

# CompuCell 3D

# Quickstart Guide

**Version 0.5**

**Authors: Maciej Swat, Ariel Balter, James A. Glazier**

**Please send corrections and Revisions to: [mawat@indiana.edu](mailto:mawat@indiana.edu)**

**Extra credit may be offered**

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## 1. Developing a CompuCell3D Simulation—Overview

We hope that CompuCell is a user-friendly tool. Once you have CompuCell installed on your computer, you will be able to design, run and post-process your own biological simulations. In this guide we briefly outline the steps involved in developing a simulation. Currently, all CompuCell simulations are based on an .xml configuration file which the CompuCell Player reads and executes. This configuration file contains the basic parameters that define the cells and their interactions and directs CompuCell to other user-defined text files containing initial configurations of cells and chemical fields.

The first step in building a CompuCell simulation is to design the cells and their interactions. Properties that you can assign to cells include a target volume or surface area, a response to chemical gradients, secretion of chemicals, differential cell adhesion, *etc.*.... Since the Monte Carlo employed in the Glazier-Graner Cellular Potts Model (CPM) method is based on fluctuations, you must also specify the overall amplitude of fluctuations and the degree of deviation allowed from target values, *e.g.* how much the volume will fluctuate around the target volume.

CompuCell includes some standard initializers that create initial configurations of cells, but you will probably want to create your own. You specify the initial cell configuration in a data file with a simple format. You can create this file with a scripting language or just type it in using a word processor, working from a diagram on some graph paper. In the future, CompuCell will have graphical tools to help with this process.

Once you have written your configuration file, running CompuCell is as simple as playing a movie. You open the player, select the configuration file you want to use (using the command [Open](#) from the [File](#) drop-down menu) and click the [Play](#) button. You can select visualization options and customize the output you wish to store for later analysis. In addition to visualizing (and saving) the cell fields, you can look at chemical fields, pressure fields, velocity fields, *etc.*....

Finally, you can analyze your data with standard techniques for analyzing and visualizing spatial data, *e.g.* in MatLab or Mathematica. We are currently developing some basic analysis tools to add to the CompuCell player.

## 2. Writing Your Own Configuration Files

### 2.1 XML Structure and Syntax

*XML* (or *.xml*), which stands for "eXtensible Markup Language" is an extension (or superclass) of *HTML* (Hypertext Markup Language). If you are familiar with HTML then you should find using XML easy. If not, it may take some getting used to. We use XML to specify configuration files because it is easy for a computer to parse. In the .xml configuration file you will specify the general parameters of your simulation such as the types of cells, their properties, *etc.*....

A typical block of .xml you will use in CompuCell3D looks like this:

```
<SectionName Attribute1="attribute" Attribute2="attribute">
  <Variable1 VarAttribute1="attribute" VarAttribute2="attribute">
    ValueOfVariable
  </Variable1>
  <Subsection>
    <VarA>ValueA</VarA>
  </Subsection>
</SectionName>
```

**Example 1.**

If that looks like a lot of gobble-dee-gook, don't worry. I'll explain it. The first thing to notice is that in XML you specify where each **statement** or **element** begins and ends like this:

```
<begin>
    ...
</begin>
```

`<begin>` is referred to as a **begin tag** and `</begin>` is called an **end tag**. Every xml element must have a begin tag and an end tag.

We can also use the following syntax: `<begin .... />`. In this case, `/>` marks the end of the element. This is an example of shortcut notation often becomes handy.

As a matter of style, defining characteristics, properties, or **attributes** of a **section** are specified using the syntax `PropertyValue="attribute"`, while specific **values** for a variable is usually placed between a `<begin>` and an `</begin>` for that variable. By section we mean everything that is contained between beginning tag and ending tag. For example:

```
<Sentence>
    <Text>This is nice example</Text>
    <Font>TimesNewRoman</Font>
</Sentence>
```

Above we can see a section called `Sentence` which consists of two elements `Text` and `Font`. An set of examples, each of which defines a variable and assigns it a style and value is:

```
<Age Style="numeric">38</Age>
or
<Age Style="InWords">"Thirty-Eight"</Age>
or
<Age Style="Roman">"XXXVIII"</Age>
```

I say it's a matter of style, because we could just use the syntax:

```
<Age>
    <Style>"Roman"</Style>
    <Number>XXXVIII</Number>
</Age>
```

or:

```
<Age Style="Roman" Value="XXXVIII"/>
```

In the last example, properties of an element are attributes. In the second to last they are specified as values of two sub-elements `Style` and `Number`. Most parts of a configuration file will use a mixture of properties and attributes. The reference section of this manual lays out explicitly the proper syntax for these definitions.

