# Session 7: Functions in PhysiCell



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@MathCancer

## PhysiCell Project

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## Goals

- PhysiCell full modeling workflow
- Handy C++ Tidbits for Cell Agents
- Typical form / syntax / purpose of PhysiCell functions
- The customizable functions in Cell.functions
- How to assign new functions to a cell definition
- Sampling the microenvironment at Cell locations
- Example: Oxygen-based cell birth, death, and motility
- Stretch goal: Controlling initial cell placement
- Stretch goal: Custom coloring functions

## Full modeling workflow

Suitable for creating a new PhysiCell model with custom C++ to drive dynamical phenotype changes

- Plan the model
- Populate a project
- Edit configuration Model Builder GUI
  - Edit domain
  - Edit microenvironment
  - Edit cell definitions
  - Add custom variables
  - Add custom parameters

- Edit custom modules:
  - Declare functions in custom.h
  - Implement functions in custom.cpp
  - Assign functions to cell definitions
- Edit initial cell placement
- Edit cell coloring function
- Build
- Run
- View results

## Project structure: custom modules

- Custom Modules
  - Setup functions
  - Cell definitions
  - Custom functions
  - any other modeling
  - Custom coloring functions

```
hysiCallacd custom module
C:\GitHub\engr-MCSB\lectures\Lecture2 source\PhysiCell\custom modules\custom.h - Notepad++
<u>File Edit Search View Encoding Language Settings Tools Macro Run Plugins Window</u>
     PhysiCell settings.xml 🗵 📙 custom.cpp 🗵 📙 custom.h 🗵
         # CONSEQUENTIAL DAMAGES (INCLUDING, BUT NOT LIMITED TO, PROCUREMENT OF
        # SUBSTITUTE GOODS OR SERVICES; LOSS OF USE, DATA, OR PROFITS; OR
        # INTERRUPTION) HOWEVER CAUSED AND ON ANY THEORY OF LIABILITY, WHETHER
         # CONTRACT, STRICT LIABILITY, OR TORT (INCLUDING NEGLIGENCE OR OTHERWISE)
        #include ... / core / PhysiCell.h"
         #include . ".. / modules / PhysiCell standard modules.h"
        using namespace BioFVM;
        using namespace PhysiCell;
        void tumor cell phenotype with oncoprotein ( Cell* pCell, Phenotype & phenotype, double dt );
        // any additional cell types (beyond cell defaults)
        extern Cell Definition motile cell;
        // custom cell phenotype functions could go here
        // setup functions to help us along
        void create cell types( void );
        void setup tissue( void );
        // set up the BioFVM microenvironment
        void setup microenvironment( void );
        // custom pathology coloring function
         std::vector<std::string> my coloring function( Cell* );
```

## Project structure: custom modules

- Custom Modules
  - Any user-defined globals (at top)
  - Setup functions
    - ♦ create cell types()
      - » Do all setup on all cell types
        - Adjust phenotype
        - o Add / adjust custom data
        - Set functions
    - - » Place initial cells in microenvironment
      - » Modify each cell as needed
  - Custom functions
  - any other modeling
  - Custom coloring functions

```
hysiCell>cd custom_modules
C:\GitHub\engr-MCSB\lectures\Lecture2 source\PhysiCell\custom modules\custom.h - Notepad++
File Edit Search View Encoding Language Settings Tools Macro Run Plugins Window
     PhysiCell settings.xml 🗵 📙 custom.cpp 🗵 📙 custom.h 🗵
         # CONSEQUENTIAL DAMAGES (INCLUDING, BUT NOT LIMITED TO, PROCUREMENT OF
        # SUBSTITUTE GOODS OR SERVICES; LOSS OF USE, DATA, OR PROFITS; OR
        # INTERRUPTION) HOWEVER CAUSED AND ON ANY THEORY OF LIABILITY, WHETHER
         # CONTRACT, STRICT LIABILITY, OR TORT (INCLUDING NEGLIGENCE OR OTHERWISE)
        #include ... / core / PhysiCell.h"
        #include "../modules/PhysiCell standard modules.h"
        using namespace BioFVM;
        using namespace PhysiCell;
        void tumor cell phenotype with oncoprotein ( Cell* pCell, Phenotype & phenotype, double dt );
        // any additional cell types (beyond cell defaults)
        extern Cell Definition motile cell;
        // custom cell phenotype functions could go here
        // setup functions to help us along
        void create cell types( void );
        void setup tissue( void );
        // set up the BioFVM microenvironment
        void setup microenvironment( void );
        // custom pathology coloring function
         std::vector<std::string> my coloring function( Cell* );
```

## Project structure: main.cpp

- main.cpp
  - (in the root directory)
  - calls the setup functions

```
C:\GitHub\engr-MCSB\lectures\Lecture2_source\PhysiCell\main.cpp - Notepad++
File Edit Search View Encoding Language Settings Tools Macro Run Plugins Window ?
           😼 😘 🚔 🕹 😘 🛍 🗩 🗷 📾 🚱 💌 🤏 🕞 🏗 🏗 🏗 🌃 💯 🗷 🐵 🗩 🗎 🖼 🕬
             setup microenvironment(); // modify this in the custom code
             // set mechanics voxel size, and match the data structure to BioFVM
            Cell Container* cell container = create cell container for microenvironment( microenvironment, mechanics voxel size );
             /* Users typically start modifying here. START USERMODS */
            create_cell_types();
           →//·set·MultiCellDS·save·options
            →set_save_biofvm_mesh_as_matlab( true );
            →set save biofvm data as matlab( true );
            →set_save_biofvm_cell_data( true );
            -set_save_biofvm_cell_data_as_custom_matlab( true );
           →//·save·a·simulation·snapshot
            sprintf( filename , "%s/initial" , PhysiCell_settings.folder.c_str() );
            -save_Physicell_to_MulticellDS_xml_pugi( filename , microenvironment , Physicell globals.current time );
            -// save a quick SVG cross section through z = 0, after setting its
           →//·length·bar·to·200·microns
            PhysiCell_SVG_options.length_bar = 200;
```

