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Ion channel formation for advanced betatron emission

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On behalf of the EuPRAXIA@SPARC\_LAB and SL\_BETATEST collaboration







#### Introduction



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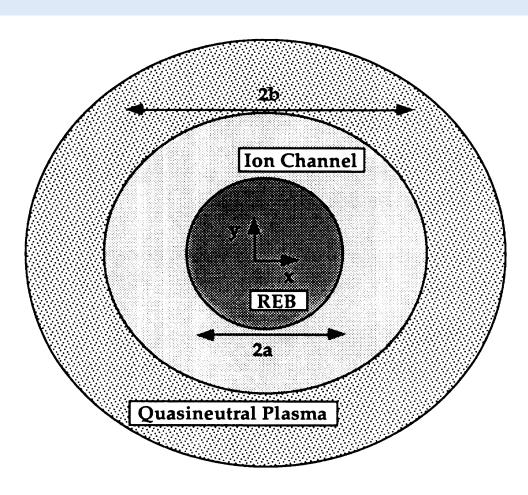
PHYSICAL REVIEW LETTERS

21 May 1990

#### **Ion-Channel Laser**

David H. Whittum and Andrew M. Sessler Lawrence Berkeley Laboratory, Berkeley, California 94720

John M. Dawson Department of Physics, University of California at Los Angeles, Los Angeles, California 90024 (Received 5 February 1990)



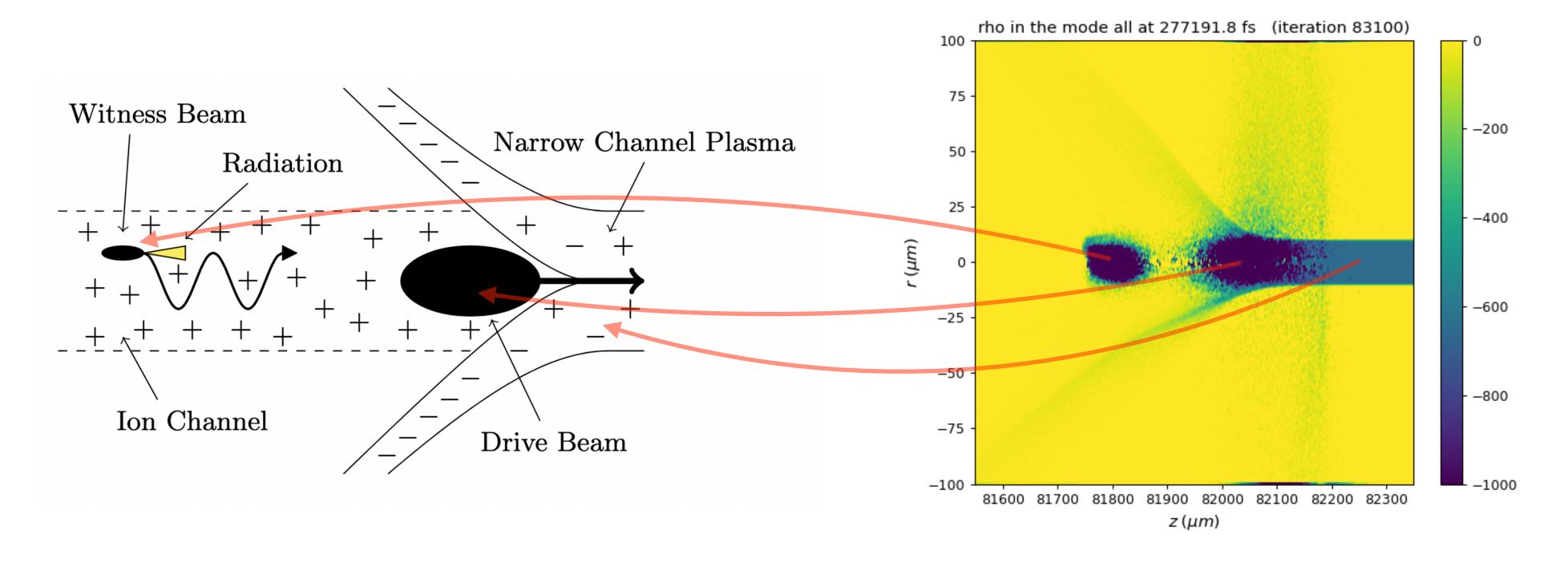
- ▶ Relativistic electron beams (REBs) void a preformed plasma by electrons. The plasma has linear radial forces: focuses the beam and electrons perform betatron oscillations. In some situations, the longitudinal electric field may be negligible (wakeless regime).
- ightharpoonup Betatron oscillations at  $\omega_{eta} \propto \omega_p/\sqrt{\gamma}$  provide a source of e.m. radiation with a fundamental frequency  $\omega_0 \propto \gamma^{3/2}\omega_n$ .
- ▶ If oscillations amplitude is small (i.e negligible harmonic emission), collective effects in e.m. radiation emission may set in, realizing a plasma based FEL or ion-channel laser.
- Compared to standard magnetic undulators, the ICL has larger acceptance in bunch energy spread, due to large Pearson parameter.



#### Motivation



- $\triangleright$  The wakeless regime can be realized when plasma is preformed in a cylindrical volume with limited radius  $R_{ch}$  and a drive bunch manages to expel all electrons from it, realizing a plasma based compact undulator.
- ▶ Even without emission collective effects, the resulting betatron source can have a much reduced emission band compared to emission with acceleration.
- Drive bunch creates the wakeless channel; a properly tailored and injected witness emits radiation.



Test experiment @ SPARC\_LAB

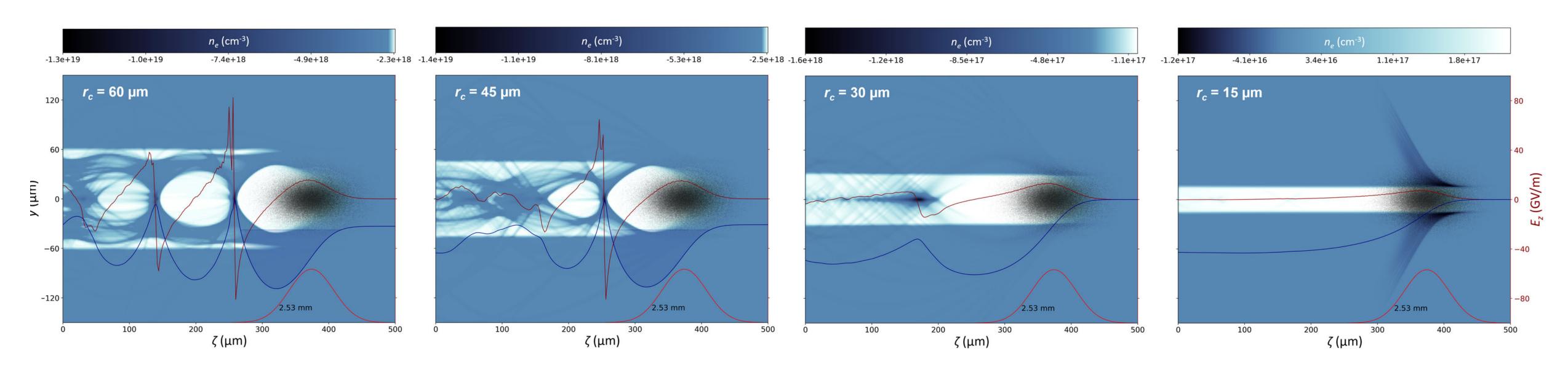


#### State of the art



The idea dates back to 1990 but...

- All published papers (not many!!) deal with radiation emission conditions and properties.
- ▶ Only one gives some hints about channel formation but just as a limitation in PWFA!



A.F. Habib et al., Plasma Photocathodes, Ann. Phys. 535, 2200655 (2023). A.F. Habib et al., arXiv:2111.01502v1 (2021).