XML is hierarchical and nested. Thus sections can contain **sub-sections**, and the properties defined within sub-sections apply only within those subsections. The section called `Subsection` in Example 1 is nested within the section `SectionName`. So `VarA` only takes the value `ValueA` within the subsection.

## 2.2 Configuration File Contents

Any configuration file will contain two main types of **blocks**, called **plugins** and **steppables**. A **block** is an `.xml`

element with non-trivial content. Plugins and steppables have different functions. A **plugin** is a routine that defines the global properties of your simulation such as cell properties. A plugin is called at every spin-flip attempt. A **steppable** is a routine that operates on the CompuCell lattice after each **Monte Carlo Step (MCS)** (*i.e.* after as many spin-flip attempts as the number of lattice sites).

**Note:** You must list all plugins first, then steppables. If you reverse the order or mix plugin and steppable declarations in the configuration file you will generate cryptic runtime errors.

**Note:** The difference between a spin flip and a Monte Carlo Step (MCS) is crucial. A Monte Carlo Step includes many spin flip attempts. Typically the number of spin-flip attempts equals the number of lattice sites, though you can change this relationship in the configuration file. Confusion between MCS and spin-flip attempts is common among novice CPM users.

### 3. Your First CompuCell Simulation—Foam Growth

I will keep things as simple as possible and instead of starting with an introduction, motivation, overview *etc.*..., I will show you complete configuration file for a foam-coarsening simulation. I found that looking at an example is the best way to grasp how to write CompuCell configuration files. Writing these files is really not magic, so let's start:

Our first simulation will model the growth of soap bubbles in a foam. Bubbles are compact domains of gas separated by thin films of liquid stabilized by surfactants. The boundaries are subject to surface tension, and rearrange to try to minimize their total boundary length, causing them to assume the shapes of circular arcs. Triples of boundaries meet at vertices and the minimization causes the vertex angles to be  $120^\circ$ . In our CPM simulation, domains with the same index will represent the gas and the boundaries between domains (links with mismatched indices) will represent the soap films. In this case we have only one type of cell (the bubbles), though we will reserve a **Medium** cell type for the background. The curvature of the bubble walls causes pressure differences between bubbles and this in turn results in diffusion of gas from high pressure bubbles to low pressure bubbles. Somewhat counter-intuitively, walls move towards their concave side. Eventually, some bubbles will disappear and the average length-scale of the pattern will grow.

Here is a typical configuration file:

```
<CompuCell3D>
  <Potts>
    <Dimensions x="101" y="101" z="1"/>
    <Anneal>0</Anneal>
    <Steps>1000</Steps>
    <Temperature>5</Temperature>
    <Flip2DimRatio>1.0</Flip2DimRatio>
    <Boundary_y>Periodic</Boundary_y>
    <Boundary_x>Periodic</Boundary_x>
    <FlipNeighborMaxDistance>1.75</FlipNeighborMaxDistance>
  </Potts>

  <Plugin Name="CellType">
    <CellType TypeName="Medium" TypeId="0"/>
    <CellType TypeName="Foam" TypeId="1"/>
  </Plugin>

  <Plugin Name="Contact">
    <Energy Type1="Foam" Type2="Foam">50</Energy>
```

```

<Depth>2.0</Depth>
</Plugin>

<Steppable Type="PIFInitializer">
<PIFName>foaminit2D.pif</PIFName>
</Steppable>

</CompuCell3D>

```

It wasn't that bad. In fact, I am sure, that without any explanation you could figure out what every symbol means in this file. Nevertheless let's go through it step by step to make sure we understand syntax of every section.

