

An ensemble approach to study association between metastasis and high interstitial fluid pressure in pancreatic cancer

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> > January 24, 2023



# Fluid-sensitive migration mechanisms predict association between metastasis and high interstitial fluid pressure in pancreatic cancer

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#### https://doi.org/10.1016/j.jbiomech.2022.111362



- Data: From preclinical "models" of human pancreatic ductal adenocarcinoma (PDAC)
- Model: Mathematical model developed by Evje & co-workers
- Study done using an ensemble of in silico tumors

### Pancreatic cancer



- Less than 8% survival rate after 5 years
- ▶ Number of new cases in Norway 2020:  $\approx$  1000
  - (of  $\approx$  36000 cancer cases)
- Most common form: Pancreatic ductal adenocarcinomas (PDAC)
- Treatment: Surgery

### Numbers from

https://www.kreftregisteret.no/globalassets/ cancer-in-norway/2021/cin\_report.pdf

https://kreftlex.no/Bukspyttkjertel

## Preclinical data<sup>1</sup>



- Based on xenografts
  - Xeno: "stranger", "guest"
  - Graft: "transplant"
- Intramuscular BxPC-3 & Capan-2 PDAC xenografts as preclinical tumor models
- Tumor grows to certain size before observations
  - Interstitial fluid pressure (IFP)
  - Microvascular density
  - Counting metastatic lymph nodes (of 6 pairs)
- 20 tumors of each model

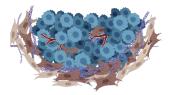
<sup>&</sup>lt;sup>1</sup>Lise Mari K. Andersen et al. "Lymph node metastasis and the physicochemical micro-environment of pancreatic ductal adenocarcinoma xenografts". In: *Oncotarget* 8.29 (May 2017), pp. 48060–48074. DOI: 10.18632/oncotarget.18231.



- Model developed by Evje and his former PhD student Waldeland
- Here: A version of the model being as simple as possible explaining the data

# Tumor microenvironment Mass balance







- Extracellular matrix
- 🛩 Vascular system
  - Cancer-associated fibroblasts (CAFs)
- $\alpha_{c}, \alpha_{w}$ : volume fraction of cell and fluid
- **u**<sub>c</sub>,**u**<sub>w</sub>: interstitial cell and fluid velocity
- Q<sub>v</sub>, Q<sub>l</sub>: transvascular flux related to blood and lymphatic vessels

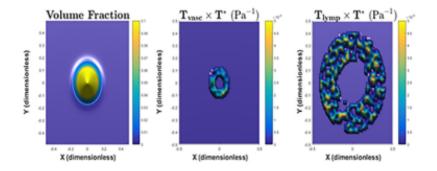
 $\begin{aligned} & (\alpha_c)_t + \nabla \cdot (\alpha_c \mathbf{u}_c) = \mathbf{0} \\ & (\alpha_w)_t + \nabla \cdot (\alpha_w \mathbf{u}_w) = \mathbf{Q} \\ & \mathbf{Q} = \mathbf{Q}_v - \mathbf{Q}_l \\ & \alpha_c + \alpha_w = \mathbf{1} \end{aligned}$ 

Figure based on Fig. 1

in Barrett & Purè [3].

## Physiochemical microenvironment





$$Q_v = T_v ( ilde{P}_v^* - P_w)$$
  
 $Q_l = T_l (P_w - ilde{P}_l^*)$ 

# Tumor microenvironment Momentum balance





Tumor cells

Extracellular matrix

Y Vascular system

Cancer-associated fibroblasts (CAFs)

 $\alpha_c \nabla (P_w + \Delta P_{cw} + \Lambda_c) = -\zeta_c \mathbf{u}_c + \zeta_{cw} (\mathbf{u}_w - \mathbf{u}_c)$  $\alpha_{W}\nabla P_{W} = -\zeta_{W}\mathbf{u}_{W} + \zeta_{CW}(\mathbf{u}_{C} - \mathbf{u}_{W})$ 

Pw:  $\Delta P_{cw}(\alpha_c)$ :  $\Lambda_{C}$ 

interstitial fluid pressure effect of elevated cell phase pressure chemotaxis  $\zeta_w (= I_w k_w \alpha_w^{r_w}), \zeta_c, \zeta_{cw}$ : fluid-ECM and cell-ECM resistance and cell-fluid interaction

### Summary of model



$$\mathbf{u}_{c} = \frac{f_{c}(\alpha_{c})}{\alpha_{c}} \mathbf{U}_{T} - \frac{h(\alpha_{c})}{\alpha_{c}} \nabla(\Delta P_{cw}) - \frac{h_{c}(\alpha_{c})}{\alpha_{c}} \nabla \Lambda_{c}$$
$$\mathbf{U}_{T} = \alpha_{c} \mathbf{u}_{c} + \alpha_{w} \mathbf{u}_{w}$$

- (i) Fluid-generated stress giving upstream migration
- (ii) Diffusive migration
- (iii) Chemotaxis of cells toward higher concentration of chemokine

### Novelties of the paper



- Represent the unknown stochastic intratumoral vasculature as well as the collecting peritumoral lymphatic network in an appropriate form
- Show that the two competing fluid-sensitive migration mechanisms, when exposed to a realistic fluid velocity field, have the ability to create aggressive behavior
- Verify that this aggressive behavior, in terms of number of isolated islands that are formed, in fact are correlated to higher IFP

