

Homework 1

Course: FFR120 - Simulation of Complex Systems

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Assignment: Homework 1 - Option 4

```
In [1]: %matplotlib notebook

import numpy as np
import matplotlib.pyplot as plt
import matplotlib.animation as anim
```

```
In [2]: rng = np.random.default_rng()
save_file = True
framerate_fast = 10
framerate_medium = 5
framerate_slow = 2
gif_writer_fast = anim.PillowWriter(fps=framerate_fast)
gif_writer_medium = anim.PillowWriter(fps=framerate_medium)
gif_writer_slow = anim.PillowWriter(fps=framerate_slow)
```

Exercise 4.1

```
In [3]: import math

def decimal_to_binary_array(dec, width):
    if width is None:
        if dec == 0:
            width = 1
        else:
            width = 1 + math.floor(math.log2(dec))

    array = np.zeros(shape=(width,), dtype='uint8')

    for i in range(width-1, -1, -1):
        dec, array[i] = divmod(dec, 2)

    return array
```

```
In [4]: def create_parent_generation(n_cells, rule_nr, rng):
    if rule_nr in (90, 30):
        parent_generation = np.zeros((n_cells,))
        parent_generation[n_cells//2] = 1

    else:
        parent_generation = rng.integers(0, 2, size=(n_cells,))

    return parent_generation

def create_grid_1d(rule_nr, n_cells, n_generations, rng):
    grid = np.zeros(shape=(n_generations, n_cells), dtype='uint8')
    grid[0, :] = create_parent_generation(n_cells, rule_nr, rng)
    return grid
```

```

def decode_1d_rule(rule_number):
    binary_numbers = [
        (1, 1, 1), (1, 1, 0), (1, 0, 1), (1, 0, 0),
        (0, 1, 1), (0, 1, 0), (0, 0, 1), (0, 0, 0)
    ]

    rule = dict()
    num = rule_number
    for i in range(8):
        num, rem = divmod(num, 2)
        rule[binary_numbers[-i-1]] = rem

    return rule

def update_grid_1d(grid, n_cells, rules, rng):
    grid = np.roll(grid, 1, 0)
    for i in range(1, n_cells-1):
        pattern = grid[1, i-1:i+2]
        grid[0, i] = rules[tuple(pattern)]

    left_pattern = np.zeros(shape=(3,))
    left_pattern[0] = grid[1, -1]
    left_pattern[1:] = grid[1, :2]

    right_pattern = np.zeros(shape=(3,))
    right_pattern[-1] = grid[1, 0]
    right_pattern[:2] = grid[1, -2:]

    grid[0, 0] = rules[tuple(left_pattern)]
    grid[0, -1] = rules[tuple(right_pattern)]

    return grid

```

```

In [5]: def run_simulation_1d(n_cells, n_generations, rule_nr, rng):
    rules = decode_1d_rule(rule_number=rule_nr)
    grid = create_grid_1d(rule_nr, n_cells, n_generations, rng)
    history = []

    for gen in range(n_generations):
        grid = update_grid_1d(grid, n_cells, rules, rng)
        history.append(grid)

    return history

```

```

In [6]: def render_grid(time, history, img):
    img.set_array(history[time])
    return img,

def create_animation(history, framerate):
    fig = plt.figure()
    img = plt.imshow(history[0], interpolation='none', animated=True)
    animation = anim.FuncAnimation(fig=fig, func=render_grid, frames=len(history), inter
    return animation

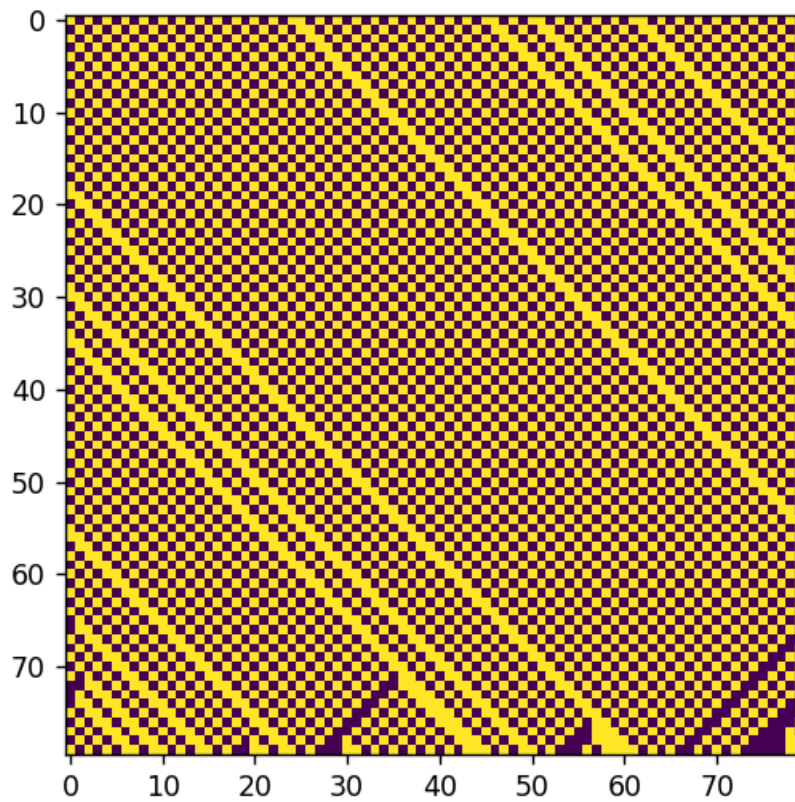
def animate_simulation(name, history, framerate, writer, save_file):
    animation = create_animation(history, framerate)
    if save_file:
        animation.save(f"./gifs/{name}.gif", writer=writer)

    return animation

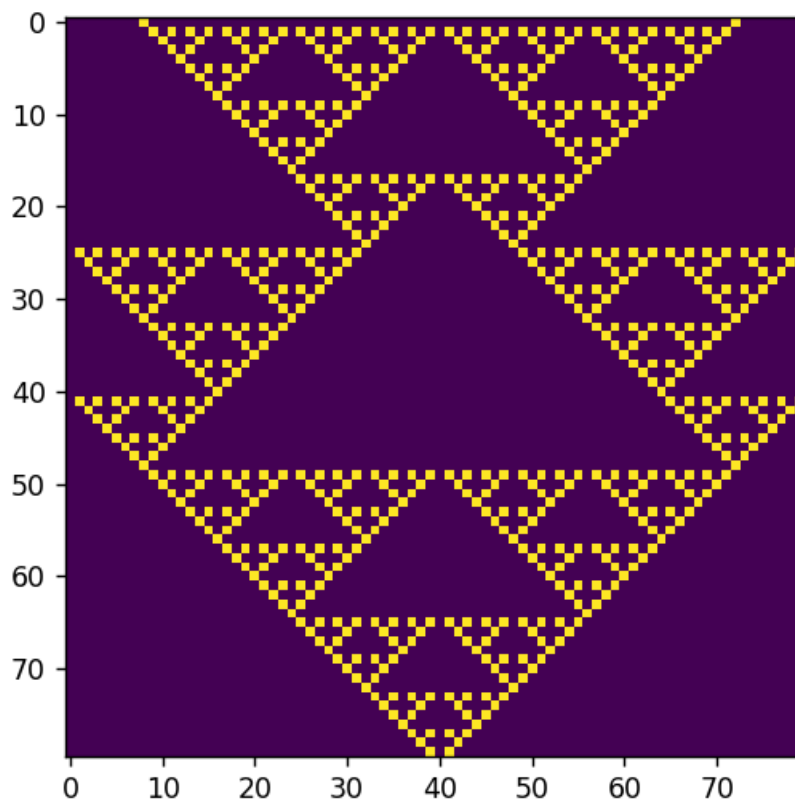
```

```
In [7]: n_cells = 80  
        n_generations = 80
```

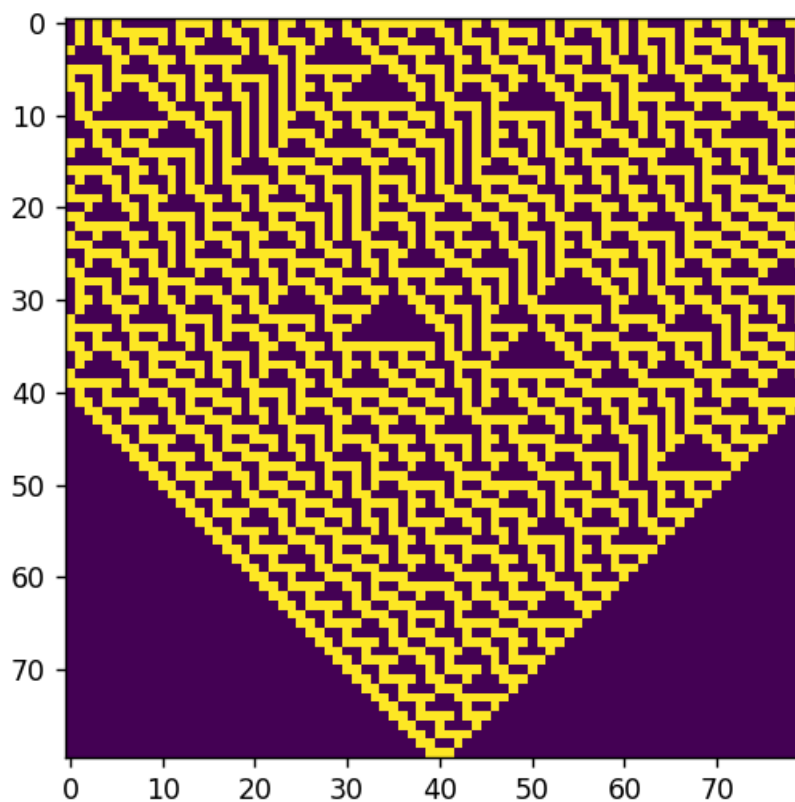
```
In [8]: history_184 = run_simulation_1d(n_cells, n_generations, 184, rng)  
        animation_184 = animate_simulation("evolution-184", history_184, framerate_fast, gif_wri
```



