

# Time-of-flight proton CT

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Physics in Medicine & Biology

ACCEPTED MANUSCRIPT

Relative stopping power resolution in time-of-flight proton CT

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Accepted Manuscript online 19 May 2022 • © 2022 Institute of Physics and Engineering in Medicine

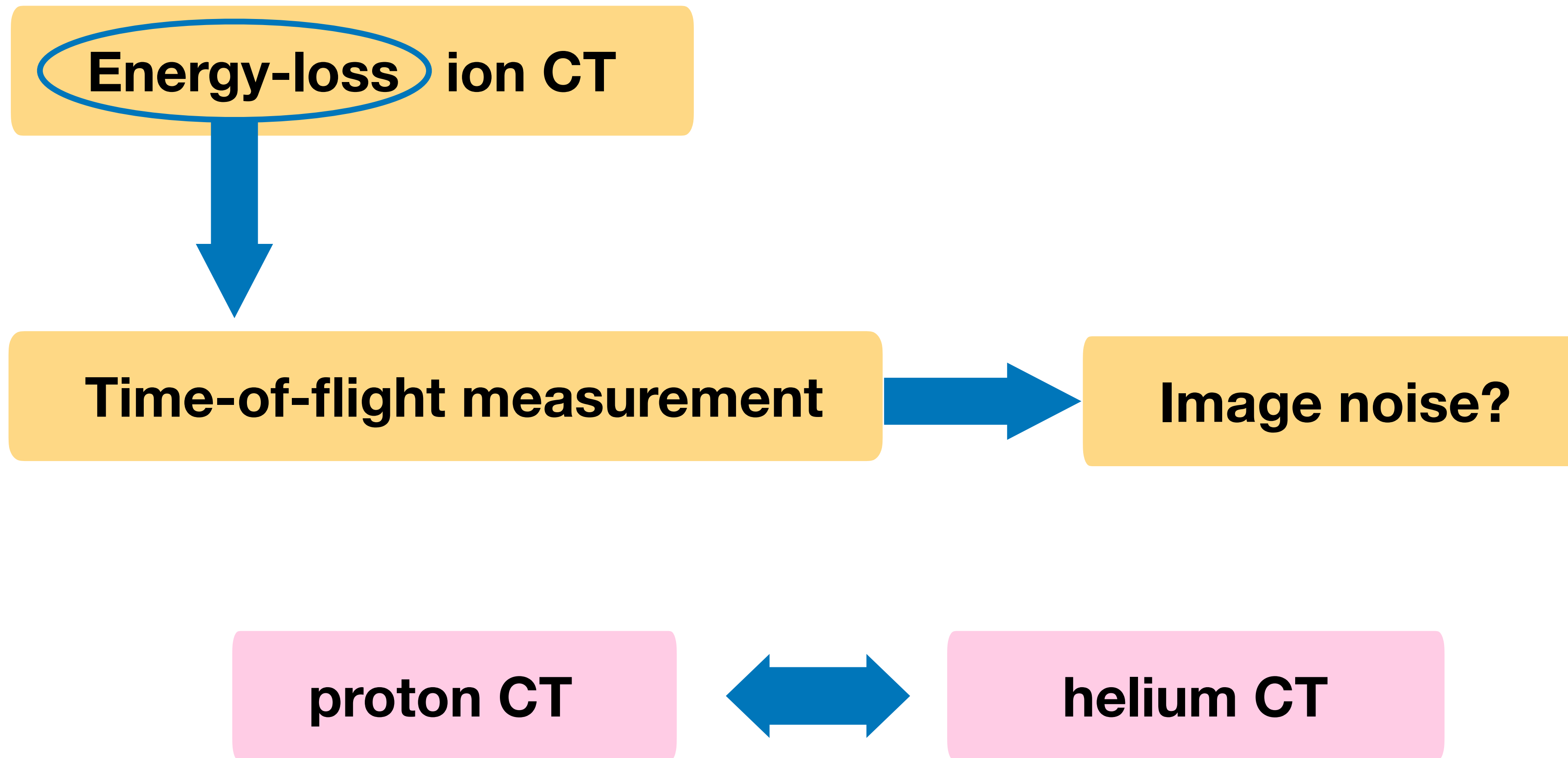
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DOI: 10.1088/1361-6560/ac7191

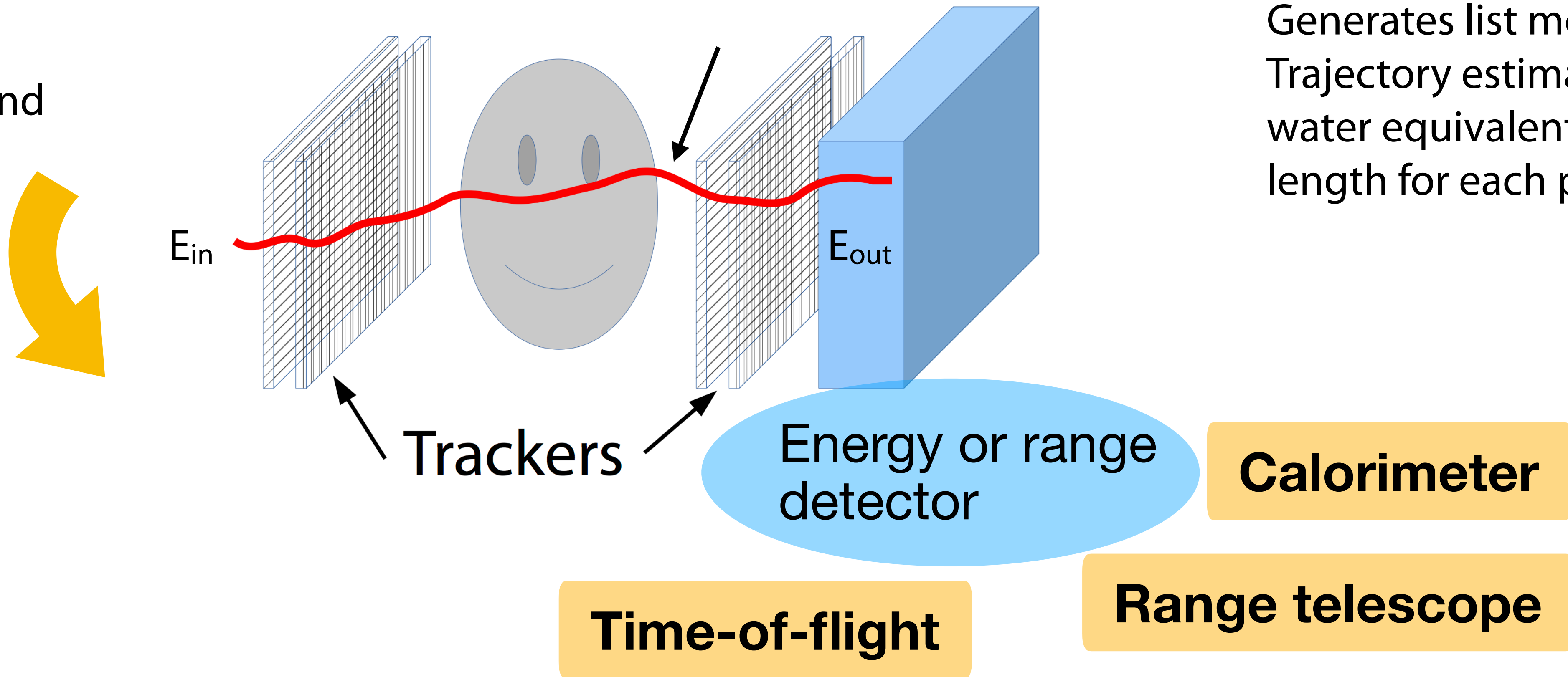


# I will speak about ...



# Typical list-mode ion CT set-up

Rotate around patient

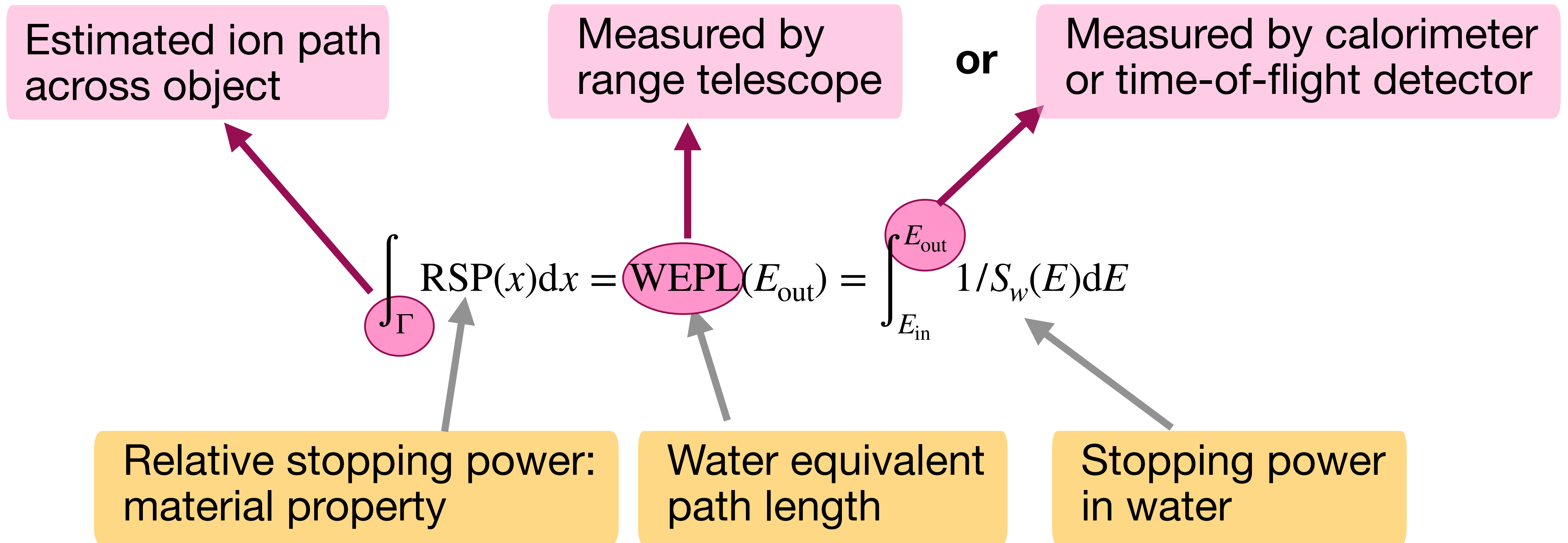


Generates list mode data:  
Trajectory estimate and  
water equivalent path  
length for each proton.

## Comprehensive review:

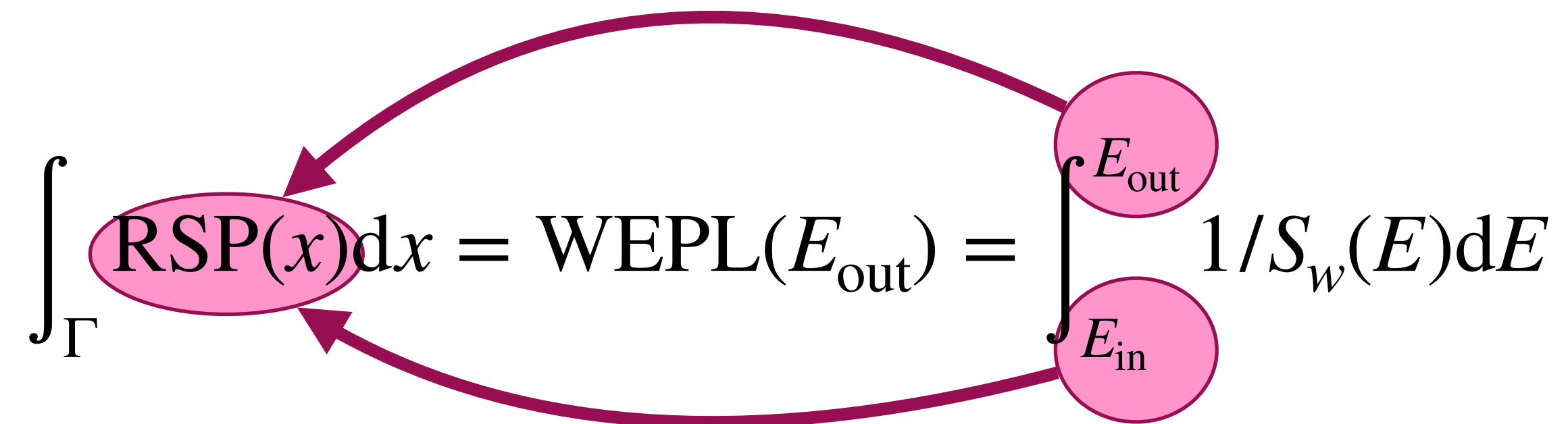
Johnson, R. P. (2018). Review of medical radiography and tomography with proton beams. Reports on Progress in Physics, 81(1), 016701. <https://doi.org/10.1088/1361-6633/aa8b1d>