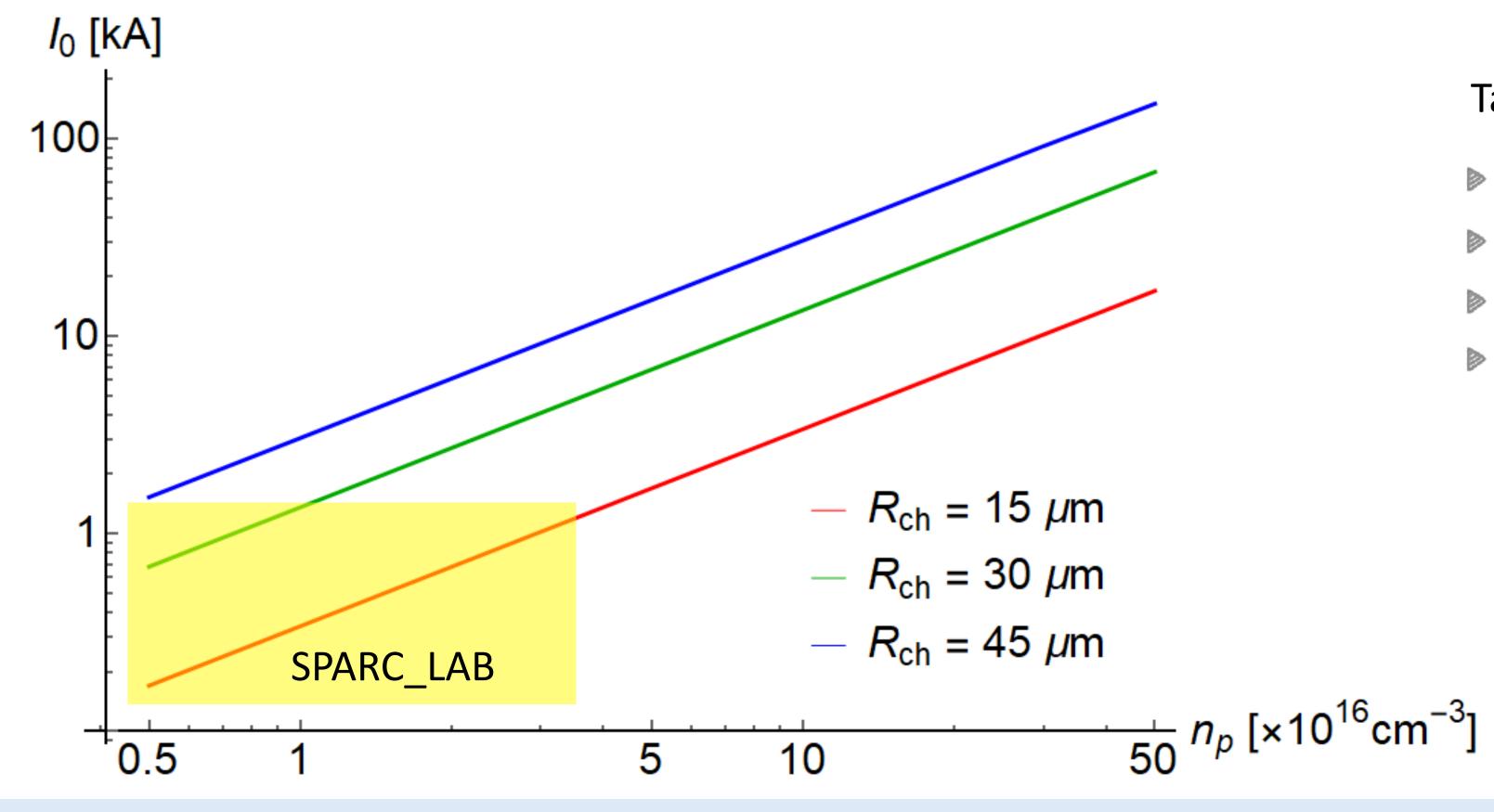
▶ As the preformed channel radius gets thinner and thinner, the ICL formation improves...



## A bit of theory



- Whittum et al. provide an estimate for the blowout radius  $R_{bl} \sim \sigma_x \sqrt{n_b/n_p}$ , assuming  $n_b > n_p$ .
- ightharpoonup Assuming a bi-Gaussian bunch, and requiring  $R_{bl}>R_{ch}$ , leads to  $I_b/I_0>1$  with  $I_0=\pi ecR_{ch}^2n_p$  (beware: the condition is only necessary!!!)



Take away informations from scaling:

- ightharpoonup Small  $R_{ch}$  favors formation.
- ightharpoonup High current required  $\gtrsim 1$  kA.
- No clues about channel quality, if formed.
- ▶ Assuming  $E_b \sim 100$  MeV, achievable photon energies in the fundamental are around  $\sim 10s - 100s$  meV (IR to visible), depending on emitting bunch transverse size.



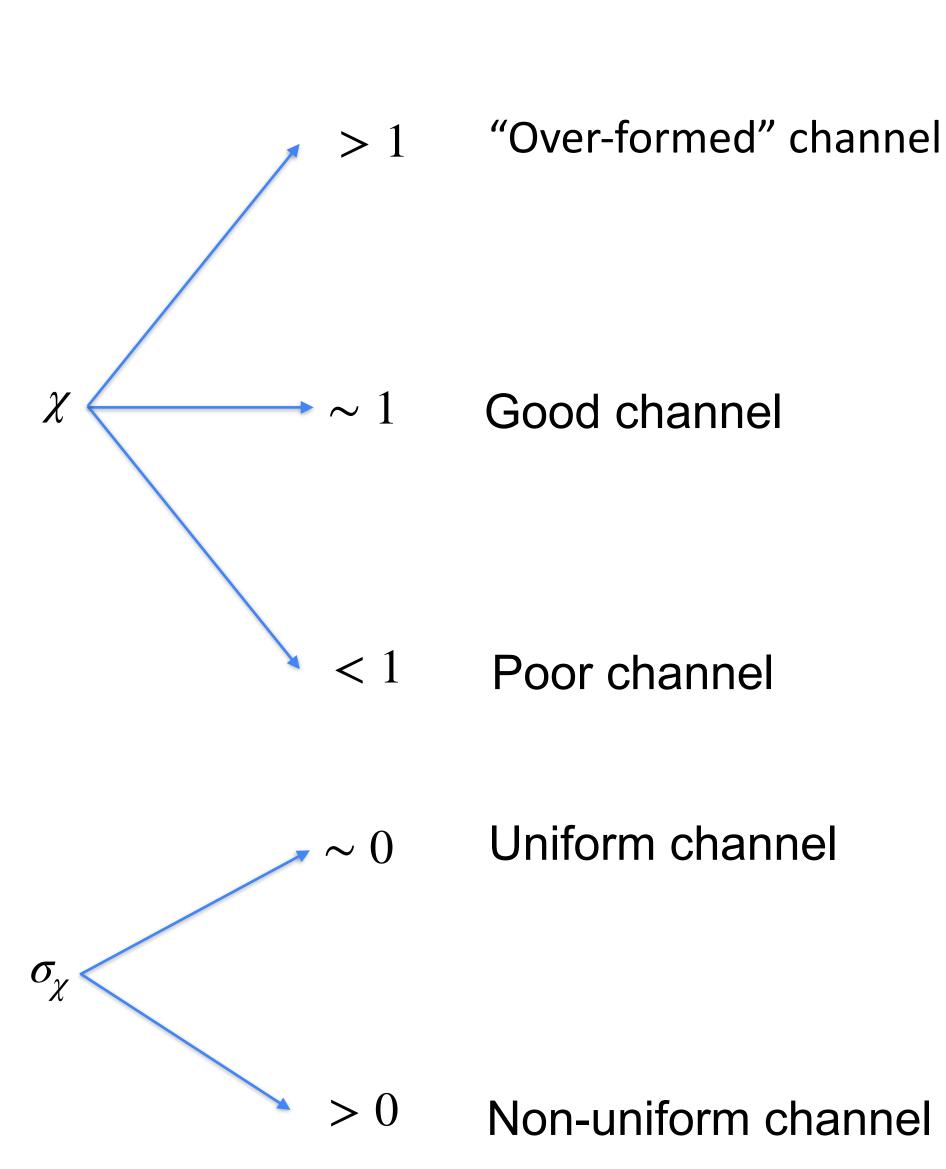
## How to "measure" channel formation?