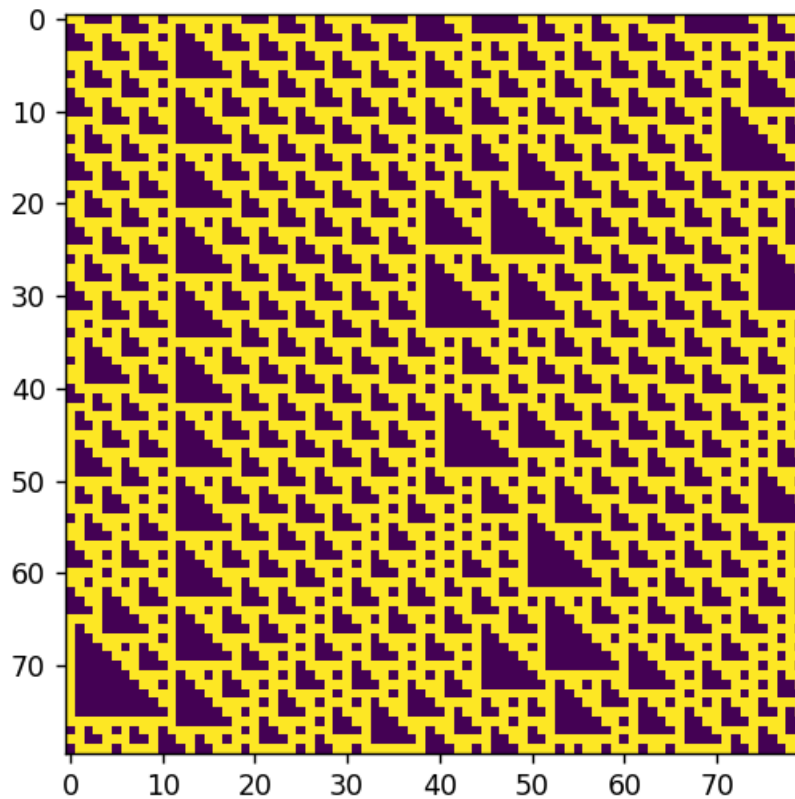
```
In [9]: history_90 = run_simulation_1d(n_cells, n_generations, 90, rng)  
        animation_90 = animate_simulation("evolution-90", history_90, framerate_fast, gif_writer
```



```
In [10]: history_30 = run_simulation_1d(n_cells, n_generations, 30, rng)
         animation_30 = animate_simulation("evolution-30", history_30, framerate_fast, gif_writer,
```

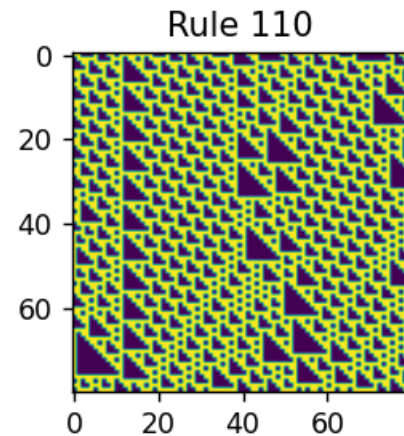
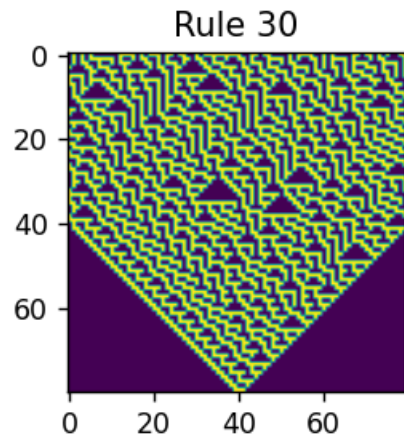
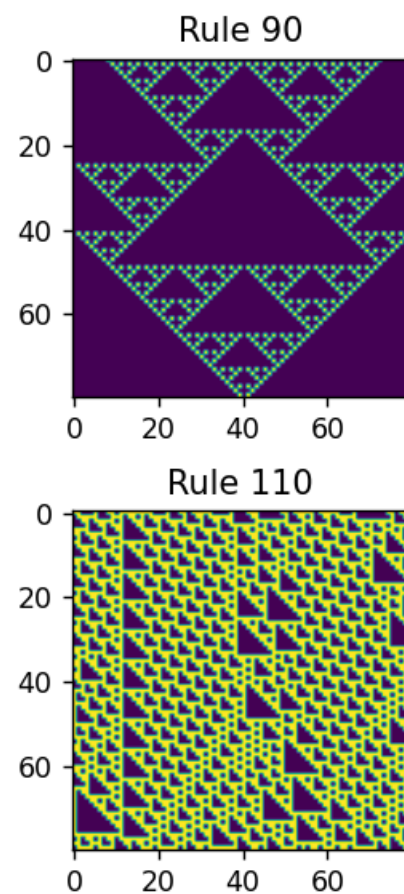
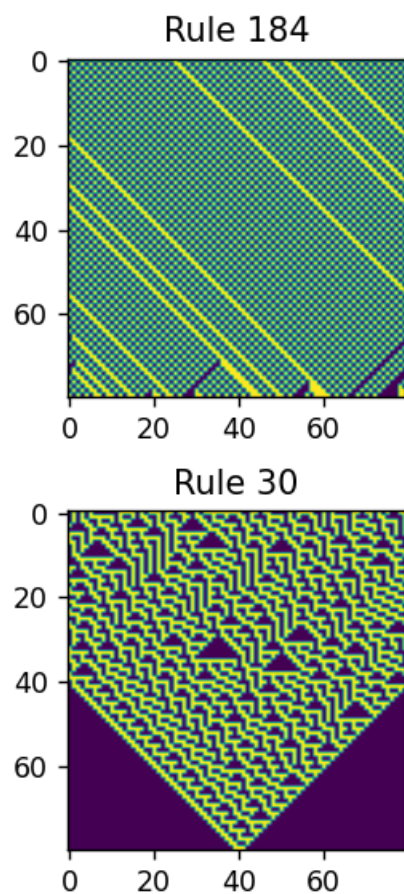


```
In [11]: history_110 = run_simulation_1d(n_cells, n_generations, 110, rng)
animation_110 = animate_simulation("evolution-110", history_110, framerate_fast, gif_wri
```



```
In [12]: fig, axes = plt.subplots(2, 2)
histories = [history_184, history_90, history_30, history_110]
plt_names = ["Rule 184", "Rule 90", "Rule 30", "Rule 110"]
fig.tight_layout(pad=2)

for hist, ax, name in zip(histories, axes.flatten(), plt_names):
    ax.imshow(hist[-1])
    ax.set_title(name)
```



Exercise 4.2

```
In [13]: def create_grid(grid_size, rng):
    return rng.integers(0, 2, size=grid_size)

def enough_nbs_to_live(value, n_nbs):
    return n_nbs == 3 or (n_nbs == 2 and value)

def count_nbs(grid, grid_size, is_periodic_boundary):
    h, w = grid_size
    counts = np.zeros(shape=grid_size, dtype='uint8')

    if is_periodic_boundary:
        for y in range(h):
            for x in range(w):
                n_nbs = 0
                for nb_y in range(y-1, y+2):
                    nb_ym = nb_y % h
                    for nb_x in range(x-1, x+2):
                        nb_xm = nb_x % w
                        n_nbs += grid[nb_ym, nb_xm]

                counts[y, x] = n_nbs - grid[y, x]

    else:
        for y in range(h):
            for x in range(w):
                n_nbs = 0
                for nb_y in range(max(y-1, 0), min(y+2, h)):
                    for nb_x in range(max(x-1, 0), min(x+2, w)):
```

```

        n_nbs += grid[nb_y, nb_x]

    counts[y, x] = n_nbs - grid[y, x]

    return counts

def calculate_new_gen(grid, counts, rule_set=None):
    if rule_set is None:
        return ((counts==3) | ((counts==2) & (grid==1))).astype('uint8')

    else:
        new_grid = np.zeros(shape=grid.shape, dtype='uint8')

        for y in range(grid.shape[0]):
            for x in range(grid.shape[1]):
                new_grid[y, x] = rule_set[grid[y, x], counts[y, x]]

        return new_grid

def update_grid(grid, grid_size, is_periodic_boundary, rule_set=None):
    counts = count_nbs(grid, grid_size, is_periodic_boundary)
    new_gen = calculate_new_gen(grid, counts, rule_set=rule_set)

    return new_gen

def run_simulation(initial_grid, n_generations, is_periodic_boundary, rule_set=None):
    grid_size = initial_grid.shape
    grid = initial_grid
    history = [grid]

    for gen in range(1, n_generations):
        grid = update_grid(grid, grid_size, is_periodic_boundary, rule_set=rule_set)
        history.append(grid)

    return history

```

```

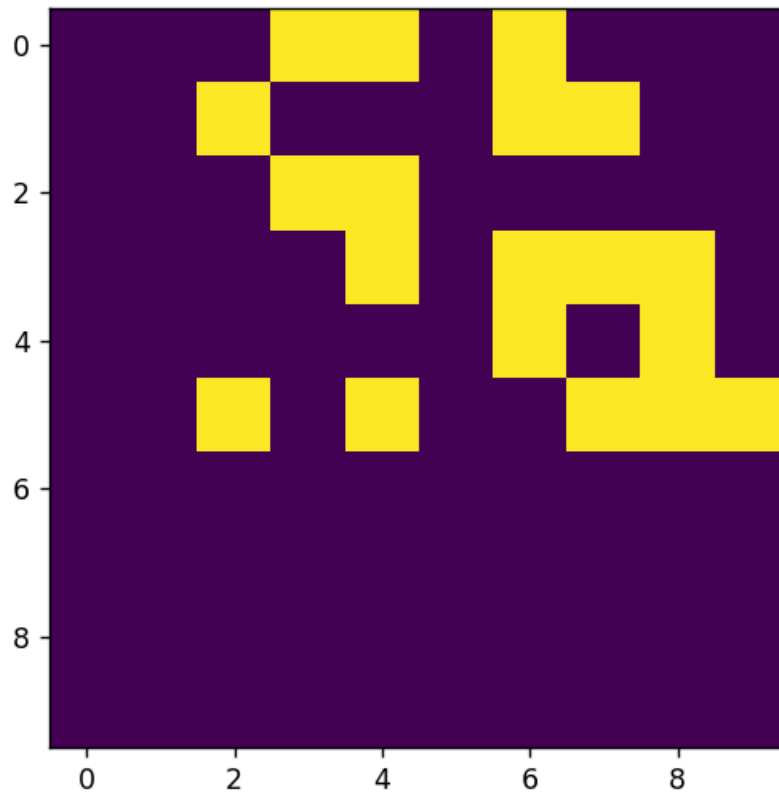
In [14]: grid_size = 10, 10
         n_generations = 20
         initial_grid = create_grid(grid_size, rng)