# Reconstruction problem in ion CT



# Question to be answered:

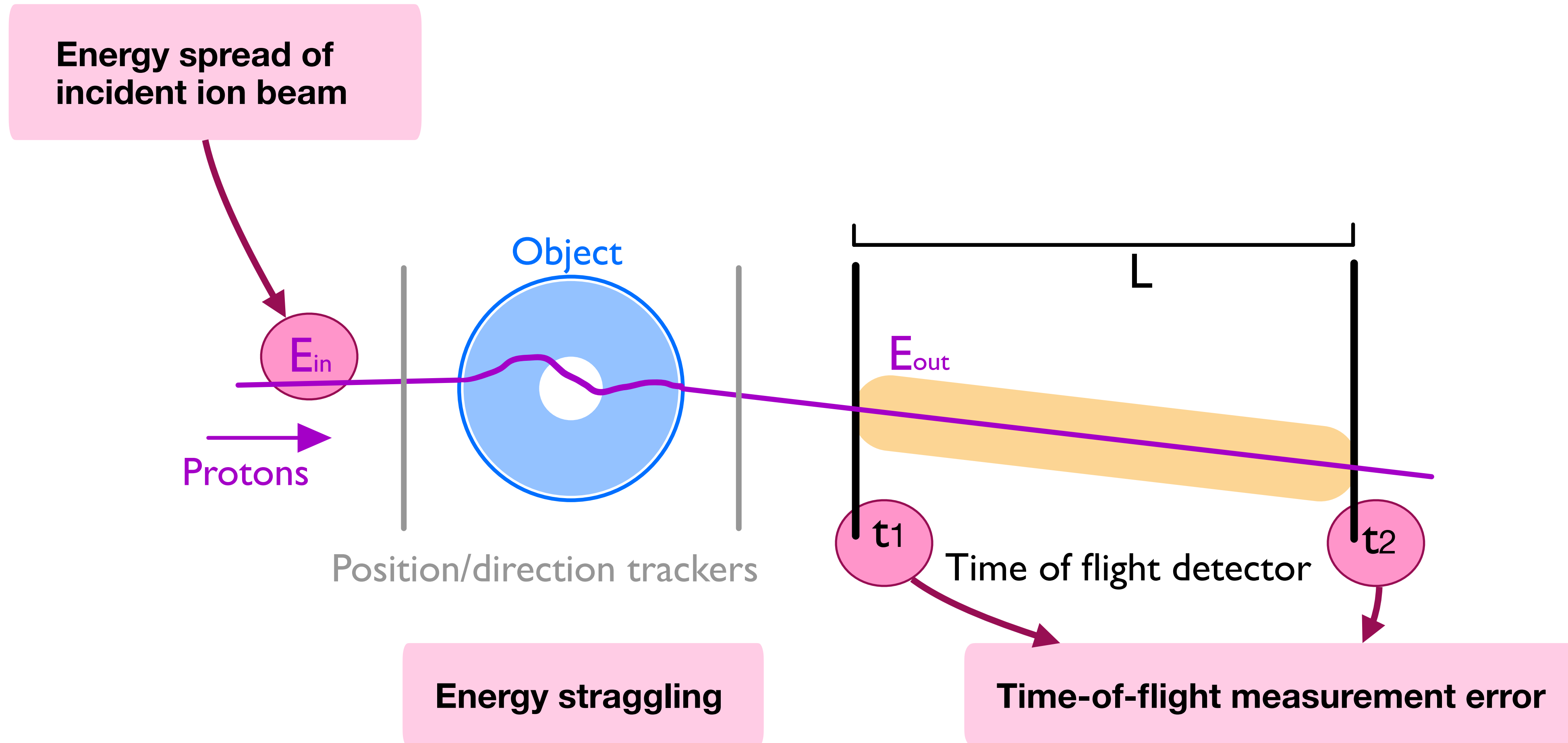
What is the impact of energy uncertainty on the estimated RSP map in terms of noise?

$$\int_{\Gamma} \text{RSP}(x) dx = \text{WEPL}(E_{\text{out}}) = \int_{E_{\text{in}}}^{E_{\text{out}}} 1/S_w(E) dE$$
The diagram illustrates the relationship between the estimated RSP map and the WEPL function. On the left, the integral of RSP(x) over the region Γ is shown. This is equated to the WEPL function evaluated at E\_out. The WEPL function is further defined as the integral of 1/S\_w(E) from E\_in to E\_out. Two curved arrows connect the E\_out and E\_in terms to the RSP(x) term, indicating the range of energy uncertainty.

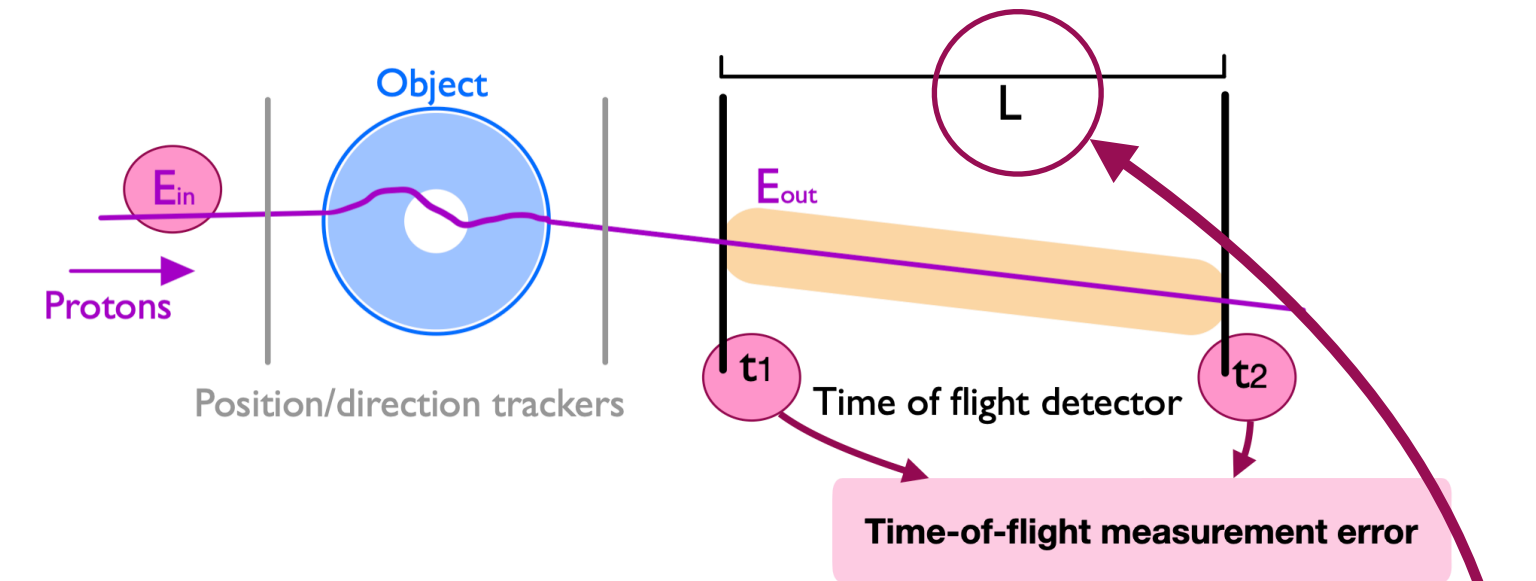


**Error propagation**

# Sources of energy error/uncertainty



# Time-of-flight measurement error



Relativistic energy - velocity relation:

$$E_{\text{out}} = \frac{m_p c^2}{\sqrt{1 - (v/c)^2}} - m_p c^2 \quad \text{with} \quad v = \frac{L}{t_2 - t_1},$$

**time-of-flight**

First order error propagation:

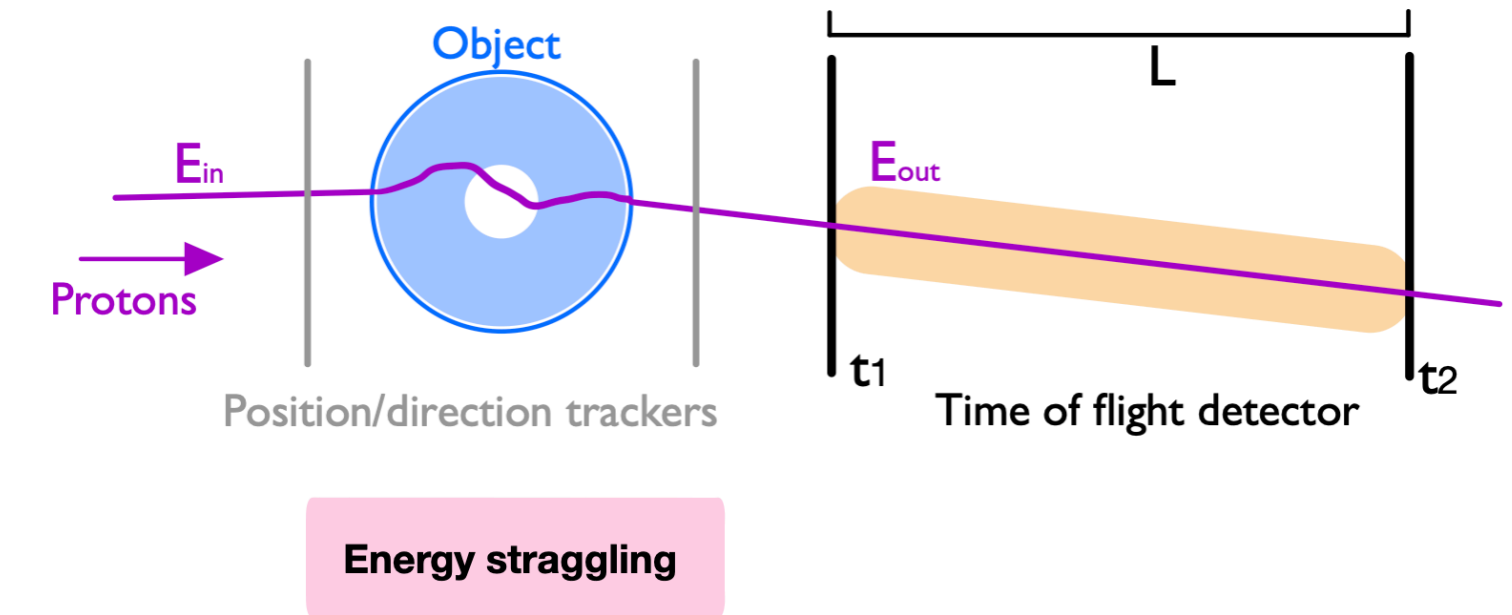
$$\sigma_{E_{\text{out}}, \text{TOF}}^2(E_{\text{out}}) = \left| \frac{dE}{dt_1} \right|^2 \sigma_{t_1}^2 + \left| \frac{dE}{dt_2} \right|^2 \sigma_{t_2}^2 = \frac{1}{m_p^4 c^6} (E_{\text{out}}^2 + 2m_p c^2 E_{\text{out}})^3 \frac{\sigma_t^2}{L^2}$$

**energy error (variance)** **velocity error (variance)**

**Note:**  $\sigma_{E_{\text{out}}, \text{TOF}}^2 \propto E_{\text{out}}^3$

# Energy straggling

- Variation of energy loss within ensemble of ions due to stochastic nature of electromagnetic interactions.
- Approximately Gaussian energy distribution.
- Variance can be calculated analytically (to first order) [1].



energy error  
(variance)

$$\sigma_{E_{\text{out, straggling}}}^2(E_{\text{out}}) = \chi_1^2(E_{\text{out}}) \int_{E_{\text{out}}}^{E_{\text{in}}} \frac{\chi_2(E)}{\chi_1^3(E)} dE$$

Solve via  
numerical  
integration.

$$\chi_1(E) = K \frac{1}{\beta^2} \left[ \ln \left( \frac{2m_e c^2 \beta^2}{I(1 - \beta^2)} \right) - \beta^2 \right]$$

$$\text{with } \beta = \frac{v}{c} = \left[ 1 - \left( \frac{m_p c^2}{m_p c^2 + E} \right)^2 \right]^{1/2}$$

$$\chi_2(E) = K m_e c^2 \frac{1 - \beta^2/2}{1 - \beta^2}$$

I: ionisation potential (approx. as water, 75 eV)  
 m<sub>p</sub>: proton mass  
 m<sub>e</sub>: electron mass  
 K: a constant

