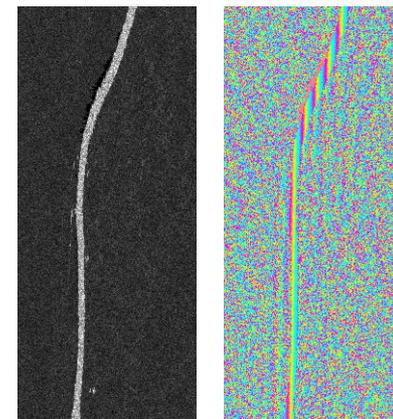
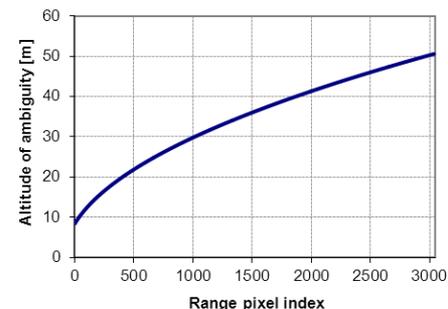
# Apply Phase Corrections

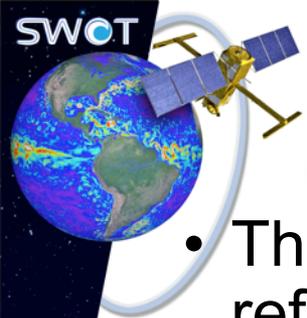
- Apply the phase corrections listed below to the flattened, multilooked and pruned interferogram.
- Similar to the corresponding LR corrections, except that they are applied to phase rather than height, and that radiometer and Ku/C measurements cannot be used to compute range delays over land.
  - Phase drift correction: compensate measured instrument drift between the reference and secondary channel (slow variation).
  - Wet/dry troposphere: based on NWP model (ECMWF, MERRA...)
  - Ionosphere: GIM (GPS Ionosphere Model)
  - Crossover calibration: ocean crossover roll estimates, interpolated over land
- Prior models for some range delay corrections may be applied during SAR processing, in which case the corrections applied here are the differences between the estimated and prior corrections.



# Phase Unwrapping, Absolute Phase

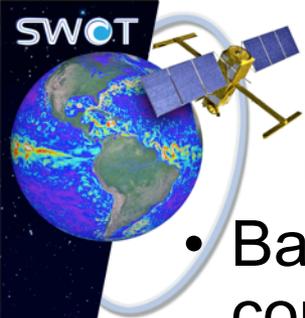
- The phase is flattened w.r.t. the reference DEM but residual fringes will occur due to limited DEM resolution and accuracy (when error  $> \pm 4$  m in near range and  $> \pm 25$  m in far range)
- Algorithm concept:
  1. Classic spatial phase unwrapping
    - Use minimum cost flow based algorithms to unwrap phase of detected water bodies (heritage from AirSWOT, SRTM reprocessing, ...)
    - The results will be disconnected regions with undetermined  $2\pi$  ambiguity for each region
  2. Correct phase ambiguity inconsistency within each water region
    - Using continuity of each water region and water surface flatness to determine relative phase ambiguity
  3. Determine phase ambiguity for each water region
    - Use DEM and other prior information
    - Slope anomalies and range shifts indicate ambiguity error
- Reference DEM: SRTM v3, NASADEM, TanDEM-X...?
- Reference water heights can be improved with SWOT measurements