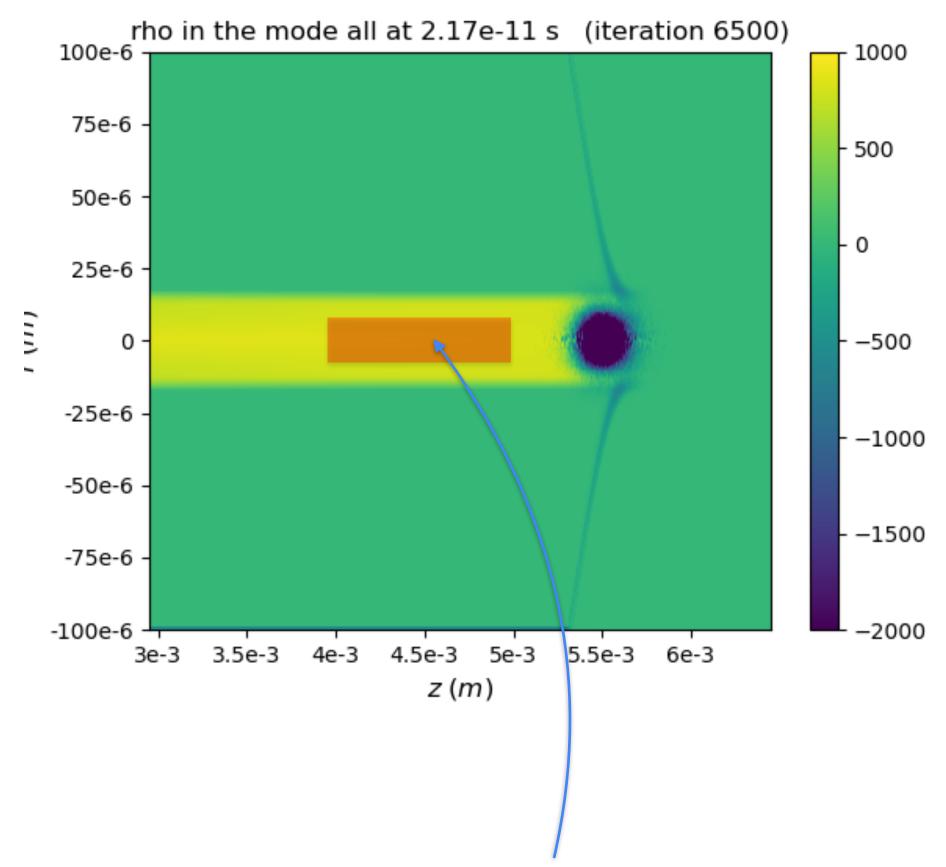


Total charge density

$$\chi = \frac{\langle \rho \rangle}{\rho_N^{(0)}}$$

Ions unperturbed charge density





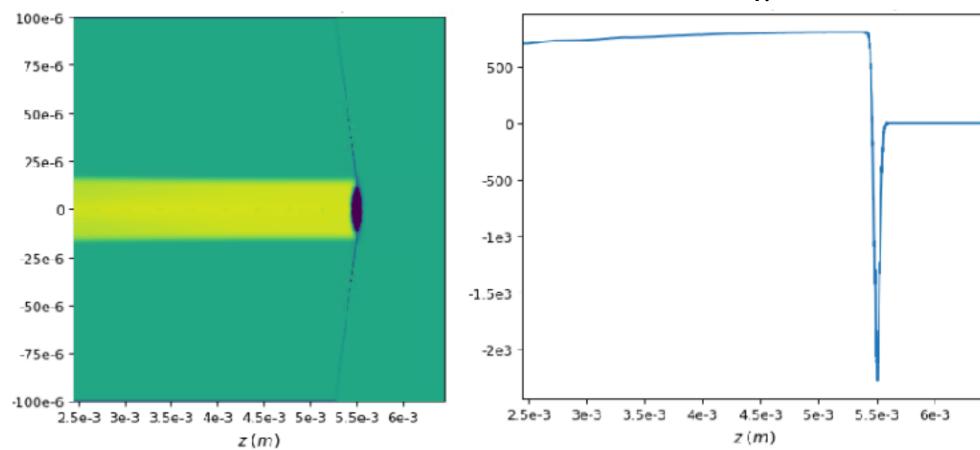
average is calculated on a cylindrical volume V with radius  $r_V = \frac{1}{2}R_{ch}$  and length equal to about 25% of the window length (1 mm)



#### Does it work?

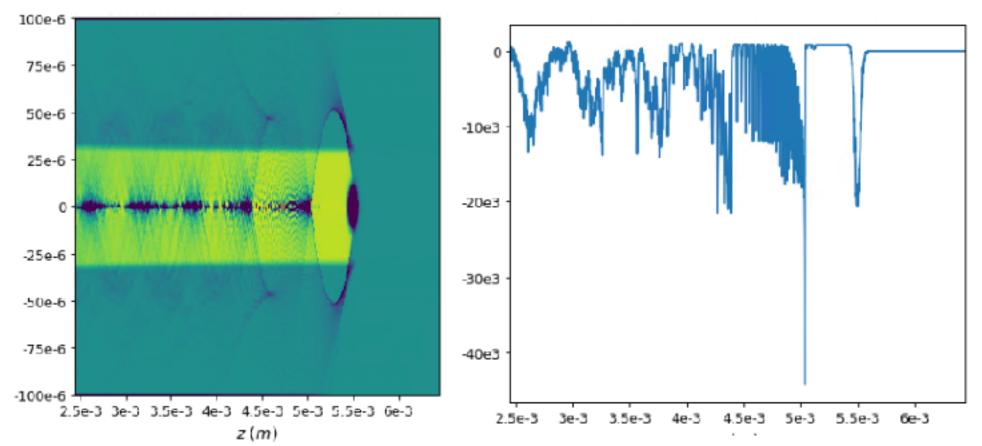


$$R_{\rm ch} = 15 \ \mu {\rm m}, \, n_0 = 5 \times 10^{15} \ {\rm cm}^{-3}$$
  $\chi = 0.99$   $Q_b = 200 \ {\rm pC}, \, \sigma_z = 24 \ \mu {\rm m}$   $\sigma_\chi = 0.02$ 

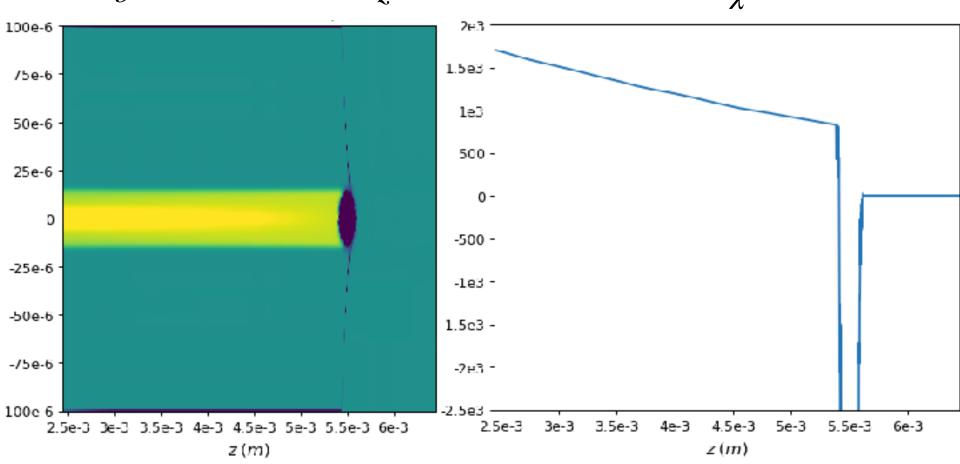


$$R_{\rm ch} = 15~\mu{\rm m}, \, n_0 = 10^{17}~{\rm cm}^{-3}$$
  $\chi = -0.03$   $Q_b = 200~{\rm pC}, \, \sigma_z = 24~\mu{\rm m}$   $\sigma_\chi = 0.14$ 

$$R_{\rm ch} = 30 \ \mu {\rm m}, \, n_0 = 5 \times 10^{15} \ {\rm cm}^{-3}$$
  $\chi = 0.67$   $Q_b = 200 \ {\rm pC}, \, \sigma_z = 24 \ {\rm \mu m}$   $\sigma_\chi = 0.34$ 



$$R_{\rm ch} = 15 \ \mu {\rm m}, \, n_0 = 5 \times 10^{15} \ {\rm cm}^{-3}$$
  $\chi = 1.17$   $Q_b = 1000 \ {\rm pC}, \, \sigma_z = 30 \ \mu {\rm m}$   $\sigma_\chi = 0.13$ 



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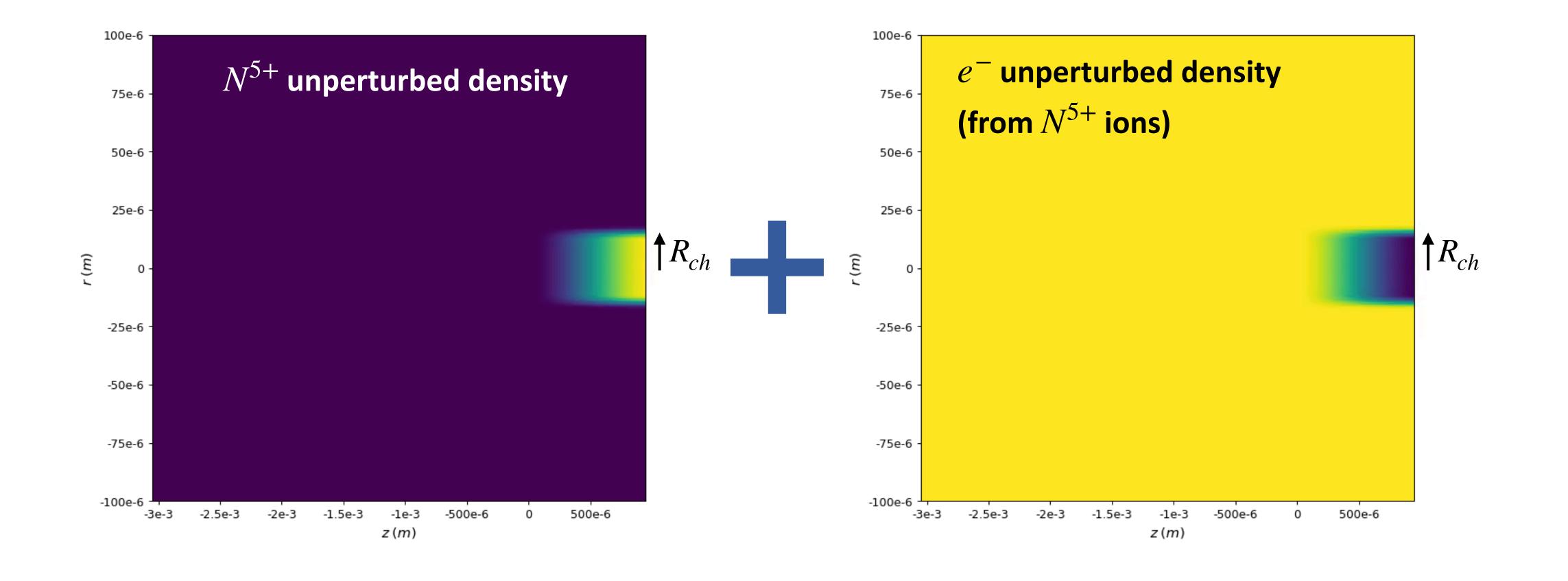


## Simulations setup



Pre-ionized channel:  $N^{5+}$  within  $R_{ch}$ and neutral N outside

- $\triangleright$  Constant parameters:  $\sigma_x = 5 \, \mu \text{m}$ ,  $E_b \to \infty$
- ightharpoonup Scanned parameter:  $I_b/I_0$  which is a function of  $R_{ch}$ ,  $n_p$ ,  $Q_b$  and  $\sigma_z$ .