[1] Payne, M. G. (1969). Energy Straggling of Heavy Charged Particles in Thick Absorbers. Physical Review, 185(2), 611–623. DOI: 10.1103/PhysRev.185.611



# Comparison with calorimeter

$$\sigma_{E_{\text{out}}}^2(E_{\text{out}}) = \sigma_{E_{\text{out, straggling}}}(E_{\text{out}}) + \sigma_{E_{\text{out, TOF}}}(E_{\text{out}})$$

**time-of-flight**

Compare with calorimeter-based ion CT system [1]:

$$\sigma_{E_{\text{out, cal}}}(E_{\text{out}}) = \sigma_{E_{\text{out, straggling}}}(E_{\text{out}}) + \delta^2 E_{\text{out, cal}} E_{\text{out}}^2$$

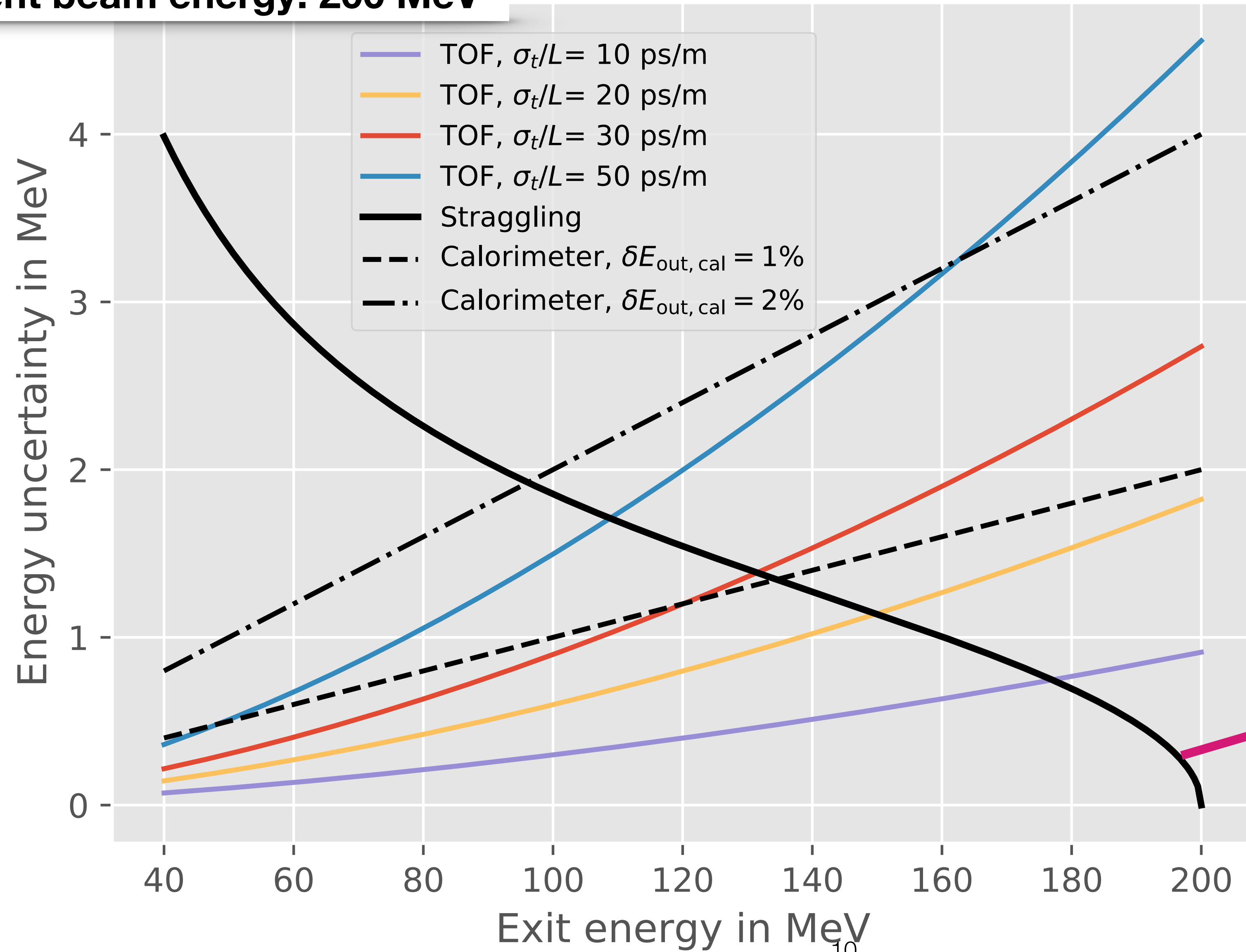
**calorimeter**

$$\delta E_{\text{out, cal}} \approx 1 - 2 \%$$

[1] Bashkirov, V. A. et al. (2016). Novel scintillation detector design and performance for proton radiography and computed tomography. Medical Physics, 43(2), 664–674.  
<https://doi.org/10.1118/1.4939255>

# Energy uncertainty

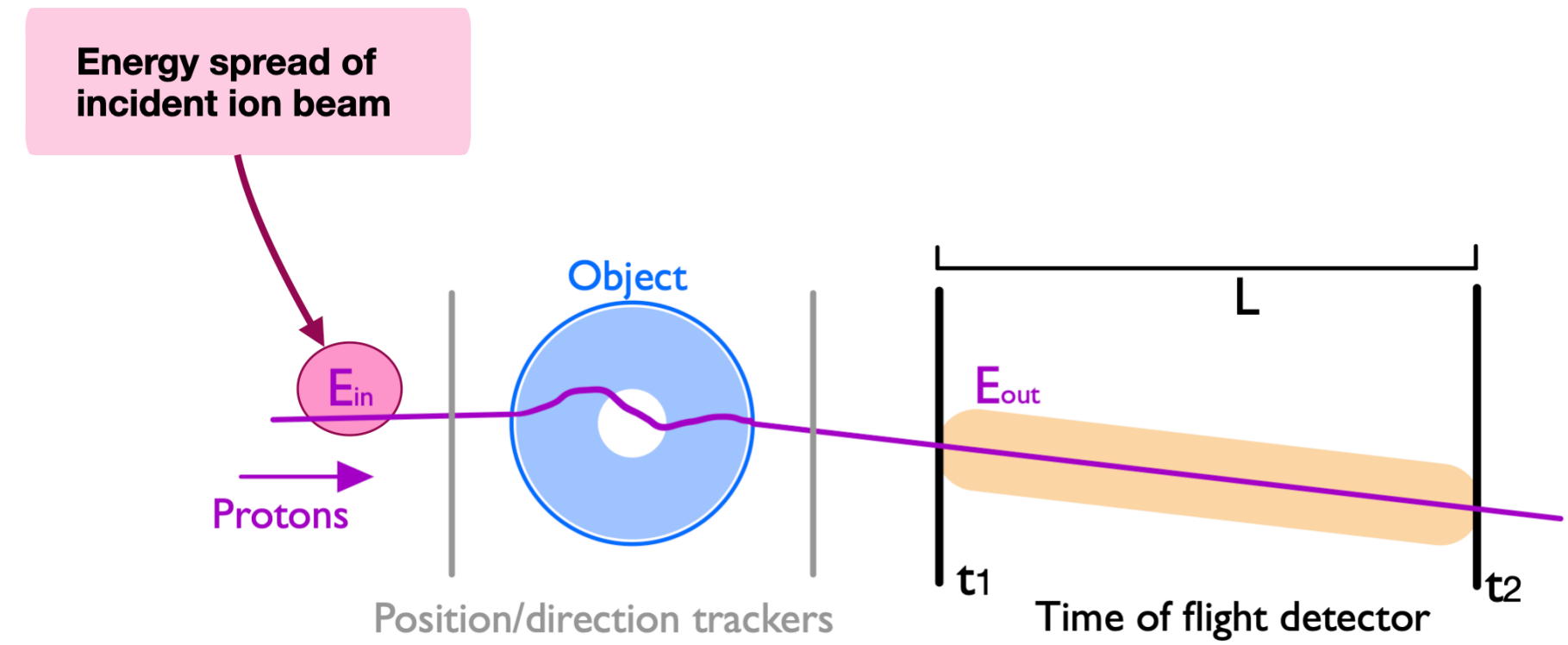
Incident beam energy: 200 MeV



Imaging system

Intrinsic limitation

# Energy spread of incident beam



- Depends on accelerator and beam delivery system.
- E.g. synchrotron vs. cyclotron
- We assumed 0.5% of beam energy [1].

$$\sigma_{\text{beam}}^2(E_{\text{in}}) = \delta^2 E_{\text{beam}} E_{\text{in}}^2 \quad \text{with} \quad \delta E_{\text{beam}} = 0.5 \%$$

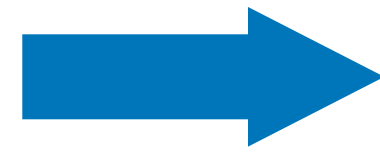
# WEPL uncertainty

$$\sigma_{\Delta E}^2(E_{\text{out}}) = \sigma_{E_{\text{out}}, \text{straggling}}^2(E_{\text{out}}) + (\delta E_{\text{beam}} E_{\text{in}})^2 + \sigma_{E_{\text{out}}, \text{TOF}}^2(E_{\text{out}})$$

+ multiple Coulomb scattering

First order error propagation:

$$\text{WEPL}(E_{\text{out}}) = \int_{E_{\text{in}}}^{E_{\text{out}}} 1/S_w(E) dE$$



$$\sigma_{\text{WEPL}}^2(E_{\text{out}}) = \frac{\sigma_{\Delta E}^2(E_{\text{out}})}{S_w^2(E_{\text{out}}) N} = \frac{\sigma_{\Delta E}^2(E_{\text{out}})}{S_w^2(E_{\text{out}}) \Phi \Delta \xi^2}$$

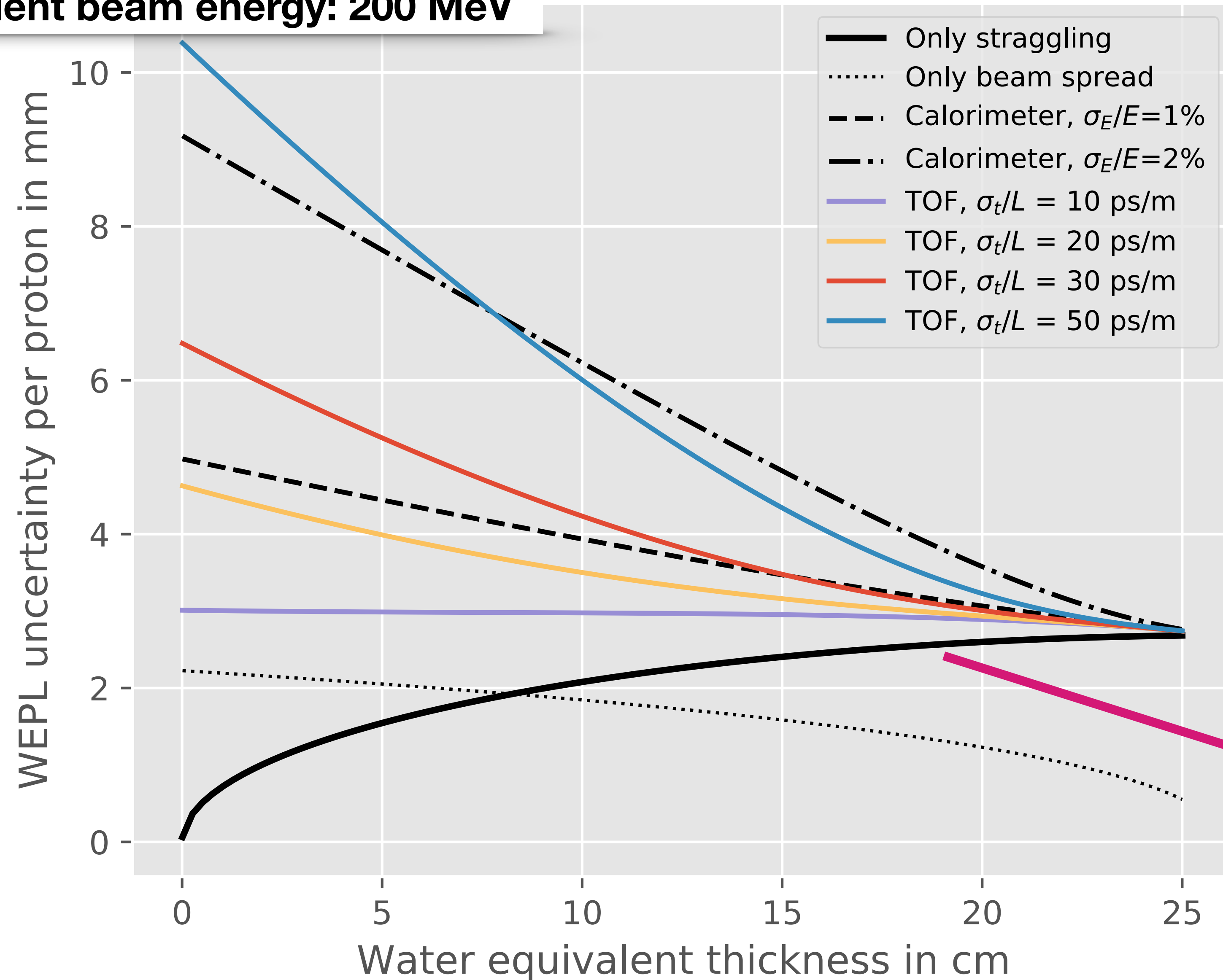
number of ions

particle fluence (dose)

pixel size, e.g. 1 mm<sup>2</sup>

# WEPL uncertainty

Incident beam energy: 200 MeV



$$\sigma_{\text{WEPL}, N=1}^2(E_{\text{out}}) = \frac{\sigma_{\Delta E}^2(E_{\text{out}})}{S_w^2(E_{\text{out}})}$$

