

# Discrete-time Stochastic Simulation of Chemical Reaction Networks

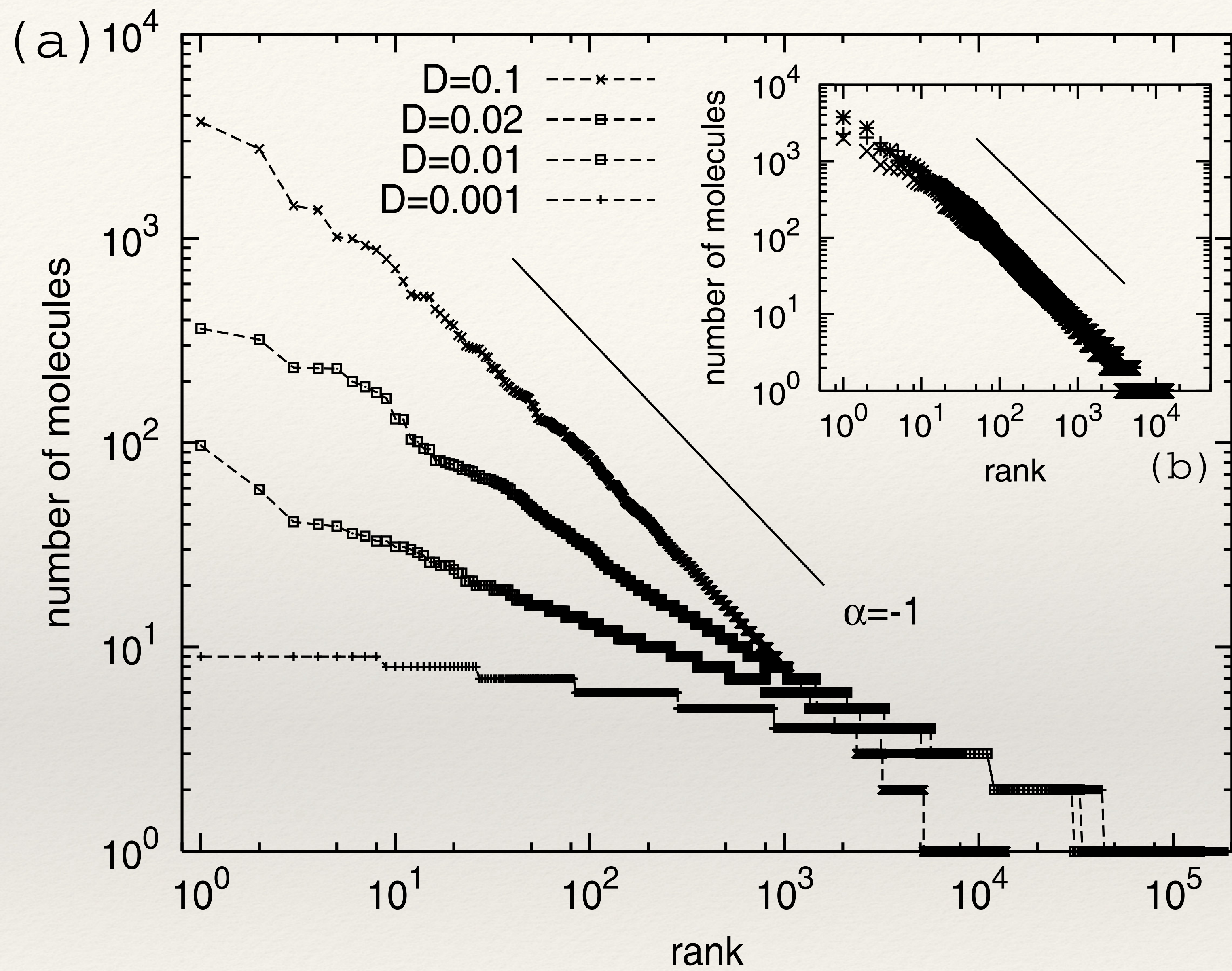
based on Furusawa & Kaneko's model in PRL 90.088102