### 3.1 CPM Definitions

The first section of the .xml file defines the global parameters of the lattice and the simulation.

```

<Potts>
<Dimensions x="101" y="101" z="1"/>
<Anneal>0</Anneal>
<Steps>1000</Steps>
<Temperature>5</Temperature>
<Flip2DimRatio>1</Flip2DimRatio>
<Boundary_y>Periodic</Boundary_y>
<Boundary_x>Periodic</Boundary_x>
<FlipNeighborMaxDistance>1.75</FlipNeighborMaxDistance>
</Potts>

```

This section appears at the beginning of the configuration file. Line `<Dimensions x="101" y="101" z="1"/>` declares the dimensions of the lattice to be 101 x 101 x 1, *i.e.*, the lattice is two-dimensional and extends in the xy plane. The basis of the lattice is 0 in each direction, so the 101 lattice sites in the x and y directions have indices ranging from 0 to 100. `<Steps>1000</Steps>` tells CompuCell how long the simulation lasts in MCS. After executing this number of steps, CompuCell can run simulation at zero temperature for an additional period. In our case it will run for `<Anneal>10</Anneal>` extra steps. Setting the temperature is as easy as writing `<Temperature>5</Temperature>`. Now, as you remember from the discussion about the difference between spin-flip attempts and MCS we can specify how many spin flips should be attempted in every MCS. We specify this number indirectly by specifying the **Flip2DimRatio** - `<Flip2DimRatio>1</Flip2DimRatio>`, which tells CompuCell that it should make 1 x number of lattice sites attempts per MCS – in our case one MCS is 101x101x1 spin-flip attempts. To set 2.5x101x101x1 spin flip attempts per MCS you would write `<Flip2DimRatio>2.5</Flip2DimRatio>`.

The next line specifies the neighbor range of interactions (nearest neighbor, next-nearest neighbor, *etc.....*), **FlipNeighborMaxDistance**, `<FlipNeighborMaxDistance>1.75</FlipNeighborMaxDistance>`. This line tells CompuCell to search for a trial spin among those pixels whose distance from the current pixel (the one that undergoes the flip) is less than 1.75 lattice constants from the site to be substituted. The simplest simulation would set this distance to be 1 (nearest neighbor interaction), but as discussed in class nearest neighbor interactions may cause artifacts due to lattice anisotropy. The longer the interaction range, the more isotropic the simulation and the slower it runs. In addition, if the interaction range is comparable to the cell size, you may generate unexpected effects, since non-adjacent cells will contact each other.

The Potts section also contains tags called `<Boundary_y>` and `<Boundary_x>`. These tags impose boundary conditions on the lattice. In this case the x and y axes are **periodic** (`<Boundary_x>Periodic</Boundary_x>`) so that *e.g.* the pixel with x=0, y=1, z=1 will neighbor the pixel with x=100, y=1, z=1. If you do not specify boundary conditions CompuCell will assume them to be of type **no-**

**flux**, *i.e.* lattice will not be extended. The conditions are independent in each direction, so you can specify any combination of boundary conditions you like.

Once we have used the Potts section to create our lattice we can start listing plugins.

### 3.2 Cell Type Plugin

Let's start with the **CellType** plugin whose main purpose is to inform CompuCell what cell types you will be using in the simulation.

**Note:** In CompuCell, every cell has a unique index or **Id** which differentiates it from other cells and a non-unique **cell type** which identifies its class of behavior. Many distinct cells may have the same type and will appear painted with the same color when you visualize them.

```
<Plugin Name="CellType">
<CellType TypeName="Medium" TypeId="0"/>
<CellType TypeName="Foam" TypeId="1"/>
</Plugin>
```

The syntax here is quite straightforward. Each line contains the name of a type that the simulation uses and assigns it to an integer valued **TypeId**. We strongly recommend that **TypeIds** are consecutive positive integers (*e.g.* 0,1,2,3...). Medium is traditionally assigned a TypeId=0 but this assignment is not a requirement. In Example 1, we have created two cell types, Medium and Foam, with Medium assigned a **TypeId** of 0 and Foam a **TypeId** of 1.

### 3.3 Contact Energy Plugin

Energy calculations for the foam simulation are based on the boundary or contact energy between cells (or surface tension, if you prefer). The total energy of the foam is simply the total boundary length times the surface tension (here defined to be  $2J$ ).

