# Waveform Feature Extraction Using (Relatively) Slow Digitization

Jim Braun July 5, 2018

#### **Motivation & Goals**

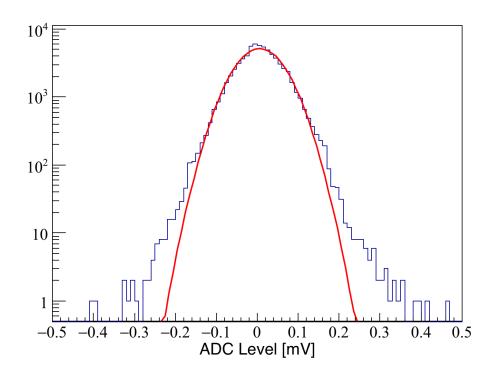
- Slow digitization (~40 Msps) yields power and cost savings in proposed Gen2 optical module
- Single digitization source simplifies hardware, calibration, and downstream software
- Question: Do we impair physics capabilities with slower digitization?
- Goal: Evaluate effects of using a single, slow digitizer on feature extraction:
  - 1. Charge resolution
  - 2. Timing resolution
  - 3. Double-pulse separation

#### **Analysis**

- Simulate a 40 Msps device with identical low-pass pulse shaping to the IceCube fADC
  - Create 40 Msps waveforms by injecting pulses assuming the standard IceCube fADC SPE pulse template
  - Add random noise to each bin (128 total bins)
  - Make bin value discrete assuming SPE peak → 20 counts
- Unfold waveforms using wavedeform
  - Modified to handle waveforms from single digitizer
- Compare unfolded pulses to true injected pulses
- Do the same for ATWD-like device, for comparison

#### IceCube DOM fADC Noise

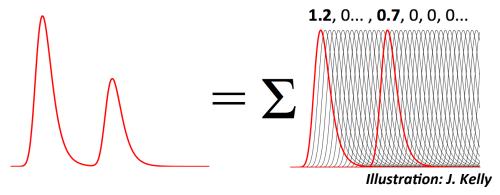
 Create a histogram of the first bin of fADC waveforms with local coincidence



- Noise peak is reasonably well-described by a Gaussian of width 54  $\mu V$ 
  - Use this Gaussian in model

# Waveform Unfolding: Wavedeform

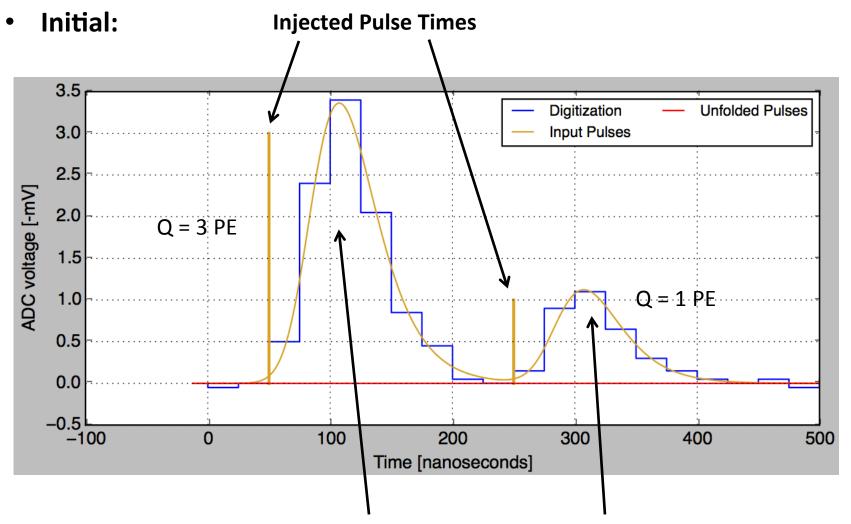
- Waveform is a superposition of SPEs
- SPE template waveform represents response to SPE
  - → Unfold the waveform using a vector of time-shifted SPE templates as a basis