**Intrinsic lower limit**

# RSP uncertainty via noise reconstruction

Propagate noise from WEPL to RSP:

$$\text{WEPL}(E_{\text{out}}) = \int_{\Gamma} \text{RSP}(x) dx$$

projection images  
containing WEPL  
variance

noise reconstruction [1,2]

reconstructed  
images containing  
RSP variance

## Assumptions:

- Ion CT images are reconstructed via filtered backprojection ...
- ... in fan beam geometry
- Linear interpolation between pixels
- Filtered with an apodized ramp filter

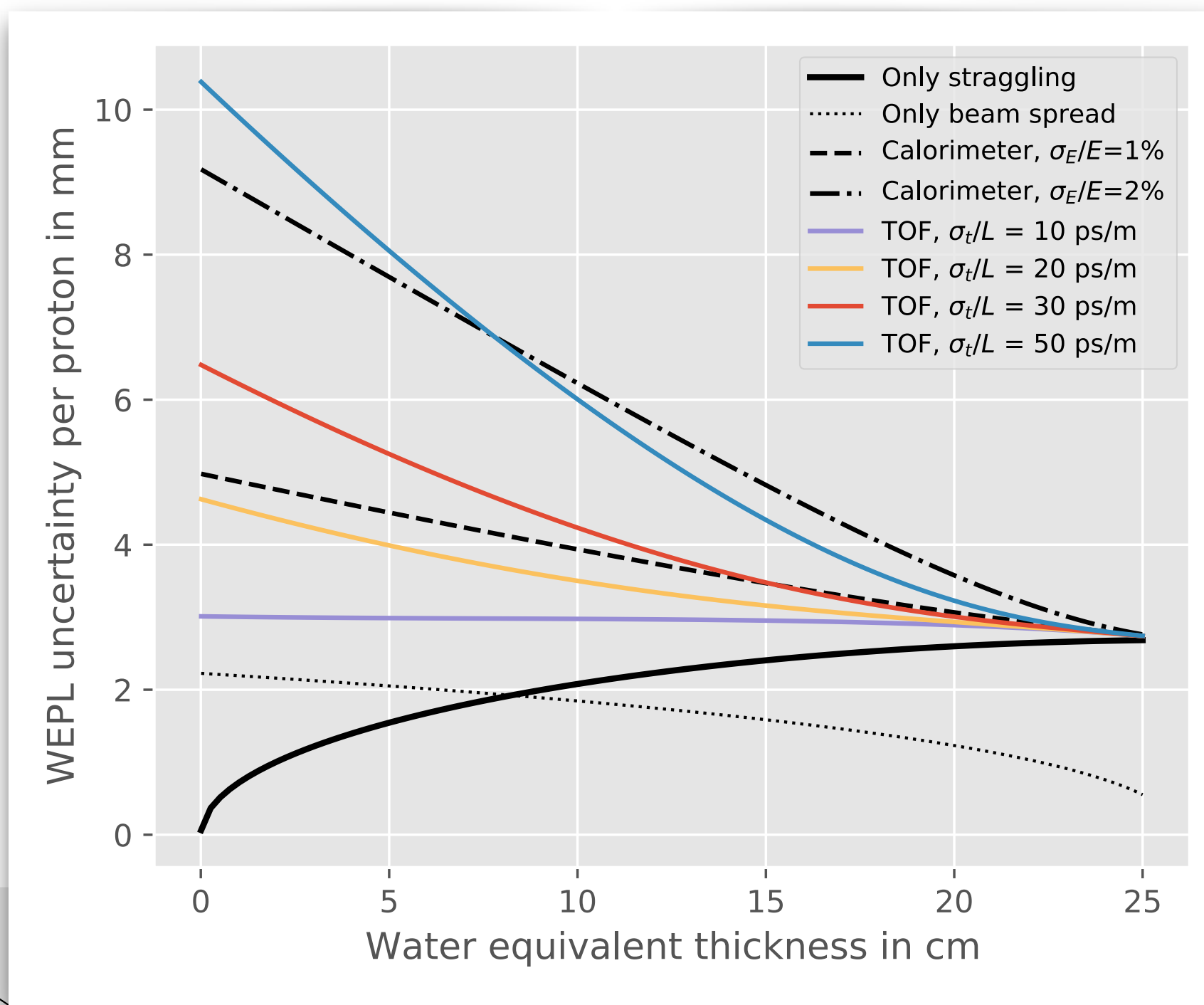
See Stefanie's talk  
yesterday

[1] Wunderlich, A., & Noo, F. (2008). Image covariance and lesion detectability in direct fan-beam x-ray computed tomography. *Physics in Medicine and Biology*, 53(10), 2471–2493. <https://doi.org/10.1088/0031-9155/53/10/002>

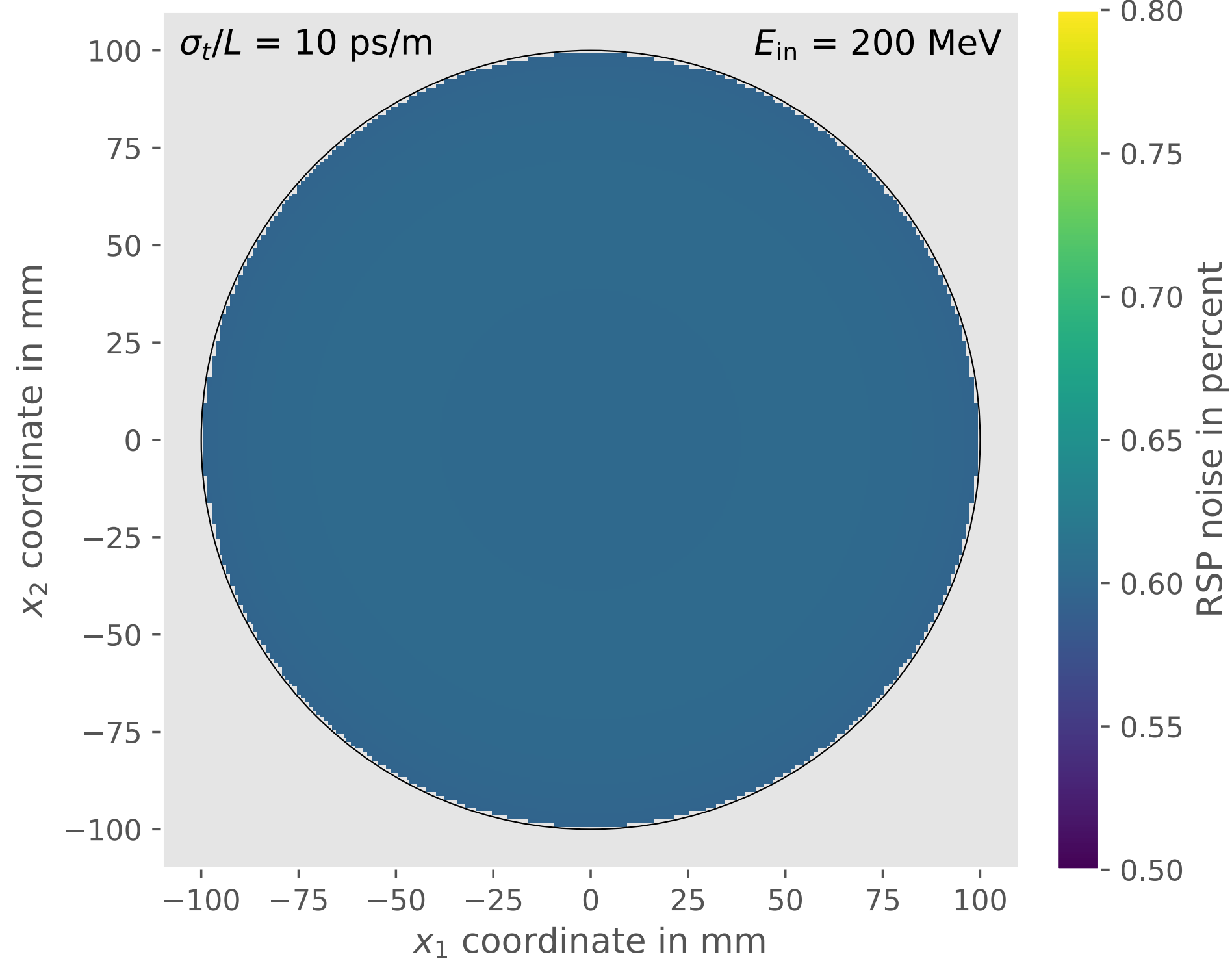
[2] Rädler, M. et al. (2018). Two-dimensional noise reconstruction in proton computed tomography using distance-driven filtered back-projection of simulated projections. *Physics in Medicine & Biology*, 63(21), 215009. <https://doi.org/10.1088/1361-6560/aae5c9>

# RSP uncertainty in a water cylinder

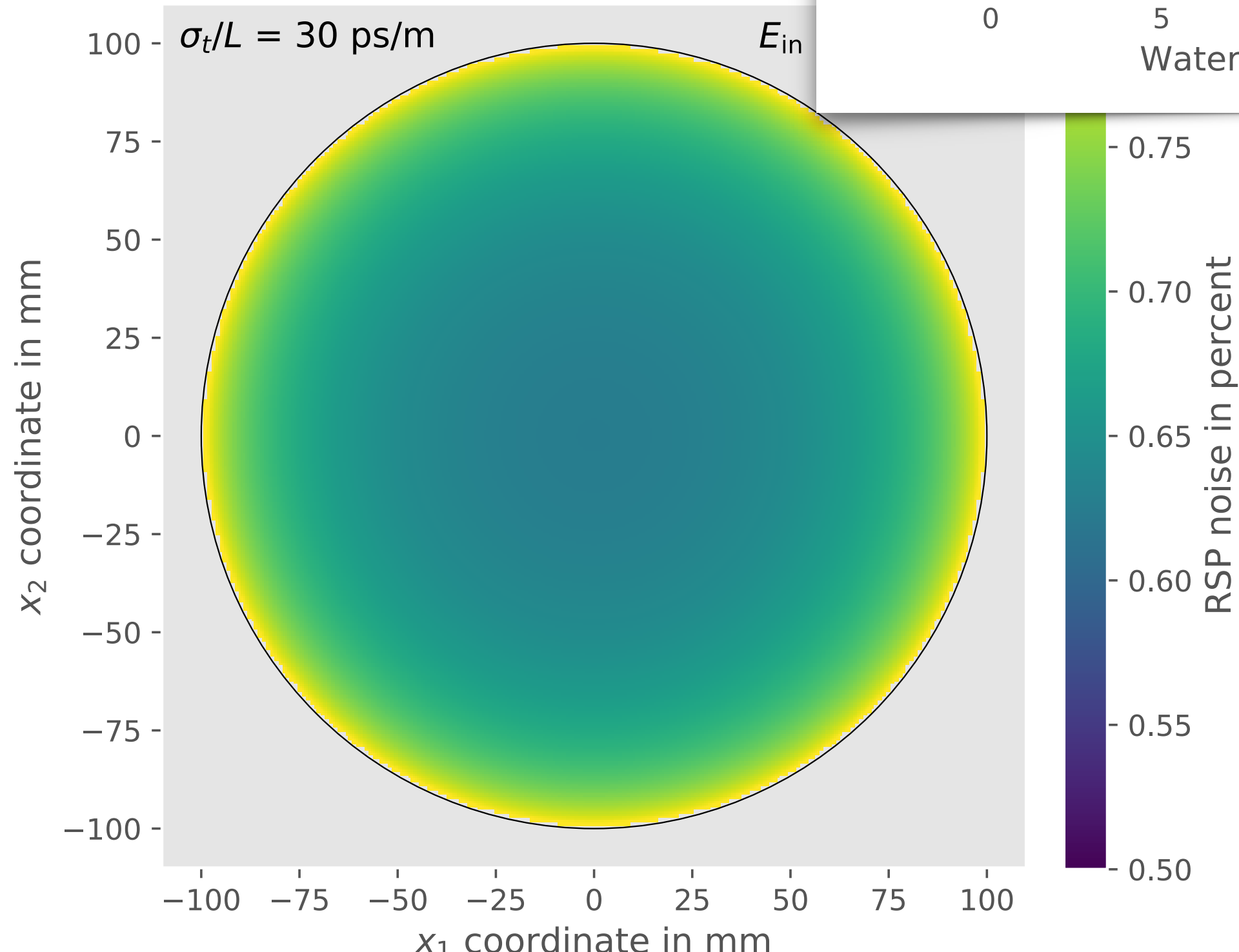
- Diameter: 20 cm
- Dose to center: 10 mGy (full acquisition)
- 1x1 mm<sup>2</sup> pixel size
- Incident beam energy: 200 MeV