## Project structure: main.cpp (continued)

- main.cpp
  - set coloring function

```
C:\GitHub\engr-MCSB\lectures\Lecture2_source\PhysiCell\main.cpp - Notepad++
 Edit Search View Encoding Language Settings Tools Macro Run Plugins Window ?
        🗟 😘 🔝 🖟 🐚 🖍 🐚 🖍 🗩 🗷 🍇 🔍 🤏 🖳 🚟 🏗 🖺 🖺 💹 🔊 💌 💿 💌 🗈 🕟 🖼 🚱
          std::vector<std::string> (*cell_coloring_function)(Cell*) = my_coloring_function;
          sprintf( filename , "%s/initial.svq" , PhysiCell settings.folder.c str() );
          SVG_plot(filename, microenvironment, 0.0., Physicell_globals.current_time, cell_coloring_function);
         display citations();
          BioFVM::RUNTIME_TIC();
         →BioFVM::TIC();
          std::ofstream report file;
          if ( PhysiCell settings.enable legacy saves == true )
              sprintf( filename , "%s/simulation report.txt" , PhysiCell settings.folder.c str() );
              report file<<"simulated time\tnum cells\tnum division\tnum death\twall time"<<std::endl;
       →//·main·loop
              while ( PhysiCell globals.current time < PhysiCell settings.max time + 0.1*diffusion dt )
                  pif( fabs( PhysiCell globals.current time - PhysiCell globals.next full save time ) < 0.01 * diffusion dt )</pre>
                     display simulation status ( std::cout );
                     >if( PhysiCell settings.enable legacy saves == true )
```

## Project structure: main.cpp (continued)

- main.cpp
  - main loop:
    - ◆ This would be a good place to put extensions.

```
C:\GitHub\engr-MCSB\lectures\Lecture2_source\PhysiCell\main.cpp - Notepad++
   Edit Search View Encoding Language Settings Tools Macro Run Plugins Window ?
                   X 🖺 🖺 ⊃ C l 🛍 🐈 🤏 🥞 👺 T 葦 T 葦 🐷 💹 🔑 📹 ③ 🗩 🗉 🗷 🕸
                         PhysiCell globals.full output index++;
                         PhysiCell globals.next full save time += PhysiCell settings.full save interval;
                     if ( fabs ( PhysiCell globals.current time - PhysiCell globals.next SVG save time ) < 0.01 * diffusion dt )
                         if ( PhysiCell settings.enable SVG saves == true
                             sprintf(filename, "%s/snapshot%08u.svg", PhysiCell settings.folder.c str(), PhysiCell globals.SVG output index);
                             SVG plot (filename, microenvironment, 0.0, Physicell globals current time, cell coloring function);
                             PhysiCell globals.SVG output index++;
                             PhysiCell_globals.next_SVG_save_time -+= PhysiCell_settings.SVG_save_interval;
                     microenvironment.simulate diffusion decay( diffusion dt );
                     ((Cell Container *)microenvironment.agent container) -> update all cells( PhysiCell globals.current time );
                     PhysiCell globals.current time += diffusion dt;
                 if( PhysiCell settings.enable legacy saves == true )
                     log output (PhysiCell globals.current time, PhysiCell globals.full output index, microenvironment, report file);
                     report file.close();
C++ source file
                                                                     length: 10,848 lines: 241
                                                                                               Ln:157 Col:95 Sel:0|0
```

## Summary: Where things will go

- Declare custom functions in ./custom\_modules/custom.h
- Implement these functions in ./custom\_modules/custom.cpp
- Assign custom functions to cell definitions in custom.cpp in create\_cell\_types();
- Declare any cell parameters needed for custom functions in the custom\_data part of a cell definition in the XML configuration file
- Declare any parameters need to set up the simulation in the user\_parameters part of the XML config file

# Handy C++ Helpers (Part 1)

## Handy C++ Tidbits: Random Numbers

- double UniformRandom ( void );
  - Get a uniformly distributed number in U(0,1)
- double NormalRandom ( double mean, double standard deviation );
  - Get a normally distributed number in N(mean, standard deviation)
- std::vector<double> UniformOnUnitCircle( void );
  - Get a uniformly random point on the Unit Circle
- std::vector<double> **UniformOnUnitSphere**( void );
  - Get a uniformly random point on (not in!) the unit sphere.
- int choose event( std::vector<double>& probabilities );
  - Given a vector of probabilities  $(p_0, p_1, ..., p_{n-1})$ , choose an integer in [0, n-1] with the given probabilities.
  - The probabilities must sum to 1.

These use the STL 64-bit Mersenne Twister in C++11.



## **Handy C++ Tidbits: Vectors**

- std::vector<double> normalize(std::vector<double>& v);
   Return a normalized vector. (Convention: return (0,0,0) for small vectors)
   void normalize(std::vector<double>\* v);
   Directly normalize the vector at v. (Convention: return (0,0,0) for small vectors)
   double norm\_squared(const std::vector<double>& v);
   Return a norm squared. (Handy and avoids an expensive square root.)
- double norm( const std::vector<double>& v );
  - Returns standard Euclidean (ℓ₂) norm.
- double maxabs ( const std::vector<double>& v );
  - Returns the maximum absolute value in the vector. i.e., this is the  $\ell_{\infty}$  norm.

We have also defined expected vector operations for std::vector<double>: +, -, \*, /, +=, -=, \*=, /=

- void csv to vector( const char\* buffer , std::vector<double>& vect );
  - Starting with a character string, separates (by a comma delimiter), converts to doubles, and stores result in the vector.
- char\* vector to csv( const std::vector<double>& vect );
  - Turns a vector into a comma-separated string. Should probably modernize these with std::string.