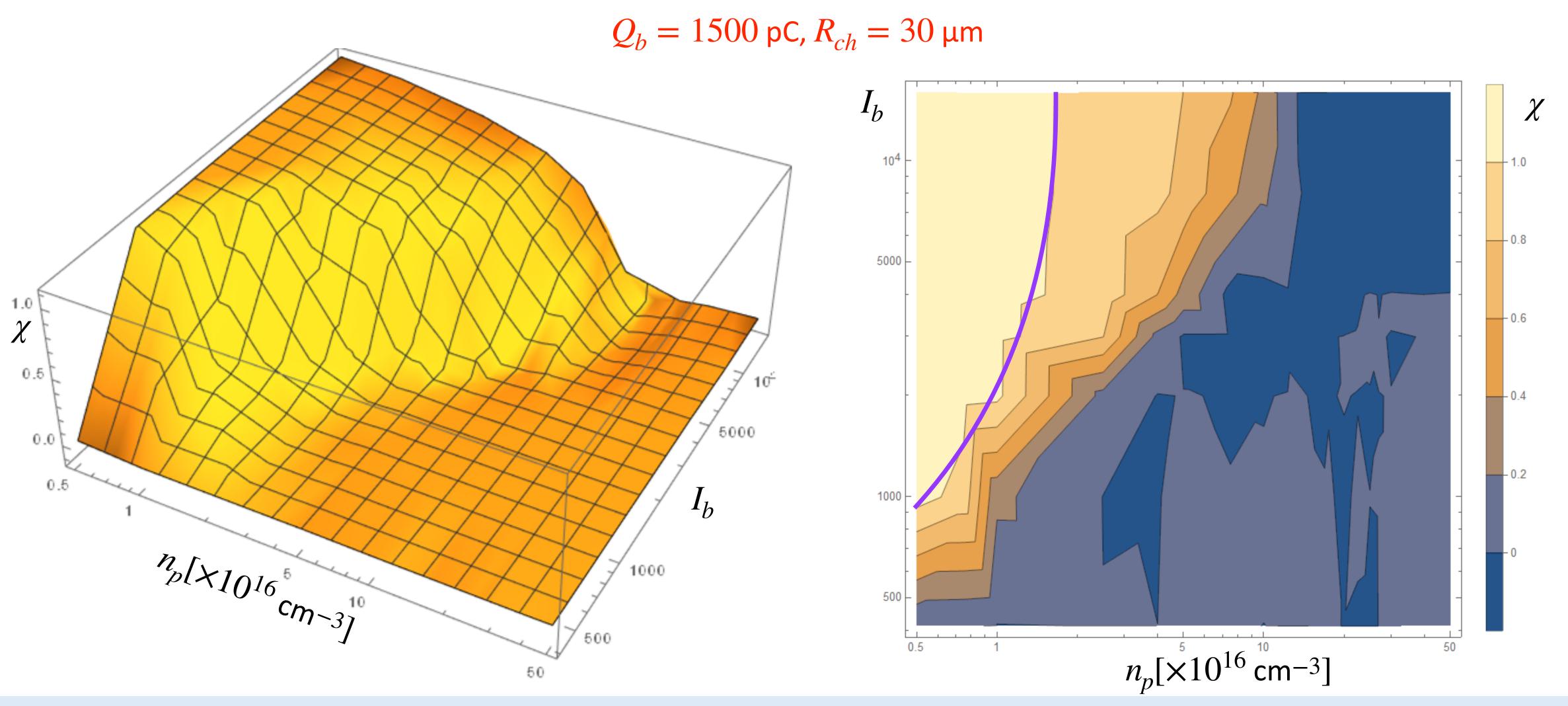




#### Simulation results: channel formation



Constant parameters:  $\sigma_x = 5 \, \mu \text{m}$ ,  $E_b \to \infty$  Scanned parameter:  $I_b/I_0$  which is a function of  $R_{ch}$ ,  $n_p$ ,  $Q_b$  and  $\sigma_z$ .