### velocity error: 10 ps/m



### velocity error: 30 ps/m

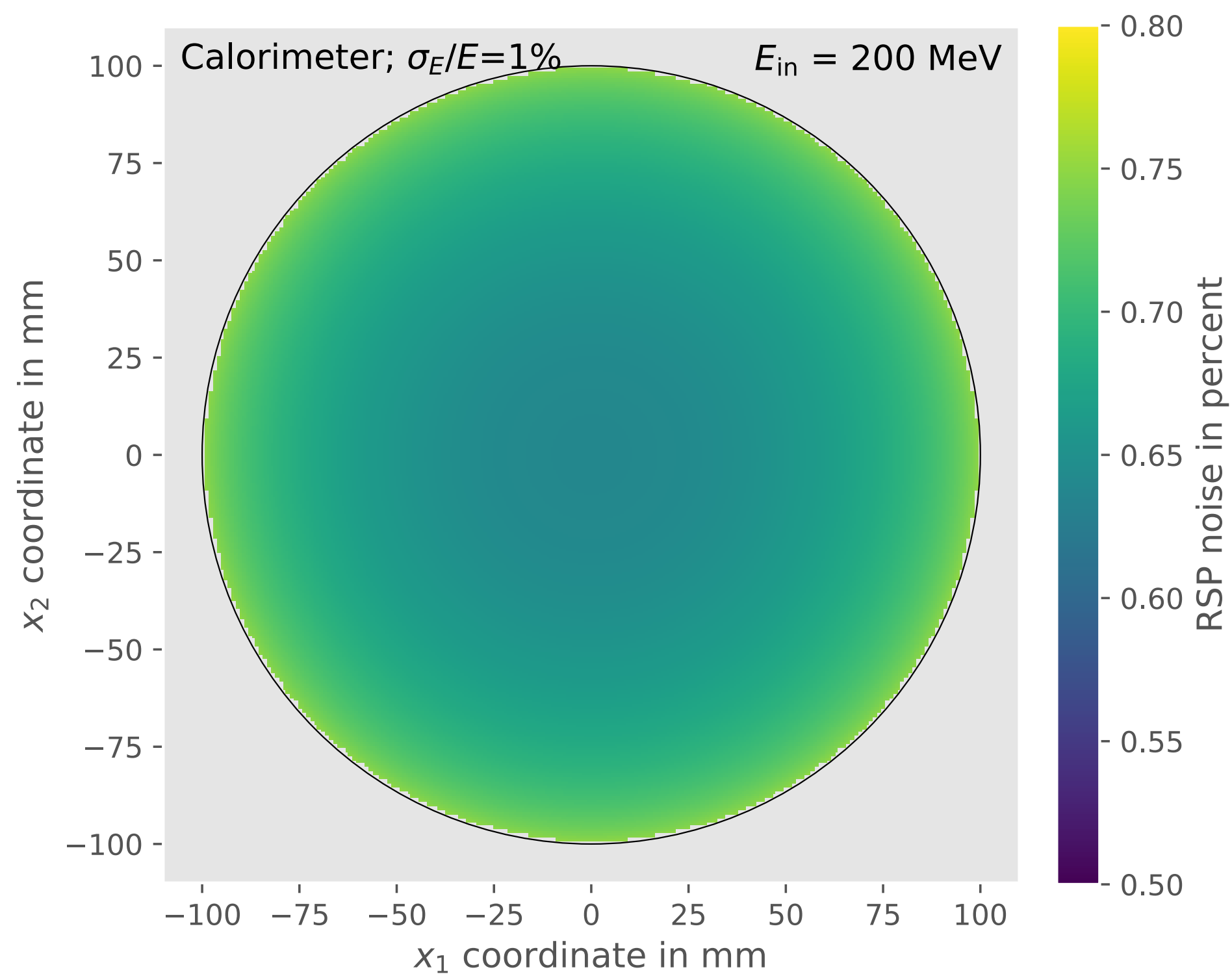


**Images noisier towards the edges**

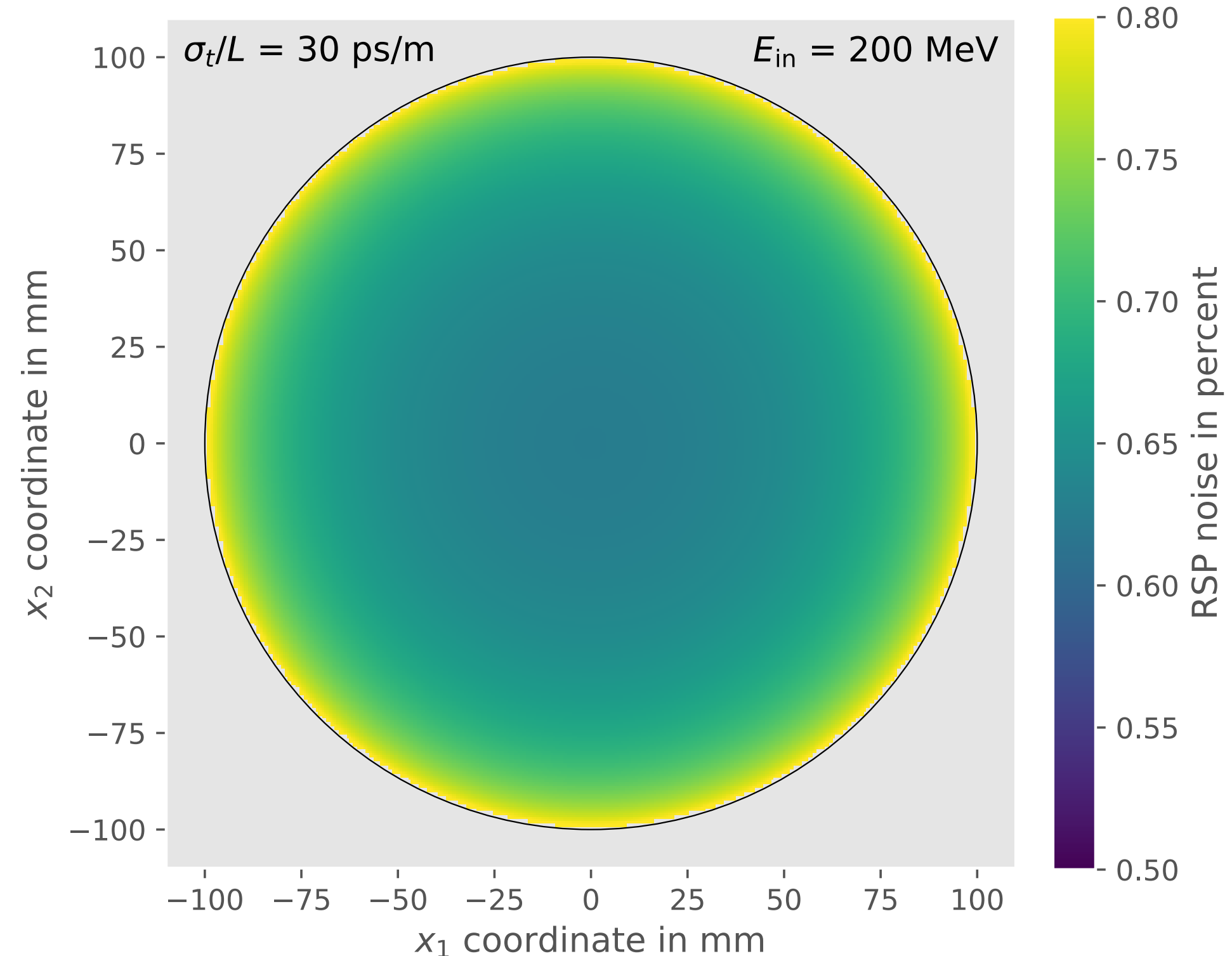
# RSP uncertainty in a water cylinder

- Diameter: 20 cm
- Dose to center: 10 mGy (full acquisition)
- 1x1 mm<sup>2</sup> pixel size
- Incident beam energy: 200 MeV

**calorimeter: 1% error**



**TOF velocity error: 30 ps/m**



**Images noisier towards the edges also with calorimeter-based system**

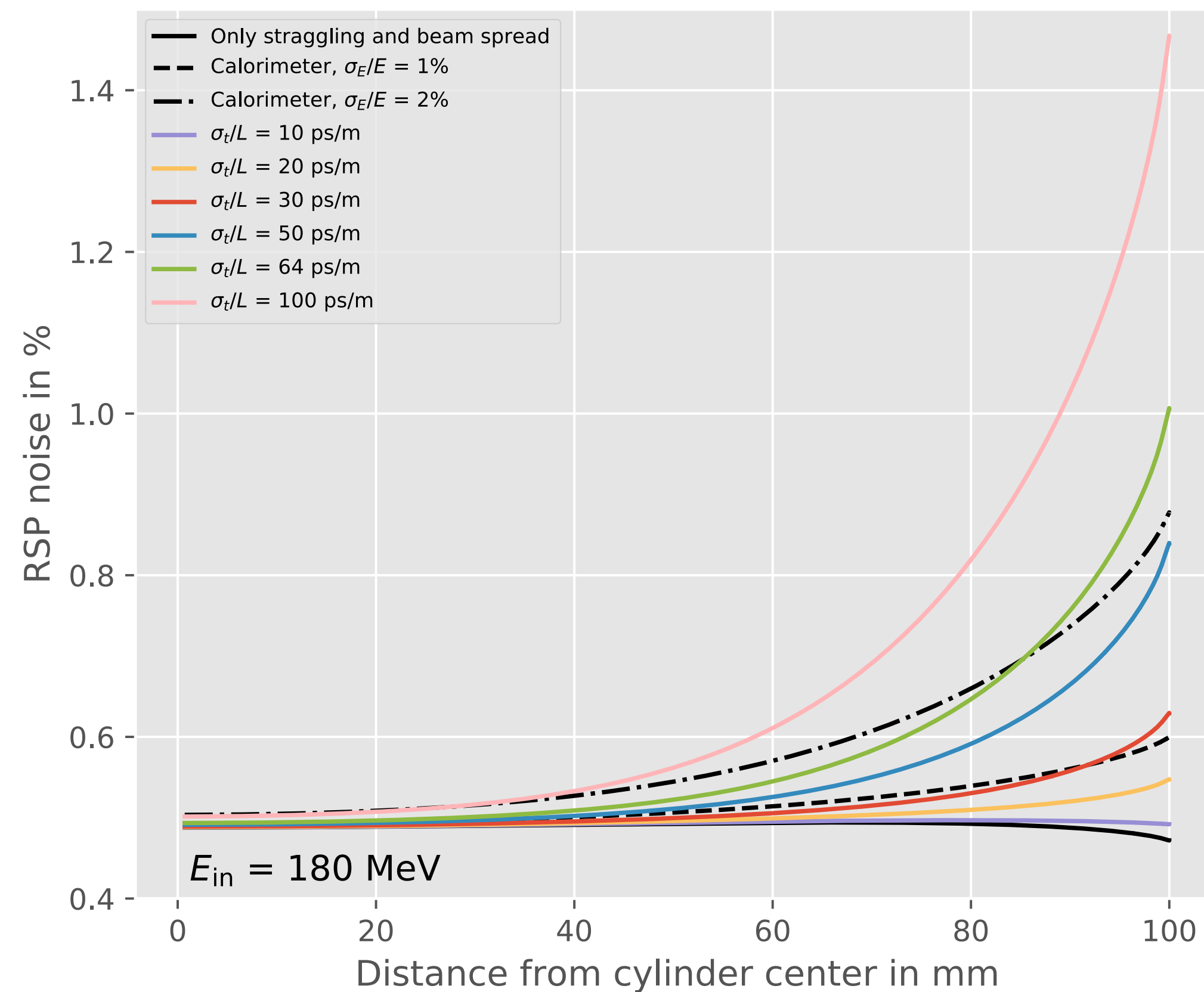
Reason for 5-stage system in phase II pCT scanner (Bashkirov et al. 2016)