#### Formulate the unfolding as a least-squares problem

- Solution is the weighted superposition of basis functions that minimizes the chi-squared (basis weight == charge)
- Basis weights must be non-negative: we can't simply invert the basis matrix to get the answer
- Use Lawson-Hanson NNLS: Represent the waveform using the fewest basis functions possible
- Use relatively dense basis with 1 ns spacing
- Use IceCube "road-grading": bins within 2σ of noise are set to zero

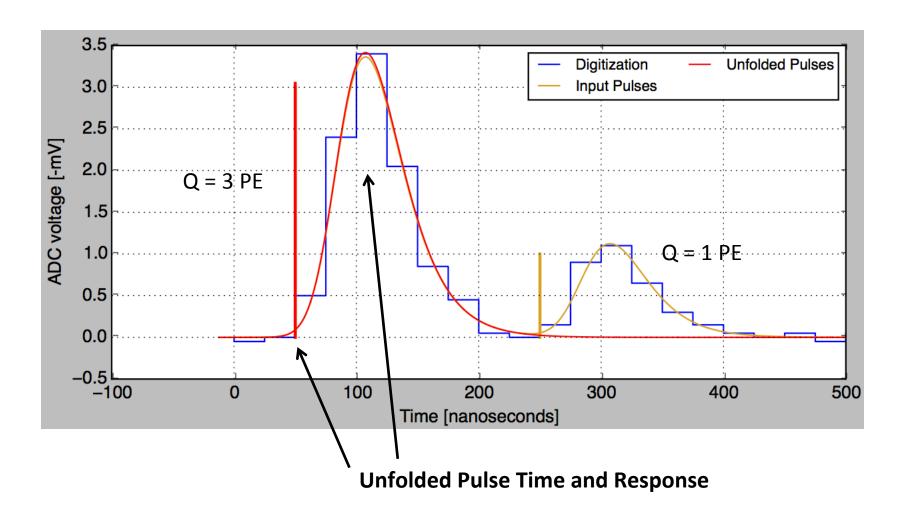
# Waveform Unfolding



**Expected Response and Noisy Digitization** 

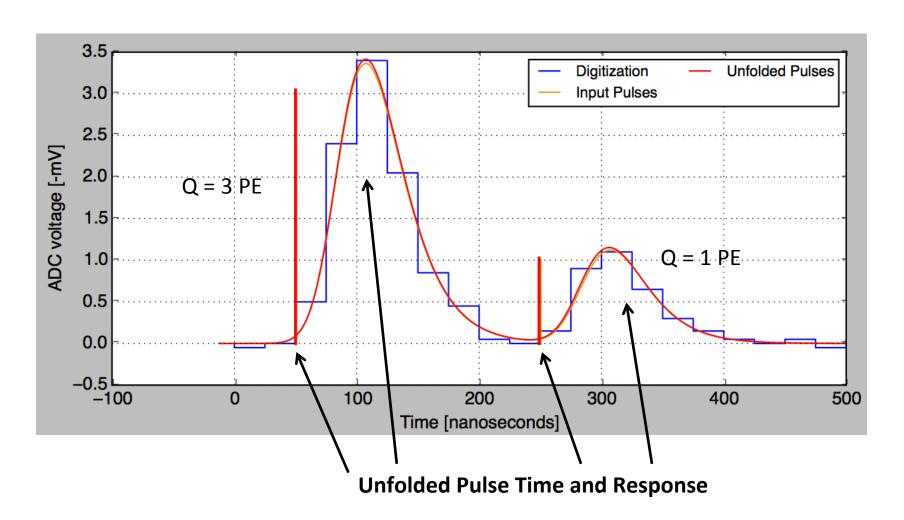
# Waveform Unfolding

#### • Iteration #1:



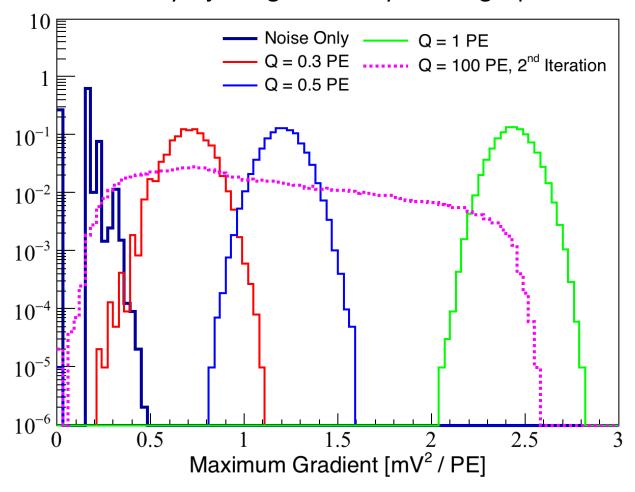