The explicit formula for the energy is:

$$E_{\text{adhesion}} = \sum_{i,j,\text{neighbors}} \mathbf{J}(\tau_{\sigma(i)}, \tau_{\sigma(j)}) (1 - \delta_{\sigma(i),\sigma(j)}),$$

where  $i$  and  $j$  label two neighboring lattice sites,  $\sigma$  s denote cell Ids,  $\tau$  s denote cell types . Once again you need to differentiate between cell types and cell Ids. This formula shows that cell types and cell Ids are not the same. The Contact plugin in the .xml file, defines the energy per unit area of contact between cells of different types ( $\mathbf{J}(\tau_{\sigma(i)}, \tau_{\sigma(j)})$ ) and the interaction range (**Depth**) of the contact:

```
<Plugin Name="Contact">
<Energy Type1="Foam" Type2="Foam">3</Energy>
<Energy Type1="Medium" Type2="Medium">0</Energy>
<Energy Type1="Medium" Type2="Foam">0</Energy>
<Depth>2.0</Depth>
</Plugin>
```

In this case, the interaction range is 2, fourth-nearest neighbor , foam cells have a contact energy per unit area of 3 and foam and medium and medium and medium have a contact energy of 0 per unit area.

### 3.4 PIF Initializer

To initialize the configuration of the simulation lattice you can use one of the built-in lattice **initializers** (we will show one in the next example), or you can write your own **lattice initialization file**. Our experience suggests that

you will probably have to write your own initialization files rather than relying on built-in initializers. The reason is simple: the built-in initializers implement very simple cell layouts, and if you want to study more complicated cell arrangements, the built-in initializers will not be very helpful. Therefore we encourage you to learn how to prepare lattice initialization files. Again, file definition is not complicated and we will explain every step. The lattice initialization file tells CompuCell3D how to lay out assign the simulation lattice pixels to cells.

The **Potts Initial File (PIF)** is a simple file format that we created for easy specification of initial cell positions. The PIF consists of multiple lines of the following format:

```
cell# celltype x1 x2 y1 y2 z1 z2
```

Where `cell#` is the unique integer index of a cell, `celltype` is a string representing the cell's initial type, and `x1` and `x2` specify a *range* of x-coordinates contained in the cell (similarly `y1` and `y2` specify a range of y-coordinates and `z1` and `z2` specify a range of z-coordinates). Thus each line assigns a rectangular volume to a cell. If a cell is not perfectly rectangular, multiple lines can be used to build up the cell out of rectangular sub-volumes (just by reusing the `cell#` and `celltype`).

A PIF can be provided to CompuCell3D by including the steppable object **PIFInitializer**.

Let's look at a PIF example for foams:

```
0 Medium 0 101 0 101 0 0
1 Foam 13 25 0 5 0 0
2 Foam 25 39 0 5 0 0
3 Foam 39 46 0 5 0 0
4 Foam 46 57 0 5 0 0
5 Foam 57 65 0 5 0 0
6 Foam 65 76 0 5 0 0
7 Foam 76 89 0 5 0 0
```

These lines define a background of Medium which fills the whole lattice and is then overwritten by seven rectangular cells of type Foam numbered 1 through 7. Notice that these cells lie in the *xy* plane ( $z1=0$   $z2=0$  implies that cells have thickness =1) so this example is a two-dimensional initialization.

You can write the PIF file manually, but using a script or program that will write PIF file for you in the language of your choice (Perl, Python, Matlab, Mathematica, C, C++, Java or any other programming language) will save a great deal of typing. We will provide some sample scripts that you will be able to modify later to create your own PIF files.

We will use simple script which creates initialization file for foam simulation. The syntax to use the script is the following:

```
./FoamInit.pl -r<row_size> -i<number of rows> -o<PIF file name> -z<random ratio> -m<min_width>.
```

What the script does it divides lattice into rows of width `<row_size>` then in each row it creates rectangular cells of height defined by `<row_size>` and width chosen randomly from interval `[<min_width>, <min_width>*<random ratio>]`.

Let's do few exercises.

