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Deviceless respiratory motion correction in PET imaging – exploring the potential of novel data driven strategies


Presented by Adam Kesner, Ph.D., DABR

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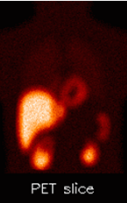
AAPM Spring clinical meeting, 2015

Introduction

- Respiratory and cardiac motion are inherent problems in medical imaging
- Limits scan quality
 - Resolution
 - Quantification
 - Lesion detectability
 - AC artifacts



True projection




PET slice

Simulation

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Thorax PET Spatial Resolution vs Time



Year	Transverse resolution (mm)
1975	15
1980	14
1985	13
1990	12
1995	11
2000	10
2005	9
2010	8

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Slide prepared by Kate Pedraza, MS

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Introduction

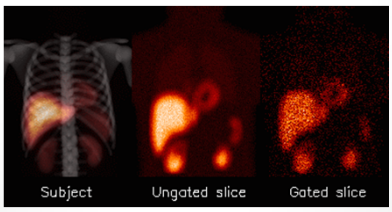
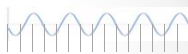
- Respiratory motion considered the resolution limiting factor in thorax imaging
- Future perspective

“Respiratory motion handling is mandatory to accomplish the high-resolution PET destiny”

Oliver D. Respiratory motion handling is mandatory to accomplish the high-resolution PET destiny. *European Journal of Nuclear Medicine and Molecular Imaging*. 2008;35(11)
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Introduction

- Gating is a potential solution

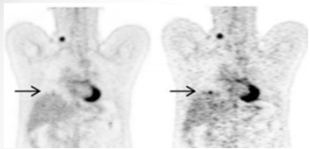


Subject Ungated slice Gated slice

Simulation

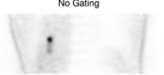

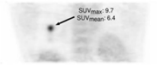
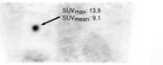
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Detection



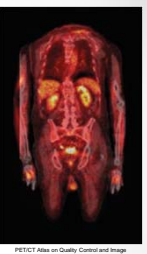
PETCT Atlas on Quality Control and Image Artifacts, © IAEA, 2014, p59

SUV quantitation

	No Gating	With Data-Driven Gating
NonAC		
AC		

Oliver et al., *EJNMMI Physics*, 2014

AC artifacts



PETCT Atlas on Quality Control and Image Artifacts, © IAEA, 2014, p59

Introduction


- State of respiratory gating technology in nuclear medicine:
 - 10+ years of research
 - Major vendors sell integrated systems
 - Many clinics own necessary equipment
- Respiratory gating rarely used in routine imaging
- (my) question: why is respiratory motion correction failing its transition into the clinic?
- (my) answer: cost / benefit
- (my) solution: stick around for the talk!

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Introduction

- Cost / benefit of gating
 - Most respiratory gating is implemented using hardware based respiratory tracking equipment



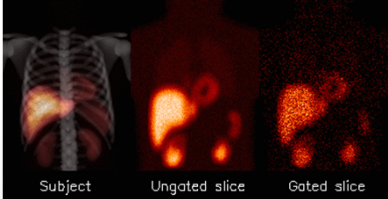
- Negatives of such equipment include
 - Patient discomfort
 - Prone to setup error
 - Slower throughput
 - Increased costs (hardware, training)
 - Increased radiation dose
- Overall gating represents a change towards complexity when considered for use in routine scanning

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Introduction

- Cost / benefit of gating
 - There is a fundamental tradeoff when gating
 - Improved resolution comes with the loss of image statistics,
 - Benefit uncertain



Subject Ungated slice Gated slice


Simulation

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Introduction

- Gating comes with a cost and has uncertain benefit



If we can bring the cost of gating to nil, and the benefit to guaranteed – that could change the equation.