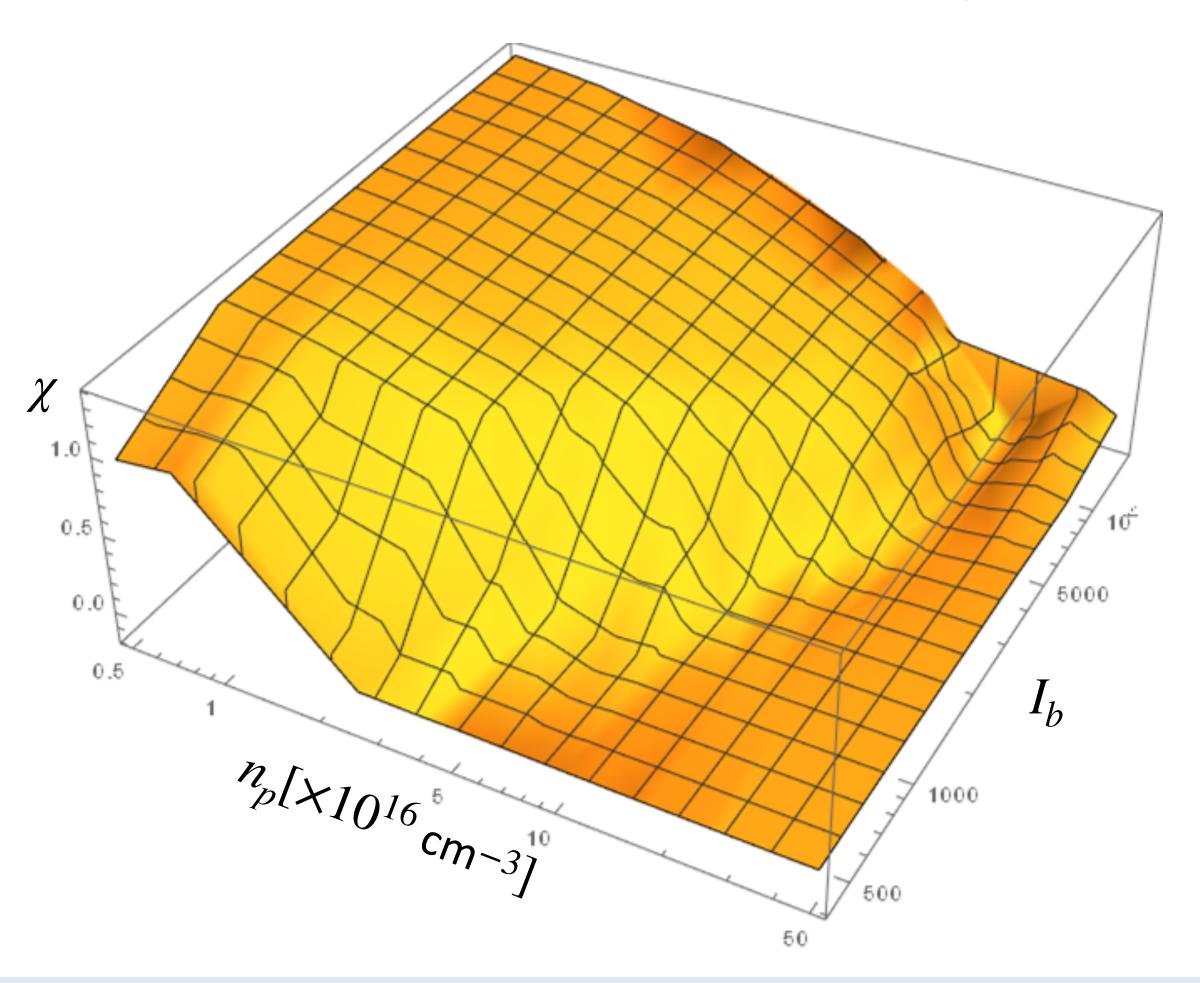


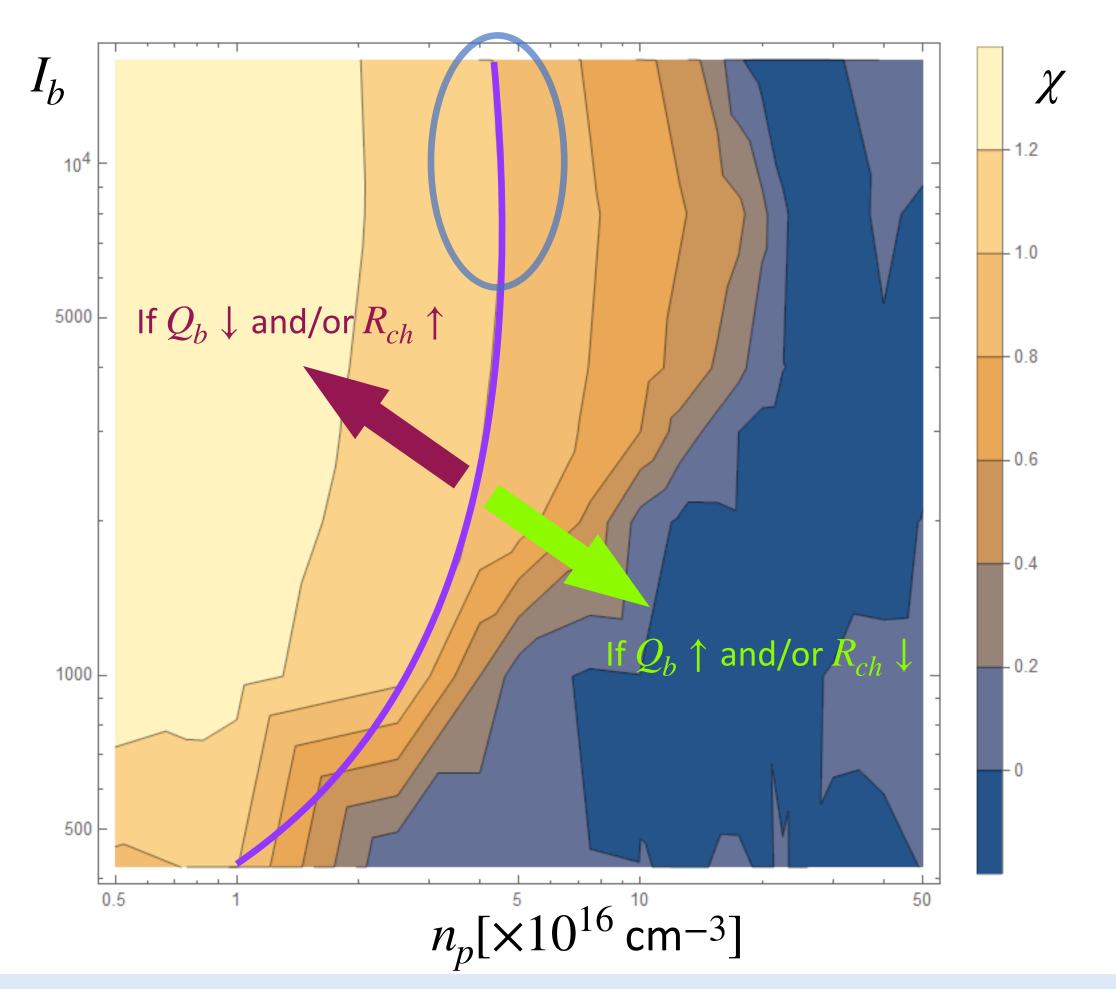
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$$Q_b = 1500 \text{ pC}, R_{ch} = 15 \text{ }\mu\text{m}$$



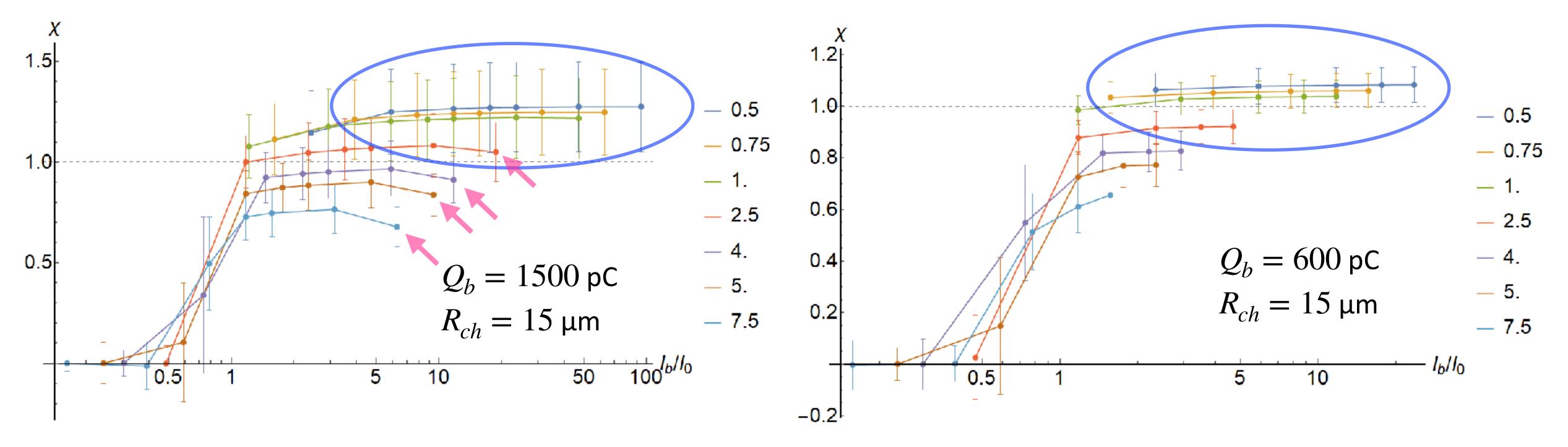




## Simulation results: channel uniformity



Constant parameters:  $\sigma_x = 5 \, \mu m$ ,  $E_b \to \infty$  Scanned parameter:  $I_b/I_0$  which is a function of  $R_{ch}$ ,  $n_p$ ,  $Q_b$  and  $\sigma_z$ .



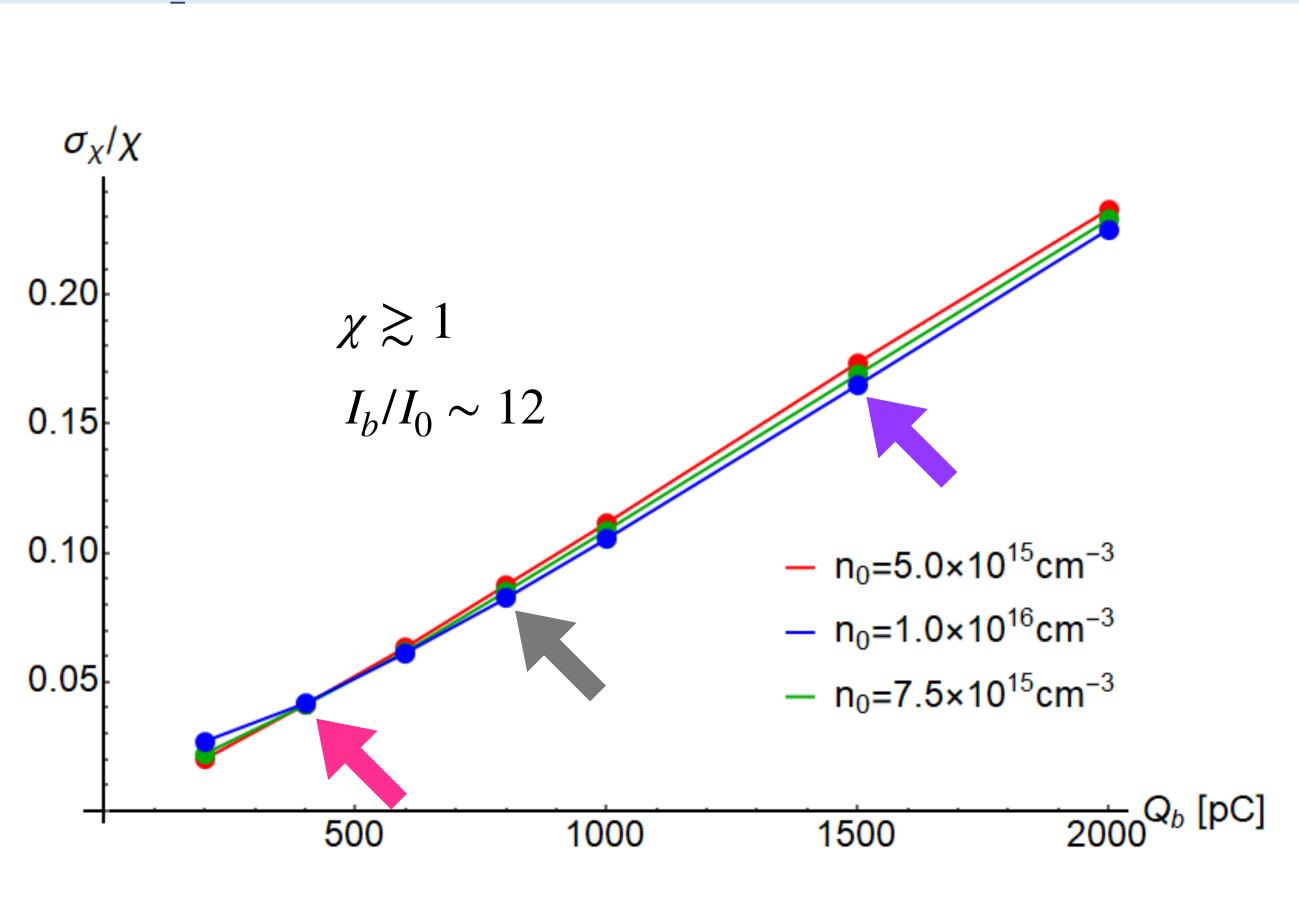
- ▶ The condition  $I_b/I_0 > 1$  for channel formation seems to be confirmed.
- ho Once channel is formed,  $\sigma_{\!\scriptscriptstyle \gamma}$  seems to strongly increase with  $Q_b$  and do not depend on  $I_b/I_0$ .
- ▶ For  $I_b/I_0 \gg 1$  and sufficiently large  $n_0$  values,  $\chi$  starts to decrease.