**Note:** Generate a new subdirectory for each run for each exercise that you do and do run in that subdirectory so that you can identify which output files belong to which simulation parameters. Type `mkdir <new_directory>`, then `cd <new_directory>` , finally start the simulation in the new directory by typing

`<path_to_CompuCell_run_script>/run_CompuCellNew.sh`

### Exercise 1

Let's generate different initial condition by modifying `<min_width>` and `<random_ratio>`. For example let's run `FoamInit.pl` with the following arguments:

```
./FoamInit.pl -r5 -i60 -ofoaminit2D_1.pif -z2 -m10.
```

This command will create a lattice initialization file called "foaminit2D\_1.xml". The lattice will be 301x301 (5\*60+1) and will consist of 60 rows each of which is 5 pixel tall. Each row is divided into rectangular cells of randomly chosen width. The width is chosen from the interval [10,20] pixels.

Now in the `.xml` configuration file for foam simulation you need to change the line

```
<PIFName>foaminit2D.pif</PIFName> to <PIFName>foaminit2D_1.pif</PIFName>
```

This ensures that CompuCell3D will use the `foaminit2D_1.pif` initialization file that you have just created. Observe what happens to the simulation. You may want to play with other values as well.

Make sure that you understand how to create different initial conditions with different file names and that you change the `.xml` file to correspond to these file names.

Note: If you change the size of the lattice you generate using `FoamInit.pl`, you must also change the size of the lattice in the `.xml` file (line `<Dimensions x="101" y="101" z="1"/>`). What happens if the sizes don't match? Are the two cases (the initial lattice too big and too small) the same?

### Exercise 2

Change the interaction range in the contact energy. In the line:

```
<Depth>2.0</Depth> ,
```

change 2.0 to 1.0, 1.43, 1.75 and see what happens.

Note: There is a pattern here, namely if in contact energy calculations you want to include only the nearest neighbors you type:

```
<Depth>1.0</Depth>
```

To include second nearest neighbors you use a number that is slightly greater than  $\sqrt{2}$ . In our case we use 1.43:

```
<Depth>1.43</Depth>
```

For third nearest neighbor interactions, the `Depth` will be a number slightly greater than  $\sqrt{3}$ , in our case 1.75, and so on.

Note that the Number of Neighbors ( $NN$ ) in two-dimensions goes as follows: For Nearest Neighbors ( $Depth=1$ ),  $NN=4$ , For Next Nearest neighbors ( $Depth=1.43$ ),  $NN=8$ , For Third neighbors ( $Depth=1.75$ ),  $NN=12$ , For fourth neighbors ( $Depth=2$ )  $NN=20$  and for fifth neighbors ( $Depth=2.86$ )  $NN=24$ . See pictures below. Numbers on the grid denote orders of neighbors ( $1^{st}$ ,  $2^{nd}$ , *etc...*).

2	1	2
1	X	1
2	1	2

5	4	3	4	5
4	2	1	2	4
3	1	X	1	3
4	2	1	2	4
5	4	3	4	5

You should see that for longer interaction ranges with the same temperature and interaction energy, the evolution is slower and the boundary walls are smoother, because longer interaction ranges have smaller LATTICE ANISOTROPY. That is, the variation in the energy of a wall as a function of the angle with respect to the underlying lattice is less for longer interaction ranges. *E.g.* for a  $Depth$  of 1 (Nearest neighbors), the energy of a wall at angle  $0^\circ$  or  $90^\circ$  with respect to the lattice is 1 and for a wall at  $45^\circ$  or  $135^\circ$ , the energy per unit length is  $\sqrt{2}$ .

Observe what happens to the simulation when you change interaction range.

### Exercise 3

In this exercise you will change the simulation  $Temperature$ . In the Potts Section of the code, this line looks like `<temperature>5</temperature>`. So you will use, *e.g.*:

`<temperature>0</temperature>`

or,

`<temperature>10</temperature>`

*etc....*

Run the simulation with different temperatures:  $Temperature=0, 0.5J, J, 3J, 10J, 100J, 1000J$ , where  $J$  is the contact energy coefficient between foam cells (`<Energy Type1="Foam" Type2="Foam">3</Energy>` in the .xml configuration file). The  $Temperature$  must be adjusted to match  $J$  (the contact energy coefficient) because what matters is the ratio  $J * Number\ of\ neighbors / Temperature$ . So for larger  $J$ , the  $Temperature$  needs to be bigger to have the same effect and for a longer neighbor interaction range, the  $Temperature$  must be bigger to have the same effect, because you have more neighbors. Note that the Number of Neighbors ( $NN$ ) in two Dimensions goes as follows: For Nearest Neighbors,  $NN=4$ , For Next Nearest neighbors,  $NN=8$ , For Third neighbors,  $NN=12$ , for Fourth neighbors  $NN=20$  and for Fifth neighbors  $NN=24$  (see Exercise 2 above).