# Waveform Unfolding

#### Iteration #2:



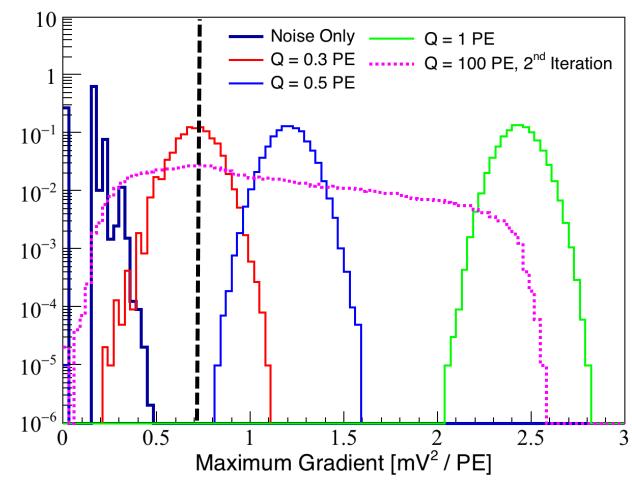
#### Free Parameter: Stopping Tolerance

- Add pulses to the waveform in order of max basis gradient
  - Stop when no member of basis set has a gradient larger than specified tolerance
  - Determine best tolerance by injecting noise only and single pulses



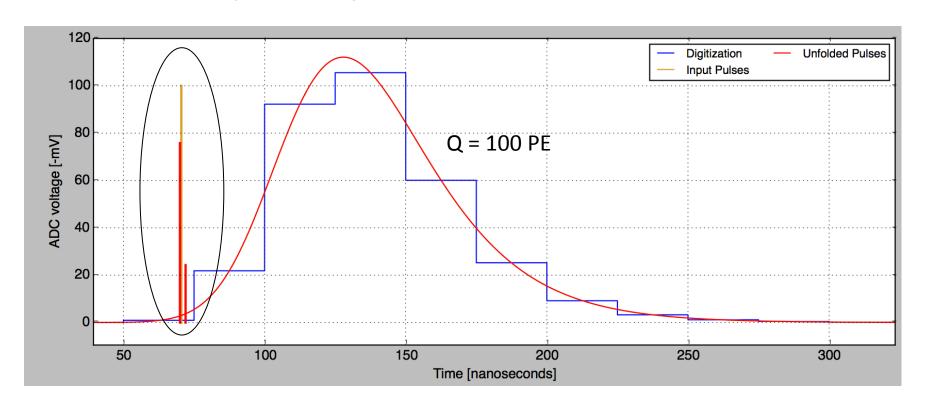
# Free Parameter: Stopping Tolerance

- Add pulses to the waveform in order of max basis gradient
  - Stop when no member of basis set has a gradient larger than specified tolerance
  - Determine best tolerance by injecting noise only and single pulses
- 0.7 mV^2/PE tolerance avoids noise-only pulses and captures ~50% of 0.3 PE pulses
- Produces a 2<sup>nd</sup>
  pulse for ~50%
  of 100 PE pulses



