

#### REGULATION AND ASSESSMENT OF QUANTITATIVE IMAGING TOOLS USED IN PRECISION ONCOLOGY

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#### DISCLOSURES



• None

### OUTLINE



 Overview of medical device regulatory framework

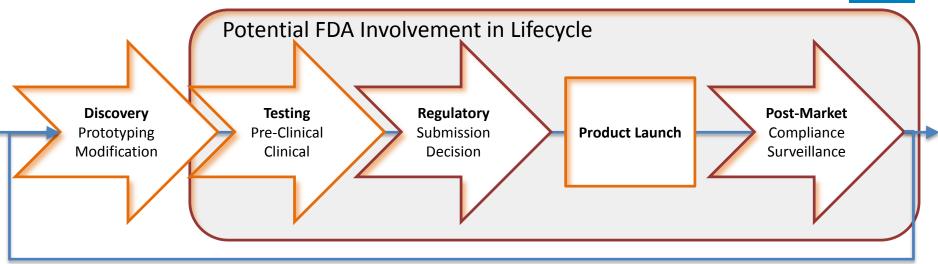
Quantitative imaging tool assessment
 – Lung nodule volumetry



 Protect and promote the health of the public by ensuring the safety and effectiveness of medical devices and the safety of radiationemitting electronic products

# FDA

### **DEVELOPMENT PATHWAY**



• FDA strives to speed translation of innovative, safe, and effective products to market throughout product lifecycle



#### DEVICE CLASS & PRE-MARKET REQUIREMENTS

| Device Class                | Controls                               | Premarket Review<br>Process                   |
|-----------------------------|----------------------------------------|-----------------------------------------------|
| Class I<br>(lowest risk)    | General Controls                       | Most are exempt                               |
| Class II                    | General Controls<br>Special Controls   | Premarket Notification<br>[510(k)] or De Novo |
| Class III<br>(highest risk) | General Controls<br>Premarket Approval | Premarket Approval [PMA]                      |

# **GENERAL/SPECIAL CONTROLS**



#### General Controls

- General controls apply to all medical devices, unless exempted by regulations
  - Registration and device listing
  - Adverse event reporting
  - Good manufacturing practice requirements
  - ...
- Special Controls
  - Controls beyond general controls necessary to establish a reasonable assurance of the safety & effectiveness. Special controls are usually device-specific
    - Postmarket surveillance
    - Special labeling requirements
    - Premarket data requirements

• ...

http://www.fda.gov/MedicalDevices/DeviceRegulationandGuidance/Overview/GeneralandSpecialControls/ucm055910.htm

## HOW DEVICES COME TO MARKET IN U.S.



#### • 510(k)

- Demonstrate <u>substantial equivalence</u> to predicate device
- De Novo
  - Risk-based classification for <u>novel medical devices</u> for which general controls, or general and special controls, provide reasonable assurance of safety and effectiveness for the intended use, but for which there is <u>no legally</u> <u>marketed predicate</u>. Devices granted through De Novo <u>may be marketed/used as predicates for future 510(k)</u> <u>submissions</u>
- PMA
  - <u>Demonstrate</u> reasonable assurance of <u>safety and effectiveness</u>
  - Most Class III devices
- Qsubs
  - Informal interaction with FDA (usually non-binding) prior to device submission
    - Answer questions about a specific device under development



### MEDICAL DEVICES BY CLASS



**Class I** 

#### **Class II**

CT, MR, US imaging systems Most imaging CADe/CADx Some IVD tests

#### Class III

Novel Imaging systems (DBT)
 Leadless Pacemakers
 Bronchial Thermoplasty Systems
 Some IVD Tests

# REGULATION OF SAMD



- IMDRF Working Group (WG) on Software as a Medical Device (SaMD)
  - SaMD: Software intended to be used for medical purposes without being part of a hardware medical device
    - Include artificial intelligence (AI) algorithms for disease diagnosis & monitoring
      - Including precision oncology tools
  - Outputs:
    - SaMD: Key Definitions
    - SaMD: Possible Framework for Risk Categorization and Corresponding Considerations
    - SaMD: Application of Quality Management System
    - SaMD: Clinical Evaluation

http://www.imdrf.org/workitems/wi-samd.asp



# IMDRF AND FDA GUIDANCE



- Adopted as FDA guidance in 2017
- FDA intends to consider principles of the IMDRF report in evolving approach to AI/ML and SaMD review

Software as a Medical Device (SAMD): Clinical Evaluation

#### **Guidance for Industry and Food and Drug Administration Staff**

Document issued on December 8, 2017.

The draft of this document was issued on October 14, 2016.

For questions about this document, contact the Office of the Center Director at 301-796-6900 or the Digital Health Program at digitalhealth@fda.hhs.gov.