```

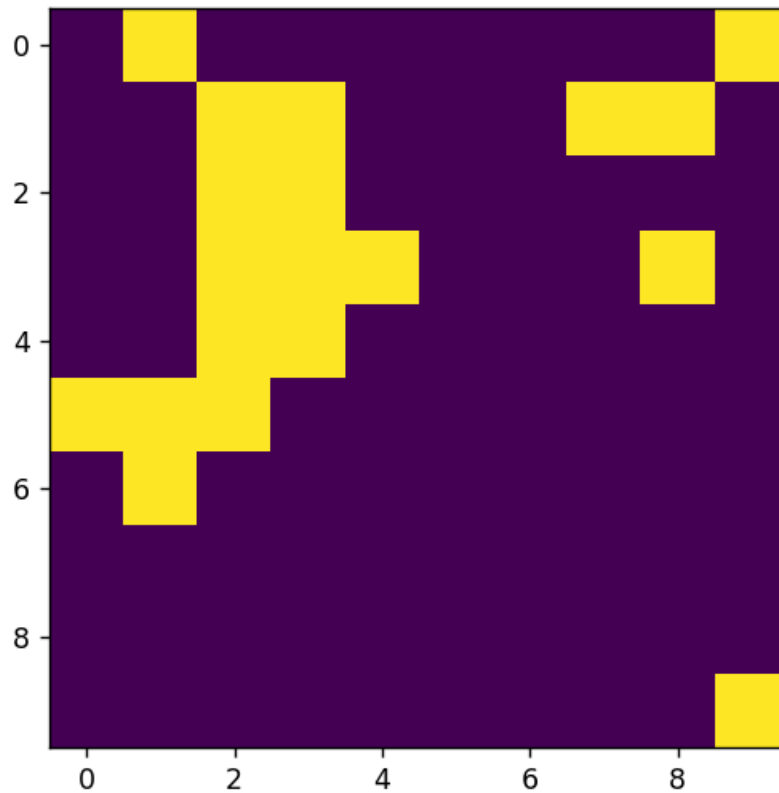
```

In [15]: history_nonperiodic = run_simulation(initial_grid, n_generations, is_periodic_boundary=False)
         animation_nonperiodic = animate_simulation(
             "evolution-nonperiodic", history_nonperiodic, framerate_medium, gif_writer_medium, s
         )

```



```
In [16]: history_periodic = run_simulation(initial_grid, n_generations, is_periodic_boundary=True)
         animation_periodic = animate_simulation(
             "evolution-periodic", history_periodic, framerate_medium, gif_writer_medium, save_fi
         )
```

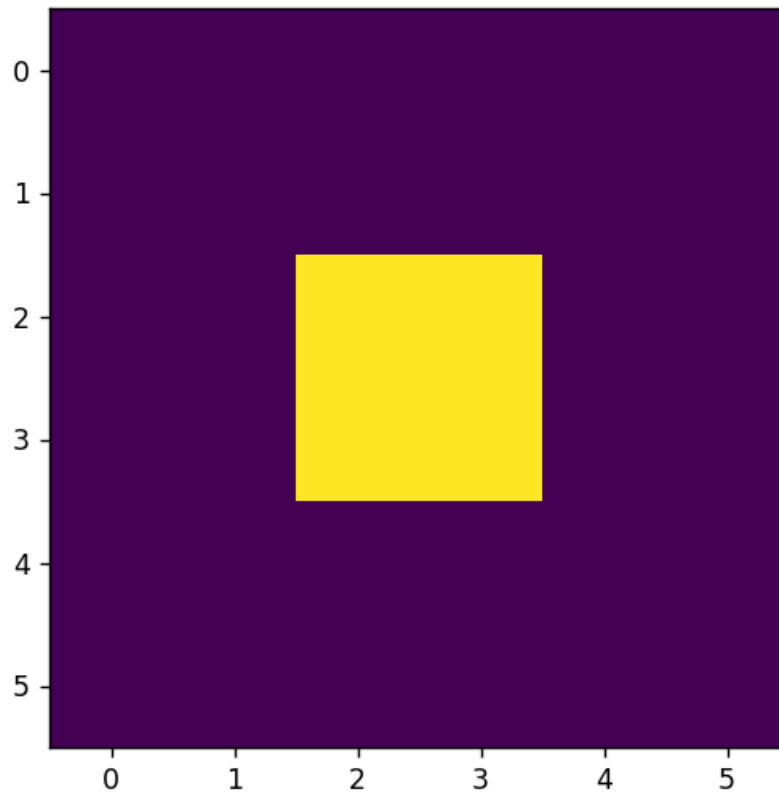



Exercise 4.3

```
In [17]: def simulate_block():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 1, 0, 0],
        [0, 0, 1, 1, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 2, False)

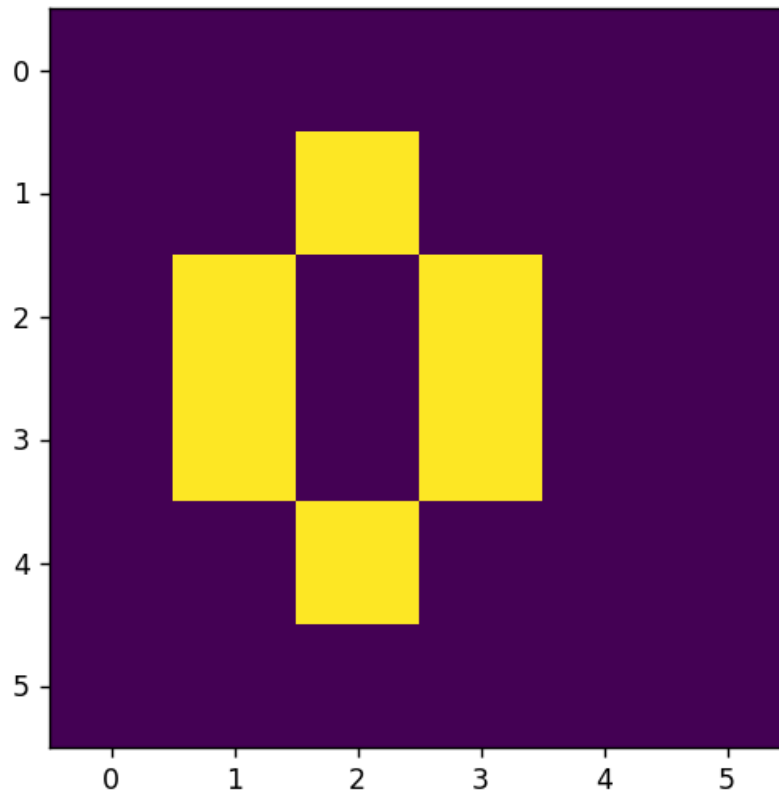
history_block = simulate_block()
animation_block = animate_simulation(
    "animation_block", history_block, framerate_medium, gif_writer_medium, save_file
)
```



```
In [18]: def simulate_beehive():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 1, 0, 1, 0, 0],
        [0, 1, 0, 1, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 2, False)

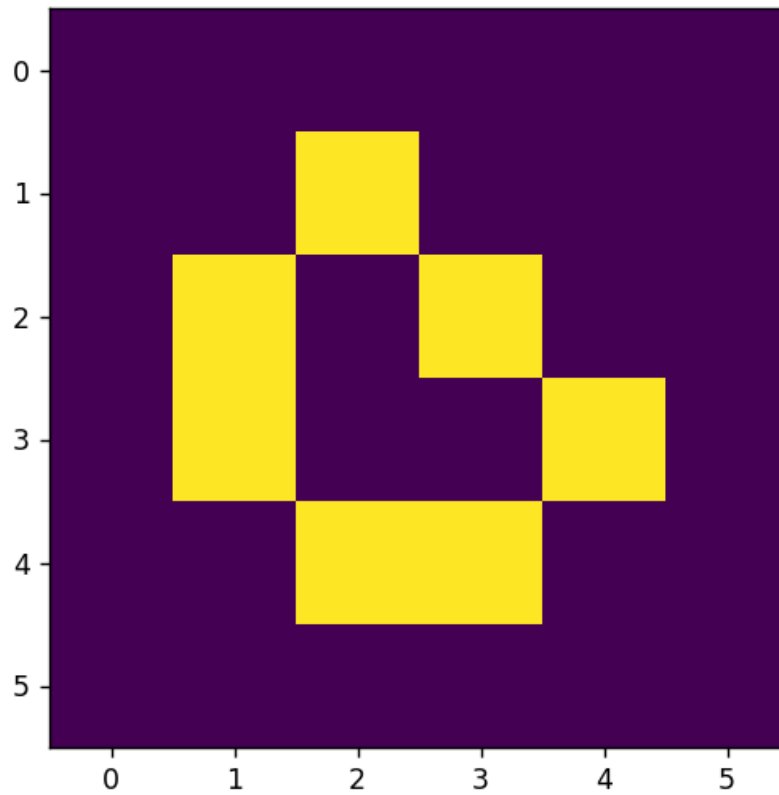
history_beehive = simulate_beehive()
animation_beehive = animate_simulation(
    "animation_beehive", history_beehive, framerate_medium, gif_writer_medium, save_file
)
```



```
In [19]: def simulate_loaf():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 1, 0, 1, 0, 0],
        [0, 1, 0, 0, 1, 0],
        [0, 0, 1, 1, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 2, False)

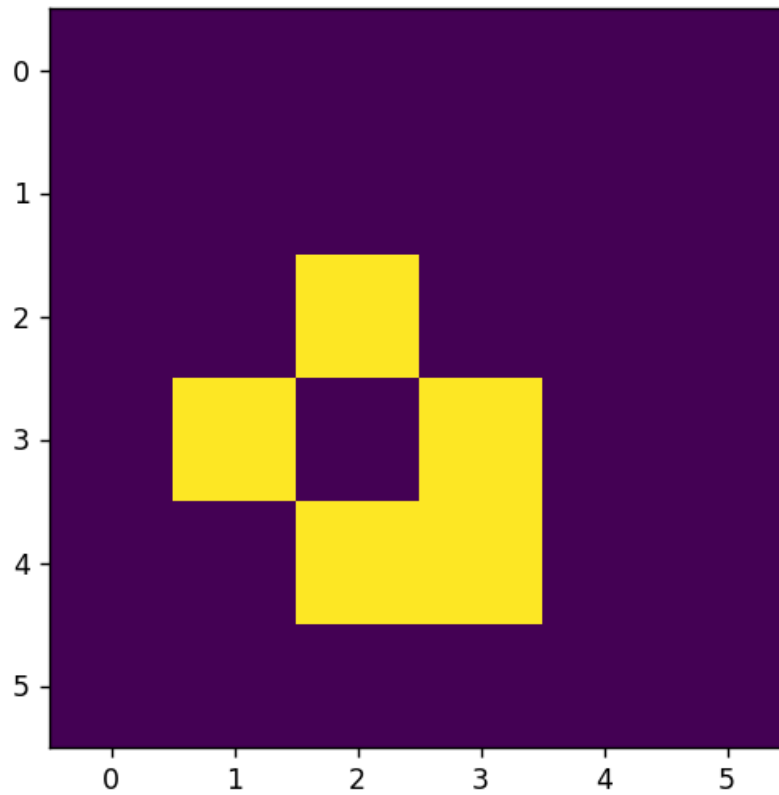
history_loaf = simulate_loaf()
animation_loaf = animate_simulation(
    "animation_loaf", history_loaf, framerate_medium, gif_writer_medium, save_file
)
```



```
In [20]: def simulate_boat():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 1, 0, 1, 0, 0],
        [0, 0, 1, 1, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 2, False)

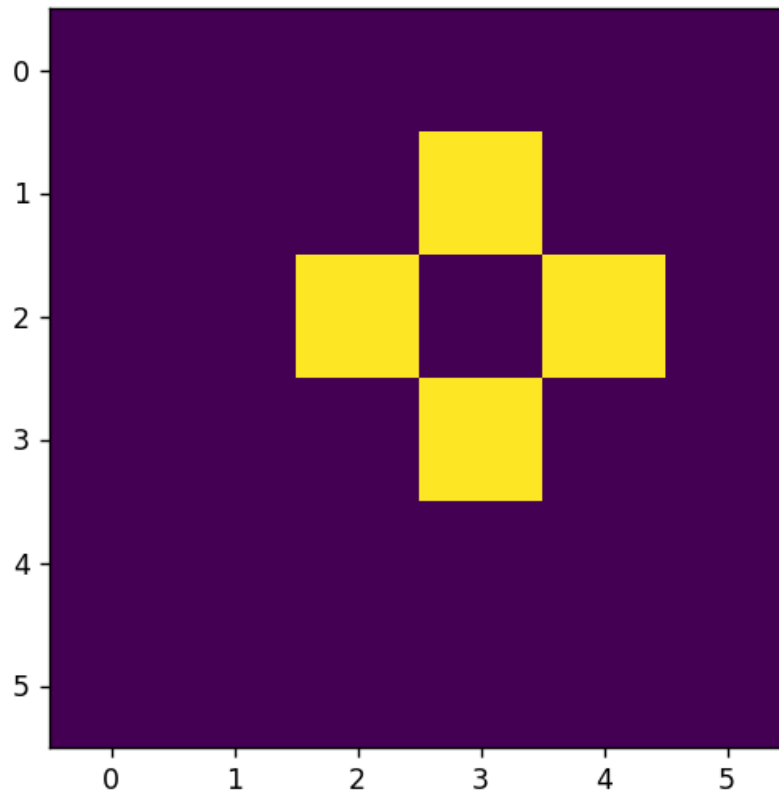
history_boat = simulate_boat()
animation_boat = animate_simulation(
    "animation_boat", history_boat, framerate_medium, gif_writer_medium, save_file
)
```



```
In [21]: def simulate_tub():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 1, 0, 0],
        [0, 0, 1, 0, 1, 0],
        [0, 0, 0, 1, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 2, False)

history_tub = simulate_tub()
animation_tub = animate_simulation(
    "animation_tub", history_tub, framerate_medium, gif_writer_medium, save_file
)
```