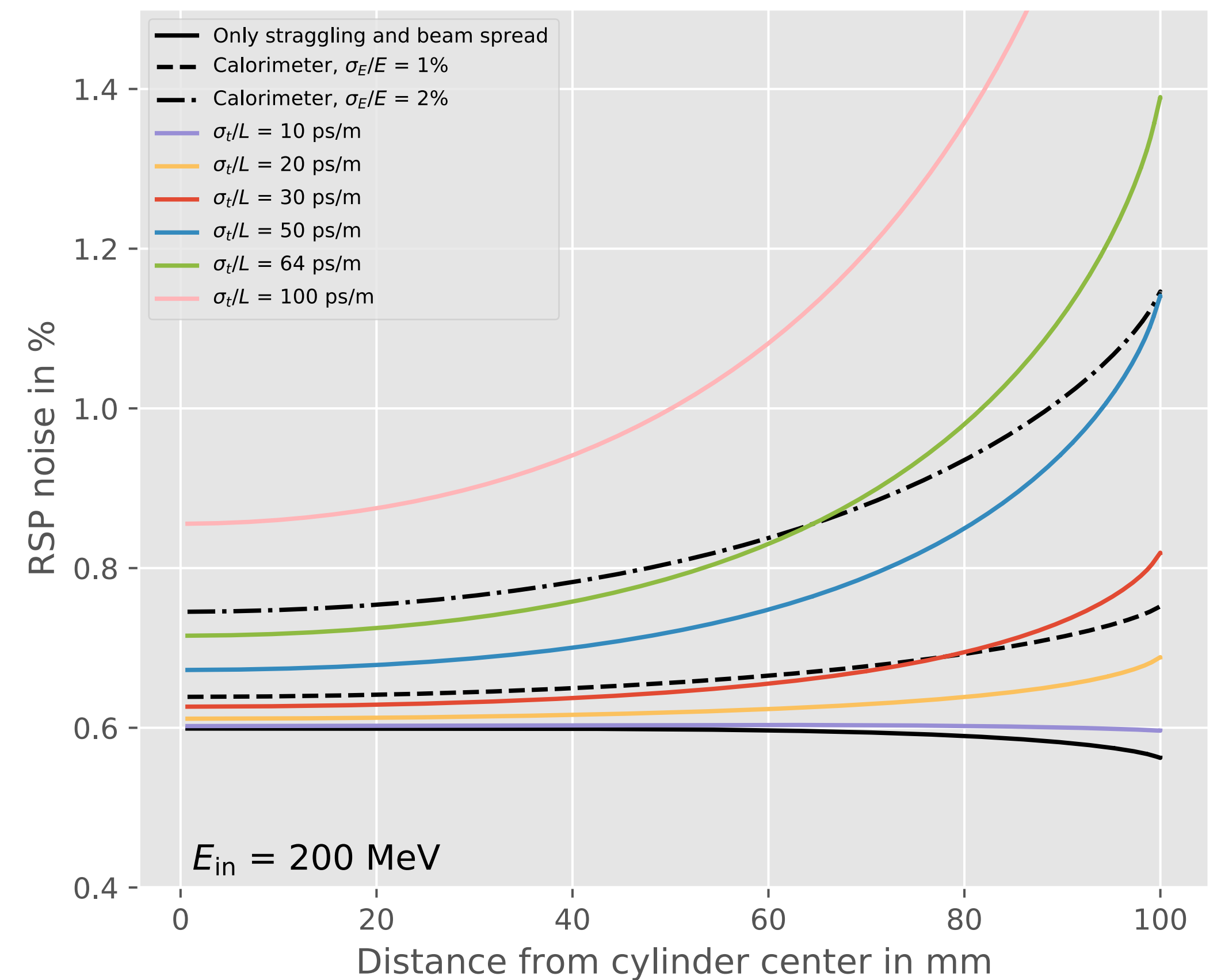
# RSP uncertainty in a water cylinder

- Diameter: 20 cm
- Dose to center: 10 mGy (full acquisition)

## Beam energy: 180 MeV

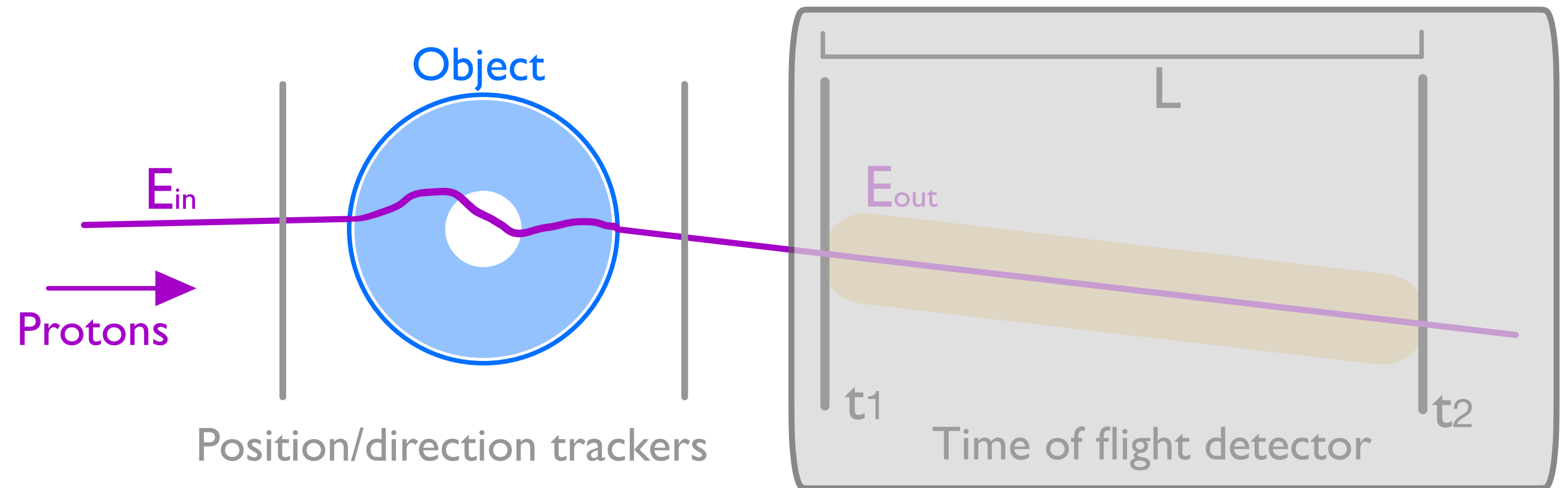


## Beam energy: 200 MeV

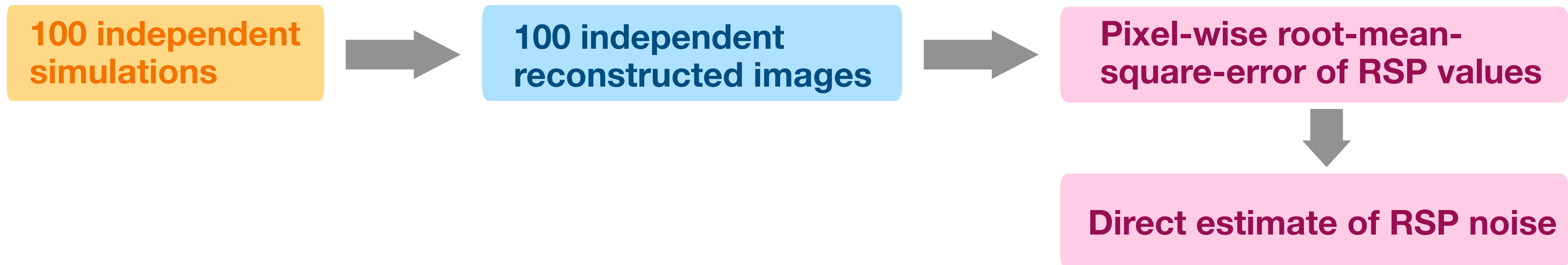


# Monte Carlo simulations

- Geant4/GATE simulation
- Dose to center: 10 mGy (full acquisition)
- Phantom: water cylinder with 20 cm diameter
- QGSP\_BIC physics list and ideal selection of protons which have only undergone electromagnetic interactions
- Ideal position and direction scoring



- Simulated as ideal energy detector
- Energy uncertainty added in post-processing



# Noise due to multiple Coulomb scattering

- Multiple Coulomb scattering (MCS) deviates ions onto stochastic non-linear paths.
- Ions binned into the same pixel have traversed different phantom regions.
- This leads to WEPL variation if density gradients are present and near the object's edge [1,2].

## Estimated MCS contribution from Monte Carlo results:

$$\text{Var}_{\text{RSP,MCS}} = \text{Var}_{\text{RSP,MC}} - \text{Var}_{\text{RSP,model}}$$

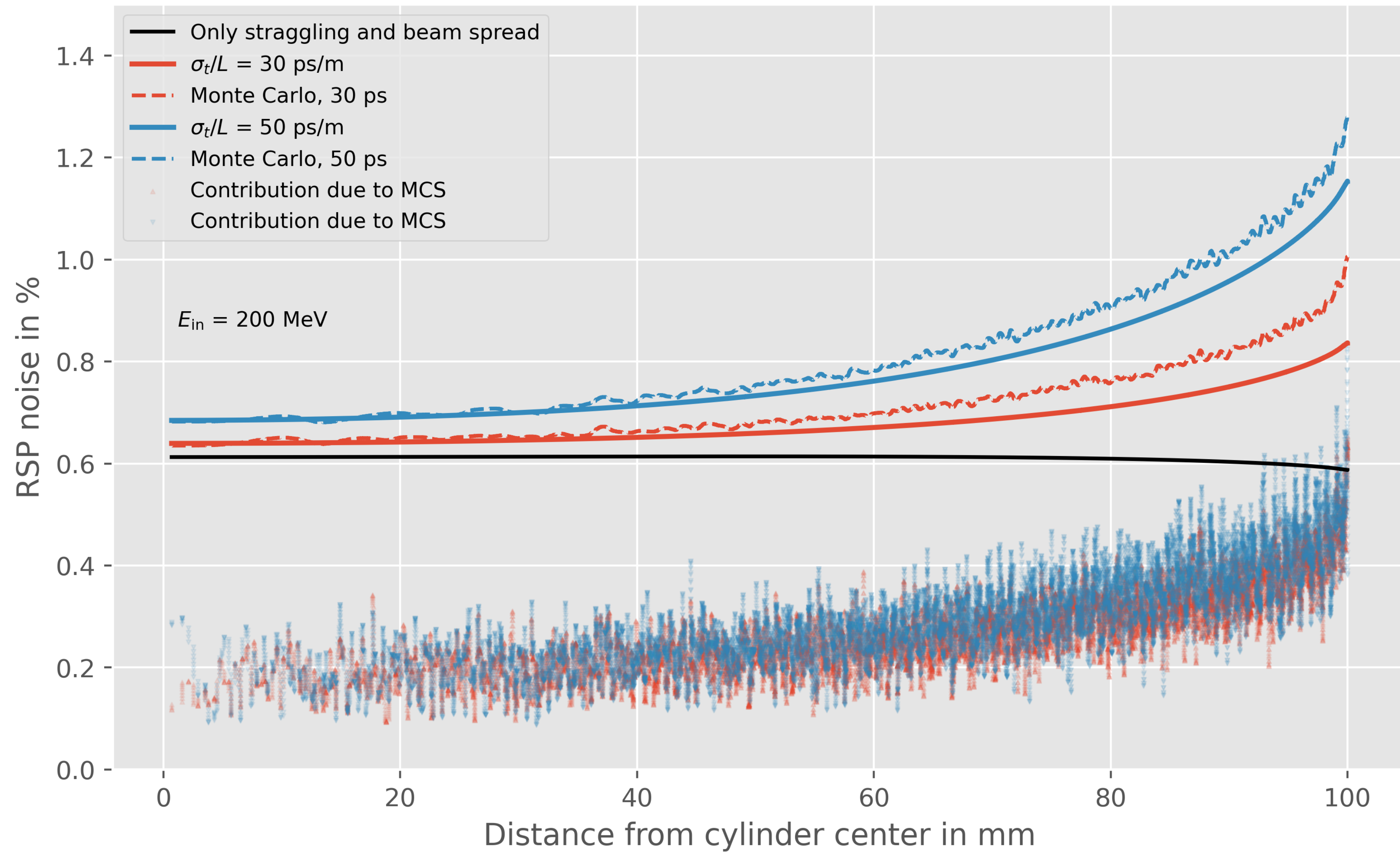
contains all noise contributions

contains all noise contributions except for MCS

[1] Rädler, M. et al. (2018). Two-dimensional noise reconstruction in proton computed tomography using distance-driven filtered back-projection of simulated projections. *Physics in Medicine & Biology*, 63(21), 215009. <https://doi.org/10.1088/1361-6560/aae5c9>