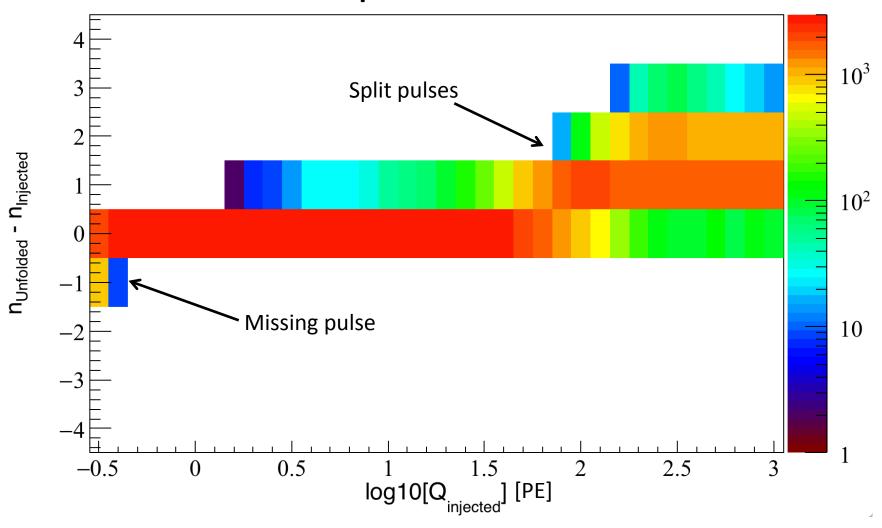
# Split Pulses

Occurs when pulse is injected in between start times in basis



- Data is fit nearly perfectly with unfolded solution
- Unfolding problem is extremely underdetermined
  - Behavior like this is impossible to avoid

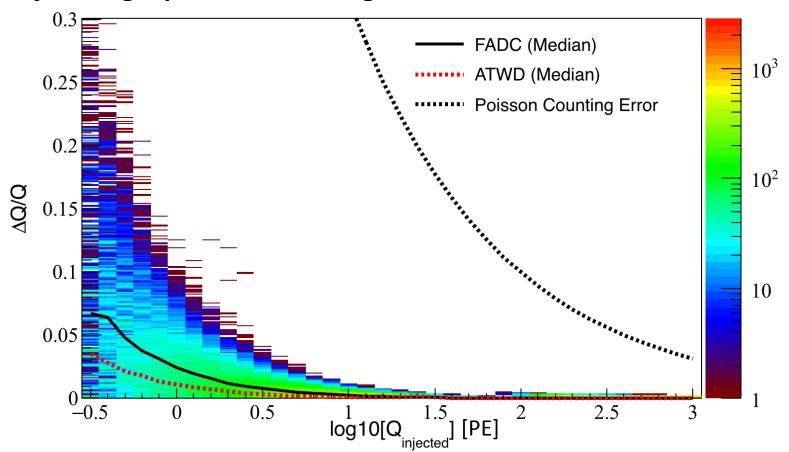
# Split Pulses



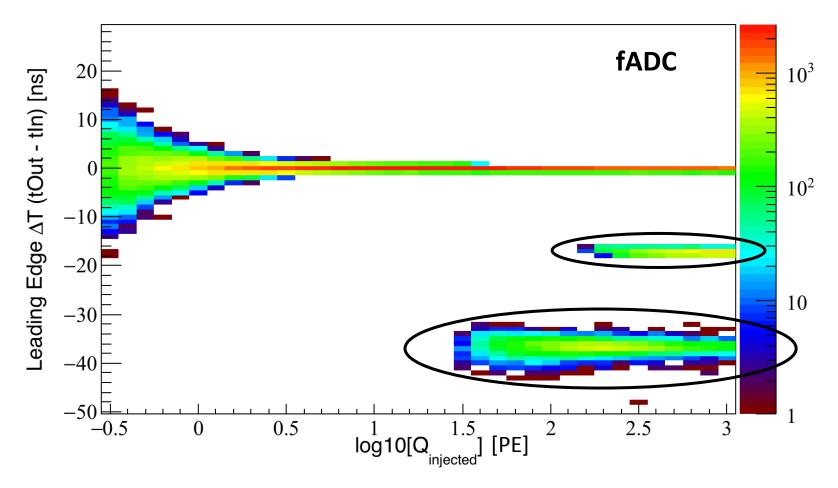
- Pulses > ~50 PE tend to be split
- Splitting pulses isn't necessarily bad
  - Photons don't all arrive at the same time in real life