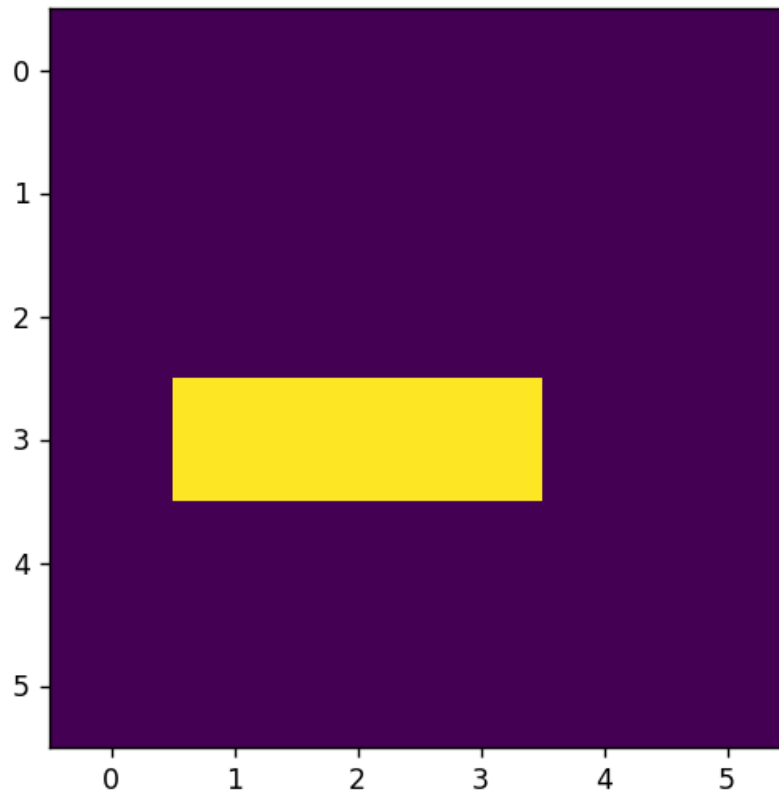


Exercise 4.4

```
In [22]: def simulate_blinker():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 4, False)

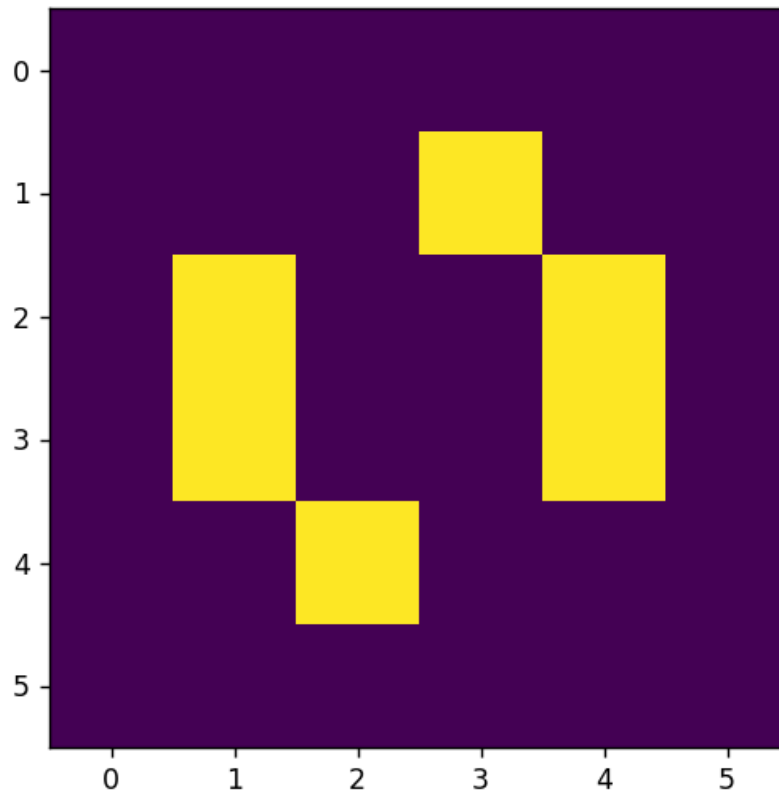
history_blinker = simulate_blinker()
animation_blinker = animate_simulation(
    "animation_blinker", history_blinker, framerate_medium, gif_writer_medium, save_file
)
```



```
In [23]: def simulate_toad():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 1, 1, 1, 0],
        [0, 1, 1, 1, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 4, False)

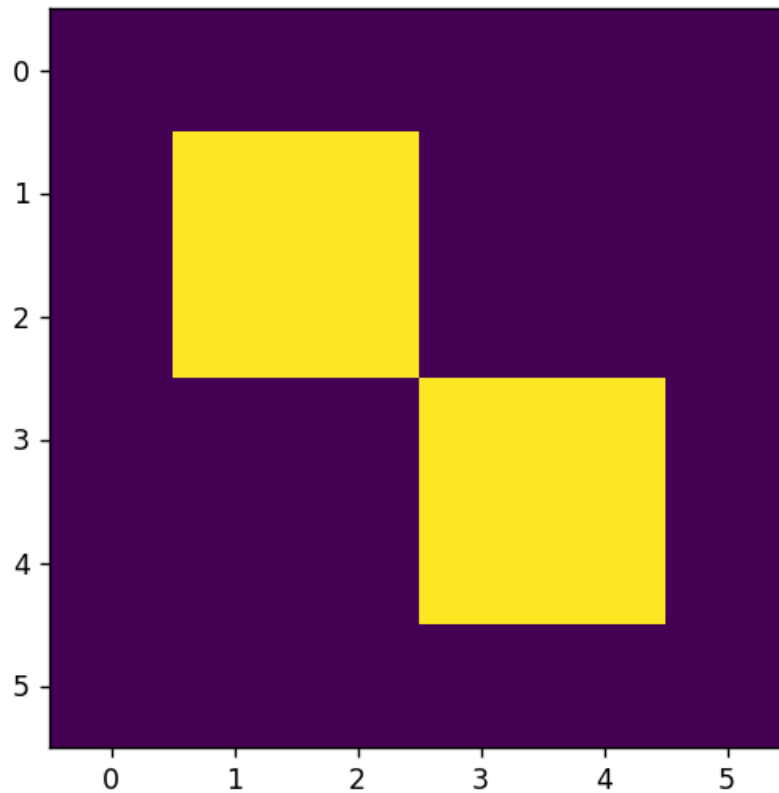
history_toad = simulate_toad()
animation_toad = animate_simulation(
    "animation_toad", history_toad, framerate_medium, gif_writer_medium, save_file
)
```



```
In [24]: def simulate_beacon():
        grid = np.array([
            [0, 0, 0, 0, 0, 0],
            [0, 1, 1, 0, 0, 0],
            [0, 1, 0, 0, 0, 0],
            [0, 0, 0, 0, 1, 0],
            [0, 0, 0, 1, 1, 0],
            [0, 0, 0, 0, 0, 0],
        ], dtype='uint8')

        return run_simulation(grid, 4, False)

history_beacon = simulate_beacon()
animation_beacon = animate_simulation(
    "animation_beacon", history_beacon, framerate_medium, gif_writer_medium, save_file
)
```