The point of this exercise is to study two things: the effect of lattice anisotropy and the transition from 'ferromagnetic' to disordered behavior. For  $Temperature=0$  for an interaction range of 1 ( $Depth$ ), the pattern will **freeze**--it will not evolve at all, because all the boundaries will line up along low energy directions and  $Temperature=0$  means that only steps that **decrease** the pattern energy are allowed. At  $Temperature=0$  for an interaction range ( $Depth$ ) of 2 the pattern will evolve normally.

For higher  $Temperature$  and the same interaction range and  $J$ , the boundaries will become rougher. You **should** find that as the  $Temperature$  increases, the coarsening rate increases up to some threshold value of  $J$  and then decreases

again as the **Temperature** becomes very large. At very high **Temperature**, the pattern **should melt**. This is a ferromagnetic to isotropic phase transition. The bubbles will fall apart and the spin values will be random, because the energy of a pixel is always very small compared to the **Temperature**, so **every** spin flip is accepted, even if it makes the boundaries longer.

#### Exercise 4

Now let's do a quantitative exercise which examine how bubble properties change in time by saving snapshots of the properties of the individual bubbles at different times. In the `.xml` file add a **steppable** which for every cell will output the cell id, volume, surface and number of neighbors. Simply place the following lines in your `.xml` file:

```
<Steppable Type="FoamDataOutput" Frequency="10">
  <Output CellID="" Volume="" Surface="" NumberOfNeighbors="" FileName="data"/>
</Steppable>
```

Did you paste it in the right place?

The syntax is simple, as you can see, namely you specify the frequency with which this **steppable** is called, and for the element **Output** you list the properties of the cells that you want to output and give an optional name for the output file (the default file name is "**Output**"). For the above example CompuCell will produce the following files: data.10, data.20, data.30, and so on. Each of these files will have the following contents:

```
73  131  64  8
74  46   32  6
75  57   50  5
76  16   18  5
77  106  58  8
79   6   10  3
80  84   48  7
13  70   46  5
2   128  66  7
```

Columns from left to right denote: cell id, volume, surface, number of neighbors.

Given this data file, plot the average bubble area as a function of time. For several chosen output files calculate the average bubble area. Then plot this average area  $\langle A \rangle$  as a function of time.

Hints: for exercises requiring quantitative estimations and extraction of data from output files you may use Excel and use its sorting capabilities (**Data->Sort...**). First open file in Excel (**File->Open...**) - this will take through several dialogs for importing text file into spreadsheets. Most of these dialogs are fairly well explained. Then once you have your spreadsheet ready you may select all the columns and go to the **Data->Sort...** to sort data with respect to a given column. Now, you should be able to do most of the exercises.

#### Exercise 5

In this exercise you will examine the correlation between area and number of sides. If you look at your patterns, you will notice that bubbles with more sides tend to be larger than bubbles with few sides. For a chosen time (output data file) find average area of an  $n$ -sided bubble. Plot  $\langle A_n \rangle$  as a function of  $n$ .

#### Exercise 6

As the bubble pattern evolves, the fraction of bubbles with a given number of sides changes. Because the initial patterns you are using have a relatively regular initial pattern, most bubbles start out with six sides, with a few five-sided and seven-sided bubbles. As the pattern evolves, the distribution will change, with more bubbles having few or many sides and the maximum of the distribution moving to five. Similarly, most bubbles start off with areas close to

the average area. With time, more small and large bubbles (relative to the average area) appear. Sometimes the distributions will broaden, then narrow again, *i.e.* they will overshoot their equilibrium values. The reason for the existence of these equilibrium distributions, or scaling states, is still a matter of discussion.

For few chosen output files plot histograms of  $p(n)$  - probability of finding  $n$  sided bubble in at time  $t$  (*i.e.* in a given output file) and  $p(A/\langle A \rangle)$  - the probability of finding a bubble of area  $A/\langle A \rangle$  at time  $t$  (*i.e.* in a given output file).

