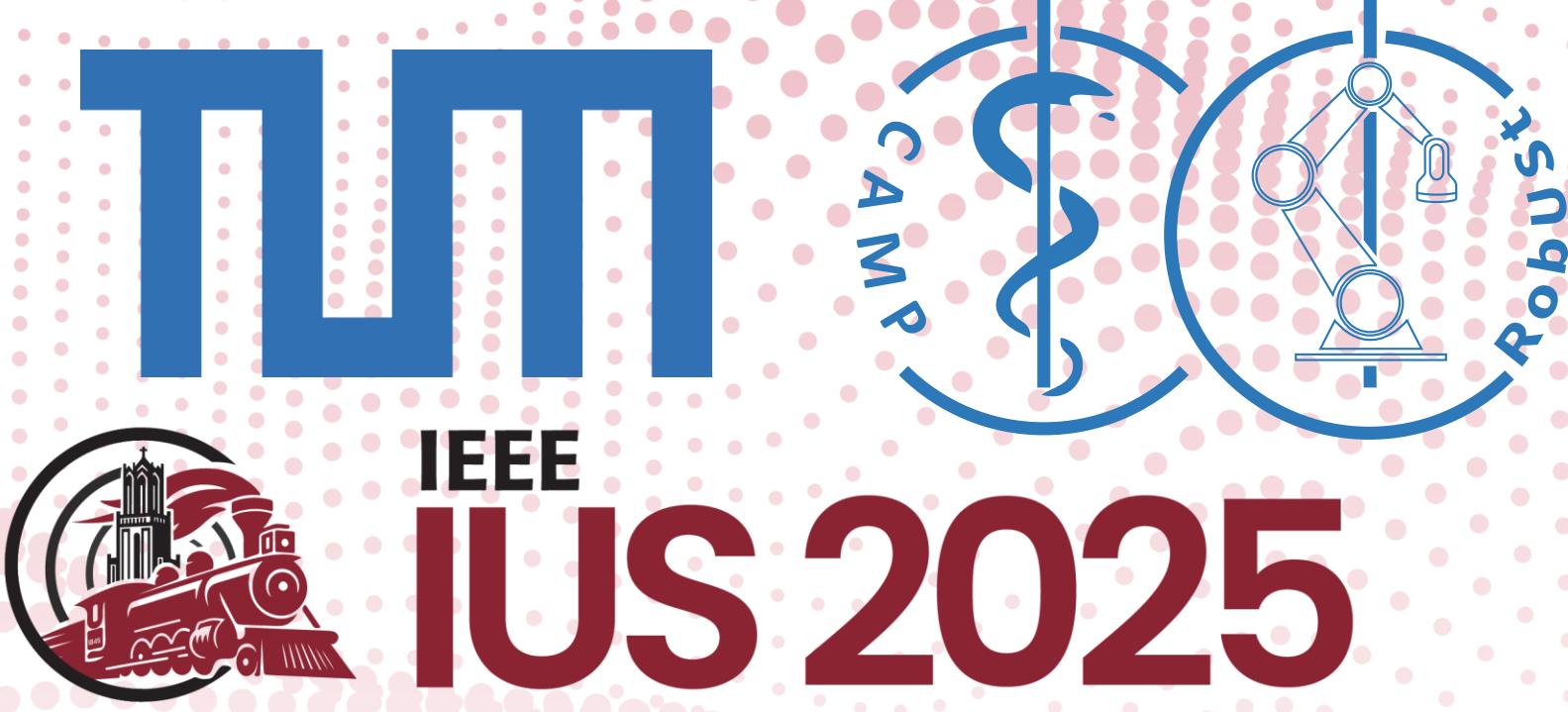


# UltraScatter: Ray-Based Simulation of Ultrasound Scattering

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## Introduction & Motivation

- **Ultrasound simulation** is critical for designing/improving reconstruction algorithms, transducers, and training ML models.
- However, **wave-based solvers** such as k-space methods [1] are computationally intensive, and their high accuracy is not always required.
- Faster convolution-based tools such as Field II [2] or delay-based simulators like SIMUS [3] cut runtime yet still take *minutes* per B-mode frame and assume weak, single scattering.

→ **UltraScatter** replaces waves with ray fronts and leverages highly parallelized **Monte-Carlo ray tracing** to model multiple scattering, attenuation and absorption *in seconds*.