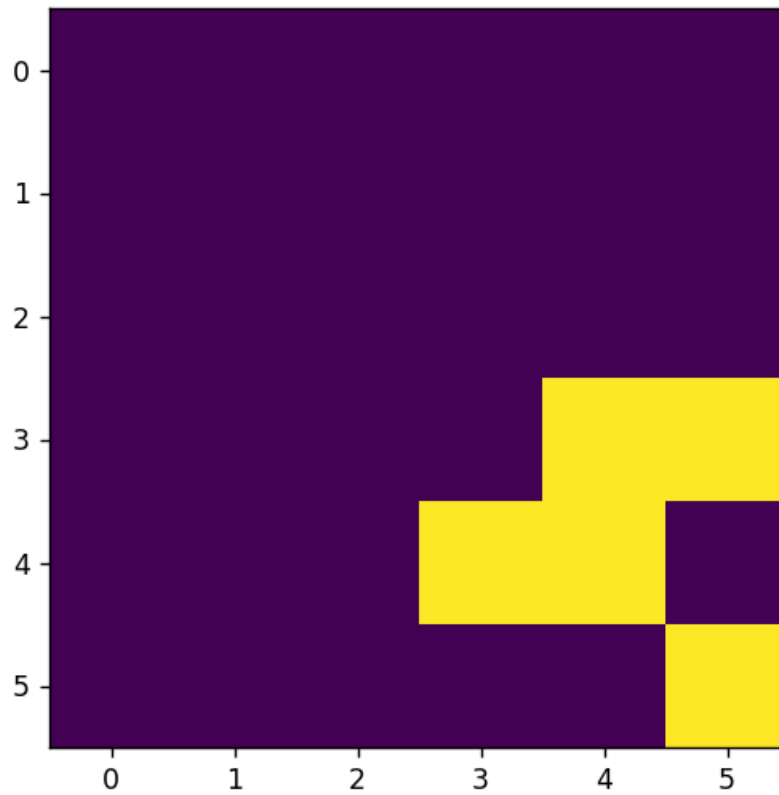



Exercise 4.5

```
In [25]: def simulate_glider_1():
        grid = np.array([
            [0, 0, 0, 0, 0, 0],
            [0, 0, 0, 0, 0, 0],
            [0, 0, 0, 0, 0, 0],
            [0, 0, 0, 1, 1, 1],
            [0, 0, 0, 1, 0, 0],
            [0, 0, 0, 0, 1, 0],
        ], dtype='uint8')

        return run_simulation(grid, 24, True)

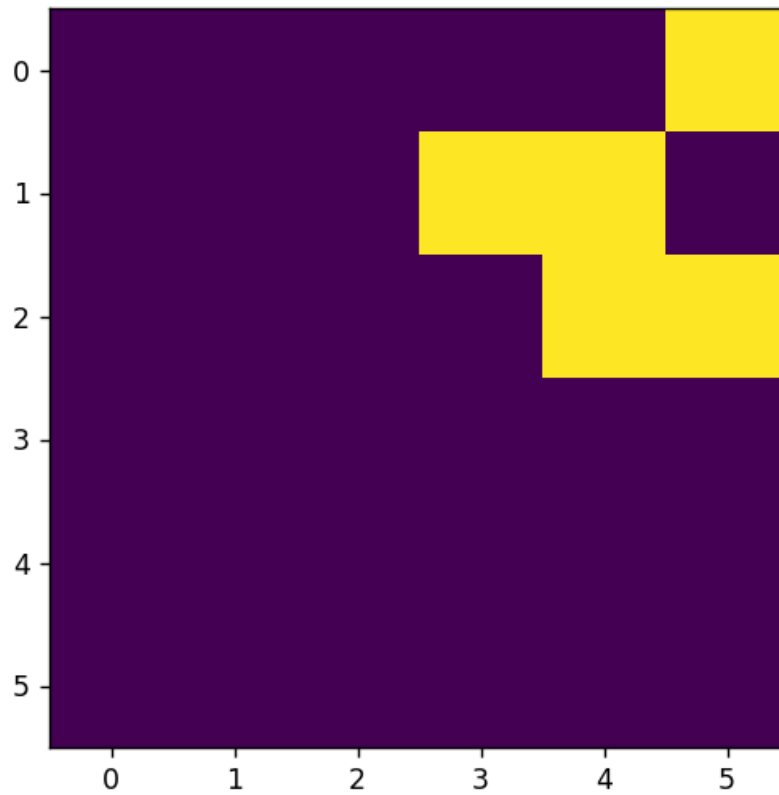
history_glider_1 = simulate_glider_1()
animation_glider_1 = animate_simulation(
    "animation_glider_1", history_glider_1, framerate_medium, gif_writer_medium, save_fi
)
```



```
In [26]: def simulate_glider_2():
    grid = np.array([
        [0, 0, 0, 0, 1, 0],
        [0, 0, 0, 1, 0, 0],
        [0, 0, 0, 1, 1, 1],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 24, True)

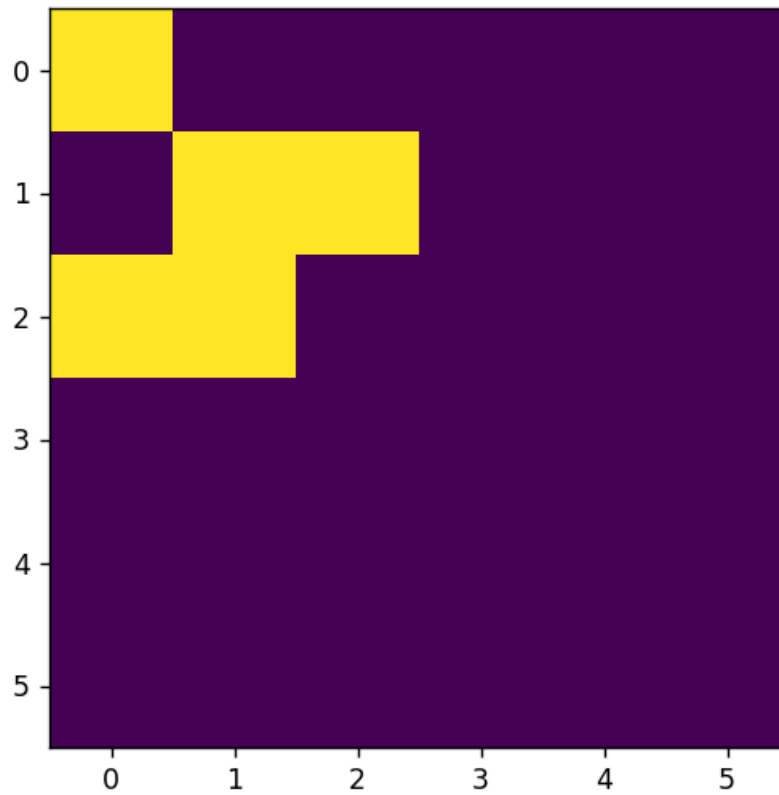
history_glider_2 = simulate_glider_2()
animation_glider_2 = animate_simulation(
    "animation_glider_2", history_glider_2, framerate_medium, gif_writer_medium, save_fi
)
```



```
In [27]: def simulate_glider_3():
    grid = np.array([
        [0, 1, 0, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [1, 1, 1, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 24, True)

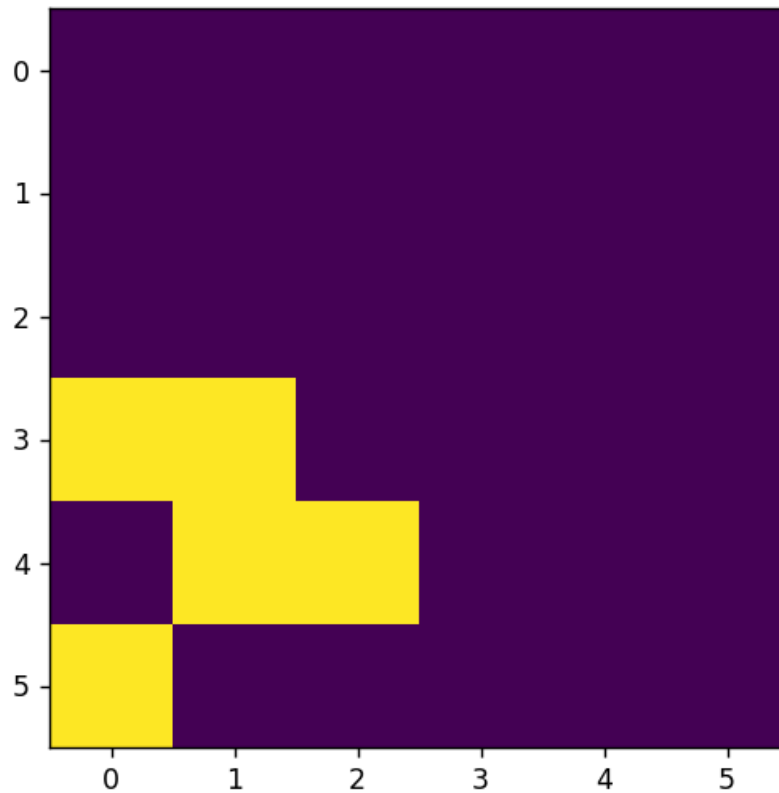
history_glider_3 = simulate_glider_3()
animation_glider_3 = animate_simulation(
    "animation_glider_3", history_glider_3, framerate_medium, gif_writer_medium, save_fi
)
```



```
In [28]: def simulate_glider_4():
    grid = np.array([
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [0, 0, 0, 0, 0, 0],
        [1, 1, 1, 0, 0, 0],
        [0, 0, 1, 0, 0, 0],
        [0, 1, 0, 0, 0, 0],
    ], dtype='uint8')

    return run_simulation(grid, 24, True)

history_glider_4 = simulate_glider_4()
animation_glider_4 = animate_simulation(
    "animation_glider_4", history_glider_4, framerate_medium, gif_writer_medium, save_fi
)
```



Exercise 4.6

```
In [29]: def generate_config(rng, config_size):
    config_h, config_w = config_size
    inner_size = (config_h - 2, config_w - 2)
    max_seed = inner_size[0] * inner_size[1]

    config_seed = rng.integers(1, 2**max_seed)
    inner_config = decimal_to_binary_array(config_seed, width=max_seed).reshape(inner_si

    config = np.zeros(shape=config_size)
    config[1:-1, 1:-1] = inner_config

    return config

def find_pattern_in_grid(rng, config_size, max_gen, rule_set=None):
    config = generate_config(rng, config_size)

    grid_size = (3*config_size[0], 3*config_size[1])
    grid = np.zeros(shape=grid_size, dtype='uint8')
    start_pos = config_size
    grid[start_pos[0]:start_pos[0]+config_size[0],
          start_pos[1]:start_pos[1]+config_size[1]] = config

    initial_grid = grid

    for gen in range(1, max_gen):
        grid = update_grid(grid, grid_size, False, rule_set)

        pos = find_config_shift(grid, config, config_size)
```

```

        if pos:
            shift = (pos[0]-start_pos[0], pos[1]-start_pos[1])
            return gen, shift, config, initial_grid, grid

    return None

def shift_config(grid, config_pos, config_size, shift):
    y, x = config_pos
    h, w = config_size
    dy, dx = shift
    config = grid[y:y+h, x:x+w]

    grid[y:y+h, x:x+w] = 0
    grid[y+dy:y+dy+h, x+dx:x+dx+w] = config

    return grid

def find_config_shift(grid, config, config_size):
    h, w = config_size

    for y in range(0, 2*h):
        for x in range(0, 2*w):
            if np.array_equal(grid[y:y+h, x:x+w], config):
                return y, x

    return None