# Charge Resolution

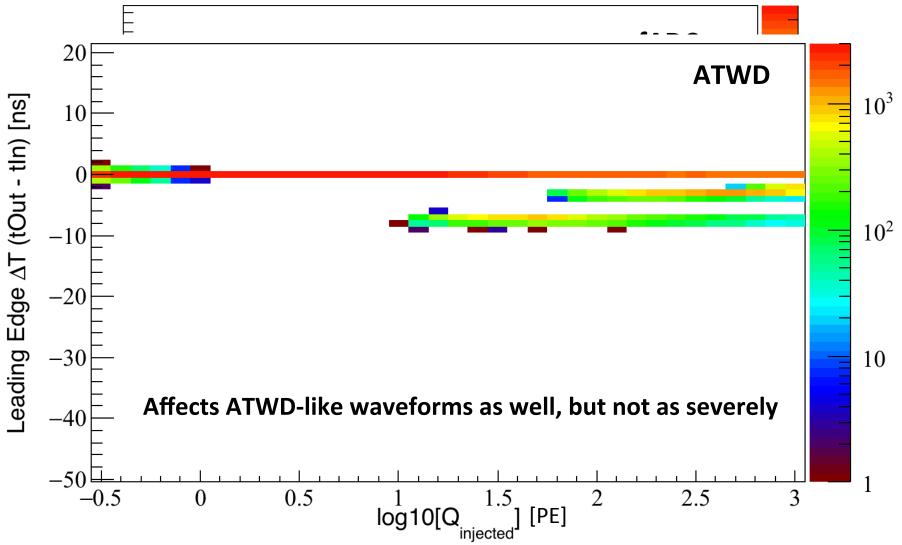
Inject single pulses with charge 0.3 PE < Q < 1000 PE</li>



- Poisson error dominates if using Q\_unfolded to measure amplitudes
- Resolution better than 1 PE over entire range of Q\_injected
- Shouldn't be significantly different with more complex waveforms

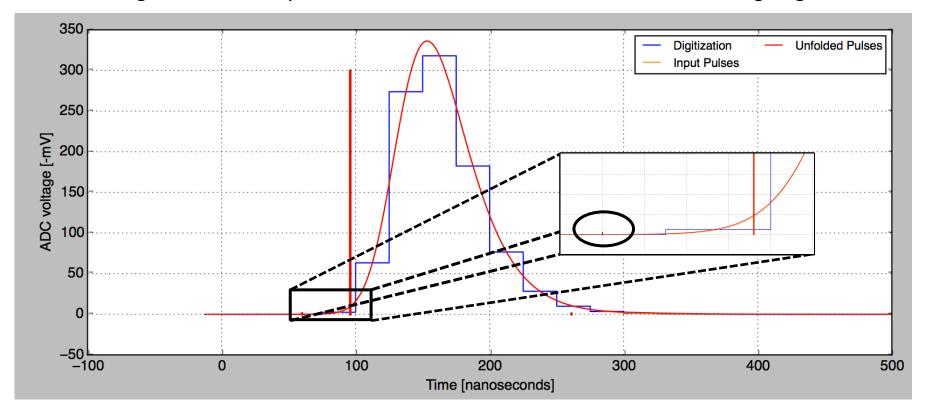


- Unfolding produces early pulses for Q > 30 PE
- Early pulses are problematic for reconstruction
  - A single early pulse can significantly affect track reconstruction
- This is a major problem