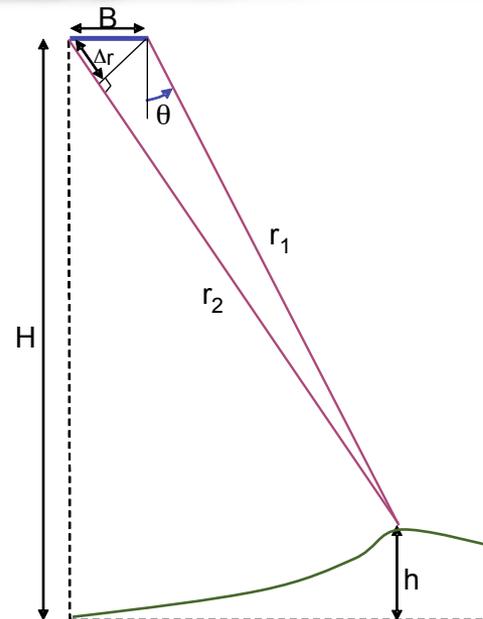
# Apply Phase Screen Correction

- The phase screen is a phase error caused by multi-path reflection of the antennas and the close-by platform structures. It depends on the echo arriving direction of the target (look angle) and can be approximated as a function of the absolute interferometric phase.
- The phase screen correction must therefore be done after absolute phase determination.
- This phase term is very slow function of time and will be determined from cross-over paths by the post-calibration.
- After phase drift and phase screen correction, we get the absolute interferometric phase, which will be used for determining geolocation of each image pixel.

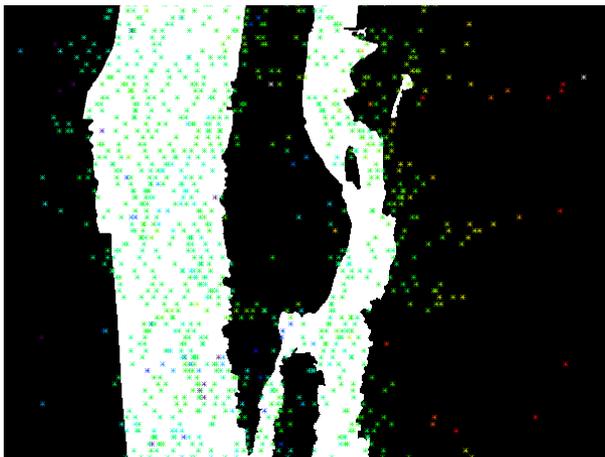


# Geolocation / Height Calculation

- Basically the same principle as for computation of geolocated heights in LR mode.
- Invert absolute interferometric phase into geolocated heights, using the direct geocoding equations



Example



Ground-projected (lat,lon) ideal water mask (ground truth) shown in white. Dots indicate geolocation of pixels and color = height.

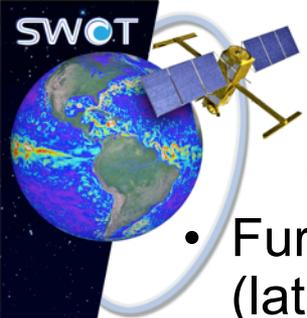


~50-look geolocation [medium]



# Earth Tide Height Correction

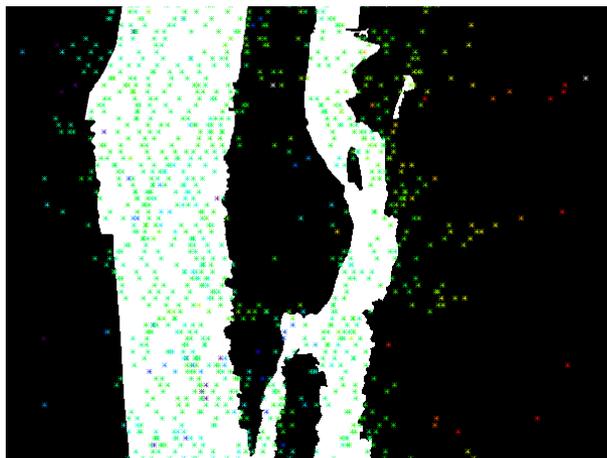
- Correct the earth tide after the geolocation of each pixel of the pixel cloud product has been determined.
- The earth tide is the displacement of the solid Earth's surface caused by the gravity of the Moon and the Sun.
- The displacement is function of time and geolocation.
- Earth tide displacement model used for earlier missions (legacy system).