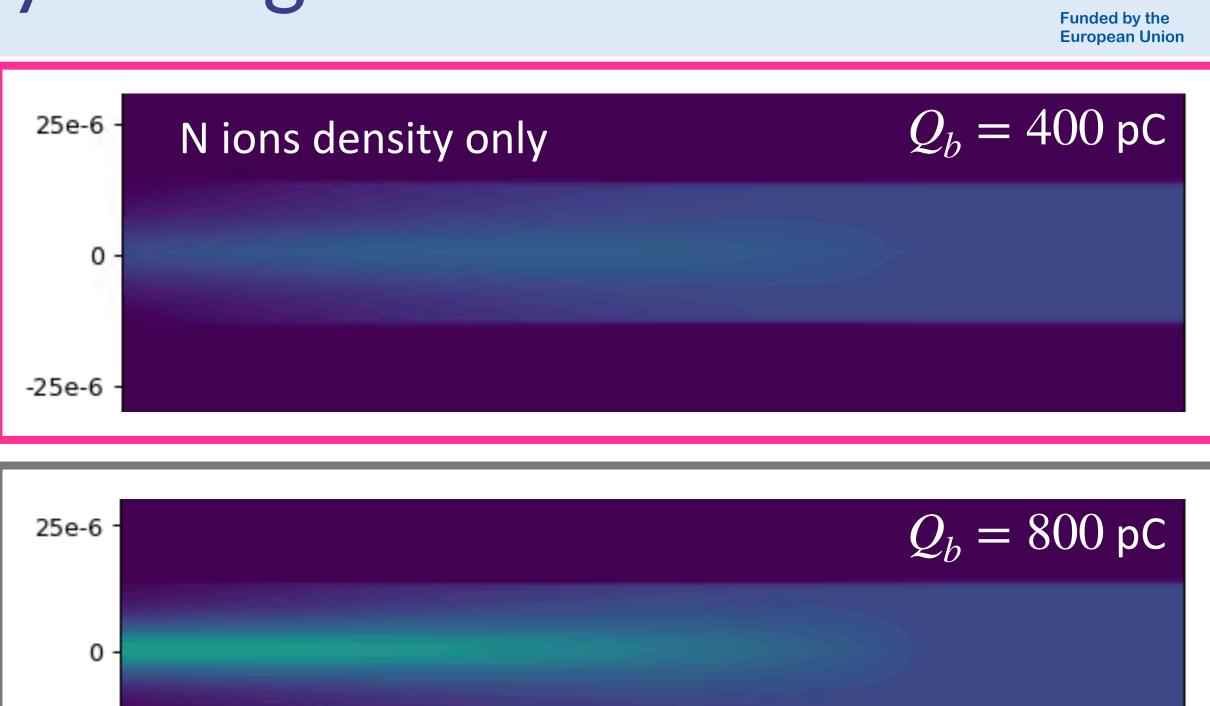
## Channel uniformity: charge effects

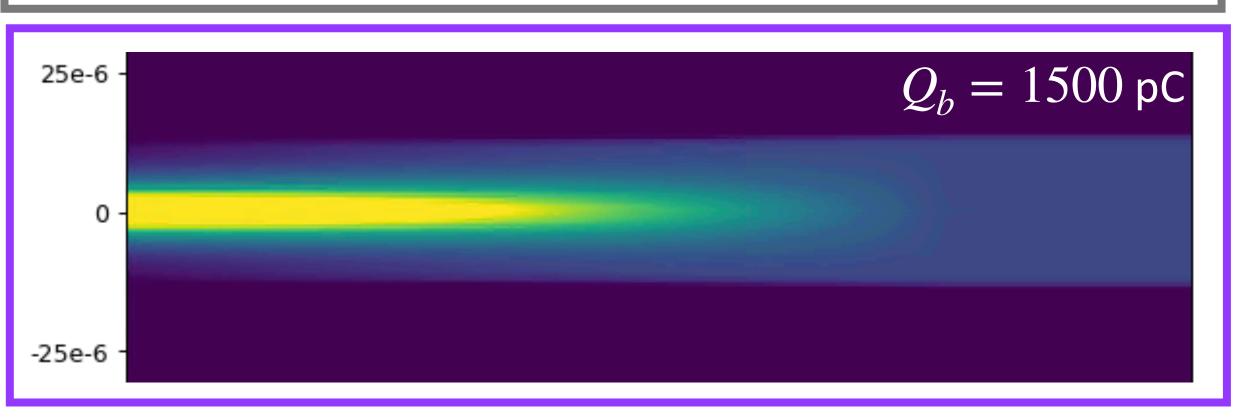
-25e-6 -







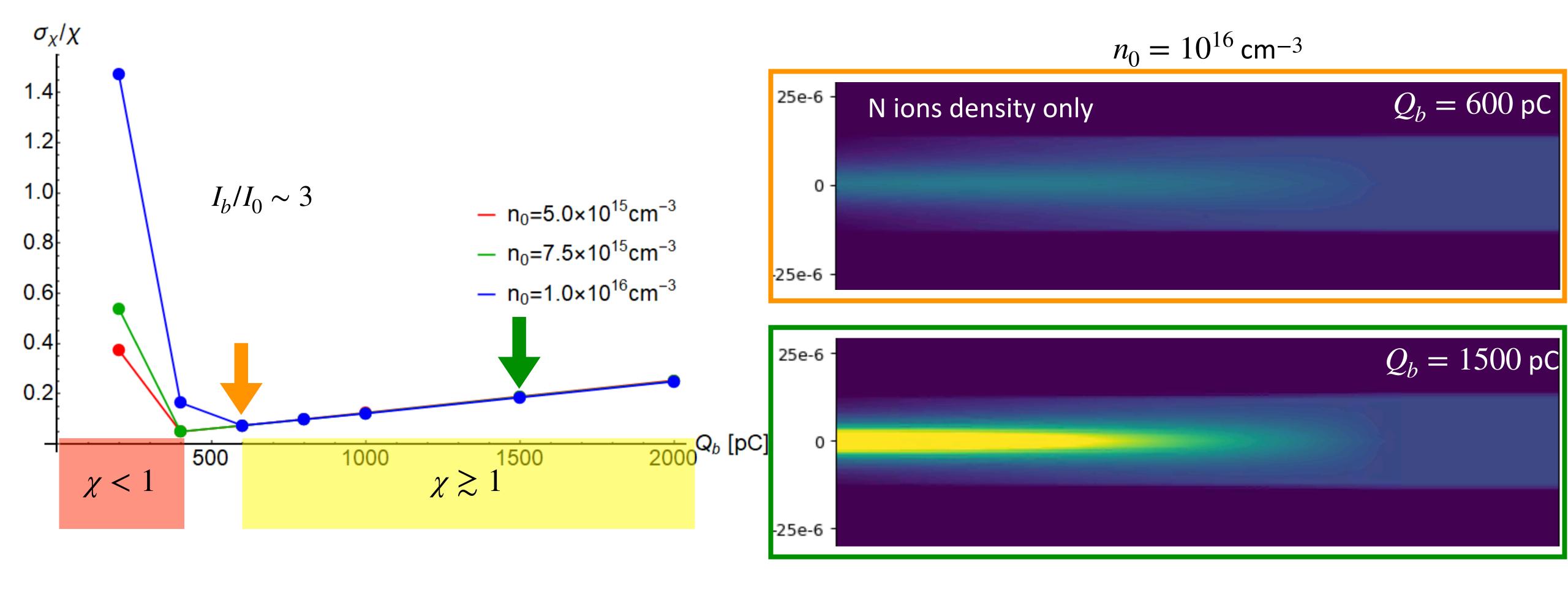






## Channel uniformity: optimization





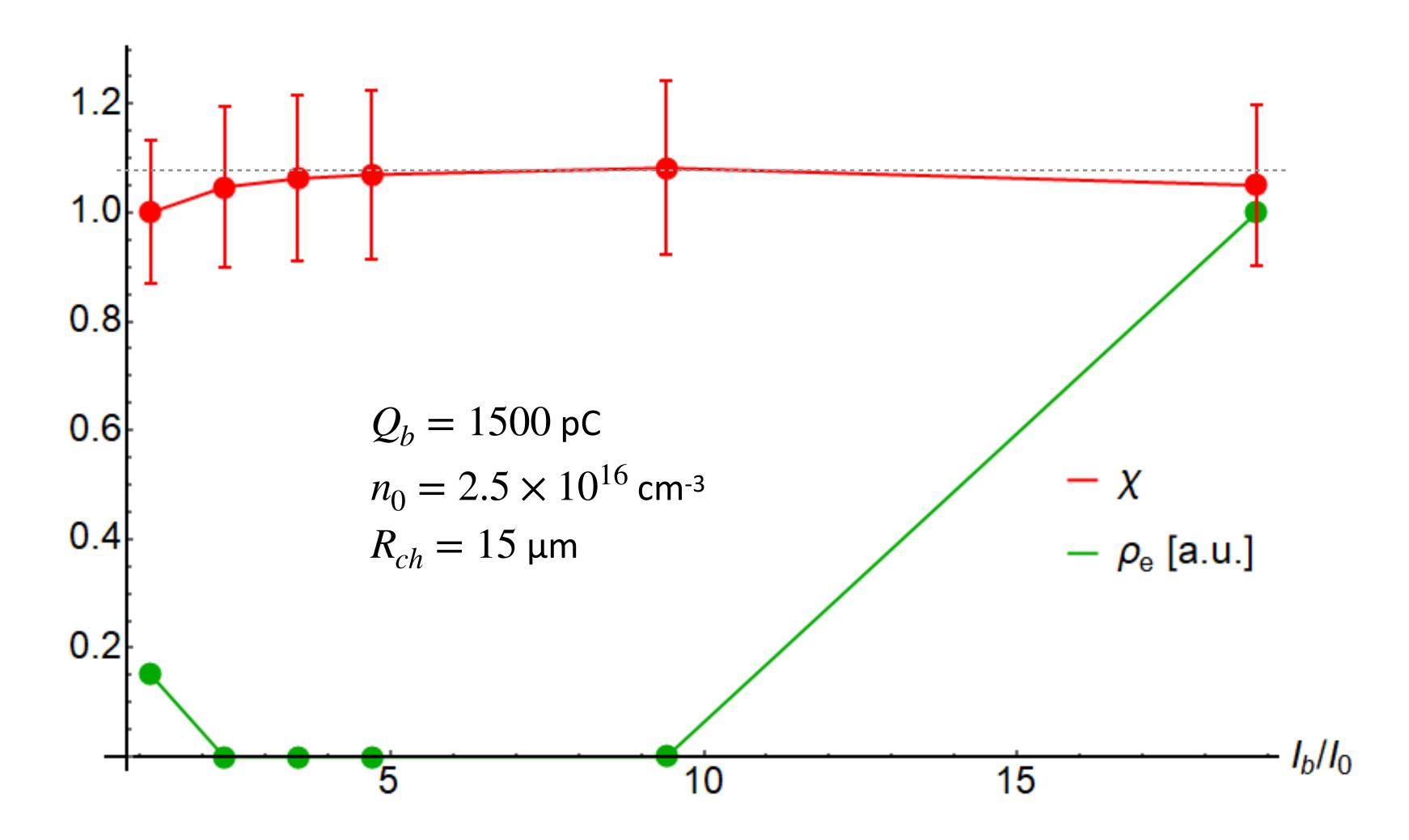
- ▶ For fixed  $I_b/I_0 \gg 1$ ,  $\sigma_{\gamma}/\chi$  grows linearly  $\Longrightarrow$  ION MOTION!
- ightharpoonup For fixed  $I_b/I_0 \gtrsim 1$ ,  $\sigma_{\chi}/\chi$  reaches a minimum  $\Longrightarrow$  OPTIMIZATION CRITERION!



## Channel uniformity: current effect



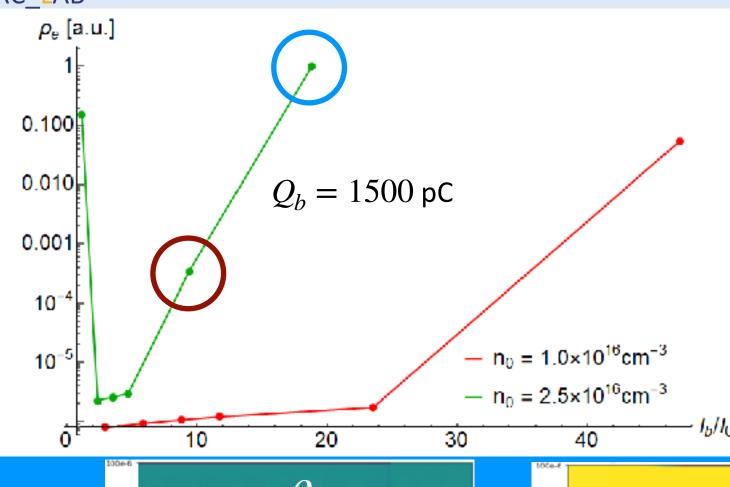