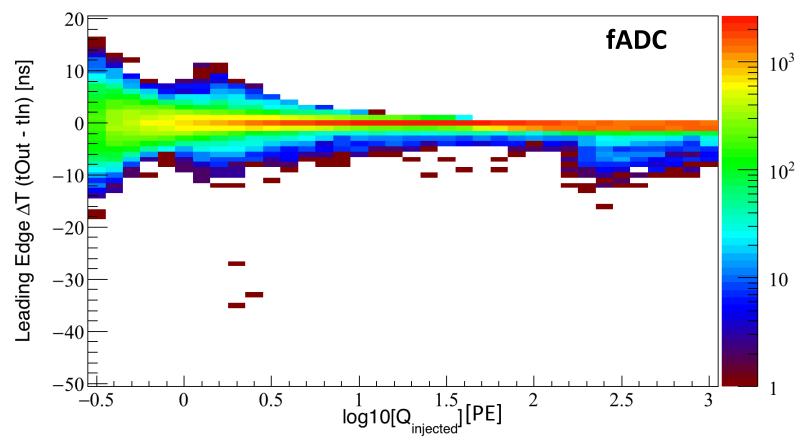
- A single early pulse can significantly affect track reconstruction
- This is a major problem

- Mechanism: Large pulse immediately preceding a start time in basis
  - Algorithm adds a pulse 1-2 waveform bins earlier to match leading edge

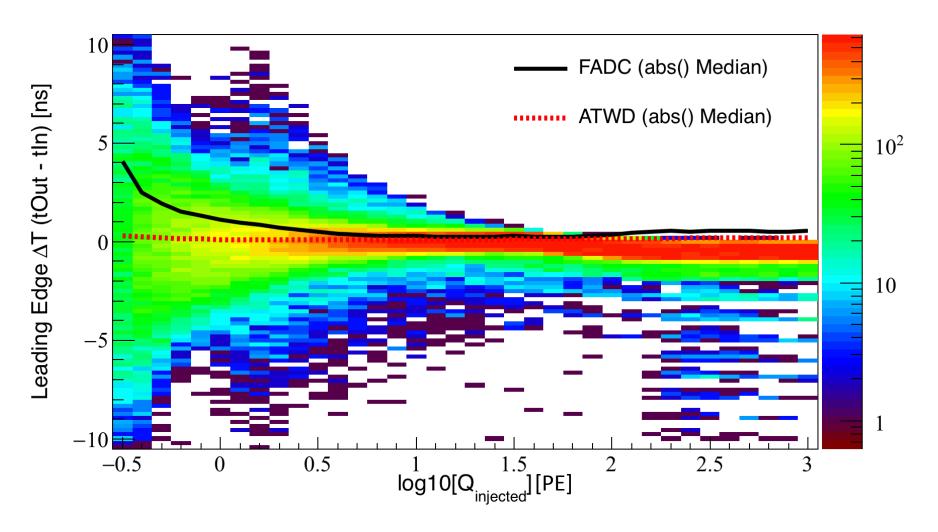


- Best description of waveform is a superposition of start times on either side of start time of injected pulse
  - This solution is not considered because tolerance is reached before neighboring basis function is allowed to become nonzero

 Ad hoc solution: Run unfolding until no basis has a positive gradient, then add back basis in order of charge until tolerance is reached