Notice that  $p(n)$  is the ratio of the number of  $n$ -sided bubbles to the total number of bubbles. Analogously,  $p(A/\langle A \rangle)$  is the fraction of bubbles with a given area  $A$  relative to the average bubble area  $\langle A \rangle$ .

### Exercise 7

The rate of growth of the bubbles and the way that the distribution reaches its equilibrium depends on the degree of disorder in the initial conditions. Generate different initial conditions and check if  $p(A/\langle A \rangle)$  as a function of  $t$  and  $A/\langle A \rangle$  as a function of  $t$  depend on initial conditions.

### Exercise 8

So far your simulations have used periodic boundary conditions. Bubbles interact with rigid walls in a distinctive way. Change the boundary conditions from periodic to no flux. Does the pattern look different? Why? Have you ever observed this effect in a real foam?

Note: Do all of your other simulations with periodic boundary conditions.

### Exercise 9

In Exercise 5 you plotted  $\langle A_n \rangle$  as a function of  $n$ . Now evaluate  $\langle n_A \rangle$ , the average number of sides of a bubble of area  $A/\langle A \rangle$  at a fixed time. You will have to use intervals of a convenient width in  $A/\langle A \rangle$  to get better statistics. Is this plot just the plot of Exercise 5 turned by 90°? Why, or why not?

### Exercise 10

The most important properties of foams are the rate of growth or shrinkage of bubbles and the changes in their numbers of sides. While understanding changes in the number of sides is still an unsolved problem, the rate of growth of a bubble is simple. Surprisingly, it depends only on its number of sides, not on its area or the behaviors of its neighbors. This result was first derived by von Neumann (of computer fame) theoretically in 1952. By comparing sequential files and looking for bubbles whose numbers of sides do not change between files,

calculate  $\frac{dA_n}{dt}$ . Does  $\frac{dA}{dt} = \kappa(n - 6)$  (*i.e.* does the foam obey von Neumann's law)? Why or why not?

Note that if you don't check that the number of sides doesn't change before you calculate your derivative, you will get the wrong answer. Why?

### Exercise 11

I said above that foams reach a scaling state (a state where the average area grows but the statistical properties, *i.e.* the number-of-sides and relative-area histograms remain constant). Do they? When? When do they not do so? Does the scaling state depend on interaction range and [Temperature](#)?

### Exercise 12 (Extra Credit)

Three dimensional foams are much less well understood than two dimensional foams because there is no three-

dimensional equivalent of von Neumann's law and because they are much harder to study experimentally. Repeat the above exercises in three dimensions, substituting number of faces for number of sides and volume for area. How does a three-dimensional foam differ from a two-dimensional foam?

#### 4. A Slightly More Complex Simulation—Cell Sorting

Another relatively simple CompuCell simulation models biological cell sorting. In this simulation you start with a mixture of different cell types with different adhesivities to each other.

Embryonic cells of two different types, when dissociated, randomly mixed, and reaggregated can spontaneously sort to reestablish coherent homogenous tissues. Both complete and partial cell sorting (in which large clusters of one cell type are trapped inside a continuous structure of another type) have been observed experimentally in vitro in embryonic cells. Sorting is a key step in regeneration of a normal animal from aggregates of dissociated cells of adult hydra and involves neither cell division nor differentiation but only spatial rearrangement of cell positions. Physically cell sorting is caused by differences in adhesivities. In this simulation you will be able to verify how different hierarchies of adhesion coefficients will lead to different types of sorting.