## Handy C++ tidbits: forced birth and death

- Cell methods for forcing cell birth and death
  - void flag for division( void );
    - ♦ Use this if you want to force the cell to divide at the next opportunity
  - void start death( int death model index );
    - ♦ Use this to trigger a specific death model (at the next opportunity)
  - void lyse\_cell( void );
    - ◆ Trigger *immediate death* that sets volume to 0, deactivates all functions, and detaches the cell from all other linked cells. Cell will be deleted at next dt\_cell step.
    - ♦ Safer than flag\_for\_removal()

## Handy C++ tidbits: Boolean flags

- The Cell class has a few useful member data:
  - bool is\_out\_of\_domain;
    - ♦ Set this to **true** if the cell is out of the domain.
    - ♦ I'm not 100% sure this is maintained up-to-date by the code. (It's on my to do list!)
  - bool is\_movable;
    - ♦ This is ordinarily **true**, and allows the cell to be pushed by other cells.
    - ◆ Set this to **false** if you want the cell to exert forces on other cells, but don't want it to move (i.e., behave as a rigid barrier)

# PhysiCell Cell Functions

## Functions in PhysiCell

In PhysiCell, almost all cell functions have the following form:

```
void function ( Cell* pCell, Phenotype& phenotype , double dt );
```

- pCell: pointer to a cell. Can be NULL
- phenotype: a cell phenotype. Usually pCell->phenotype.
- dt: how far the function / model should be advanced in time.
- These functions can access:
  - Cell state via pCell->state
  - Cell custom data via pCell->custom data
  - Cell functions via pCell->functions
  - Cell phenotype via phenotype
  - nearby microenvironment via pCell->nearest\_density\_vector() and pCell->nearest\_gradient\_vector()

## Functions in PhysiCell

void my function( Cell\* pCell, Phenotype& phenotype, double dt );

(default NULL, evaluated at each mechanics time step)

Almost all functions in PhysiCell have this form:

We'll spend more time on this in Sessions 9-11

```
All cells have the following key functions (in pCell->functions):

• volume_update_function (defaults to a built-in model)

• update_migration_bias (default NULL unless you enabled chemotaxis)

• custom_cell_rule (default NULL, evaluated at each mechanics time step)

• update_phenotype (default NULL, evaluated at each phenotype time step)

• update_velocity (defaults to a built-in model with potentials)

• set_orientation (automatically set as needed)
```



• contact function

## **Purpose of the Functions**

#### volume\_update\_function

Dynamically grow / shrink cells towards "target" values

#### update\_migration\_bias

Used whenever a cell chooses a new migration bias direction

#### custom cell rule

- A catch-all customization that's evaluated at each mechanics time step. (0.1 min)
- Use this for rules that need frequent evaluation.

#### update\_phenotype

- The general purpose rule to set phenotype parameters at each cell temp step. (6 min)
- Generally where you spend the majority of your (implementation) time in a modeling project.

#### update\_velocity

- Sets the cell velocity based on interaction potentials.
- The custom rule and motility functions are automatically evaluated as well.

#### set\_orientation

- Used during cell division to choose the division plane (a random plane through this vector).
- We set this to (0,0,1) for 2-D simulations to ensure division in the xy-plane

#### contact\_function

A newer addition for cell-cell contact interactions such as adding/removing spring links. Evaluated at each mechanics step. More tomorrow.



## A short example

In custom.h, declare your new function;

```
void my_phenotype_function( Cell* pCell, Phenotype& phenotype, double dt );
```

• In custom.cpp, write the code:

```
void my_phenotype_function( Cell* pCell, Phenotype& phenotype, double dt )
{
      // get a rate from cell's custom data
      double rate = pCell->custom_data["rate"];
      // change a cell's apoptosis rate
      phenotype.death.rates[0] = rate;
      return;
}
```

Use the function

```
cell_defaults.functions.update_phenotype = my_phenotype_function;
```

The best place to do this is in create\_cell\_types() in custom.cpp

# Handy C++ Helpers (Part 2)

## Cell methods to access the microenvironment

- int get current voxel index( void )
  - Gives the index of the voxel that contains the agent's center.
  - More on this when we discuss diffusion
- std::vector<double>& nearest density vector( void )
  - a vector for all the substrate density values (stuff/volume) in the cell's voxel
  - allows the user to directly access (i.e., sample or modify) the vector of substrates at the cell's position
  - useful building functions that alter cell phenotype based on the microenvironment.
- std::vector<double>& nearest\_gradient( int substrate\_index )
  - for the substrate with index *i*, gives the gradient  $\left[\frac{\partial}{\partial x}, \frac{\partial}{\partial y}, \frac{\partial}{\partial z}\right] \rho_i$  in the cell's voxel
  - useful for things like chemotaxis.
- std::vector<gradient>& nearest gradient vector( void )
  - gives a vector of all the gradients in the cell's voxel returns

## More key functions

- Cell\_Definition\* **find\_cell\_definition**( std::string )
  - Get a pointer to a cell definition by searching for its name.
- Cell Definition\* find\_cell\_definition( int )
  - Get a pointer to a cell definition by searching for its integer type.
  - Since cells keep their type ID, this can be quite handy for phenotype functions.
- int Microenvironment::find\_density\_index( std::string )
  - Search for the index in for a specific ucstrate
  - Useful for phenotype functions.
  - The default microenvironment in PhysiCell is named microenvironment.

# Full Model Workflow: Example

# Scenario: Oxygen-dependent cells

- Let's illustrate these with an example:
  - tumor cells:
    - ♦ Cycle entry proportional to local pO2
    - ♦ Necrosis probability increases below a pO2 threshold
  - motile tumor cells:
    - ♦ Same as tumor cells, but:
      - » 1/10 cycling rate
      - » 1/10 apoptosis rate
      - » a more advanced chemotaxis up oxygen gradients
      - » migration slows as oxygen increases.