# SAMD: CLINICAL EVALUATION



**Clinical Evaluation** 

| Valid Clinical Association                                                                                              | Analytical Validation                                                                                         | Clinical Validation                                                                                                                                                      |
|-------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Is there a valid clinical<br>association between your<br>SaMD output and your<br>SaMD's targeted clinical<br>condition? | Does your SaMD correctly<br>process input data to generate<br>accurate, reliable, and precise<br>output data? | Does use of your SaMD's<br>accurate, reliable, and precise<br>output data achieve your intended<br>purpose in your target population<br>in the context of clinical care? |
|                                                                                                                         | <ul> <li>Evidence generation</li> </ul>                                                                       |                                                                                                                                                                          |

- Evidence generation
  - Literature
  - Professional guidelines
  - Secondary data analysis
  - Clinical trials/studies

# SAMD: CLINICAL EVALUATION



**Clinical Evaluation** 

| Valid Clinical Association                                                                                              | Analytical Validation                                                                                         | Clinical Validation                                                                                                                                                      |  |  |  |
|-------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--|--|--|
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| ▼                                                                                                                       |                                                                                                               |                                                                                                                                                                          |  |  |  |
| <ul> <li>SaMD meet technical requirements</li> </ul>                                                                    |                                                                                                               |                                                                                                                                                                          |  |  |  |
| <ul> <li>Provide evidence that software correctly</li> </ul>                                                            |                                                                                                               |                                                                                                                                                                          |  |  |  |

constructed

conforms to user needs

—

Demonstrate it meets specifications and

# SAMD: CLINICAL EVALUATION



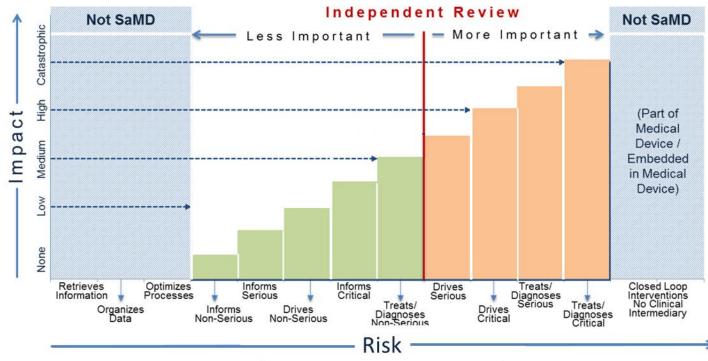
**Clinical Evaluation** 

| Valid Clinical Association                                                                                              | Analytical Validation                                                                                         | Clinical Validation                                                                                                                                                      |
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- Evidence that shows
  - SaMD has been tested in target population and for intended use
  - Users can achieve clinically meaningful outcomes



## **RISK-BASED REGULATORY APPROACH**



# **DEVICE REGULATION TAKEAWAYS**



- Devices are classified into three tiers
- Indications for use and type of technology are equally important for deciding what validation is needed
- You can ask FDA questions in a pre-submission (Qsub)
- Al tools
  - FDA has substantial guidance on AI tool assessment
  - FDA's approach to AI/SaMD is now evolving



QUANTITATIVE IMAGING TOOL ASSESSMENT



### QUANTITATIVE IMAGING

- Extraction of quantifiable features from medical images for the assessment of normal or the severity, degree of change, or status of a disease, injury, or chronic condition relative to normal
  - Single feature
  - Multiple features (artificial intelligence)
- Center working on QI guidance document

#### EXAMPLE CASE: CT VOLUMETRY



- CT lesion volume is a quantitative measure of actual tumor size in vivo
  - Actual quantitative imaging biomarker (QIB) claims would add specific performance goals to be achieved
  - Performance across multiple QI tools

# **QI TOOL ASSESSMENT**

- Basic components
  - Verification and Validation (V&V) software testing
    - Does tool meet technical specifications
    - Analytical validation
      - Technical assessment
  - Clinical assessment
    - Typical requires specific randomized clinical studies
      - Generally need patient outcome data



## **TECHNICAL ASSESSMENT**

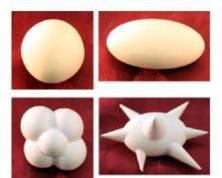
- Statistical measures of performance
  - Accuracy
    - Linearity
    - Bias
  - Precision
    - Repeatability
    - Reproducibility



### **TECHNICAL ASSESSMENT-ACCURACY**









- Accuracy assessment requires truth
- No volume reference from clinical CT scans
  - Phantom-based study
    - Thorax phantom with synthetic nodules

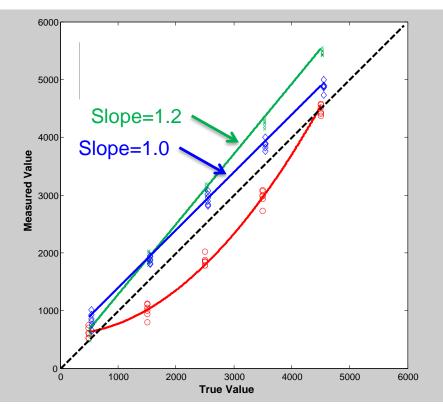
## LINEARITY



- Measure of how change in reference reflects <u>proportional</u> <u>change</u> in measurement on avg.
  - Linear:

#### Proportional change (straight line)

- Blue: Slope 1.0
- Green: Slope 1.2
- Nonlinear
  - Red: Non-proportional change







- Difference between an estimator's expected value & reference standard
  - Scaler value
- Types
  - Unbiased
    - Bias=0
  - Constant bias
    - Bias=B
  - Non-constant bias
    - Bias=function of true value

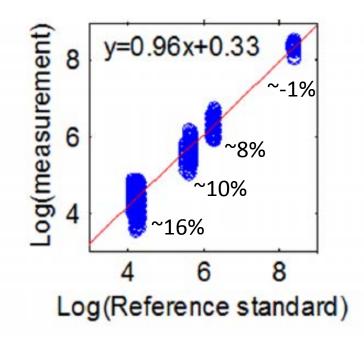


# PHANTOM STUDY LINEARITY ANALYSIS

- Accuracy assessment
  - Linearity
    - y= <u>0.96</u>x+0.33
      - $R^2 = 0.98$
      - Slope= <u>0.96</u> [0.96, 0.96]

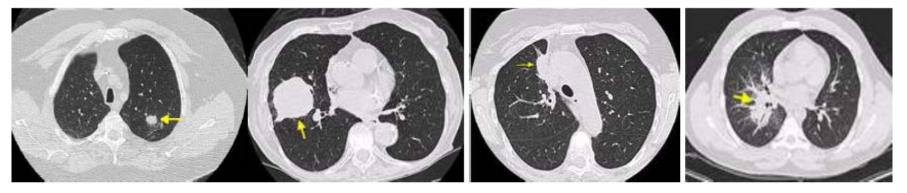


• B= <u>39%</u> [38.1,40.1]



## **TECHNICAL ASSESSMENT-PRECISION**





- Repeatability/reproducibility assessment
  - Clinical coffee-break scans
    - Patient scanned twice in <15 minutes
      - Same scanner
      - Same reconstruction

\*Buckler et al., Acad Radiol, 2015.

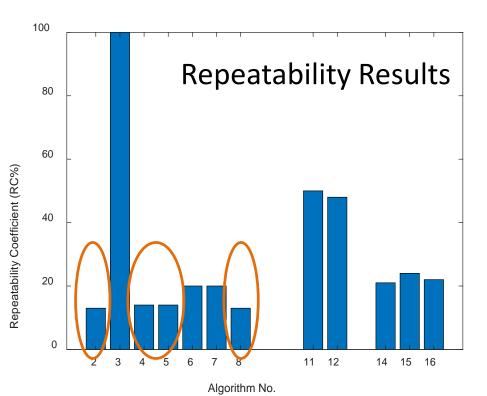
# **TECHNICAL ASSESSMENT-PRECISION**

- Clinical repeatability
  - Variability under identical or near-identical conditions
    - Individual algorithm assessment
    - Repeatability coefficient (RC)
      - − smaller RC → higher precision
- Clinical reproducibility
  - Variability under <u>a range of experimental conditions</u>
    - Across multiple algorithm
    - Reproducibility coefficient (RDC)
      - − smaller RDC → higher precision

FD/

## CLINICAL REPEATABILITY ANALYSIS

- Repeatability
  - Single algorithm
  - RC range: 13%-100%
  - Best performers
    - ~13-14%
      - Algorithms: 2,4,5,8
    - Interchangeable?



\*Buckler et al., Acad Radiol, 2015.

FDA



## **CLINICAL REPRODUCIBILITY ANALYSIS**

| Algorithm<br>Grouping | RDC                    | RDC% |
|-----------------------|------------------------|------|
| All but Algm 3        | 25,284 mm <sup>3</sup> | 84%  |
| Best Performers       | 9,290 mm <sup>3</sup>  | 58%  |

- Reproducibility
  - Across algorithms
  - Even best algorithms pay a large penalty if interchanged
    - 13% → 58%

#### \*Buckler et al., Acad Radiol, 2015.

### **SUMMARY**



- Device Regulation
  - Devices are classified into three tiers
  - Indications for use and type of technology are equally important for deciding what validation is needed
  - FDA's approach to AI/SaMD is now evolving

### **SUMMARY**



- QI/radiomic tool assessment
  - Basic components
    - Verification and Validation (V&V) testing
      - Technical assessment
    - Clinical assessment

#### ACKNOWLEDGMENTS



 I' d like to acknowledge Qin Li, Marios Gavrielides, and Ben Berman for their QI research efforts presented in this talk