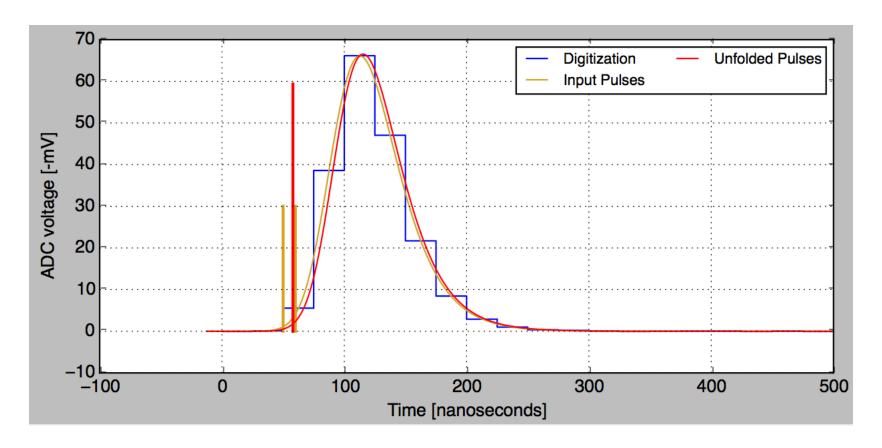


- Significantly reduces artificial early start times
- Work to improve algorithm is needed and is ongoing
- This problem indicates that waveform templates must be precise!



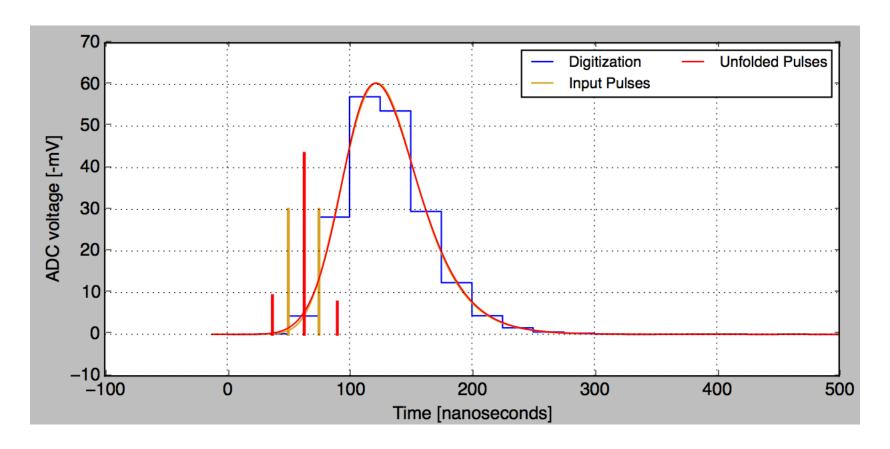
Median timing uncertainty from unfolding already near 1 ns at 1 PE

- Inject two pulses: Q1 = Q2 = 30 PE
- $\Delta T = 10 \text{ ns}$



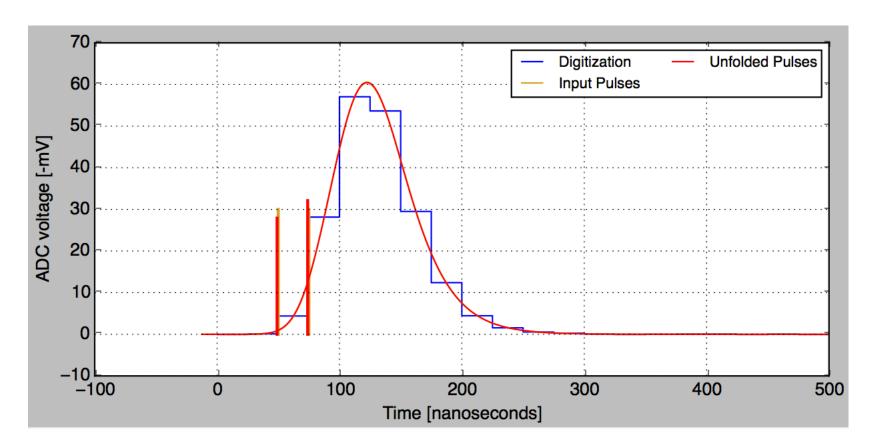
- Double pulse not resolved
- Treated as single, large pulse