```

```

In [30]: i_still = 0
         i_oscillator = 1
         i_glider = 2

def find_patterns(rng, n_tries, config_size, max_gen, rule_set=None):
    found_patterns = [[], [], []]
    found_identifiers = set()

    n_counts = [0, 0, 0]
    n_unique = [0, 0, 0]

    print("Looking for patterns...")
    for t in range(n_tries):
        if t%100 == 0:
            print(f"{t}/{n_tries}, counts={n_counts}, unique={n_unique}")

        found_info = find_pattern_in_grid(rng, config_size, max_gen, rule_set=rule_set)

        if found_info:
            gen, shift, *_ = found_info

            if shift != (0, 0):
                index = i_glider
            elif gen == 1:
                index = i_still
            else:
                index = i_oscillator

            n_counts[index] += 1

            identifier = (gen, shift)
            if identifier in found_identifiers:
                continue
            else:
                found_identifiers.add(identifier)

```

```

        n_unique[index] += 1
        found_patterns[index].append(found_info)

    if len(found_patterns) == 0:
        print("No pattern found")
    else:
        print(f"Finished! Found {len(found_patterns[i_still])} still-lives, "
              f"{len(found_patterns[i_oscillator])} oscillators, and "
              f"{len(found_patterns[i_glider])} gliders.")

        print()
        print(f"Probability of still life: {n_counts[0] / n_tries}")
        print(f"Probability of oscillator: {n_counts[1] / n_tries}")
        print(f"Probability of glider: {n_counts[2] / n_tries}")
        print()
        print(f"Probability of unique: {sum(n_unique) / n_tries}")
        print(f"Probability of duplicate: {(sum(n_counts)-sum(n_unique))/n_tries}")

    return found_patterns, n_counts, n_unique

```

```

In [31]: n_tries = 1000
        config_size = 5, 5
        max_gen = 8

        found_patterns, n_counts, n_unique = find_patterns(rng, n_tries, config_size, max_gen)

        Looking for patterns...
        0/1000, counts=[0, 0, 0], unique=[0, 0, 0]
        100/1000, counts=[3, 2, 3], unique=[1, 1, 2]
        200/1000, counts=[5, 3, 7], unique=[1, 1, 4]
        300/1000, counts=[8, 5, 11], unique=[1, 1, 4]
        400/1000, counts=[12, 8, 15], unique=[1, 1, 4]
        500/1000, counts=[13, 8, 18], unique=[1, 1, 4]
        600/1000, counts=[14, 9, 22], unique=[1, 1, 4]
        700/1000, counts=[15, 9, 24], unique=[1, 1, 4]
        800/1000, counts=[16, 9, 26], unique=[1, 1, 4]
        900/1000, counts=[19, 12, 30], unique=[1, 1, 4]
        Finished! Found 1 still-lives, 1 oscillators, and 4 gliders.

        Probability of still life: 0.019
        Probability of oscillator: 0.012
        Probability of glider: 0.032

        Probability of unique: 0.006
        Probability of duplicate: 0.057

```

```

In [32]: def plot_found_patterns(found_patterns, max_of_each=None):
        mixed_patterns = (
            found_patterns[i_still][:max_of_each] +
            found_patterns[i_oscillator][:max_of_each] +
            found_patterns[i_glider][:max_of_each]
        )

        if not len(mixed_patterns):
            return

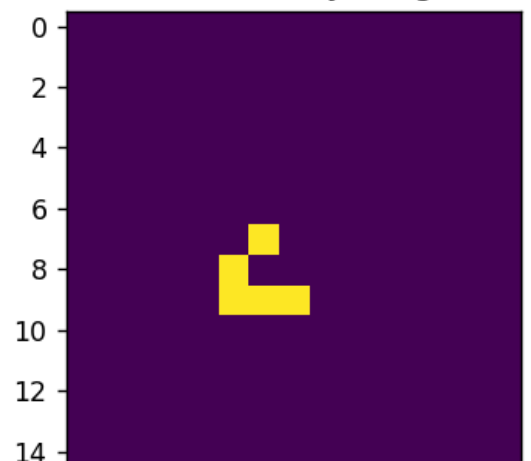
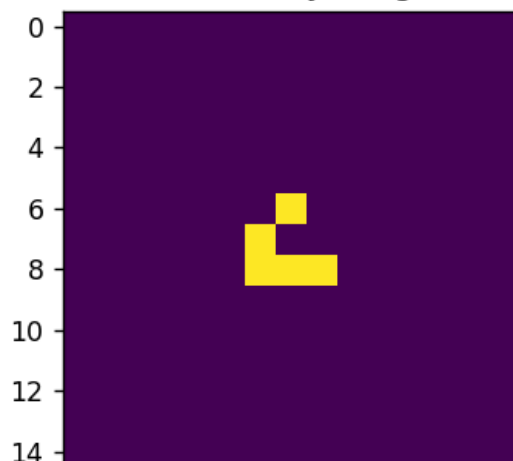
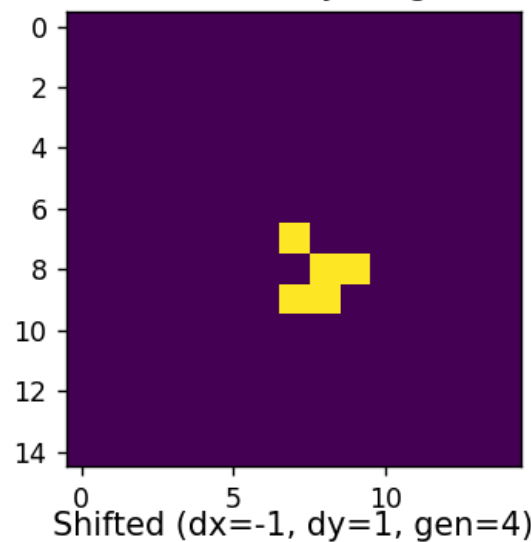
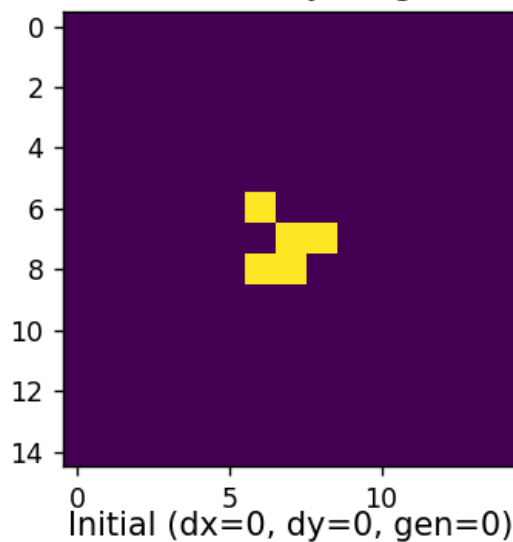
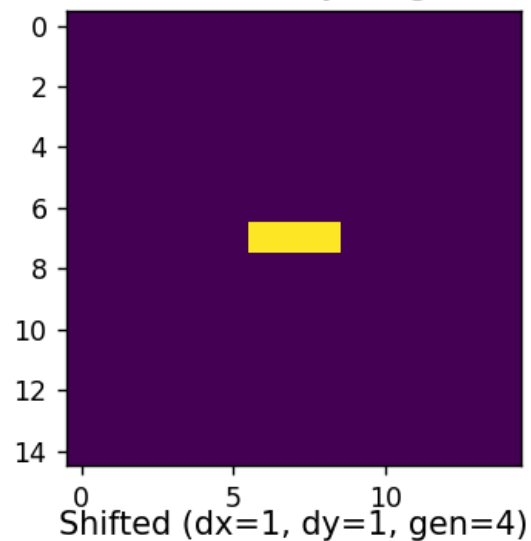
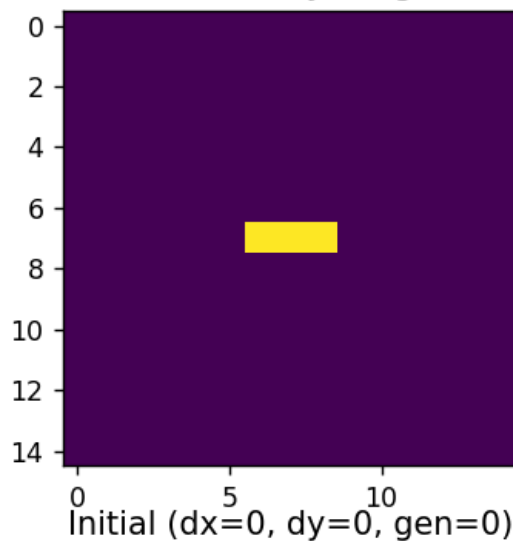
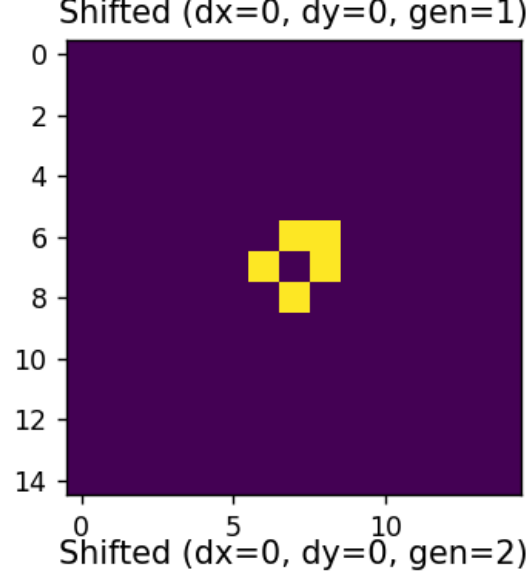
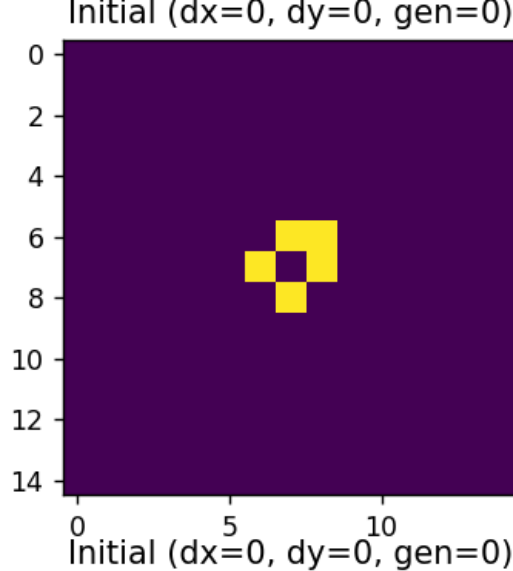
        fig, axes = plt.subplots(len(mixed_patterns), 2, figsize=(7, 17))
        fig.tight_layout()

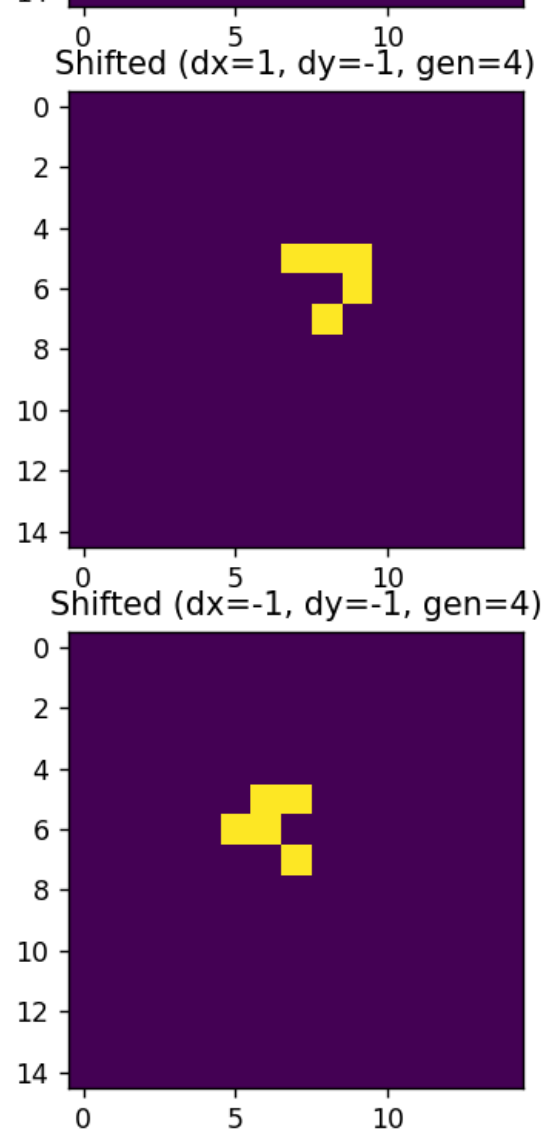
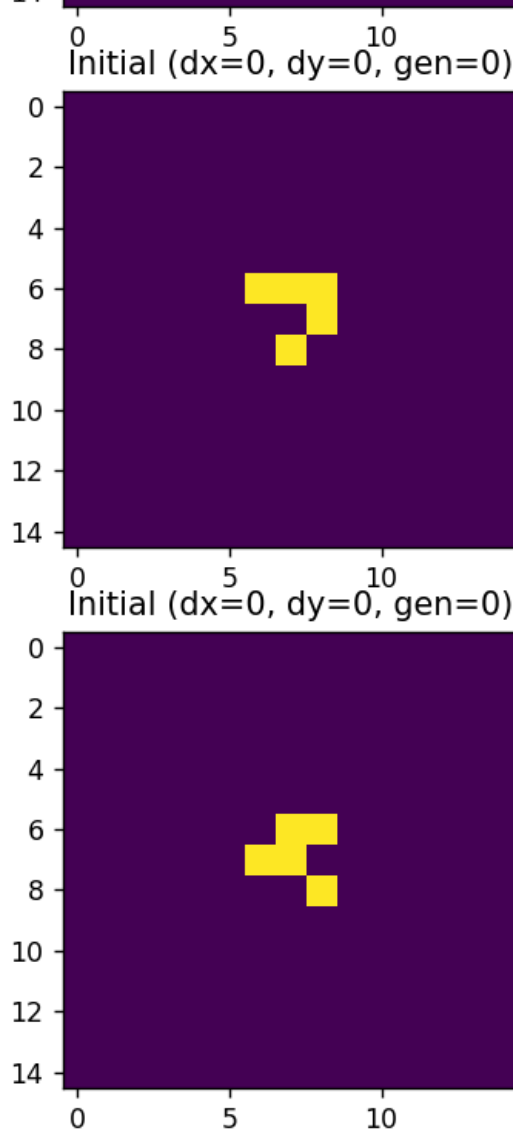
        for i, (gen, shift, config, initial_grid, grid) in enumerate(mixed_patterns):
            if axes.shape == (2,):
                ax1, ax2 = axes
            else:
                ax1, ax2 = axes[i, :]
            ax1.imshow(initial_grid)