[2] Dickmann, J., Wesp, P., Rädler, M., Rit, S., Pankuch, M., Johnson, R. P., ... Dedes, G. (2019). Prediction of image noise contributions in proton computed tomography and comparison to measurements. *Physics in Medicine & Biology*, 64(14), 145016. <https://doi.org/10.1088/1361-6560/ab2474>

# Monte Carlo results



# Proton vs helium

## Observations:

Helium mass = 4 x proton mass

Helium stopping power = 4 x proton stopping power

At equal residual range:

helium beam energy = 4 x proton beam energy

All energy and mass terms scale by factor of 4!

$$\sigma_{\text{WEPL,He}}^2 = \frac{1}{S_{\text{w,p}}^2 \Phi \Delta \xi^2} \left( \frac{1}{4} \sigma_{E_{\text{out,strag,p}}}^2 + \frac{\sigma_{t,\text{He}}^2}{\sigma_{t,\text{p}}^2} \sigma_{E_{\text{out,TOF,p}}}^2 + (\delta E_{\text{beam,He}} E_{\text{in,p}})^2 \right)$$

## Ratio of measurement errors:

$$\frac{\sigma_{t,\text{He}}}{\sigma_{t,\text{p}}} \approx \frac{1}{4} \quad \text{because detector response scales with stopping power}$$

# Proton vs helium: at equal dose

$$\sigma_{\text{WEPL,He}}^2 \approx \frac{1}{S_{\text{w,p}}^2 \Phi_{\text{helium}} \Delta \xi^2} \left( \frac{1}{4} \sigma_{E_{\text{out,strag,p}}}^2 + \frac{1}{4} \sigma_{E_{\text{out,TOF,p}}}^2 + (\delta E_{\text{beam,He}} E_{\text{in,p}})^2 \right)$$

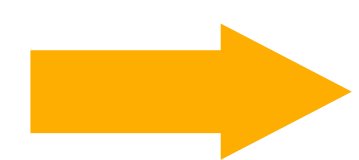
Dose scales with stopping power:

$$D \propto S \quad \text{and} \quad S_{\text{helium}} \approx 4S_{\text{proton}}$$



Therefore, at equal dose:

$$\frac{1}{\Phi_{\text{helium}}} \approx 4 \frac{1}{\Phi_{\text{proton}}}$$

 
$$\sigma_{\text{WEPL,He}}^2 = \frac{1}{S_{\text{w,p}}^2 \Phi_{\text{proton}} \Delta \xi^2} \left( \sigma_{E_{\text{out,strag,p}}}^2 + \sigma_{E_{\text{out,TOF,p}}}^2 + 4(\delta E_{\text{beam,He}} E_{\text{in,p}})^2 \right)$$

**Protons and helium ions expected to yield similar noise.**

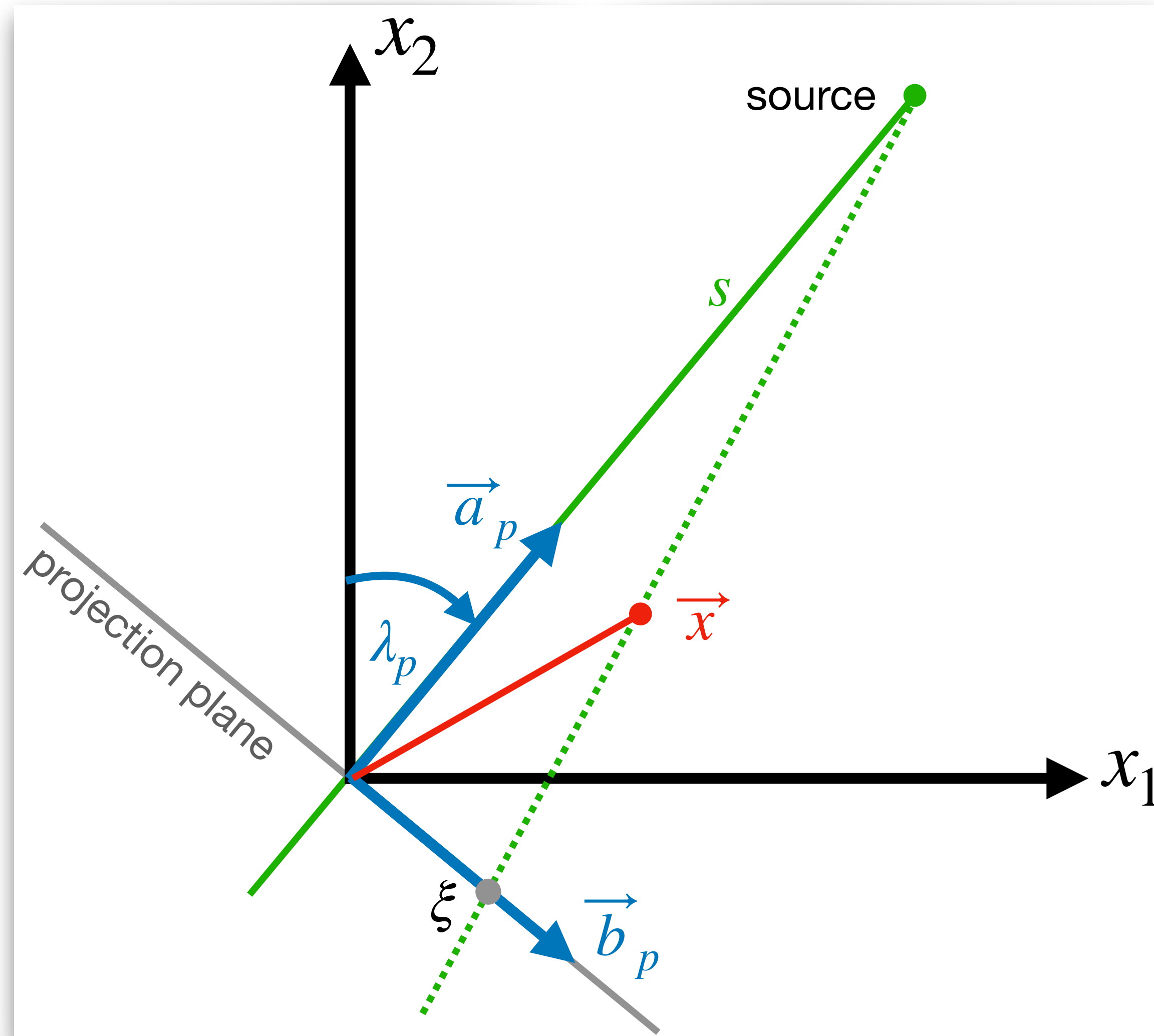
# Conclusion

- Time-of-flight is an alternative method for energy-loss measurement in ion CT
- RSP resolution better than 1% with velocity errors  $<50$  ps/m
- At 30-50 ps/m velocity error: image noise is comparable with calorimeter-based system with 1-2% error
- Noise can be improved by optimizing incident beam energy as a function of expected water equivalent path length, e.g. via optimization similar to Dickmann et al. 2019
- Image noise expected to be similar with protons and helium ions.
- Interesting novel sensor technology from field of particle physics, e.g. LGAD (see talk by Albert)

**Thanks**



# Noise reconstruction: geometry (2D)



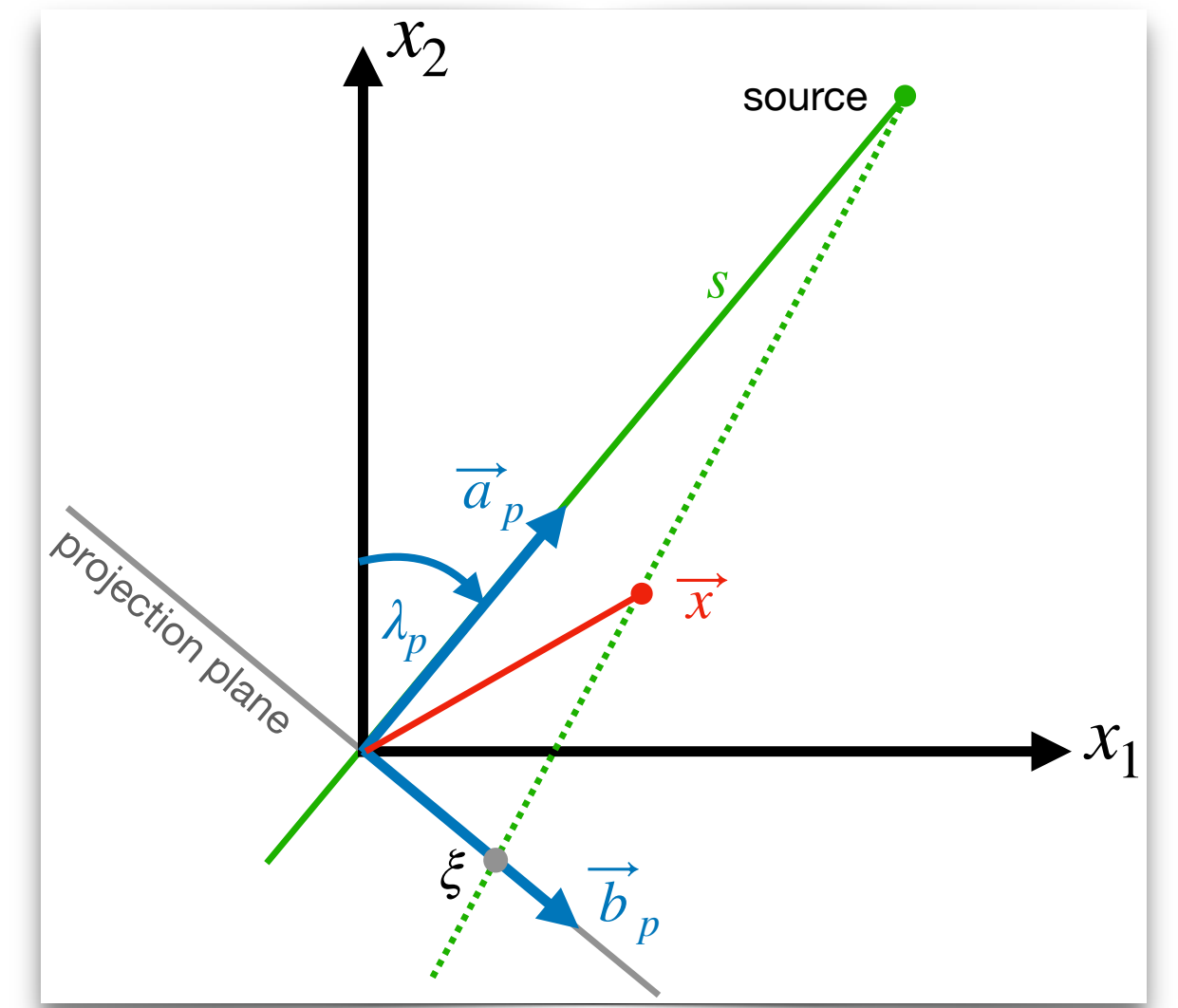
# RSP uncertainty via noise reconstruction

(approximate)