Tuan Pham



UNIVERSITY OF  
COPENHAGEN

*Niels Bohr Institute*  
*Biocomplexity Department*



$$k = 5 \times 10^6, N = 5 \times 10^5, \rho = 0.022$$

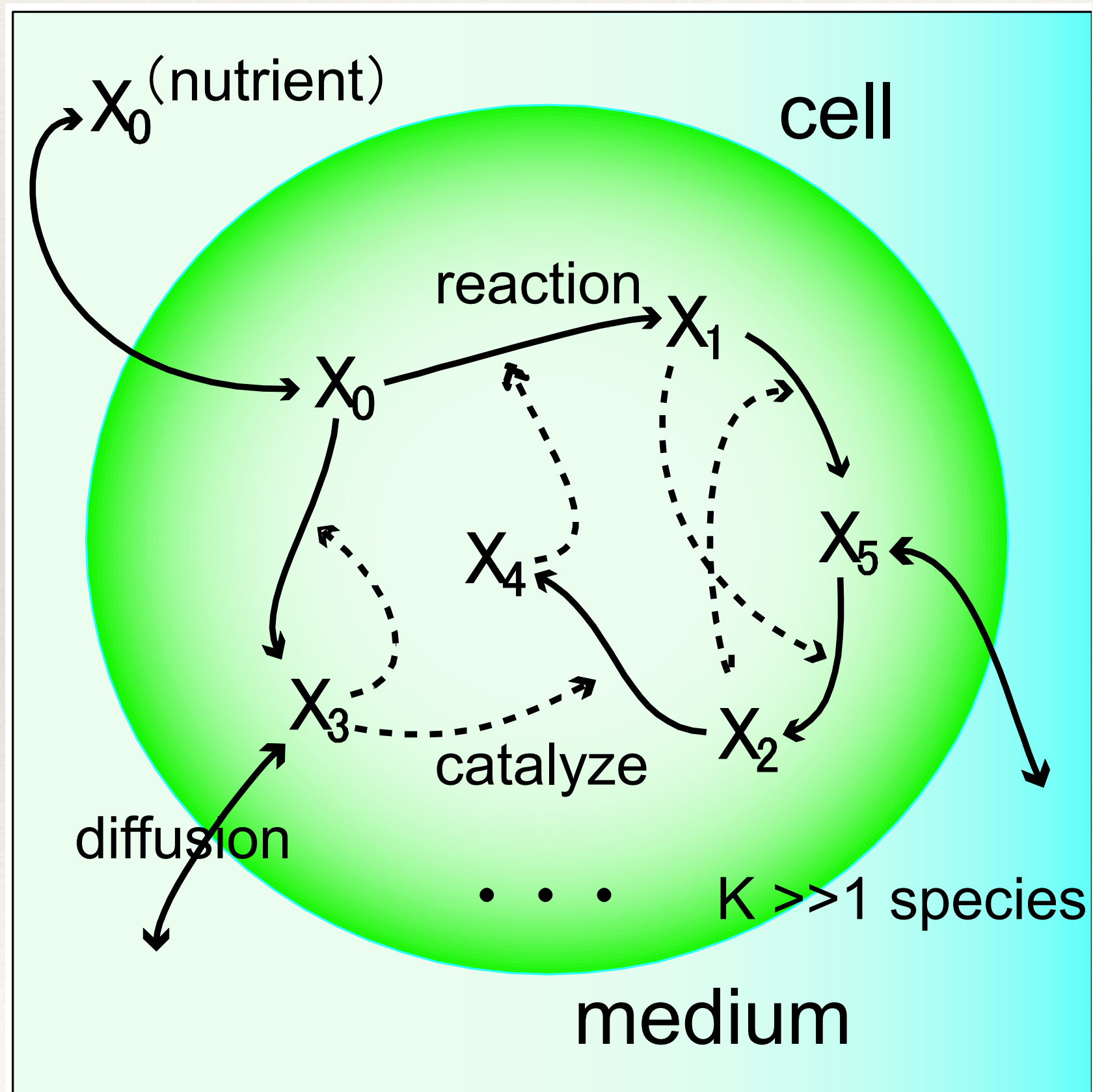
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# Algorithm