- We propose to do this with 2 independent / integratable steps
 - Both based on utilizing information currently unused

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Presentation overview

Software driven motion control

- Software driven gating
analogous to hardware
- "Gating+"
method for signal optimization
- Recovery of continuous motion
method for decoupling data from gates it was created with

Automated workflow

↓

- Summary/implications

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Software driven gating

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Section I

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Respiratory gating in PET

- Hardware driven gating is the field standard
- In recent years several software-based methods have been presented to extract respiratory signal to be used for gating
- Software driven methods appeal
 - Ease of use
 - Operator independent
 - None of the errors in the application of hardware
 - If integrated properly, their implementation would be a software add-in, and require no change to current clinical protocols

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Introduction

- The idea behind software based algorithms:
 - There is a lot of information in list mode data not being utilized**
 - signal from respiratory motion
- The challenge:
 - How to sort out signal from the noise?

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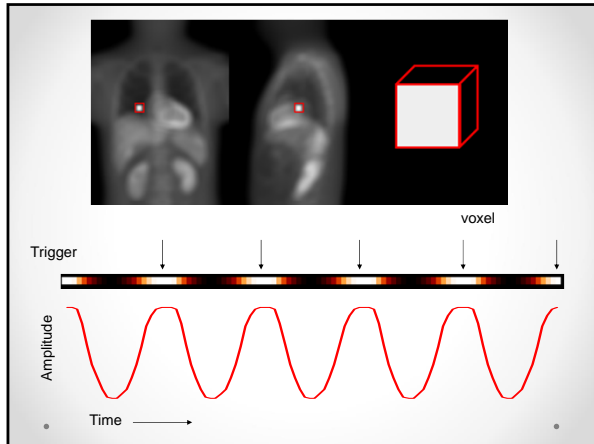
IVF method (2009)

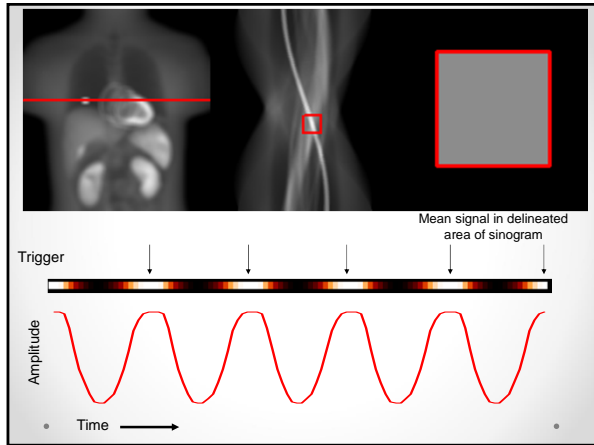
- Image Voxel Fluctuation method for extracting respiratory signal from data
 - Use the fluctuating signals per voxel over time
 - $\sim 2 \times 10^7$ voxels in scan
 - Signal extracted from each voxel evaluated
 - Global respiratory signal is created as a combination of many individual voxel contributions
- Different than traditional image based methods of following structural movement
 - fully automated



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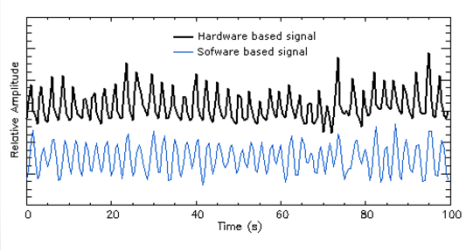
Acquisition of respiratory signal (SRF method)

- Summary

The flowchart illustrates the SRF method for respiratory signal acquisition. It starts with a PET scanner, followed by a box labeled 'PET sinogram'. The next step is a box labeled 'Consecutive 500 ms acquisition data are loaded into 50 sinograms and then collapsed to a smaller data structure (~0.5GB memory)'. This is followed by a box labeled '100 time activity curves are extracted from each small sinogram location and processed, a global respiratory trace is generated'. The final step is a box labeled 'Patient Respiratory Trace' showing a sinusoidal wave. The flowchart is attributed to the '2015 AAPM spring clinical meeting'.