```

```
ax1.set_title("Initial (dx=0, dy=0, gen=0)")
ax2.imshow(grid)
ax2.set_title(f"Shifted (dx={shift[1]}, dy={shift[0]}, gen={gen})")
```

```
In [33]: plot_found_patterns(found_patterns)
```



The function is quite inefficient for finding new patterns since it samples randomly, which results in many duplicates. A better way could be to only use unique seeds. Create a list of random and unique seeds and use every single one from it.

Exercise 4.7

```
In [34]: def generate_rule_set(rng, dead_seed, live_seed):
    rule_set = np.zeros((2, 9))

    rule_set[0] = (decimal_to_binary_array(dead_seed, 9)
                    if dead_seed
                    else rng.integers(0, 2, (9,)))

    rule_set[1] = (decimal_to_binary_array(live_seed, 9)
                    if live_seed
                    else rng.integers(0, 2, (9,)))

    return rng.integers(0, 2, (2, 9))
```

```
In [35]: rule_set = generate_rule_set(rng, 300, 250)
    n_tries = 1000
    config_size = 5, 5
    max_gen = 8
```

```
found_patterns, n_counts, n_unique = find_patterns(rng, n_tries, config_size, max_gen, r
plot_found_patterns(found_patterns)
```

Looking for patterns...

0/1000, counts=[0, 0, 0], unique=[0, 0, 0]

100/1000, counts=[0, 1, 44], unique=[0, 1, 10]

200/1000, counts=[0, 3, 90], unique=[0, 2, 10]

300/1000, counts=[0, 6, 130], unique=[0, 2, 10]

400/1000, counts=[0, 9, 180], unique=[0, 2, 10]

500/1000, counts=[0, 13, 213], unique=[0, 3, 10]

600/1000, counts=[0, 15, 257], unique=[0, 3, 10]

700/1000, counts=[0, 17, 299], unique=[0, 3, 10]

800/1000, counts=[0, 18, 347], unique=[0, 3, 10]

900/1000, counts=[0, 19, 389], unique=[0, 3, 10]

Finished! Found 0 still-lives, 3 oscillators, and 10 gliders.

Probability of still life: 0.0

Probability of oscillator: 0.022

Probability of glider: 0.432

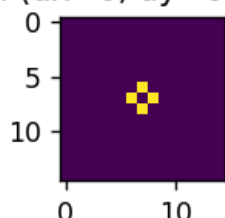
Probability of unique: 0.013

Probability of duplicate: 0.441

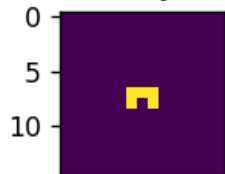
C:\Users\gaspa\AppData\Local\Temp\ipykernel_45900\2689297507.py:11: RuntimeWarning: More than 20 figures have been opened. Figures created through the pyplot interface (`matplotlib.pyplot.figure`) are retained until explicitly closed and may consume too much memory. (To control this warning, see the rcParam `figure.max_open_warning`).

fig, axes = plt.subplots(len(mixed_patterns), 2, figsize=(7, 17))

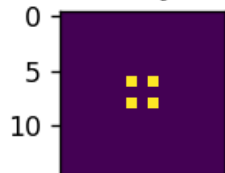
Initial (dx=0, dy=0, gen=0)



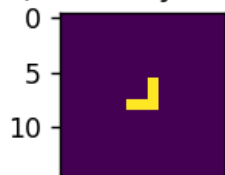
Initial (dx=0, dy=0, gen=0)



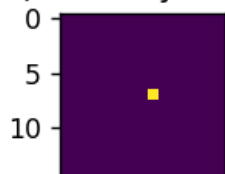
Initial (dx=0, dy=0, gen=0)



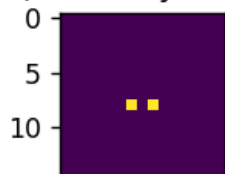
Initial (dx=0, dy=0, gen=0)



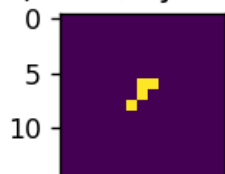
Initial (dx=0, dy=0, gen=0)



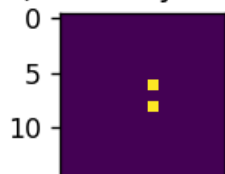
Initial (dx=0, dy=0, gen=0)



Initial (dx=0, dy=0, gen=0)



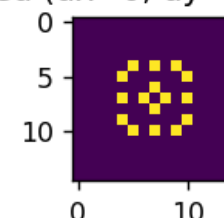
Initial (dx=0, dy=0, gen=0)



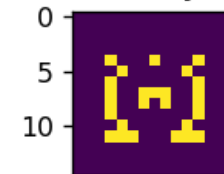
Initial (dx=0, dy=0, gen=0)



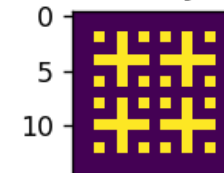
Shifted (dx=0, dy=0, gen=2)



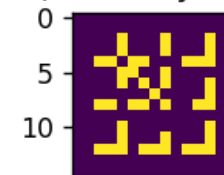
Shifted (dx=0, dy=0, gen=3)



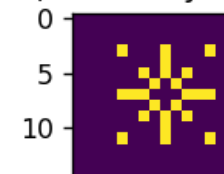
Shifted (dx=0, dy=0, gen=4)



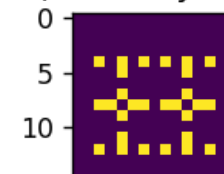
Shifted (dx=4, dy=-4, gen=4)