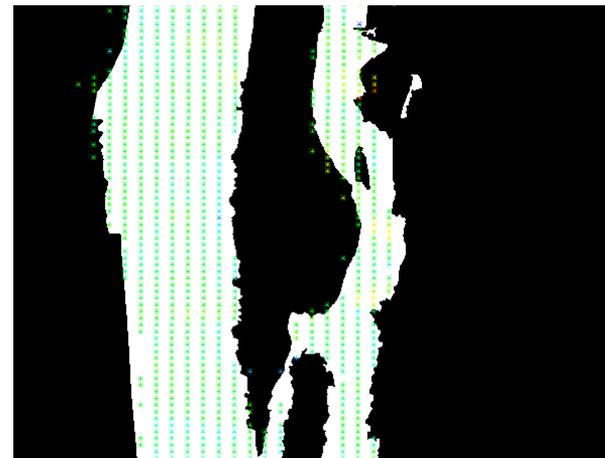
# Adaptive Averaging (Improved Geolocation)

- Further averaging to generate, in addition to the principal (lat,lon,height) triple, an additional (lat,lon) pair with improved geolocation, in order to facilitate the use of L2 HR data.
- Several approaches proposed:
  - Further shape-adaptive averaging (big window)
  - MAP estimate using prior heights (that can be iteratively improved)
  - Regularization of entire detected water bodies, reaches or lakes based on spatial relationships and estimated height/slope

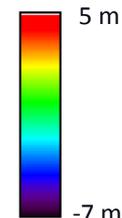
Example



~50-look geolocation [medium]



Improved geolocation [well-done]





# Generate Pixel Cloud

- Gather results of L2 HR processing steps to produce the pixel cloud
- The pixel cloud is a compact representation of the results of water detection, layover, rain and ice flagging, data pruning, instrument and geophysical corrections, and estimation of geolocated heights

*[rare]*  
*~4 looks*

*Posting kept close to full resolution (~4 looks) to be able to accurately represent rivers > 50 m, lakes > 100 × 100 m<sup>2</sup>, and to perform only minimal averaging of information*

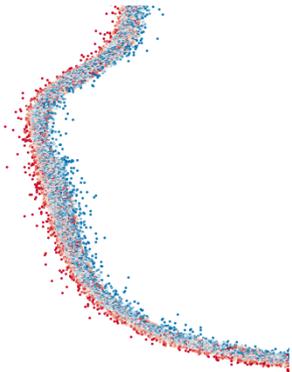
- *water mask with layover/rain/ice flags, estimated water fraction*
- *slant range pixel coordinates, ground-projected pixel size*
- *phase-flattened interferogram, phase corrections (TBC)*

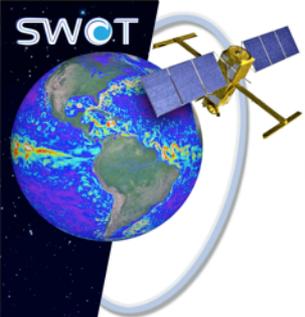
*[medium]*  
*~50 looks*

*Additional interferogram averaging up to ~50 looks prior to phase-to-height conversion to optimize precision while preserving water surface topography*  
*- (lat, lon, height) and associated uncertainties*