- Inject two pulses: Q1 = Q2 = 30 PE
- $\Delta T = 25 \text{ ns}$



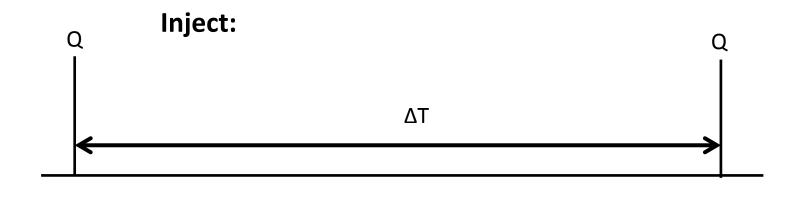
 Waveform unfolded into three pulses, with largest in the middle of the two injected pulses

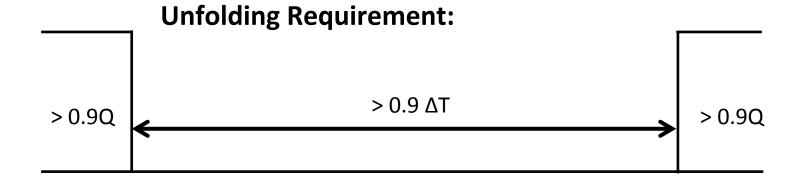
- Inject two pulses: Q1 = Q2 = 30 PE
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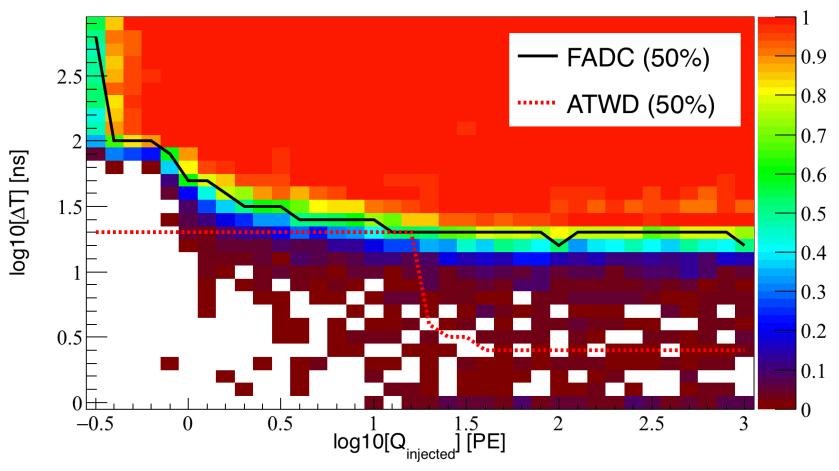
- Same waveform, but with unfolding modifications from leading edge study
- Double pulse resolved even though not obvious from waveform by eye

- Inject two pulses, each with charge Q and separation ΔT
- Declare double-pulse resolved if there is a gap of at least
   0.9 \* ΔT inside the 0.45 0.55 quantiles of unfolded charge





Fraction of double pulses resolved



Q = 1 PE: ~50 ns

• Q > 10 PE: ~20 ns

Not fully optimized!

#### **Conclusions and Caveats**

- We can extract charge and leading edge time from a 40 Msps waveform with accuracy better than other limitations (i.e. Poisson sampling, time calibration, etc.)
- We make the implicit assumption that the SPE template used for unfolding is the same one that we injected
  - If SPE template used for unfolding is not correct, results could be very different, particularly for large pulses
  - SPE pulse templates probably need to be more accurate than those used in IceCube
- The performance of wavedeform out-of-the-box is unacceptable for this use case
  - Modifications to the algorithm yield acceptable performance
  - Additional work likely needed if single 40 Msps digitizer is used in Gen2

#### Extra Slides