**Backprojection:**

$$\text{Var}_{\text{RSP}}(\vec{x}) = \underset{\text{approximation}}{f_{\text{interp}}} \frac{\Delta\lambda^2}{4} \sum_{p=1}^P \left( \frac{\|\vec{a}_{\lambda_p}\|}{\|\vec{x} \cdot (\vec{a}_{\lambda_p}/s) - \vec{a}_{\lambda_p}\|} \right)^4 V_p(\xi_k)$$

weighting factor



**Filtering:**

$$V_p(\xi_k) = (\Delta\xi)^2 \sum_{j=-J}^{J-1} h_F^2(\xi_k - \xi_j) \frac{\|\vec{a}_{\lambda_p}\|^2}{\|\vec{a}_{\lambda_p}\|^2 + \xi_j^2} \text{Var}(\lambda_p, \xi_j)$$

weighting factor

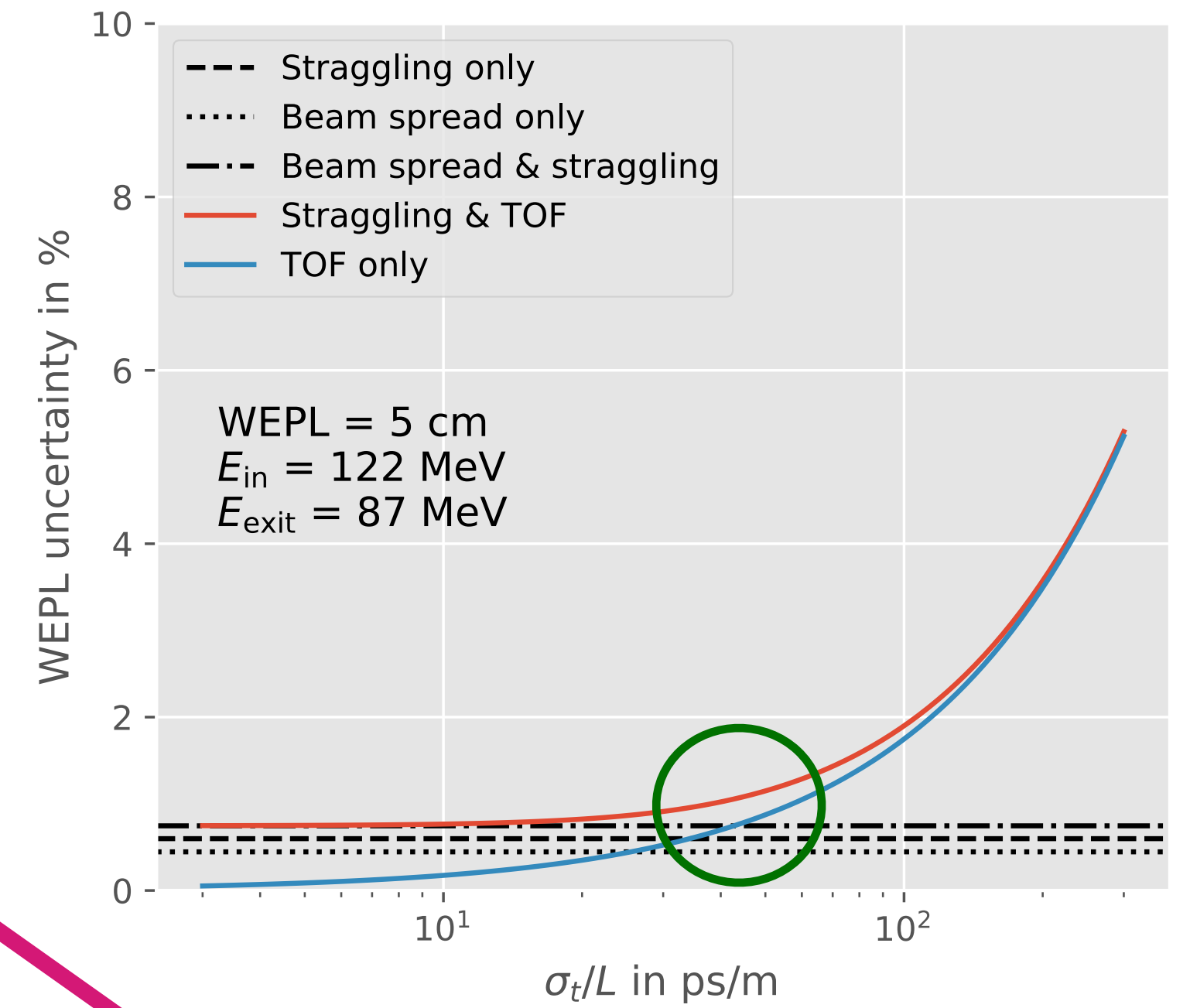
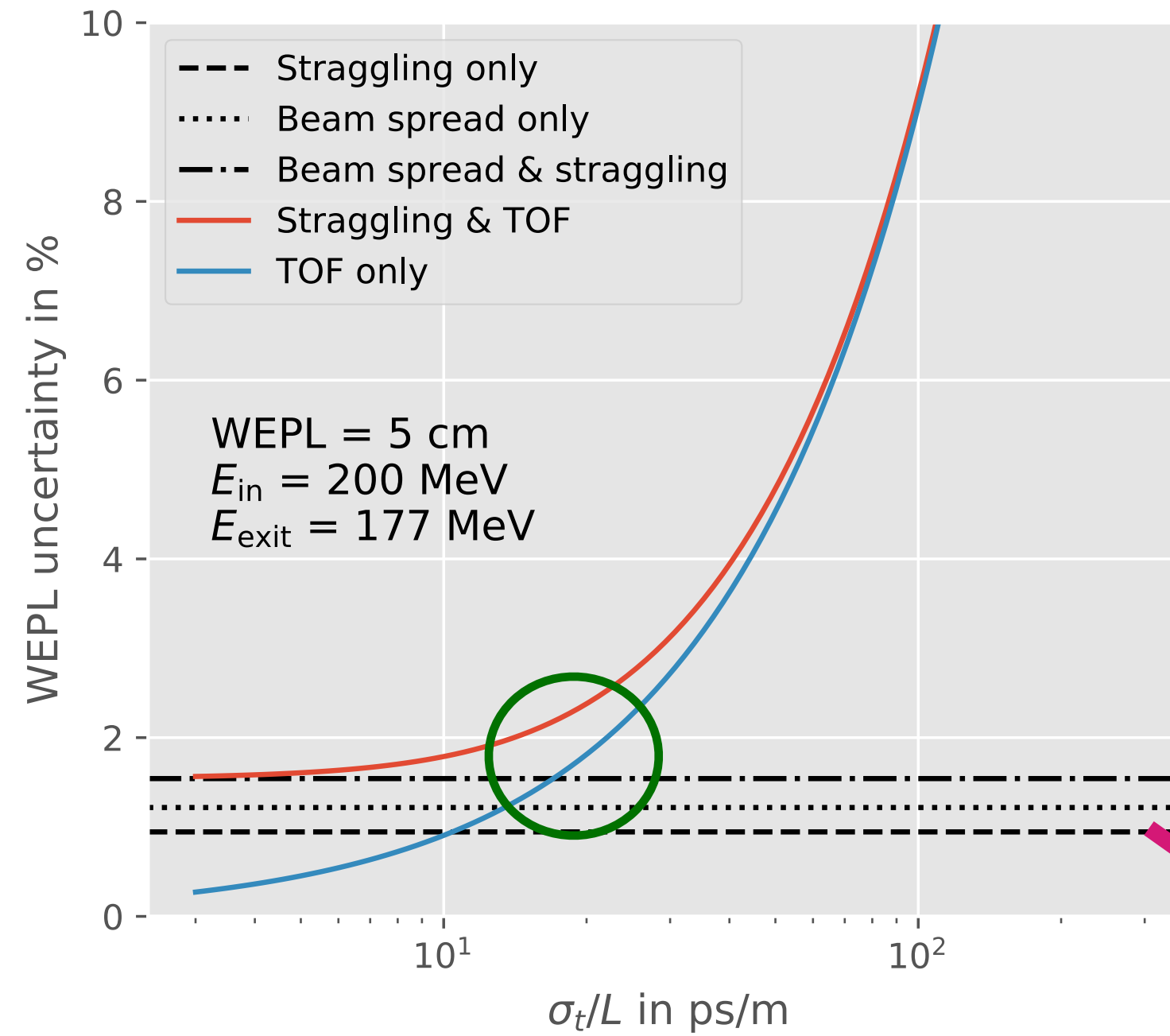
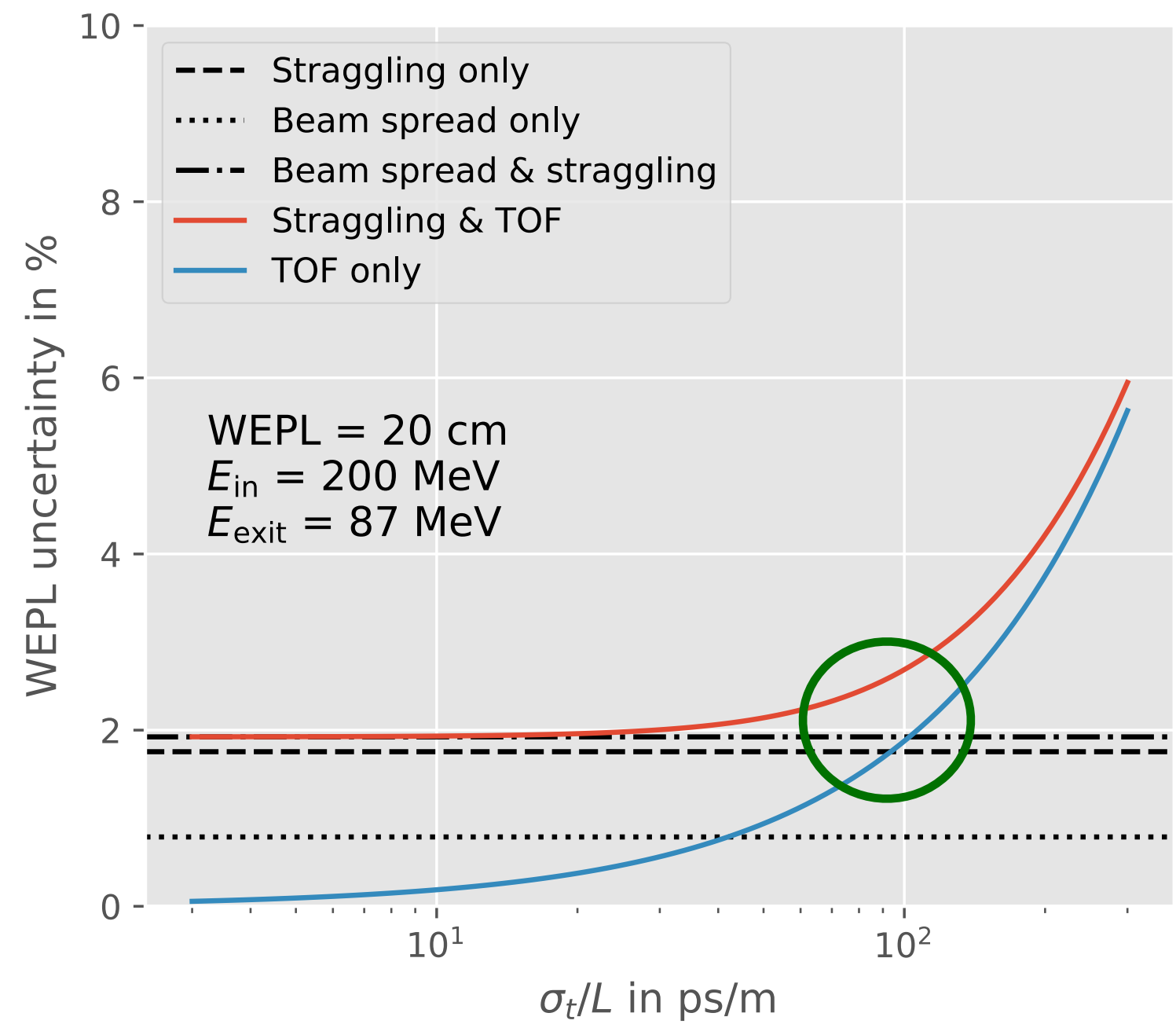
Anodized ramp filter:

$$h_F(\xi_j) = h_F((j + 1/2)\Delta\xi) = \begin{cases} 1/(2\Delta\xi)^2 & \text{for } j = 0, \\ 0 & \text{for } j \text{ even and } j \neq 0 \\ -1/(j\pi\Delta\xi)^2 & \text{for } j \text{ odd,} \end{cases}$$

**WEPL variance in pixel j and projection p**

# WEPL uncertainty: TOF vs straggling

$$\sigma_{\text{WEPL}, N=1}^2(E_{\text{out}}) = \frac{\sigma_{\Delta E}^2(E_{\text{out}})}{S_w^2(E_{\text{out}})}$$



**Intrinsic lower limit**

**Ideally: Incident energy should be adjusted as a function of (expected) WEPL (see Stefanie's talk yesterday)**