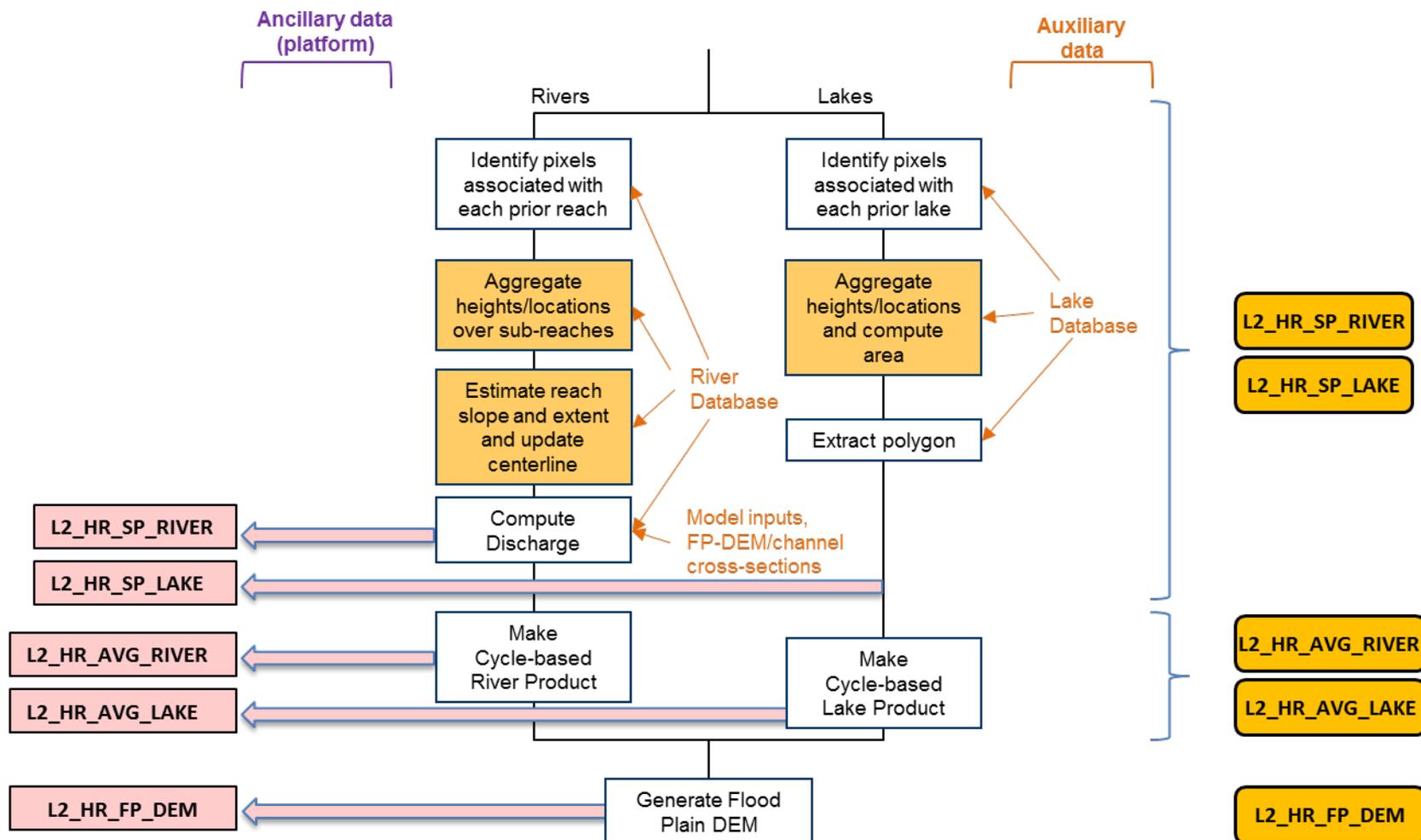
*[well-done]*  
*>>100 looks*

*Further adaptive averaging >> 100 looks to improve geolocation*  
*- improved (lat, lon)*