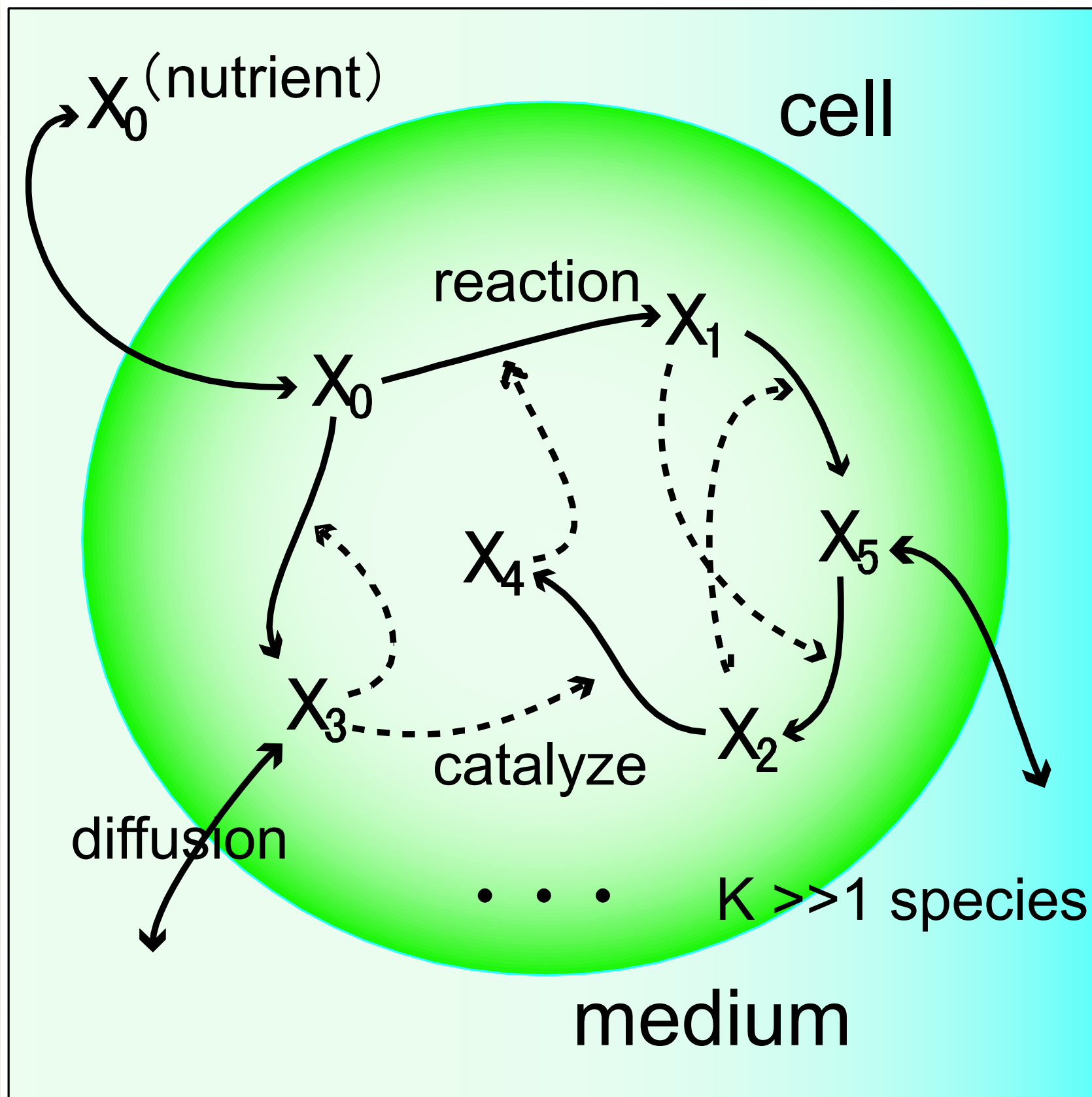
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- ❖ 0) Creating a vector of  $k$  components, denoted by  $x$  and assign to each of its component a random integer  $\in [1, N]$ . Let's keep the total number of molecules less than equal  $2N$  before anything happens, i.e.  $\sum_{i=1}^k x_i(\text{initial time}) = \alpha N, \alpha \in (0, 2)$ , note that this is not important as a constraint as long as the initial condition, if set close to  $2N$ , i.e  $\alpha$  close to 2, will reach step 4 FASTER.
- ❖ 1) Generating the chemical reaction network  $G$  with  $k$  species (nodes) and a probability  $\rho$  for  $i$  and  $j$  being connected and producing  $l$  as specified by  $i + j \rightarrow l + j$ , note  $\rho$  is independent from the pair  $i$  and  $j$
- ❖ 2) At every trial, choose a pair of species  $i$  and  $j$  at random with probability proportional to the product of their current abundances and if  $i + j \rightarrow l + j, x_i \rightarrow x_i - 1$  and  $x_l \rightarrow x_l + 1$
- ❖ 3) After every  $D$  of such trials, let a *fixed* nutrient come in with probability 1 and go out with probability proportional to its concentration inside the cell. For simplicity, incoming makes  $x_{\text{nutrient}} \rightarrow x_{\text{nutrient}} + 1$ , whereas outgoing makes  $x_{\text{nutrient}} \rightarrow x_{\text{nutrient}} - 1$ ,
- ❖ 4) Cell division happens if  $\sum_{i=1}^k x_i = 2N$ , use  $x = (1 - p)x^{(1)} + px^{(2)}$ , where  $p = \text{rand}()$ , keep one among the two  $x^{(1)}$  and  $x^{(2)}$
- ❖ Once step 4 is completed, go back to 2 and keep repeating this cycle 2-3-4-2 (for the same  $G$  that is generated at step 1) for a total number of cell\_div