First let's look at the entire .xml description file for cell sorting before going into more detail:

```
<CompuCell3D>
<Potts>
<Dimensions x="50" y="50" z="1"/>
<Anneal>10</Anneal>
<Steps>10000</Steps>
<Temperature>5</Temperature>
<Flip2DimRatio>1</Flip2DimRatio>
<FlipNeighborMaxDistance>1.75</FlipNeighborMaxDistance>
</Potts>

<Plugin Name="CellType">
<CellType TypeName="Medium" TypeId="0"/>
<CellType TypeName="Condensing" TypeId="1"/>
<CellType TypeName="NonCondensing" TypeId="2"/>
</Plugin>

<Plugin Name="PlayerSettings">
<!--Project2D XYProj="25"/>
<InitialProjection Projection="xz"/-->
<Rotate3D XRot="27" YRot="-11"/>
</Plugin>

<Plugin Name="Volume">
<TargetVolume>20</TargetVolume>
<LambdaVolume>1.0</LambdaVolume>
</Plugin>

<Plugin Name="Surface">
<TargetSurface>16</TargetSurface>
<LambdaSurface>0.5</LambdaSurface>
</Plugin>

<Plugin Name="Contact">
```

```

<Energy Type1="Medium" Type2="Medium">0</Energy>
<Energy Type1="NonCondensing" Type2="NonCondensing">14</Energy>
<Energy Type1="Condensing" Type2="Condensing">2</Energy>
<Energy Type1="NonCondensing" Type2="Condensing">11</Energy>
<Energy Type1="NonCondensing" Type2="Medium">16</Energy>
<Energy Type1="Condensing" Type2="Medium">16</Energy>
</Plugin>

<Steppable Type="BlobInitializer">
<Gap>0</Gap>
<Width>2</Width>
<CellSortInit>yes</CellSortInit>
<Radius>10</Radius>
</Steppable>

</CompuCell3D>

```

#### 4.1 Volume and Surface Constraints

```

<Plugin Name="Volume">
<TargetVolume>20</TargetVolume>
<LambdaVolume>1.0</LambdaVolume>
</Plugin>

<Plugin Name="Surface">
<TargetSurface>16</TargetSurface>
<LambdaSurface>0.5</LambdaSurface>
</Plugin>

```

These two plugins inform CompuCell that the sHamiltonian will have two additional terms associated with volume and surface conservation. That is when spin flip is attempted one cell will increase its volume and another cell will decrease. Thus overall energy of the system may or will change. Volume constraint essentially ensures that cells maintain the volume which close (this depends on thermal fluctuations) to target volume . The role of surface plugin is analogous to volume, that is to “preserve” surface.

Energy terms for volume and surface constraints have the form:

$$E_{\text{volume}} = \lambda_{\text{volume}} (\mathbf{V}_{\text{cell}} - \mathbf{V}_{\text{target}})^2$$

$$E_{\text{surface}} = \lambda_{\text{surface}} (\mathbf{S}_{\text{cell}} - \mathbf{S}_{\text{target}})^2$$

Notice that flipping a single spin may cause surface change in more that two cells – this is especially true in 3D.

Now the most important plugin in the cell sort simulation. Again, let's look at the contact plugin for the cell sort. It is a somewhat more complicated that corresponding plugin for foam simulation but the idea is the same

```

<Plugin Name="Contact">
<Energy Type1="Medium" Type2="Medium">0</Energy>
<Energy Type1="NonCondensing" Type2="NonCondensing">14</Energy>
<Energy Type1="Condensing" Type2="Condensing">2</Energy>
<Energy Type1="NonCondensing" Type2="Condensing">11</Energy>
<Energy Type1="NonCondensing" Type2="Medium">16</Energy>
<Energy Type1="Condensing" Type2="Medium">16</Energy>

```

</Plugin>

The last object that shows up in the configuration file is a steppable called BlobField initializer. Remember, I told you that steppables are called every MCS. That is true, except when steppable is some kind of initializer. In this case steppable is called once at the beginning of the simulation. What this initializer does, it creates a blob of cells. Each cell is a cube 2x2x2 (<Width>2</Width>) and they are tightly packed (<Gap>0</Gap>). The additional line <CellSortInit>yes</CellSortInit> is used exclusively for cellsort simulation and tells the initializer that cell types will be only 0,1,2 or Medium, Condensing, NonCondensing if you prefer. You can also specify radius of the blob although this is not a requirement. If you do not specify the radius it will be equal to  $2/5 * x\_lattice\_dimension$ . If you want to increase or decrease radius from its default value, use <Radius>10</Radius> option. Any space in the lattice unfilled with cells becomes Medium *i.e.* effectively all the cells are immersed in Medium (unless the radius is so big that cells fill entire lattice).

This initializer is one of CompuCell3D stock initializers, so that you do not need to prepare your own PIF initialization file.

```
<Steppable Type="BlobInitializer">
  <Gap>0</Gap>
  <Width>2</Width>
  <CellSortInit>yes</CellSortInit>
  <Radius>10</Radius>
</Steppable>
</CompuCell3D>
```