## Full modeling workflow

Suitable for creating a new PhysiCell model with custom C++ to drive dynamical phenotype changes

- Plan the model
- Populate a project
- Edit configuration Model Builder GUI
  - Edit domain
  - Edit microenvironment
  - Edit cell definitions
  - Add custom variables
  - Add custom parameters

- Edit custom modules:
  - Declare functions in custom.h
  - Implement functions in custom.cpp
  - Assign functions to cell definitions
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## Planning (1)

- Microenvironment
  - [-400,400] x [-400,400], 2160 minutes max time.
  - Oxygen with default parameters, boundary and initial conditions to 38 mmHg
  - Enable virtual wall
- Custom cell data (known once you have planned your cell functions)
  - pO2 proliferation saturation
  - pO2 proliferation threshold
  - pO2 necrosis threshold
  - pO2 necrosis saturation
  - max necrosis rate
  - pO2 half max
  - pO2 hill power

(max proliferation rate above this value)

(no proliferation below this value)

(necrosis starts at this value)

(necrosis at max value below this value)

(max necrotic death rate for very low pO2)

(for Hill function)

(for Hill function)

- Cell definitions
  - tumor
  - motile tumor

## Planning (2)

• Tumor cell proliferation ( $\sigma = pO_2$ ) with the simpler **live** cycle model.

$$r_{00} = \overline{r}_{00} \left( \frac{\sigma - \sigma_{\text{p\_threshold}}}{\sigma_{\text{p\_saturation}} - \sigma_{\text{p\_threshold}}} \right)$$

- $\sigma_{\text{p saturation}} = 38 \text{ mmHg } (5\%)$
- $\sigma_{p\_\text{threshold}} = 5 \text{ mmHg } (0.65\%)$
- $\overline{r}_{00} = 0.00072 \text{ min}^{-1}$
- Tumor cell necrosis ( $\sigma = pO_2$ )

$$r_N = \overline{r}_N \left( \frac{\sigma_{\text{n\_threshold}} - \sigma}{\sigma_{\text{n\_threshold}} - \sigma_{\text{n\_saturation}}} \right)$$

- $\sigma_{\text{n\_threshold}} = 5 \text{ mmHg } (0.65\%)$
- $\sigma_{\text{n\_saturation}} = 2.5 \text{ mmHg } (0.32\%)$
- $\overline{r}_N = 0.0028 \text{ min}^{-1}$

## Planning (3)

- Tumor cell motility ( $\sigma = pO_2$ )
  - Let's use a basic Hill function to modulate speed and bias in (already) motile tumor cells
  - Assume as pO2 increases, the "signal" is stronger for less random and faster migration.

$$\mathbf{d}_{\text{bias}} = \frac{\nabla \sigma}{|\nabla \sigma|}$$

$$\text{speed} = \overline{s} \left( 1 - \frac{s}{1+s} \right), \quad \text{where } s = \left( \frac{\sigma}{\sigma_{\text{HM}}} \right)^{\text{hp}}$$

$$\text{bias} = \left( \frac{s}{1+s} \right)$$

- $\overline{s} = 1 \,\mu\text{m/min}$
- $\sigma_{\text{HM}} = 4 \text{ mmHg } (1\%)$
- hp = 2
- set persistence time to 15 min

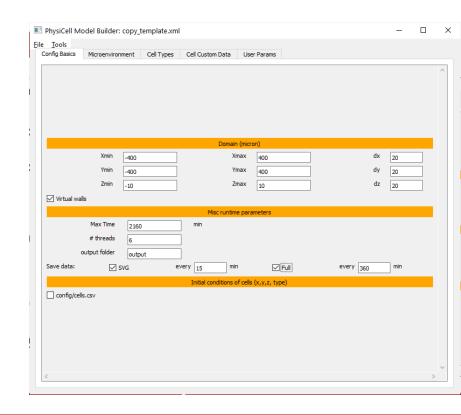
## Start modeling!

- populate and build the template project
  - make template
  - make

- Open Model Builder GUI
  - enter the ./PhysiCell/config directory
  - python ../../PhysiCell-model-builder/bin/gui4xml.py

## **Edit the model: domain**

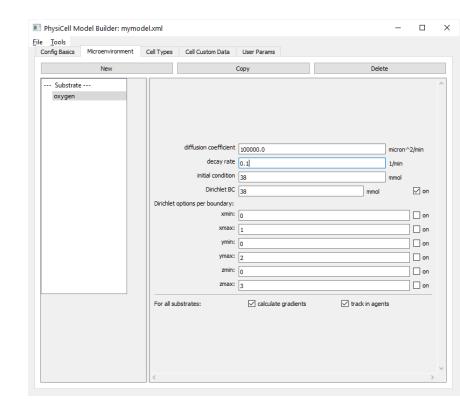
- Go to "config basics" tab
- Xmin = -400, Xmax = 400
- Ymin = -400, Ymax = 400
- max time = 2160
- full output every 360 min
- SVG every 15 min
- activate "virtual wall"
  - keep cells from leaving the domain



## Edit the model: microenvironment

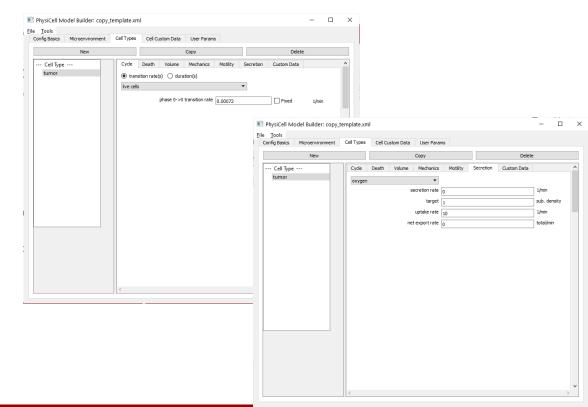
Go to "microenvironment" tab

- double-click "substrate"
  - rename it oxygen, with units mmHg
  - reduce decay rate to 0.1
  - set Dirichlet BC to 38 (mmHg)
  - enable the Dirichlet BC
  - set initial value to 38 (mmHg)