- ❖ 1) Generating the chemical reaction network  $G$  with  $k$  species (nodes) and a probability  $\rho$  for  $i$  and  $j$  being connected and producing  $l$  that is chosen as a random integer to specify the reaction  $i + j \rightarrow l + j$ .
- ❖ Note  $\rho$  is independent of the pair  $i$  and  $j$



- ❖ 1) Generating the chemical reaction network  $G$  with  $k$  species (nodes) and a probability  $\rho$  for  $i$  and  $j$  being connected and producing  $l$  as specified by  $i + j \rightarrow l + j$ .  $A_{\{ij\}} = 0, 1$   $D_{\{ii\}} = \text{product, random integer}$ .  $G_{\{ii\}} = A_{\{ii\}} D_{\{ii\}}$



```

import numpy as np
import matplotlib.pyplot as plt
import random
from tqdm.auto import tqdm

def random_reaction_network(rho, k):
    """Generates a random reaction network with k nodes and density rho."""
    # Create an array of nodes indices
    nodes = np.arange(k)

    # Keep generating edge degrees until the sum is even
    while True:
        edge_degrees = np.random.poisson(rho * k, size=k)
        if sum(edge_degrees) % 2 == 0:
            break

    # Repeat each node index by its edge degree to get the list of edges
    edges = np.repeat(nodes, edge_degrees)

    # Shuffle the edges and reshape into a 2D array
    np.random.shuffle(edges)
    Is, Js = edges.reshape((2, -1))

    # Assign a random reaction product to each edge and store in a dictionary
    G = {(i, j): np.random.randint(k) for i, j in zip(Is, Js)}
    return G

```

❖ Reaction

❖ 2) At every trial, choose a pair of species  $i$  and  $j$  at random with probability proportional to the product of their current abundances and if  $i + j \rightarrow l + j$ ,  $x_i \rightarrow x_i - 1$  and  $x_l \rightarrow x_l + 1$

❖ Diffusion

❖ 3) After every  $D$  of such trials, let a fixed nutrient come in with probability 1 and go out with probability proportional to its concentration inside the cell. For simplicity, incoming makes  $x_{\text{nutrient}} \rightarrow x_{\text{nutrient}} + 1$ , whereas outgoing makes  $x_{\text{nutrient}} \rightarrow x_{\text{nutrient}} - 1$ ,

❖ Cell division

4) Cell division happens if  $\sum_{i=1}^k x_i = 2N$ , use  $x = (1 - p)x^{(1)} + px^{(2)}$ , where  $p = \text{rand}()$ , keep one among the two  $x^{(1)}$  and  $x^{(2)}$