▶ For  $I_b/I_0 \gg 1$ , and  $n_0$  "large enough",  $\chi$  starts to decrease  $\Longrightarrow$  IONIZATION!



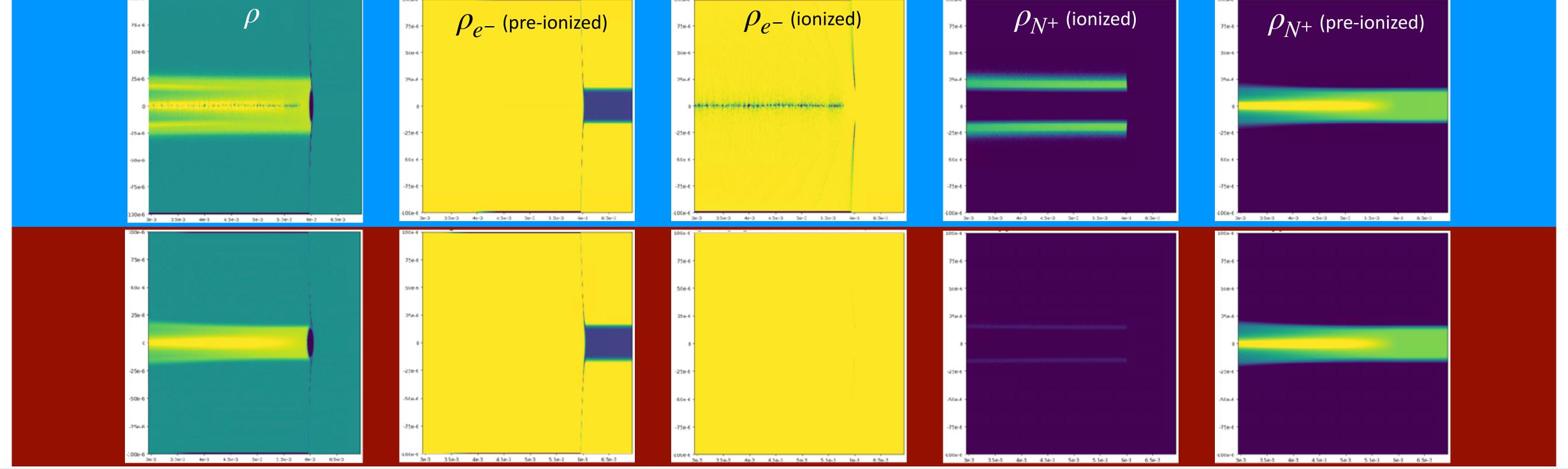


# Channel uniformity: current effect





- ▶ For  $I_b/I_0 \gg 1$ , and  $n_0$  "large enough",  $\chi$  starts to decrease  $\Longrightarrow$  IONIZATION!
- ightharpoonup If  $I_b/I_0$  and/or  $n_0$  "too small", ionization may be present but negligible.
- ▶ Large and small depend on background atoms atomic mass and ionization energies.
- ▶ The presence of a minimum represent a possible optimization criterion.