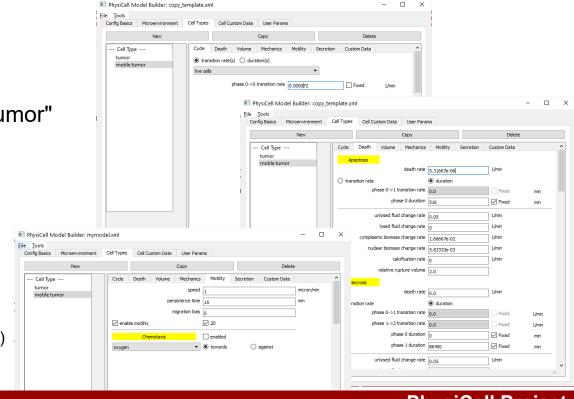
## Edit the model: cell definitions (1)

- Go to "cell types" tab
- double-click "default"
  - rename it "tumor"
  - edit its phenotype:
    - ♦ click "cycle" subtab
      - » choose live cycle model
      - » select "transition rate(s)"
      - » set  $0 \rightarrow 0$  transition to 0.00072
    - ♦ click "secretion" subtab
      - » Choose "oxygen" from dropdown
        - o set uptake rate to 10



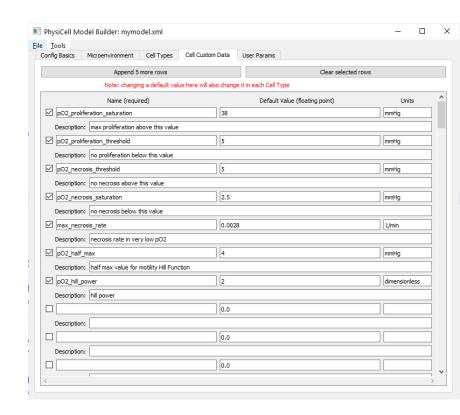
## Edit the model: cell definitions (2)

- Go to "cell types" tab
- click "copy" to duplicate the tumor type
  - double click, rename to "motile tumor"
  - edit its phenotype:
    - ♦ click on "cycle"
      - » set phase 00 transition to 0.000072
    - ♦ click on "death"
      - » set apoptosis rate to 5.31667e-06
    - ♦ click on "motility"
      - » set speed to 1
      - » set persistence time to 15
      - » set bias to 0 (we'll handle in-function later)
      - » check to enable



## Edit the model: custom cell data

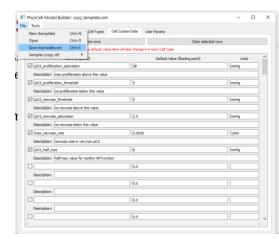
- Go to "cell custom data" tab
  - add a new data called "pO2\_proliferation\_saturation"
    - ◆ Fill out the default value, units, and description
    - ♦ Check the box on left to make sure it's copied to all cell definitions
  - Add pO2\_proliferation\_threshold
  - Add pO2\_necrosis\_threshold
  - Add pO2 necrosis saturation
  - Add max necrosis rate
  - Add pO2\_half\_max
  - Add pO2 hill power



## Save to the project

- Go to "File", then "Save mymodel.xml"
  - This saves to wherever we ran PhysiCell Model Builder

If needed, copy mymodel.xml to ./PhysiCell/config/



Since we ran inside the config directory, it's already there!

Unzip <u>Session7 checkpoint1.zip</u> in ./PhysiCell to get this code.

## **Declare custom functions**

• In ./custom\_modules/custom.h, declare:

```
void tumor_phenotype( Cell* pC, Phenotype& p, double dt);

void motile_tumor_phenotype( Cell* pC, Phenotype& p, double dt);

void motility_rule( Cell* pC, Phenotype& p, double dt );
```

## **Custom phenotype rule (1)**

```
void tumor phenotype (Cell* pC, Phenotype p, double dt)
   // find my cell definition
   // find index of O2 in the microenvironment
   // find index of necrosis death model
   // sample 02
   // set birth rate
      // get base rate from cell definition
      // set multiplier to 1.0
      // sample p02. if p02 < p02 proliferation saturation:
         // multiplier = (p02 - p0\overline{2} \text{ proliferation threshold})
         // /(p02 proliferation saturation-p02 proliferation threshold)
      // if p02 < p\overline{02} proliferation threshold, set multipler = 0.0
      // transition rate = base rate * multiplier
   // set necrosis rate
      // multiplier = 0.0
      // if p02 < p02 necrosis threshold
         // multipler = (p02 necrosis threshold - p02)
         // /(p02 necrosis threshold-p02 necrosis saturation)
      // if p02 < p\overline{0}2 necros\overline{1}s saturation
         // multipler = 1
      // necrosis rate = max necrosis rate * multiplier
   // if dead, set secretion / uptake rates to zero
   // trick: if dead, overwrite with NULL function pointer.
```

#### **Custom phenotype rule (2)**

```
void tumor phenotype( Cell* pC, Phenotype& p, double dt)
  // find my cell definition
  Cell Definition* pCD = find cell definition( pC->type );
  // find index of O2 in the microenvironment
  static int nO2 = microenvironment.find density index( "oxygen" );
  // find index of necrosis death model
  static int nNecro = p.death.find death model index( "Necrosis" );
  // sample 02
  double p02 = pC->nearest density vector()[n02];
  // set birth rate
    // get base rate from cell definition
  double base rate = pCD->phenotype.cycle.data.transition rate(0,0);
    // set multiplier to 1.0
  double multiplier = 1.0;
```

