Noisy PAQ responses → trace measurements

 Assume user responds with an item that is a noisy distance $y + \eta$ away from the reference

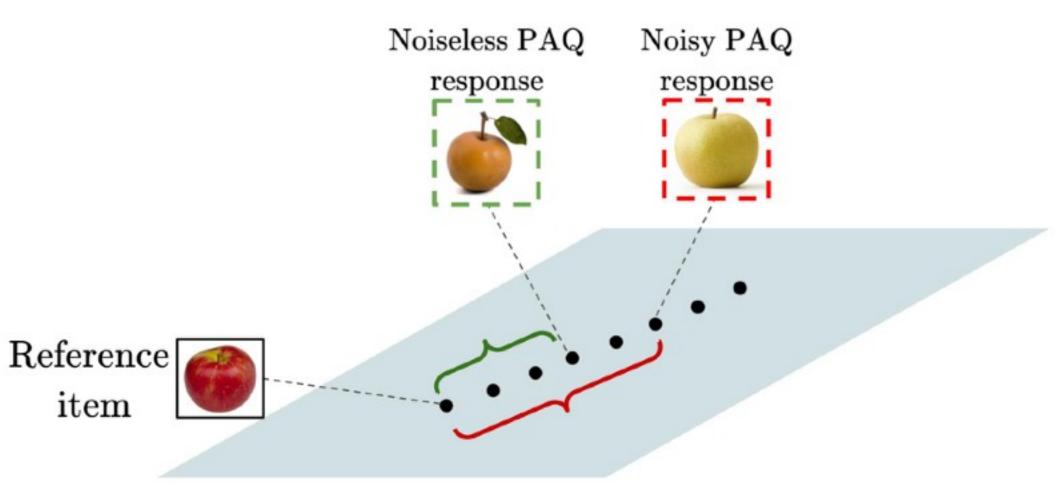
Response: <u>noisy scaling</u> γ s.t.



Equivalent to <u>trace measurements</u>



With sensing matrices $\mathbf{A} = \gamma^2 \mathbf{a} \mathbf{a}^{\mathsf{T}}$



 $\gamma^2 \mathbf{a}^{\mathsf{T}} \mathbf{M} \mathbf{a} = y + \eta$

 $\langle \gamma^2 \mathbf{a} \mathbf{a}^{\mathsf{T}}, \mathbf{M} \rangle = y + \eta$

Noisy PAQ responses → trace measurements

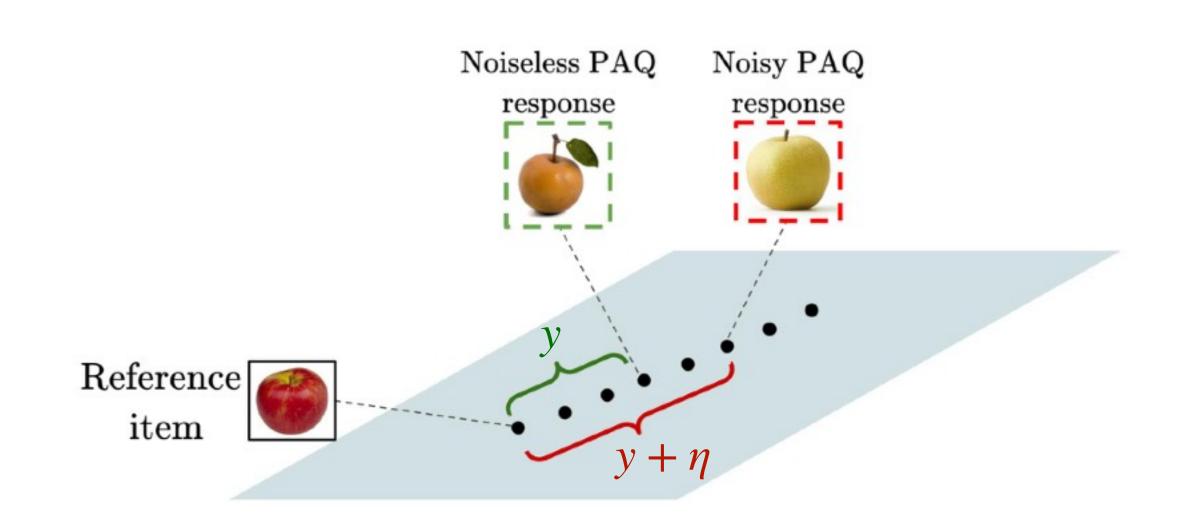
- Assume user responds with an item that is a noisy distance $y + \eta$ away from the reference
 - Response: <u>noisy scaling</u> γ s.t.

$$\gamma^2 \mathbf{a}^\mathsf{T} \mathbf{M} \mathbf{a} = y + \eta$$

Equivalent to <u>trace measurements</u>

$$\langle \gamma^2 \mathbf{a} \mathbf{a}^\mathsf{T}, \mathbf{M} \rangle = y + \eta$$

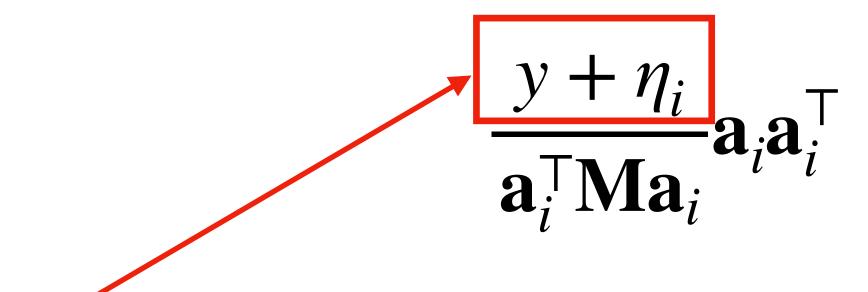
With sensing matrices $\mathbf{A} = \gamma^2 \mathbf{a} \mathbf{a}^{\mathsf{T}}$



Learning from PAQs: challenges

Choose $\mathbf{a}_i \stackrel{iid}{\sim} \mathcal{N}(\mathbf{0}, \mathbf{I}_D)$

Sensing matrices take the form



Sensing matrix depends on noise! Results in biased estimators