## Methodology

We are interested in the received pressure  $P$  at element  $e$  over time  $t$ :

$$P(e, t) = \int_{\Omega} \int_A P_i(x, t, \omega_i) f_d(\omega_i) d\omega da,$$

Scattering in the heterogeneous media is defined by the **scattering probability** (extinction coefficient)  $\sigma_t$  and the **scattering amplitude** (albedo)  $a$ .

$$P_{scattered}(x, t, \omega_o) = \int_{\Omega} a(x) p(\omega_i, \omega_o) P_i(x, t, \omega_i) d\omega_i$$

Following the methodology of **free flight delta tracking** with null interactions (Woodcock tracking [5]):

- The distance  $s$  a ray is travelling until an interaction is triggered is sampled based on the **extinction majorant**  $\mu$  (largest defined extinction value) and a randomly sampled variable  $\xi \sim \mathcal{U}(0,1)$ :

$$s = s_{min} - \frac{1}{\mu} \ln(1 - \xi)$$

- This interaction can lead to a real or null interaction event based on the **extinction value** at the sampled position  $x$ :

$$\xi' < \frac{\sigma_t(x)}{\mu} \Rightarrow \text{real interaction, else null interaction}$$

- In case of a **real** interaction event the scattering amplitude defines whether the ray is absorbed or scatters

If the ray is scattered, secondary rays are cast to **all individual elements**

The phase function  $p$  defines the subsequent direction  $\omega_o$  of the primary ray

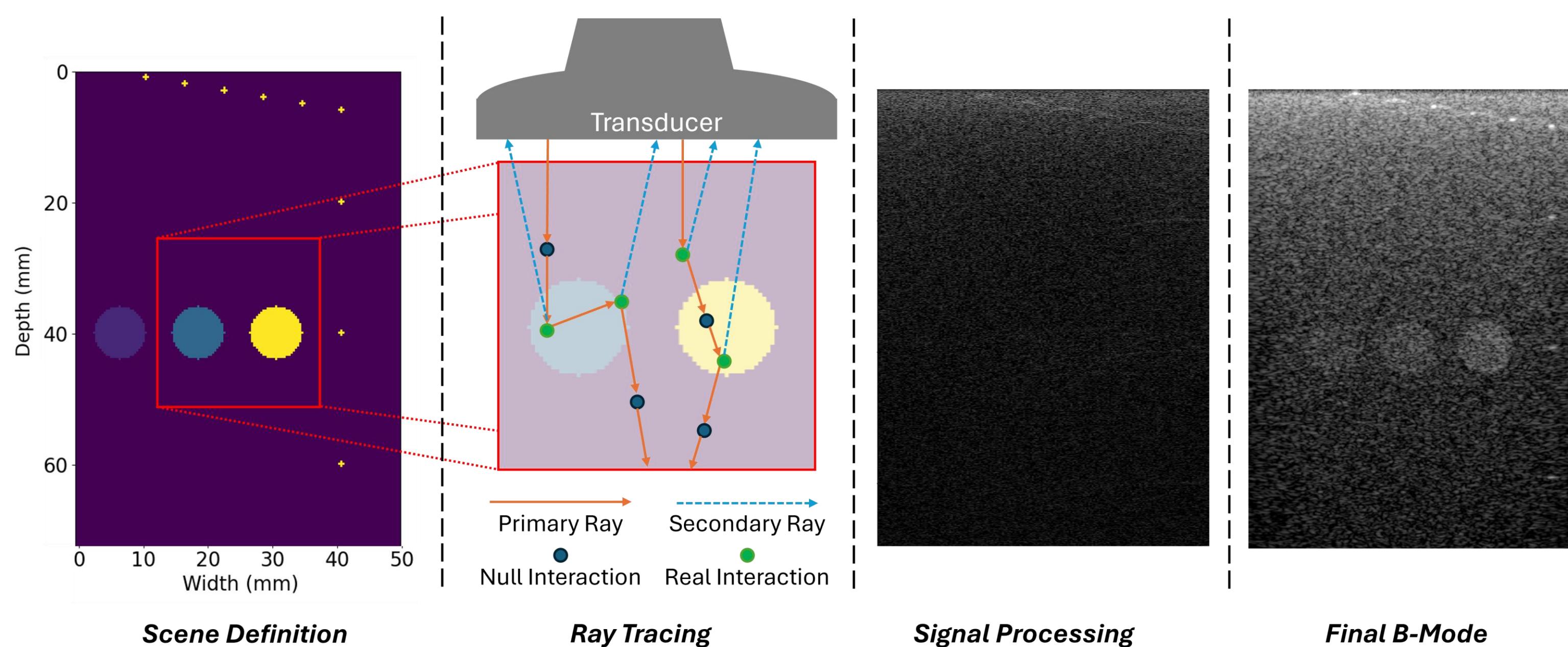
## CONCLUSION

- UltraScatter approximates wave propagation using parallel ray tracing, enabling **clinical-like B-mode imaging** at a fraction of the cost of frequency-domain solvers.
- UltraScatter is **modular** and can be easily extended for elevational focusing, heterogeneous speed of sound, etc.
- **Future work:** Speckle coherence during probe translation, full 3-D transmit/receive, refraction & harmonic generation.