Results – SRF method

- Comparison of hardware based and software based signals

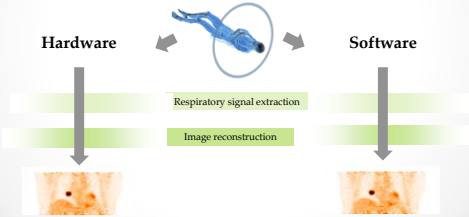


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NJH experiment

- We compared **hardware** vs **software** gating
 - 189 FDG PET scans were acquired around the thorax (116 patients)
 - Respiratory gated images reconstructed using software and hardware based methods.



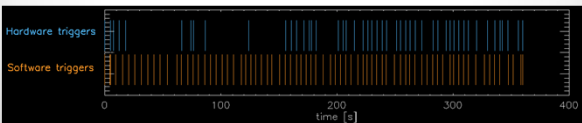
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Results

Triggers

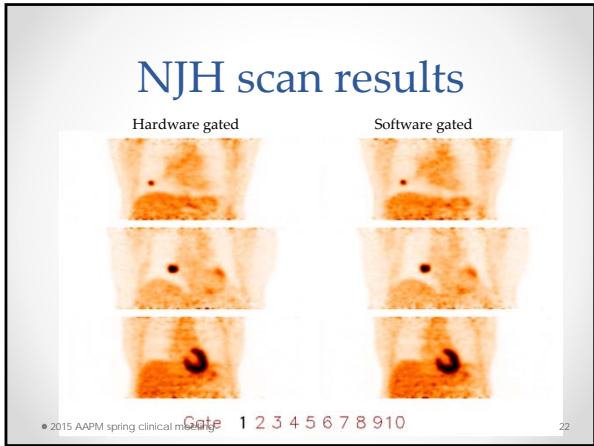
- ~1 min of processing/ scan for respiratory trigger extraction
- 92% percent of the cases exhibited periods of time where hardware failed to adequately acquire signal and software succeeded



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Example hardware fail

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Discussion

- Software gating appeared to work as well as (and in some cases better) than hardware gating
 - Limitations not yet seen
- Software gating has obvious advantages:
 - Uses existing information that is prematurely thrown out
 - Requires no changes to current clinical procedures
- Fits within “doing more with less” framework
 - All existing PET scanners are (theoretically) capable of software based gating – require a software patch
- The “low cost” implementation of software gating can reasonably support a PET field where motion corrected images are ubiquitously available for review.
 - SUV max in images displayed increased an average of

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Gated signal optimization:

Gating+


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Section II


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Introduction

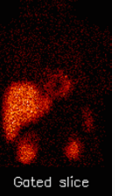
- Separating available statistics into phase-bins results in decreased image quality – less statistics per bin



Subject



Ungated slice



Gated slice

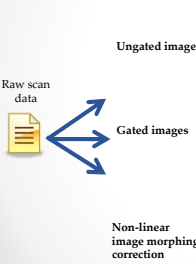
Simulation

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Introduction

- A center with gating equipment has a choice


Raw scan data




Ungated image

Gated images


Non-linear image morphing correction



Dependable (time tested)




Improved resolution, inferior contrast
*Benefits condition specific



Improved resolution and contrast, uncertain accuracy
*Benefits condition specific

It appears utilization of extra motion information comes with uncertain risk



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Methods

- Non-linear image morphing has been proposed for recombining gated data
- We present an alternative strategy for utilizing the additional information provided by motion characterization - "gating+"
 - Basic precept: Movement of signal in space is expressed in intensity fluctuations in individual voxels over the gated frames
 - Our methods are based on isolating the fluctuations in voxels, and modulating them according to their reliability

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Methods

- A gated scan can provide two sets of information per voxel

Correctly gated

Voxel Fluctuations = motion + noise

Randomly gated

Voxel Fluctuations = noise

Triggers

Simulations

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Methods

- By looking at the effective “signal” to “noise” ratio at every voxel, we can selectively accept fluctuation information in voxels that benefit from gating, and filter fluctuation information in voxels that do not, thus optimizing information at every voxel.