❖ Reaction

❖ Diffusion

❖ Cell division

```
time = 0
r = np.array(list(G.keys()))
P = x[r[:,0]] * x[r[:,1]]
P = P / P.sum()

for division in tqdm(range(celldivision)):

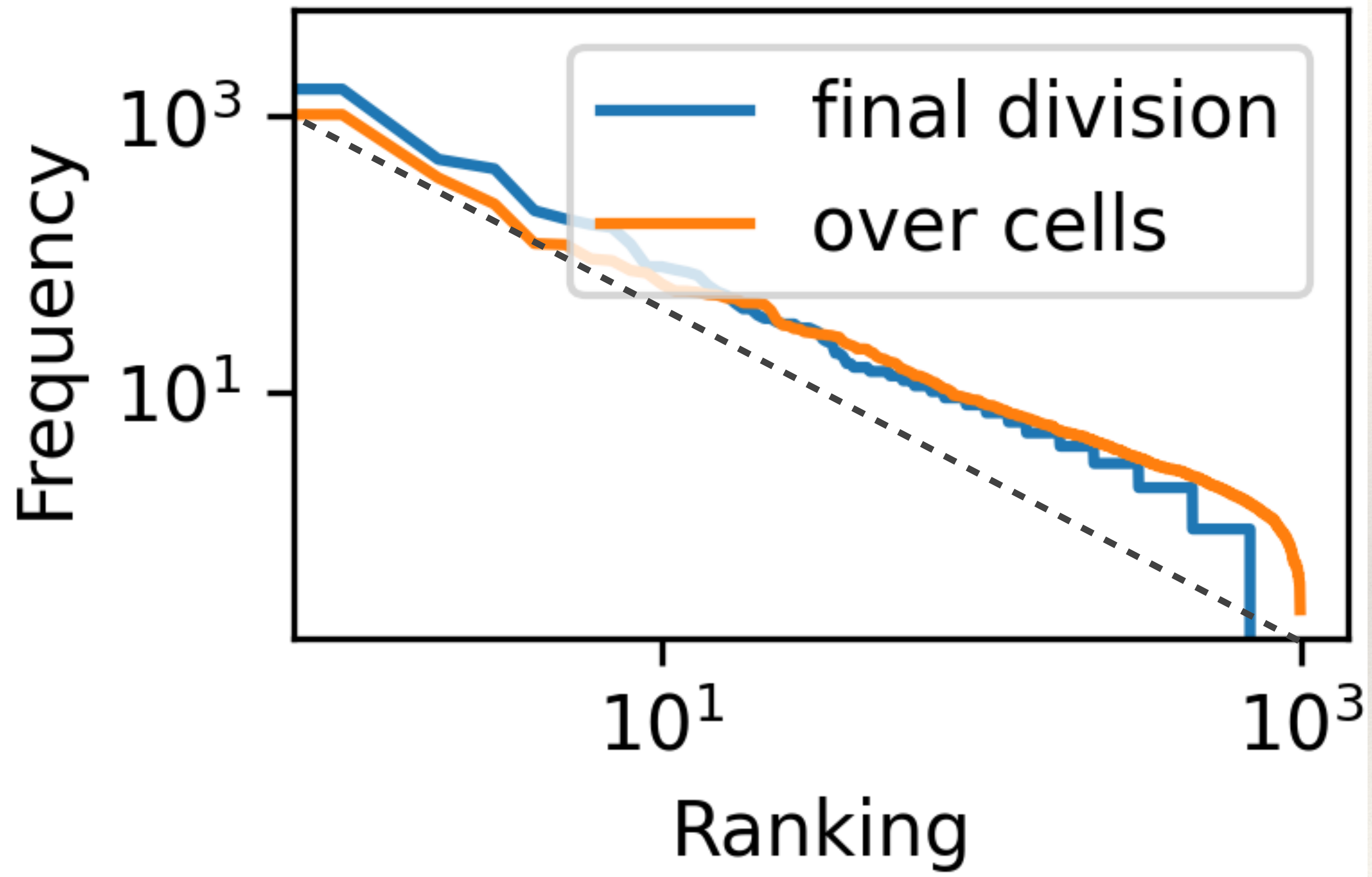
    # If the total number of molecules exceeds 2N, divide
    print('Division count: ', division)
    while np.sum(x) < 2 * N:

        # Choose two random nodes
        index = np.random.choice(len(r), p=P)
        i, j = tuple(r[index])

        # If they are connected by a reaction and both
        if ((i, j) in G) and (x[i] > 0) and (x[j] > 0):
            time += 1
            l = G[(i, j)]
            x[i] -= 1
            x[l] += 1

        # Every D iterations, add a nutrient molecule
        if time % D == 0:
            x[0] += 1
            leaking_out = x[0] / np.sum(x)
            if np.random.random() < leaking_out:
                x[0] -= 1

        P = x[r[:,0]] * x[r[:,1]]
        P = P / P.sum()
    x = x // np.random.randint(2, 10)
```



$$k = 10^3, N = 10^4, \rho = 0.11$$