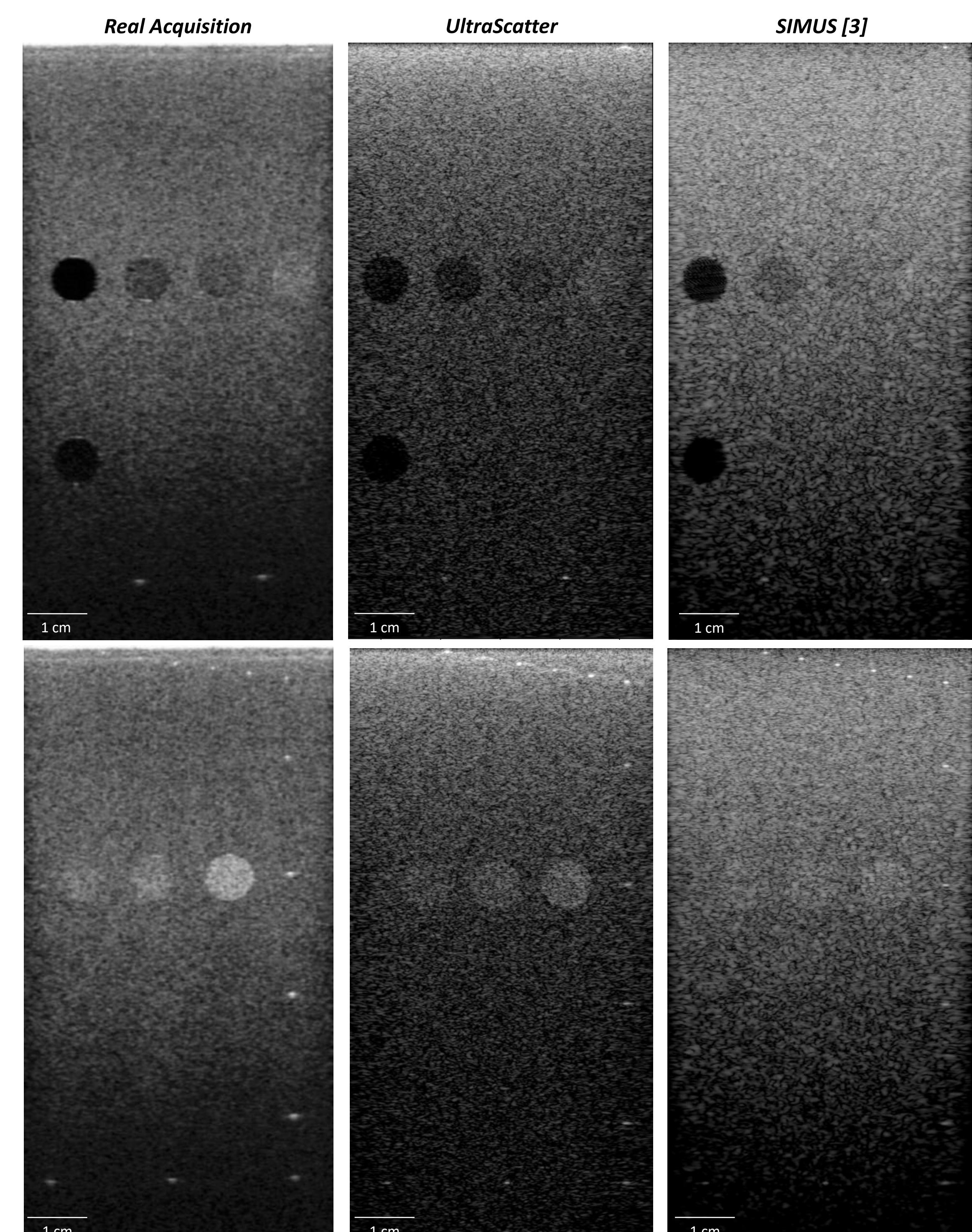
## Idea & Implementation

- Physics-Based Rendering (PBR) has achieved remarkable image fidelity and advanced simulators (such as Mitsuba 3 [4]) facilitate synthetic image generation
- By using a **Monte-Carlo** ray tracing approach multiple nested integrals can be solved computationally efficiently
- We are building on top of **Mitsuba 3** [4] – a modular framework that allows us to add modules (e.g. transducer) but also customize and adapt existing software (e.g. integrator)

## Pipeline



## Results



## REFERENCES

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