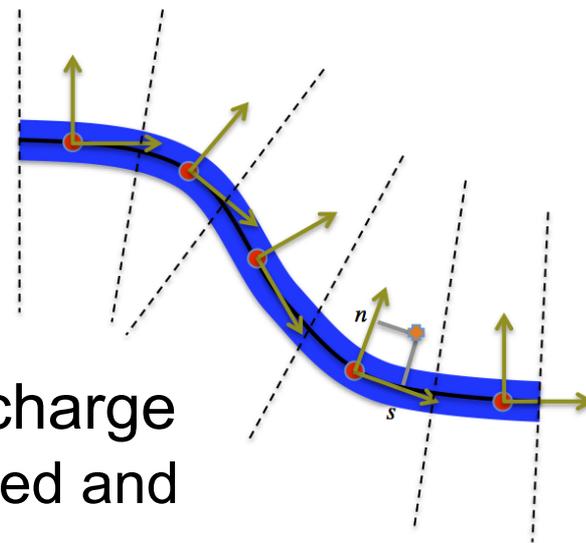
# KaRIn HR Ground Processing Flow Diagram





# Compute River Vector Products

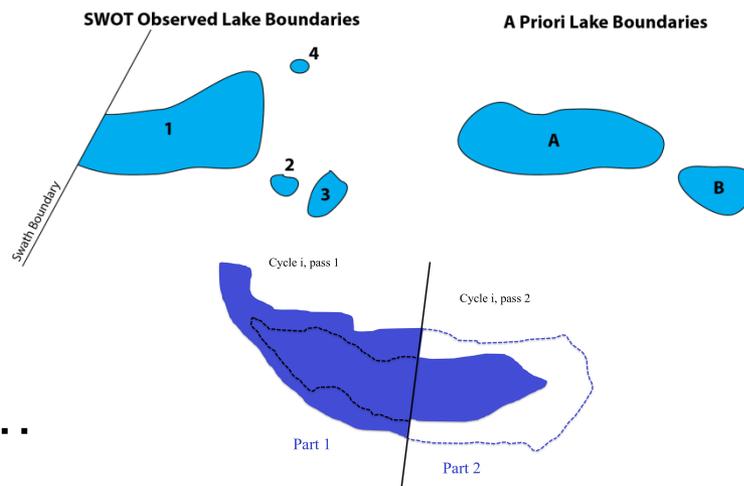
- Prior database of river reaches, centerlines
- Identify water pixels associated with each prior reach
- Aggregate heights/locations along the centerline
- Estimate reach slope and extent and update the centerline
- Concept implemented (RiverObs)
- Computation of reach-averaged discharge
  - Several algorithms have been proposed and compared (“Pepsi challenge”)
  - Substantial Science Team effort on algorithms and prior data
- Cycle-based (or monthly) average product
  - Based on stack of pixel clouds