Voxel at liver lung boundary benefits from gating -> preserve fluctuations

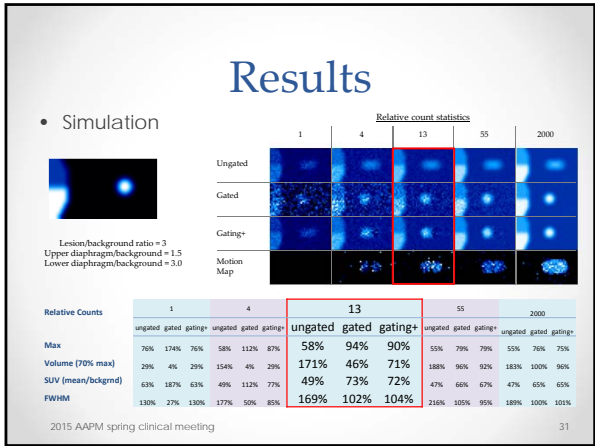
Voxel signal in background tissue is degraded from gating -> dampen fluctuations

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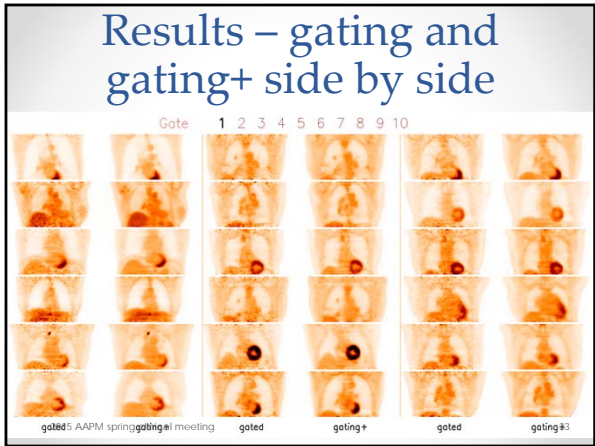
Methods

- Gating+ protocol:
 - Look at activity over gates in every voxel_{x,y,z} for volume
 - Characterize real fluctuations (correctly gated scan) and noise (randomly gated scan) through frequency amplitude analysis
 - Accept only those frequencies which are supported by statistics
- Method verification
 - Simulations
 - 189 NJH FDG PET scans
 - Previous work in small animal PET

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Discussion

- Our gating+ gate combination algorithm offers an alternative approach to optimizing information acquired in a gated scans

A

4D non-linear image morphing algorithms

B

1D signal optimization algorithm

- All correction comes down to (simple) 1 dimensional equation
- Characterizable/reproducible
- Fast
 - ~20 sec processing for gating+ (µPET volume * 16 gates)
- Accuracy:
 - All corrected voxels in simulation have a higher probability of being closer to truth than uncorrected voxels
 - Corrected image is derived from a selective use of raw information
 - No offset vectors created from assumptions
- 100% Fully automated

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Discussion

- Algorithm works with effective signal
 - Irrespective of reconstruction algorithm, smoothing, etc
 - Irrespective of quality of signal
 - Areas not benefiting from gating, or entire scans not benefiting from gating, will be returned to their ungated embodiment
- Algorithm utilizes available information and optimizes its transformation into Cartesian space.
 - Does not preclude the use of non-linear morphing algorithms
- Potential applications:
 - Support use of routine gating thorax imaging
 - Respiratory, Cardiac imaging
 - Human, small animal
 - PET, SPECT, CT (low dose 4D CT), MRI...