# Unknown parameters Ensemble of models



Three spatial varying fields

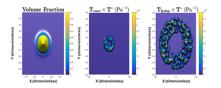
- Constant: k<sub>w</sub> (description of fluid-ECM resistance (ECM density))
- Gaussian variogram: T<sub>v</sub> (describing density and position of microvascular vessels)
- Gaussian variogram: T<sub>1</sub> (describing density and position of peritumoral lymphatics)
- The fields are stochastically independent

# **Results of simulations**

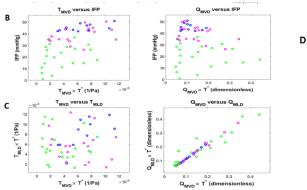


### Measures

- Number of isolated islands of cancer cells  $n \approx \overline{N} = \int_0^T N(s) \, ds$
- Interstitial fluid pressure  $(IFP = \max_{\Omega} P_w(\mathbf{x}))$
- ► Fluid produced from intratumoral vascular system  $Q_{MVD} = \int_{\Omega_{vasc}} T_v(\mathbf{x}) (\tilde{P}_v^* - P_w) d\mathbf{x}$
- "Density" of vascular network  $T_{MVD} = \int_{\Omega_{vasc}} T_v(\mathbf{x}) d\mathbf{x}$
- ► Fluid produced through peritumoral lymphatic system  $Q_{MLD} = \int_{\Omega_{Vasc}} T_l(\mathbf{x}) (P_w - \tilde{P}_l^*) d\mathbf{x}$
- "Density" of lymphatic network  $T_{MLD} = \int_{\Omega_{lymp}} T_l(\mathbf{x}) d\mathbf{x}$



# Results IFP, $T_{MVD}$ , $Q_{MVD}$ , $T_{MLD}$ , $Q_{MLD}$



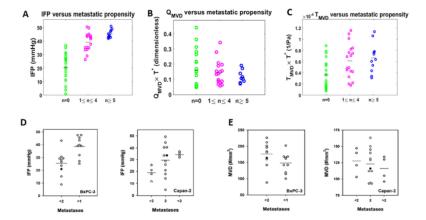


RCE

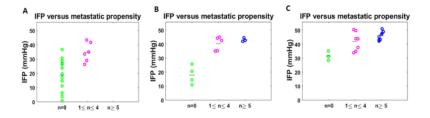
Green: Non-metastatic (n = 0). Pink: Medium metastatic propensity ( $1 \le n \le 4$ ). Blue: High metastatic propensity ( $n \ge 5$ )

# Results Metastatic propensity





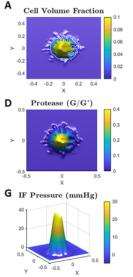
# Results **N R C E** Metastatic propensity vs. varying ECM density

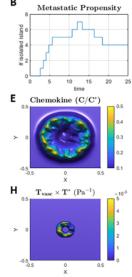


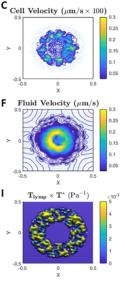
A: Sparse ECM  $(1 \le k_w \le 11)$ . B: Medium ECM  $(11 < k_w < 19)$ C: Dense ECM:  $(19 \le k_w \le 30)$ 

### **Results**

# N C E Sparse ECM with medium metastatic propensity

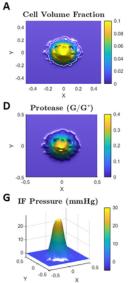


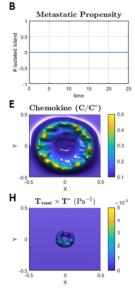


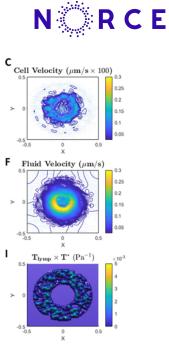


### Results

## Sparse ECM - non-metastatic

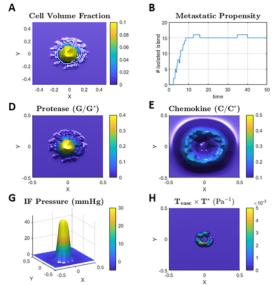


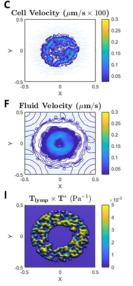




### **Results**

# N R C E Dense ECM with high metastatic propensity





### Conclusions



- Similarities with preclinical study [2]
  - No correlation between IFP and amount of leaked fluid
  - No association between amount of leaked fluid and metastatic propensity
  - Clear association between high IFP and metastatic propensity
- High ECM density gave most aggressive tumors
- Other cancers with similar behavior: cervic cancer, breast cancer, melanoma, and brain cancer
- Potential further work: Combine with data assimilation for better characterization and potential simulation of drug delivery

### References



- Geir Nævdal et al. "Fluid-sensitive migration mechanisms predict association between metastasis and high interstitial fluid pressure in pancreatic cancer". In: *Journal of Biomechanics* 145 (Dec. 2022), p. 111362. DOI: 10.1016/j.jbiomech.2022.111362.
- Lise Mari K. Andersen et al. "Lymph node metastasis and the physicochemical micro-environment of pancreatic ductal adenocarcinoma xenografts". In: Oncotarget 8.29 (May 2017), pp. 48060–48074. DOI: 10.18632/oncotarget.18231.
- [3] Richard Lee Barrett and Ellen Puré. "Cancer-associated fibroblasts and their influence on tumor immunity and immunotherapy". In: *eLife* (2020). DOI: 10.7554/eLife.57243.