# Compute Lake Vector Products

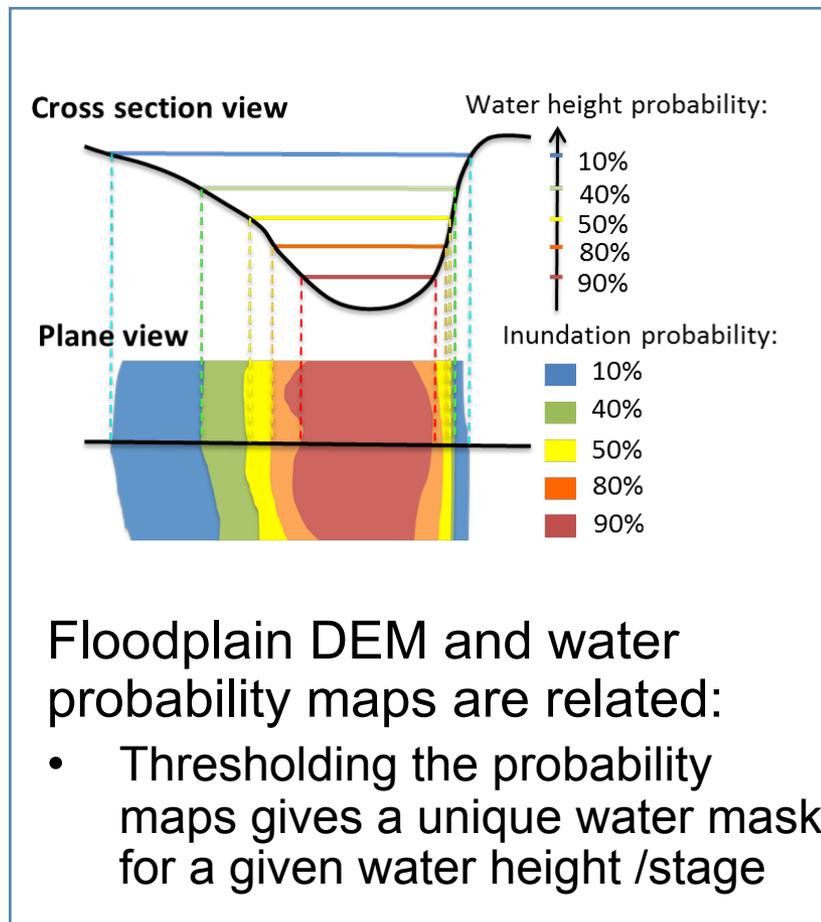
- Prior database of lakes
- Identify water pixels associated with each prior lake
- Aggregate heights/locations and compute area
- Extract polygon → Pass-based lake product
- Cycle-based (or monthly) lake product
  - Merged lake regions based on stacked information
  - Includes computation of storage change
- Challenges
  - Mismatches between detected and prior water masks
  - Partial observation (swath coverage, dark water)
  - Lakes appearing, disappearing...





# Floodplain DEM

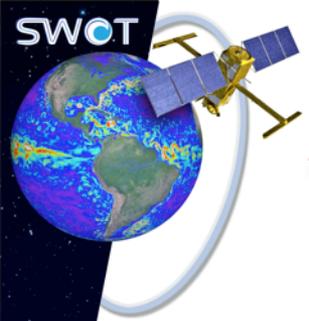
- Two concepts
  - **Bathtub ring**: use water heights for edge pixels used to estimate floodplain DEM elevations (limited to observed min/max water heights)
  - **Interferogram stacking**: use land phase, but need to beat down noise before geolocation (multitemporal averaging)
  - Final product combining both (complimentary approaches)
  - Option: update bathtub method continually with inline algorithm, then generate with stacking approach and combine offline on ~yearly interval



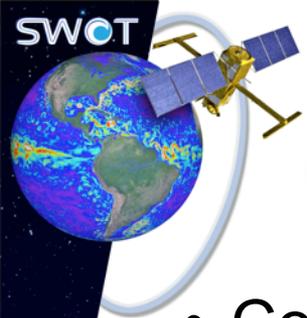


# Algorithm Status and Outlook

- The SWOT Algorithm Development Team (ADT) has elaborated preliminary LR and HR algorithm flows.
- The preliminary algorithm flows and individual steps are described in the Algorithm Description Document (ADD).
  - Represents current understanding, often with several options
  - Both flows and individual algorithms are likely to evolve.
- Prototyping and testing of algorithms on simulated SWOT data of increasing realism, and on AirSWOT data.
- Selected algorithms will be further detailed in Algorithm Theoretical Basis Documents (ATBDs).
- Science Team (ST) members can and are encouraged to contribute to algorithm development, prior data.
  - More on algorithm development, prior data and the interface between ADT and ST on Wednesday.