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Motion-gate information decoupling

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Section III

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Introduction

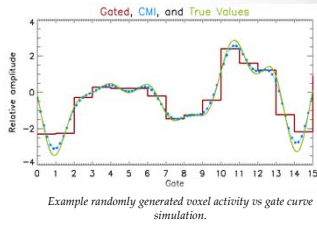
- When information is optimized in frequency space, during the gating+ processing, there is an opportunity to shift the phase of the signal by rotating the frequency components in real and imaginary space. This allows a user to extract a voxel value at any and all phases of the cycle.
 - Values adhere to the optimized frequency information
- By repeating process for all voxels, can reconstruct phase shifted images
 - ~0.02 seconds processing per slice
- With this process, we can reconstruct continuous motion image (CMI) sequences

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Phase shifted curve validation

- We generated 10⁶ simulations of true gate-activity
 - Signals < Nyquist frequency
- Gated (step function) values were derived from the true curves, CMI values were derived from gated curves
- In 100% of the simulations the CMI curves correlated better with truth than the respective gated curves.



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Combined data driven workflow results

• • •
Data driven gating
+
Gating+
+
Phase shifted CMI frame images

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Workflow results

- All images created using standard FDG PET acquisitions
- Animations created with 90 frames/cycle, displayed with 30 frames/second

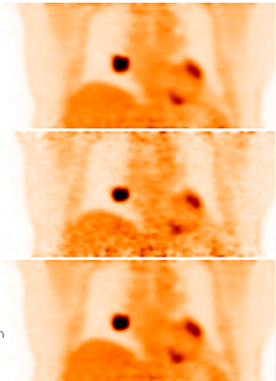
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Ungated

Software gated

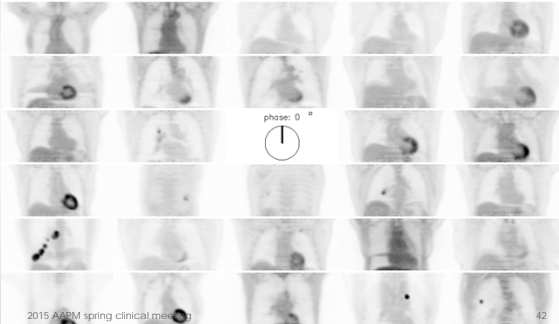
Gating+ w/
signal optimization



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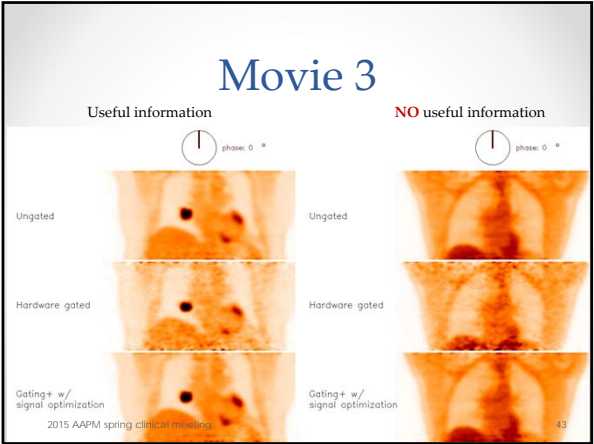
Population motion