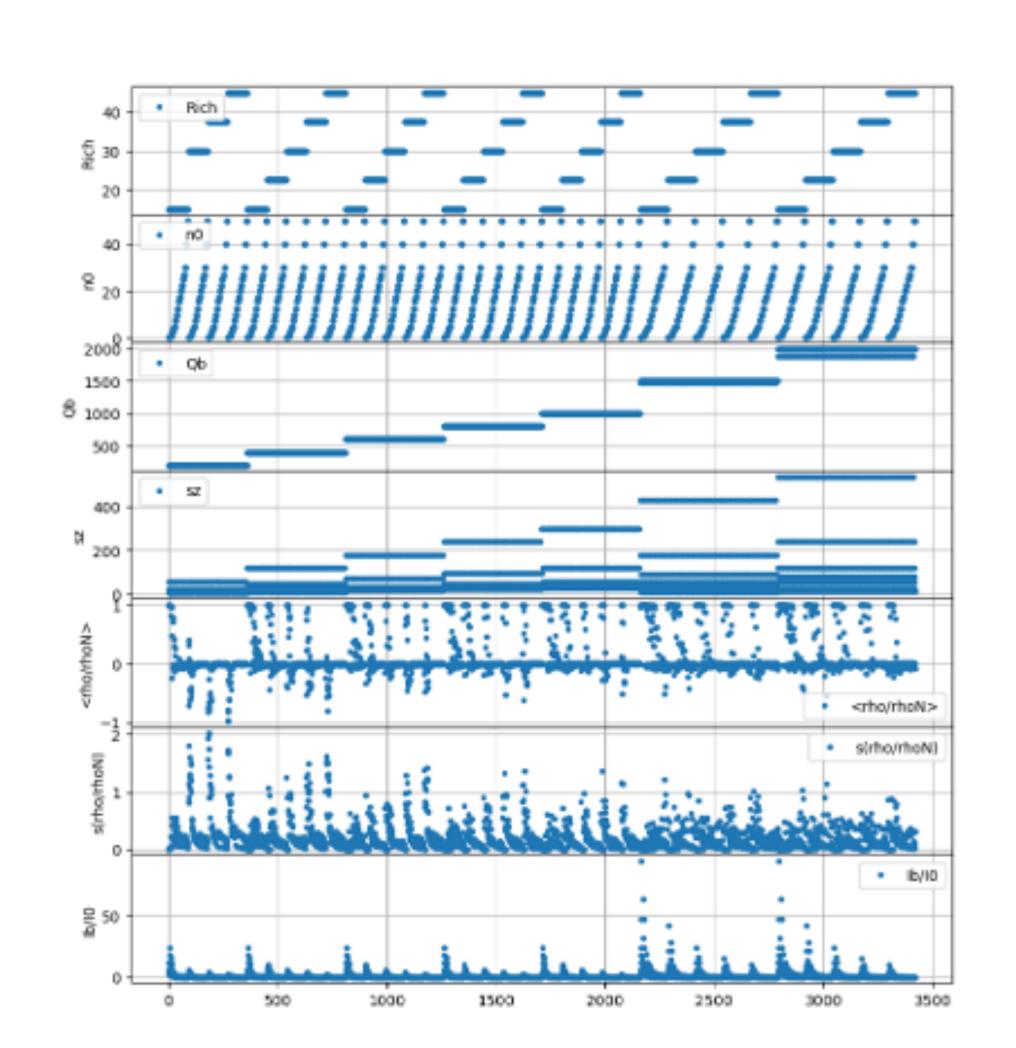




### Data driven approach to channel formation



#### Input-output mapping



Input data structure

- ▶ 3420 simulations of plasma channel with varying input parameters
  - Input parameters:  $R_{ch}$ ,  $n_p$ ,  $Q_b$ ,  $\sigma_z$ ,  $I_b/I_0$
  - Output metrics:  $\chi$ ,  $\sigma_{\chi}$
- ▶ The study goal is to find patterns and dependences in incoming parameters to ensure a stable plasma channel formation
- Proposed instrument: Al Machine Learning

Courtesy I. Drebot



## Study workflow



Plasma channel simulations (3420)



Dataset: simulation results Input parameters: Output parameters:

- *R*<sub>ch</sub>
- $\bullet$   $\sigma_{z}$

• X

- *n*<sub>p</sub>
- $I_b/I_0$
- $\bullet$   $\sigma_{\chi}$

Q<sub>k</sub>



Machine learning model (XGBoost Regression)

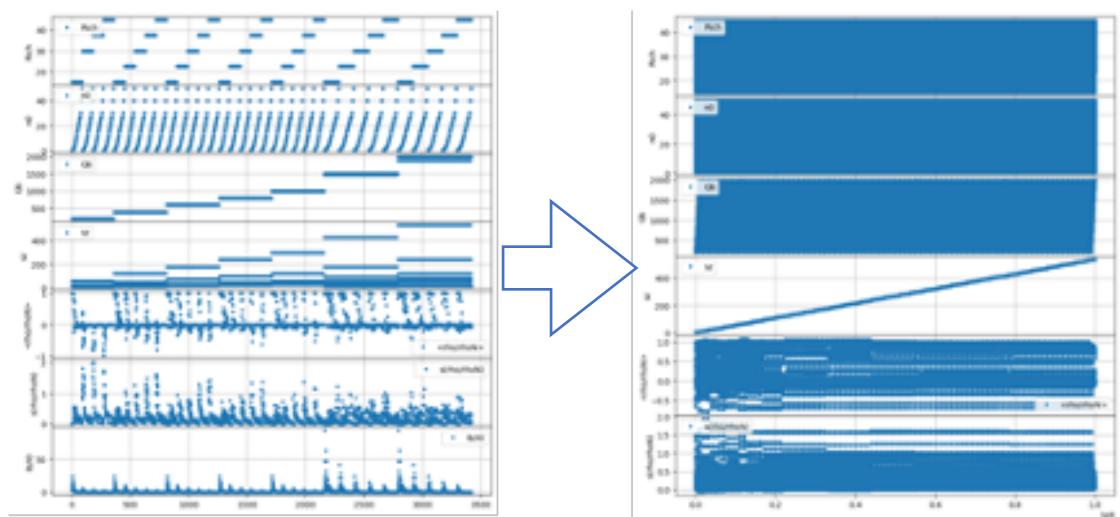


Prepare input grid & use ML to predict missing data  $\Longrightarrow$  virtual simulations

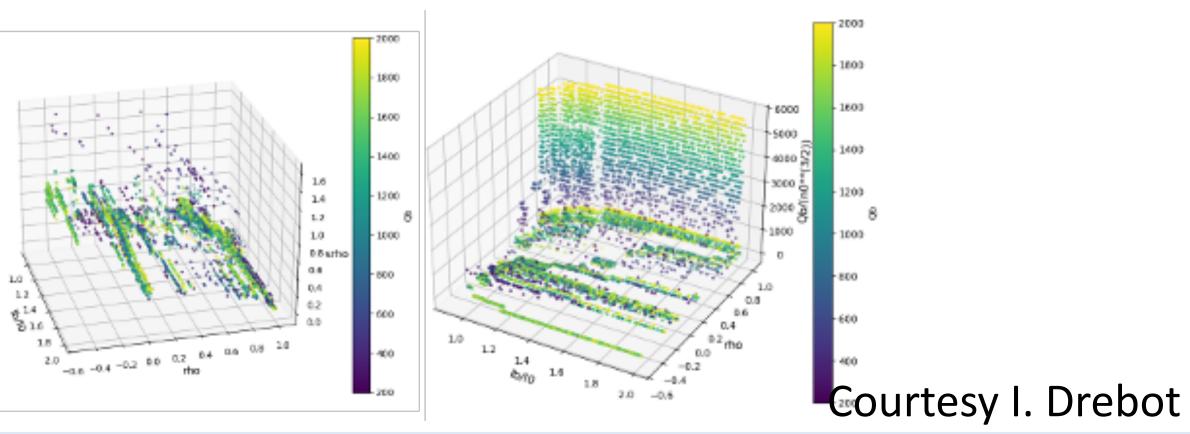


Analysis of patterns & channel formation conditions in extended dataset

ML "multi-dimensional interpolation" from 3k simulations to a dataset with 10<sup>8</sup> configurations



Extended dataset allows for deeper 6D analysis of trends

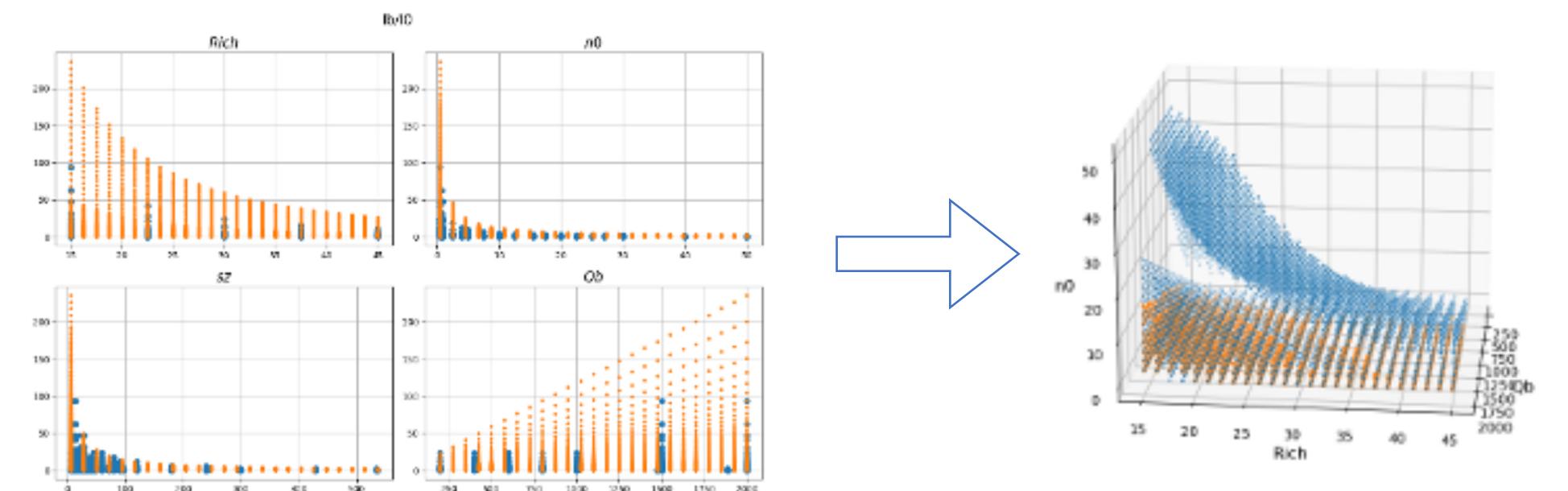




#### Possible issues



Due to the non-uniform distribution of training data, large parameter regions remain without reference points. As a result, the model extrapolates in these areas, introducing noise into the extended dataset and leading to potentially misleading results.



Example of "missing training" data effect

- ▶ Built ML-based model to map plasma channel input parameters → formation indicators
- Generated an extended virtual dataset via ML interpolation
- Identify patterns & stability conditions in multidimensional parameter space
- Highlighted limitations due to non-uniform training data distribution
- Approach provides a data-driven tool for guiding future plasma acceleration studies

Courtesy I. Drebot



#### Conclusions



- ▶ The IC formation was studied for designing a working point for the betatest experiment @SPARC\_LAB
- The validity of a scaling law for channel formation was verified
- ▶ Impact of the driving beam parameters on channel uniformity were investigated:
  - A large charge sets in ion motion
  - A large current may cause ionization in neutrals
- Both effects can be minimized (optimization conditions)
- Both effects depend on the chemical nature of neutrals
- We are starting to apply AI to data analysis and interpretation

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Thanks for your attention!