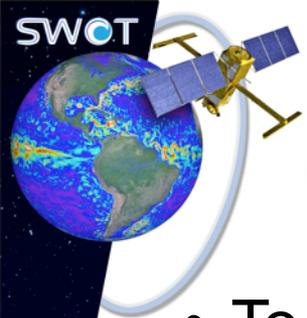


# Backup



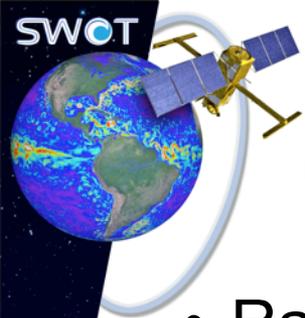
# Processing of SWOT Data

- Considerable heritage from nadir altimetry processing for
  - Nadir altimeter
  - Radiometer (though in each KaRIn swath rather than nadir)
  - DORIS/GPSP (Precise Orbit Determination)
  - Attitude (also from other satellite missions, AirSWOT...)
- Remainder of presentation devoted to KaRIn processing
  - Low Rate (LR) data mainly for oceanography, acquired continuously over both ocean and land
  - High Rate (HR) data mainly for continental hydrology, acquired over HR mask only
  - Some heritage from nadir altimetry processing, but principally from spaceborne and airborne SAR interferometry (SRTM, AirSWOT...)



# Receive Only Noise Estimation

- To estimate the noise power level  $\bar{n}$  of the acquisition system, data are regularly recorded at times where no pulse is being received (no signal, only noise), for each channel and swath.
- The receiver noise estimate has to be averaged to reduce the error. The averaging interval will be selected based on the on-orbit variability. Outliers will not be used for the averaging, and will be flagged for further investigation.
- This receive-only noise is required to compute the normalized radar cross section (NRCS, also referred to as  $\sigma_0$ ), the SNR...



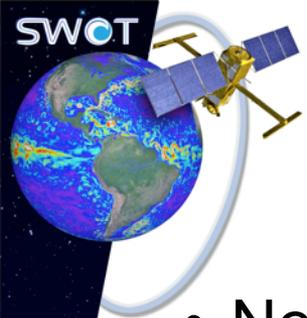
# Amplitude Correction

- Radiometric calibration of each power image applying only propagation and instrument corrections (but no geophysical corrections).

$$\sigma_0 = A_{corr} (P_{rx} - \bar{n})$$

$$A_{corr} = \frac{(4\pi)^3 R^4}{P_{tx} G_{tx} G_{rx} \lambda^2 A_{rc}}$$

- Requires knowledge of platform attitude and instrument properties (transmitted power, antenna gains), range cell size, range, etc...
- Computed as a correction factor, applied later



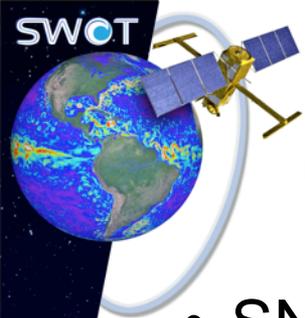
# Geometric/Angular Correlation Estimation

- Needed to invert SWH from total correlation (coherence)

$$\gamma^{(J)} = \gamma_n^{(J)} \gamma_{\varphi,g}^{(J)} \gamma_{vol}^{(J)}$$

noise      angular/geometric      volume

- Geometric/angular decorrelation is due to the fact that
  - pixels are not points, but surfaces with an extent, and that the interferometric phase difference varies throughout the resolution cell,
  - the misalignment of iso-range and iso-phase (cfr. phase bias).
- The angular correlation equation is specific to the SWOT OBP algorithm.



# SNR, $\sigma_0$ and Noise Correlation Estimation

- SNR and  $\sigma_0$  computed based on the SAR power images, the receive-only noise power and the amplitude correction

$$SNR^{(J)} = \frac{P_{rx}^{(J)} - \bar{n}^{(J)}}{\bar{n}^{(J)}}$$

$$\sigma_{0,uncorr}^{(J)} = A_{corr}^{(J)} \cdot (P_{rx}^{(J)} - \bar{n}^{(J)})$$

- Noise correlation estimated directly from the SNR of the two channels

$$\gamma_N^{(J)} = \frac{1}{\sqrt{\left(1 + \frac{1}{SNR_1^{(J)}}\right) \left(1 + \frac{1}{SNR_2^{(J)}}\right)}}$$