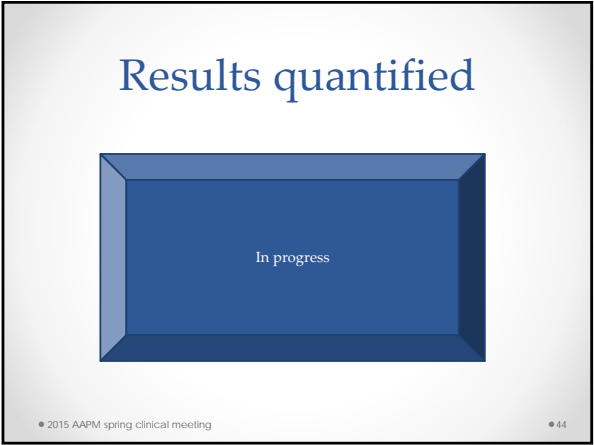


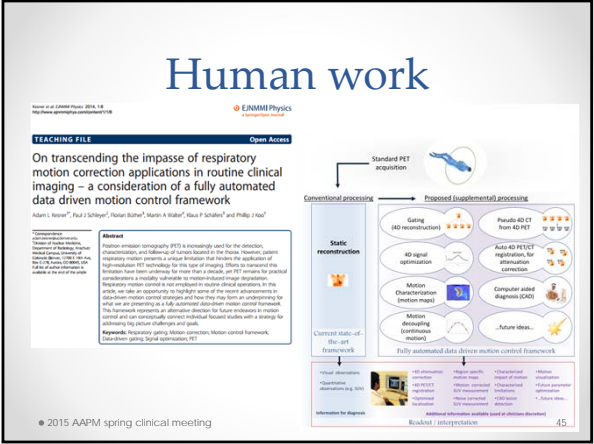
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Human work

Kenner et al. JNM PET Phys. 2014; 1:8
http://dx.doi.org/10.1118/1.2511118

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TEACHING FILE

On transcending the impasse of respiratory motion correction applications in routine clinical imaging – a consideration of a fully automated data driven motion control framework

Adam J. Kenner¹, Paul J. Schaper², Florian Schuer³, Martin A. Hübner⁴, Klaus P. Schuler⁵ and Philip J. Lee⁶

Abstract
Respiratory motion correction (RMC) is increasingly used for the detection, characterization, and follow-up of tumors located in the thorax. However, current respiratory motion correction is a complex technique that involves the application of high-resolution PET technology for this type of imaging. Effects to improve the technique have been underway for more than a decade, yet PET remains for practical applications a mostly unworkable in motion-based image degradation. Respiratory motion control is not employed in routine clinical applications. In this article, we take an opportunity to highlight some of the recent advancements in data-driven motion control strategies and how they may form an understanding for what we are presenting as a fully automated data-driven motion control framework. This framework represents an alternative approach for future endeavors in motion control and can potentially correct individual focused studies with a strategy for addressing the practical challenges and goals.

Keywords: Respiratory gating, Motion correction, Motion control framework, Data-driven gating, Signal optimization, PET

Vendor reconstruction

With in-house data driven gating
gate: 0

With DDG & gating+ signal optimization
phase: 4

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Human work

Kenner et al. JNM PET Phys. 2014; 1:8
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Vendor reconstruction

With in-house data driven gating
gate: 0

With in-house data driven signal optimization
phase: 4

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Presentation summary

- There is information in PET data that is not being utilized
- We present data driven gating, signal optimization, and information decoupling strategies
 - Can be used separately or combined in an automated workflow.
 - Can be implemented in clinical setting with minimal impact
 - Can be used with minimal risk of degradation of care
- Our strategies can reframe the boundaries of motion control
 - # of gates vs noise paradigm
 - Characterization of motion control strategies
 - Risks of using motion correction
 - Visualization of motion
- Further validation needed – we provided proof of principles and small population measurements
- Still room for improvement
 - Not seen limits in accuracy or speed
 - As technology advances (sensitivity and resolution), so will potential of such algorithms
- Still areas of application to explore

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Thank you

- Acknowledgements
 - Current collaborators
Phillip Koo (UC Denver)
Kate Petrova (UC Denver)
Jonathan Chung (NJH)
Vicki LaRue (NJH)
 - Siemens support
Jim Hamill
Judson Jones
 - Mentors
Daniel Silverman (UCLA)
Stig Palm (IAEA)
Nanette Freedman (Hebrew University)
 - Co-(data driven) pioneers
Paul Schleyer (Kings College)
Florian Büther (University of Münster)

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