#### **Custom phenotype rule (3)**

```
// sample p02. if p02 < p02 proliferation saturation:</pre>
if( p02 < pC->custom data["p02 proliferation saturation"] )
    // multiplier = (p02 -p02 proliferation threshold)
    // /(p02 proliferation saturation-p02 proliferation threshold)
  multiplier = (p02 - pC->custom data["p02 proliferation threshold"] )
      /( pC->custom data["pO2 proliferation saturation"]
        -pC->custom data["pO2 proliferation threshold"] );
  // if p02 < p02 proliferation threshold, set multipler = 0.0</pre>
if( p02 < pC->custom data["p02 proliferation threshold"] )
{ multiplier = 0.0; }
  // transition rate = base rate * multiplier
p.cycle.data.transition rate (0,0) = base rate * multiplier;
```

## **Custom phenotype rule (4)**

```
// set necrosis rate
  // multiplier = 0.0
multiplier = 0.0;
  // if pO2 < pO2 necrosis threshold
if( p02 < pC->custom data["p02 necrosis threshold"] )
    // multipler = (p02 necrosis threshold - p02)
     // /(p02 necrosis threshold-p02 necrosis saturation)
  multiplier = (pC->custom data["pO2 necrosis threshold"] - pO2 )
      / (pC->custom data["pO2 necrosis threshold"]
         -pC->custom data["pO2 necrosis saturation"] );
  // if p02 < p02 necrosis saturation</pre>
    // multipler = 1
if( pO2 < pC->custom data["pO2 necrosis saturation"] )
{ multiplier = 1.0; }
  // necrosis rate = max necrosis rate * multiplier
p.death.rates[nNecro] = pC->custom data["max necrosis rate"] * multiplier;
```

#### **Custom phenotype rule (5)**

```
// if dead, set secretion / uptake rates to zero
  // trick: if dead, overwrite with NULL function pointer.
  if( p.death.dead == true )
    p.secretion.set all secretion to zero();
    p.secretion.set all uptake to zero();
    pC->functions.update phenotype = NULL;
  return;
void motile tumor phenotype (Cell* pC, Phenotype & p, double dt)
{ return; }
```

Unzip <u>Session7 checkpoint2.zip</u> in ./PhysiCell to get this code.

#### **Custom motility rule (1)**

```
void motility rule( Cell* pC, Phenotype& p, double dt )
  // find my cell definition
  // find index of O2 in the microenvironment
  // sample p02
  // sample pO2 gradient
  // check against p02 half max; set motility false and exit if needed
  // set migration bias direction to grad(p02)
  // normalize
  // set the Hill multiplier
     // s = (p02/p02 half max)^p02 hill power
     // \text{ hill = s / (-1+s -)};
  // set speed
     // speed = base speed * (1-hill)
  // migration bias
     // bias = hill
  // trick: if dead, overwrite with NULL function pointer.
```

#### **Custom motility rule (2)**

```
void motility rule( Cell* pC, Phenotype& p, double dt )
  // find my cell definition
  Cell Definition* pCD = find cell definition( pC->type );
  // find index of O2 in the microenvironment
  static int nO2 = microenvironment.find density index( "oxygen" );
  // sample p02
  double p02 = pC->nearest density vector()[n02];
  // sample pO2 gradient
  // set migration bias direction to grad(p02)
  p.motility.migration bias direction = pC->nearest gradient(nO2);
  // normalize
  normalize( & (p.motility.migration bias direction) );
```

#### **Custom motility rule (3)**

```
// set the Hill multiplier
  // s = (p02/p02 \text{ half max})^p02 \text{ hill power}
  // \text{ hill = s / (1+s);}
double temp = pow( pO2 / pC->custom_data["pO2_half_max"] , pC->custom_data["pO2 hill power"] );
double hill = temp / (1.0 + temp);
// set speed
  // speed = base speed * hill
p.motility.migration speed = pCD->phenotype.motility.migration speed * (1-hill);
// migration bias
  // bias = multiplier
p.motility.migration bias = hill;
// trick: if dead, overwrite with NULL function pointer.
if( p.death.dead == true )
{ pC->functions.update migration bias = NULL; }
```

#### **Assign the functions**

```
// in create cell types():
  /*
     Put any modifications to individual cell definitions here.
     This is a good place to set custom functions.
  cell defaults.functions.update phenotype = phenotype function;
  cell defaults.functions.custom cell rule = custom function;
  cell_defaults.functions.contact function = contact function;
  Cell Definition* pCD = find cell definition( "tumor" );
  pCD->functions.update phenotype = tumor phenotype;
  pCD = find cell definition( "motile tumor" );
  pCD->functions.update phenotype = motile tumor phenotype;
  pCD->functions.update migration bias = motility rule;
     This builds the map of cell definitions and summarizes the setup.
```

#### Let's modify the setup

- Let's start with 200 of each cell type. Open ./config/mymodel.xml:
- Scroll down to user\_parameters

Unzip <u>Session7 checkpoint3.zip</u> in ./PhysiCell to get this code.

## Rebuild and run the project

Open the XML config file and set max simulation time to 3600 minutes

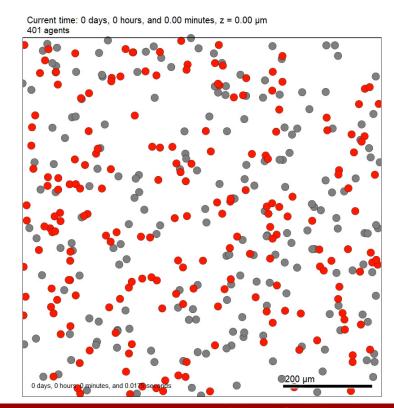
- rebuild:
  - make

- run:
  - ./project ./config/mymodel.xml (linux, MacOS)
  - project ./config/mymodel.xml (Windows)

#### View results!

- make animated GIF
  - make gif

- tumormotile tumor
- Expected behavior:
  - gray tumor cells proliferate
    - ◆ fastest near higher pO2 on boundary
  - gray cells proliferate faster than red
  - red motile tumor cells migrate towards outer boundary
  - red migration slows down as they near boundary



# Handy C++ Helpers (Part 3)

#### Handy C++ tidbits: creating cells

- Functions to help (properly) create and place new cells
  - Cell\* create cell( void );
    - ◆ Create a new **Cell** using the default cell definition (cell\_defaults: has ID 0)
    - ♦ Returns a pointer to the cell, allowing you to further access and modify it
  - Cell\* create\_cell( Cell\_Definition& cd );
    - ◆ Create a new **Cell** using supplied cell definition
    - ♦ Returns a pointer to the cell, allowing you to further access and modify it
  - bool assign\_position( std::vector<double> new\_position);
    - ♦ Use this if you want to manually set the cell's position.
    - ◆ Fully compatible with BioFVM and its data structures
    - ♦ Useful for initialization

#### Example: Creating a new (default) cell

```
// declare a cell pointer
Cell* pCell = NULL;
// create a cell
pCell = create cell();
// assign its position
std::vector<double> position = {0,0,0};
pCell->assign position (position);
// set any other state variables or properties
pCell->phenotype.motility.is motile = false;
pCell->custom data[ "damage" ] = 0.0;
```

#### Example: Creating and placing a new (custom) cell

```
// declare a cell pointer
Cell* pCell = NULL;
// find the cell definition for fibroblasts
Cell Definition* pCD = find cell definition( "fibroblast" );
// create a cell (of type *pCD)
pCell = create cell( *pCD );
// choose a random point on the circle of radius 3 centered at (4,-2,0)
std::vector<double> position = UniformOnUnitCircle();
position *= 3.0; position += \{4, -2, 0\};
pCell->assign position (position);
```

# Handy C++ tidbits: accessing all cells

• all\_cells is a pointer to a vector of all cell agents.

Here's the syntax to use it to traverse all cell agents:

# Full Model Workflow: Example 2

## Scenario: Oxygen-dependent cells v2

- Let's illustrate these with an example:
  - tumor cells:
    - ♦ Cycle entry proportional to local pO2
    - ♦ Necrosis probability increases below a pO2 threshold
  - motile tumor cells:
    - ♦ Same as tumor cells, but:
      - » 1/10 cycling rate
      - » 1/10 apoptosis rate
      - » a more advanced chemotaxis up oxygen gradients
      - » stop migrating above a threshold value
  - Specify how many of each cell type, and place them closer to origin

#### Full modeling workflow

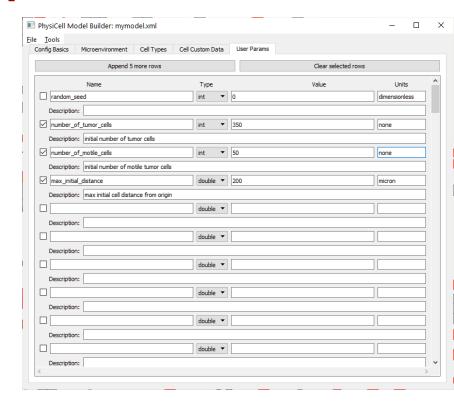
Suitable for creating a new PhysiCell model with custom C++ to drive dynamical phenotype changes

- Plan the model
- Populate a project
- Edit configuration Model Builder GUI
  - Edit domain
  - Edit microenvironment
  - Edit cell definitions
  - Add custom variables
  - Add custom parameters

- Edit custom modules:
  - Declare functions in custom.h
  - Implement functions in custom.cpp
  - Assign functions to cell definitions
- Edit initial cell placement
- Edit cell coloring function
- Build
- Run
- View results

#### Add new user parameters

- Go to "user parameters" in Model Builder
  - rename "number\_of\_cells" to "number of tumor cells"
    - ♦ Set its value to 750
    - ♦ Change its description to "initial number of tumor cells"
  - add another parameter called "number\_of\_motile\_cells"
    - set its type to int
    - ♦ set its value to 50
    - set units and description
  - add another parameter called "max initial distance"
    - ♦ keep its type as double
    - ♦ set its value and units to 250 micron
    - set description to "max initial cell distance from origin"
- Resave mymodel.xml



#### Edit setup\_tissue (1)

- In ./custom modules/custom.cpp find setup tissue
- Comment out the current placement code:

```
for (int k=0; k < cell definitions by index.size(); <math>k++)
  Cell Definition* pCD = cell definitions by index[k];
  std::cout << "Placing cells of type " << pCD->name << " ... " << std::endl;
  for ( int n = 0 ; n < parameters.ints("number of cells") ; <math>n++)
     std::vector<double> position = {0,0,0};
     position[0] = Xmin + UniformRandom()*Xrange;
     position[1] = Ymin + UniformRandom()*Yrange;
     position[2] = Zmin + UniformRandom()*Zrange;
     pC = create cell( *pCD );
     pC->assign position( position);
```

#### Edit setup\_tissue (2)

```
pC->assign position (position);
// place tumor cells
double max distance = parameters.doubles("max initial distance");
Cell Definition* pCD = find cell definition( "tumor" );
std::cout << "Placing cells of type " << pCD->name << " ... " << std::endl;
for ( int k=0 ; k < parameters.ints( "number of tumor cells" ); <math>k++ )
  std::vector<double> position = {0,0,0};
  double r = sqrt(UniformRandom())* max distance;
  double theta = UniformRandom() * 6.2831853;
  position[0] = r*cos(theta);
  position[1] = r*sin(theta);
  pC = create cell( *pCD );
  pC->assign position( position );
```

#### Edit setup\_tissue (3)

```
// place motile tumor cells
pCD = find cell definition( "motile tumor" );
std::cout << "Placing cells of type " << pCD->name << " ... " << std::endl;
for( int k=0 ; k < parameters.ints( "number of motile cells" ); k++ )</pre>
  std::vector<double> position = {0,0,0};
  double r = sqrt(UniformRandom()) * max distance;
  double theta = UniformRandom() * 6.2831853;
  position[0] = r*cos(theta);
  position[1] = r*sin(theta);
  pC = create cell( *pCD );
  pC->assign position( position );
std::cout << std::endl;
// load cells from your CSV file (if enabled)
load cells from pugixml();
return;
```

Unzip <u>Session7 checkpoint4.zip</u> in ./PhysiCell to get this code.

## Rebuild and run the project

• Open the XML config file and set max simulation time to 3600 minutes

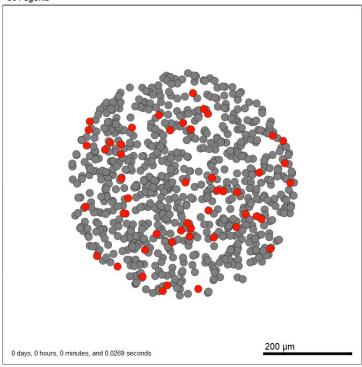
- rebuild:
  - make

- run:
  - ./project ./config/mymodel.xml (linux, MacOS)
  - project ./config/mymodel.xml (Windows)

#### View results!

- make movie
  - make jpeg && make movie
    - tumor
    - motile tumor
- Expected behavior:
  - gray tumor cells proliferate
    - ♦ fastest near higher pO2 on boundary
  - gray cells proliferate faster than red
  - red motile tumor cells migrate towards outer boundary
  - red migration slows down as they near boundary

Current time: 0 days, 0 hours, and 0.00 minutes,  $z = 0.00 \mu m$  801 agents



# Full Model Workflow: Example 3

#### Scenario: Oxygen-dependent cells v3

- Let's illustrate these with an example:
  - tumor cells:
    - ♦ Cycle entry proportional to local pO2
    - ♦ Necrosis probability increases below a pO2 threshold
  - motile tumor cells:
    - ♦ Same as tumor cells, but:
      - » 1/10 cycling rate
      - » 1/10 apoptosis rate
      - » a more advanced chemotaxis up oxygen gradients
      - » stop migrating above a threshold value
  - Specify how many of each cell type, and place them closer to origin
  - Dial initial and boundary pO2 down to 15 mmHg
  - Color non-motile tumor cells based on current cycling rate

#### Full modeling workflow

Suitable for creating a new PhysiCell model with custom C++ to drive dynamical phenotype changes

- Plan the model
- Populate a project
- Edit configuration Model Builder GUI
  - Edit domain
  - Edit microenvironment
  - Edit cell definitions
  - Add custom variables
  - Add custom parameters

- Edit custom modules:
  - Declare functions in custom.h
  - Implement functions in custom.cpp
  - Assign functions to cell definitions
- Edit initial cell placement
- Edit cell coloring function
- Build
- Run
- View results

# **Custom coloring functions for SVGs (1)**

#### Declare the function in the custom header file

```
std::vector<std::string> my coloring function( Cell* );
Create it in the custom cpp file
std::vector<std::string> my coloring function( Cell* pCell )
  // color 0: cytoplasm fill
  // color 1: outer outline
  // color 2: nuclear fill
  // color 3: nuclear outline
  // start black
  std::vector< std::string > = {"black", "black", "black", "black" };
  // make the cytoplasm red if it's not dead
  if( pCell->phenotype.death.dead == false )
  { output[0] = "red"; }
  return output;
```

Let's make our shade from blue (zero prolif rate) to yellow (max prolif rate)

# **Coloring function (1)**

```
// declare new coloring in custom.h
std::vector<std::string> custom coloring function( Cell* );
// start work in custom.cpp
std::vector<std::string> custom coloring function( Cell* pC )
  // start with paint-by-numbers
  std::vector<std::string> output = paint by number cell coloring(pC);
  // get tumor cell def
  static Cell Definition* pTC = find cell definition( "tumor" );
  // return if not live tumor cell
  if( pC->phenotype.death.dead || pC->type != pTC->type )
  { return output; }
```

## Coloring function (2)

```
// get relative birth rate
double s = pC->phenotype.cycle.data.transition rate(0,0) /
  pTC->phenotype.cycle.data.transition rate(0,0);
// make color
int color = (int) round( 255.0 * s );
char szColor [1024];
// blue to yellow
sprintf( szColor, "rqb(%u,%u,%u)",color,color,255-color );
// modify output
output[0] = szColor;
output[2] = szColor;
output[3] = szColor;
return output;
```

## Tell PhysiCell to use your coloring function

#### In main.cpp

```
std::vector<std::string> (*cell_coloring_function) (Cell*) =
   custom_coloring_function;
```

Colors follow the W3C standards for SVG files. Names, RGB values, etc.

https://www.w3.org/TR/SVG11/types.html#ColorKeywords

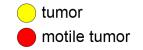
User Guide: Section 14.2

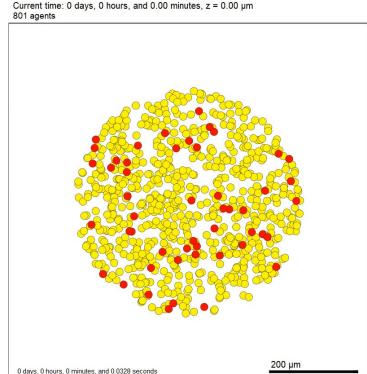
Unzip <u>Session7 checkpoint5.zip</u> in ./PhysiCell to get this code.

#### Run and View results!

make && ./project ./config/mymodel.xml

- make movie
  - make jpeg && make movie





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