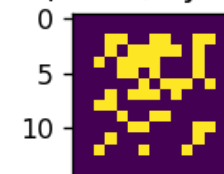
Shifted (dx=-4, dy=-4, gen=4)



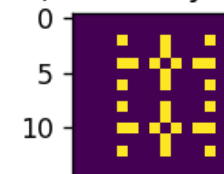
Shifted (dx=0, dy=-4, gen=4)



Shifted (dx=4, dy=4, gen=4)

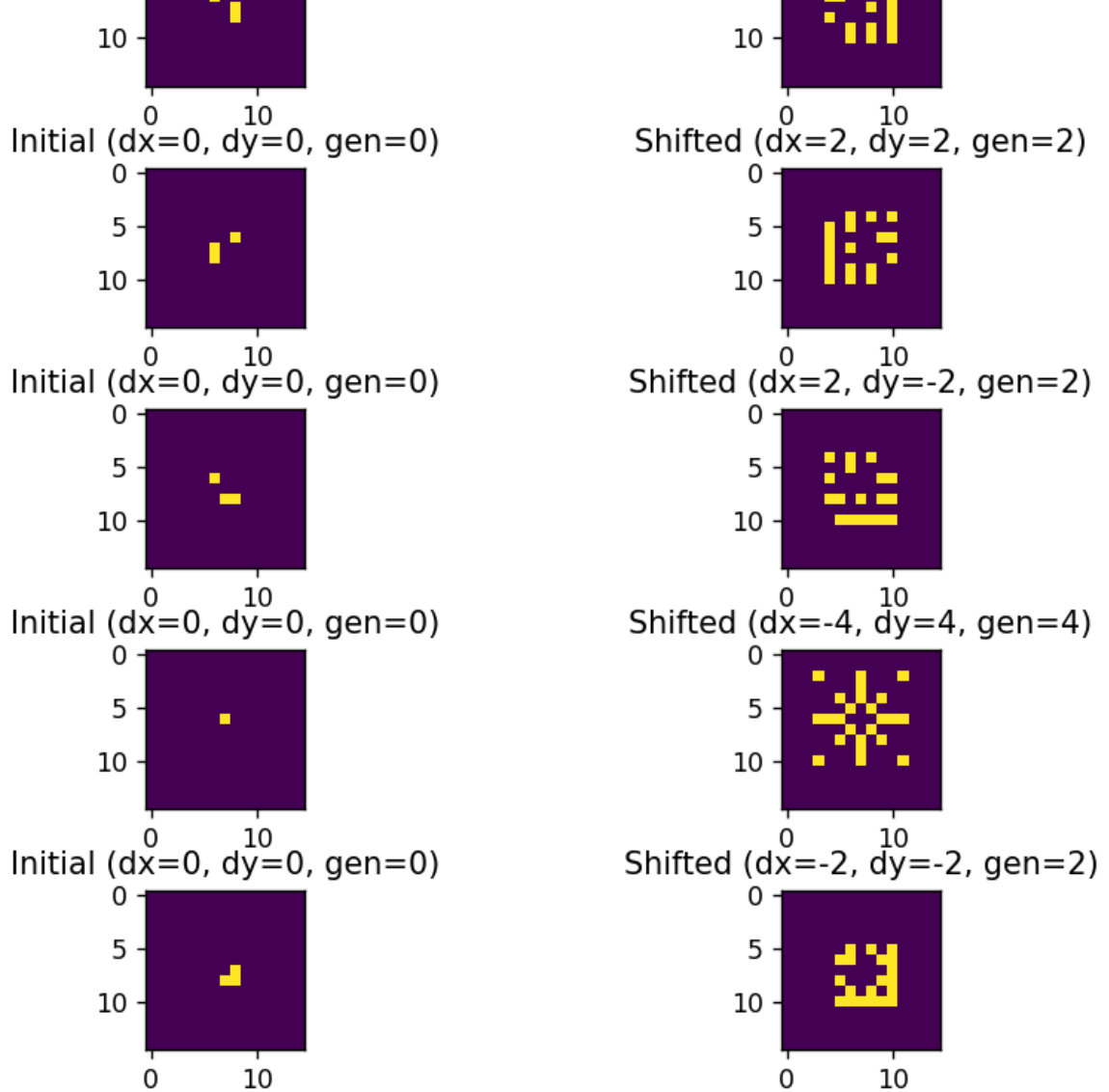


Shifted (dx=-4, dy=0, gen=4)



Shifted (dx=-2, dy=2, gen=2)





```
In [36]: rule_set = generate_rule_set(rng, 259, 421)
n_tries = 1000
config_size = 5, 5
max_gen = 8

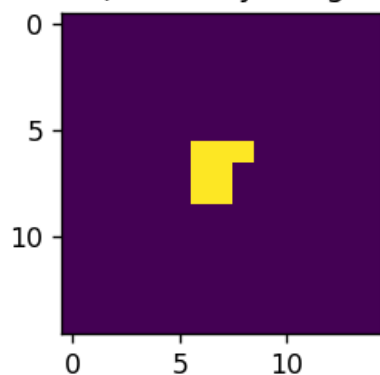
found_patterns, n_counts, n_unique = find_patterns(rng, n_tries, config_size, max_gen, r
plot_found_patterns(found_patterns)
```

```
Looking for patterns...
0/1000, counts=[0, 0, 0], unique=[0, 0, 0]
100/1000, counts=[0, 0, 11], unique=[0, 0, 4]
200/1000, counts=[0, 0, 22], unique=[0, 0, 6]
300/1000, counts=[0, 0, 28], unique=[0, 0, 7]
400/1000, counts=[0, 0, 36], unique=[0, 0, 7]
500/1000, counts=[0, 0, 48], unique=[0, 0, 7]
600/1000, counts=[0, 0, 57], unique=[0, 0, 8]
700/1000, counts=[0, 0, 64], unique=[0, 0, 8]
800/1000, counts=[0, 0, 72], unique=[0, 0, 8]
900/1000, counts=[0, 0, 78], unique=[0, 0, 8]
Finished! Found 0 still-lives, 0 oscillators, and 8 gliders.
```

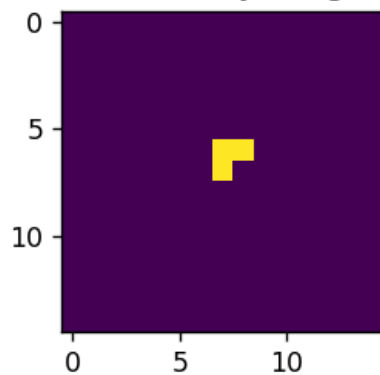
```
Probability of still life: 0.0
Probability of oscillator: 0.0
Probability of glider: 0.085
```

```
Probability of unique: 0.008
Probability of duplicate: 0.077
```

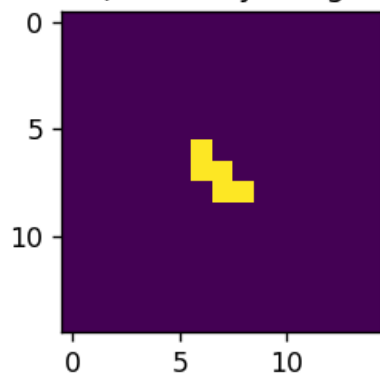
Initial (dx=0, dy=0, gen=0)



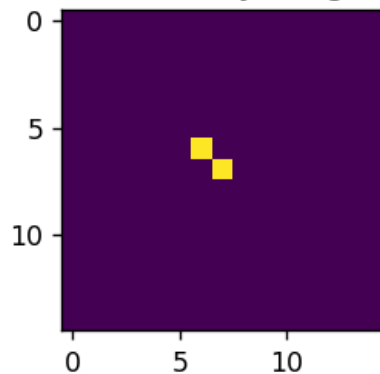
Initial (dx=0, dy=0, gen=0)



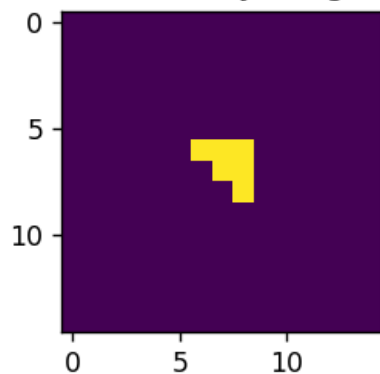
Initial (dx=0, dy=0, gen=0)



Initial (dx=0, dy=0, gen=0)



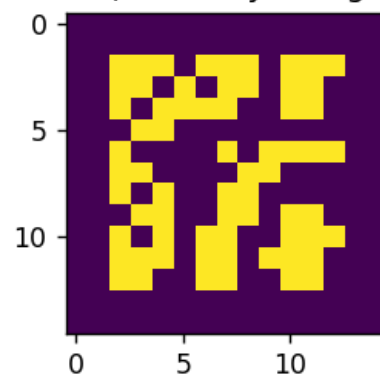
Initial (dx=0, dy=0, gen=0)



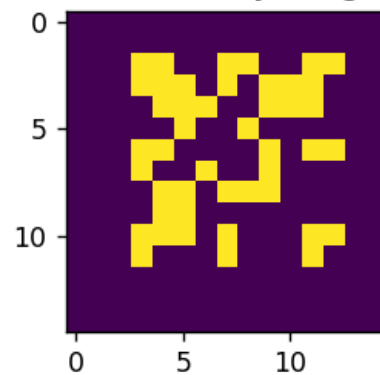
Initial (dx=0, dy=0, gen=0)



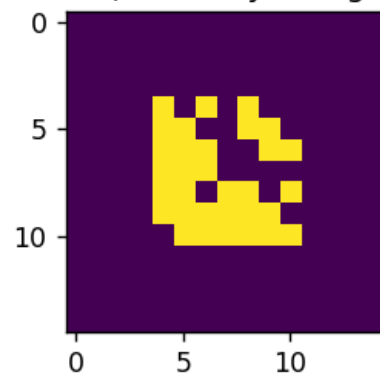
Shifted (dx=4, dy=-4, gen=4)



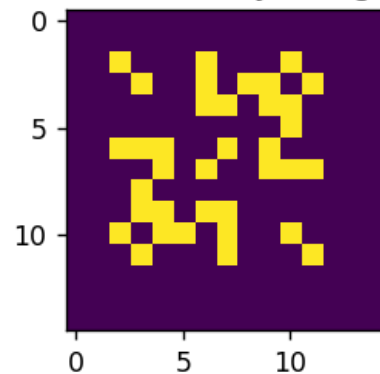
Shifted (dx=4, dy=4, gen=4)



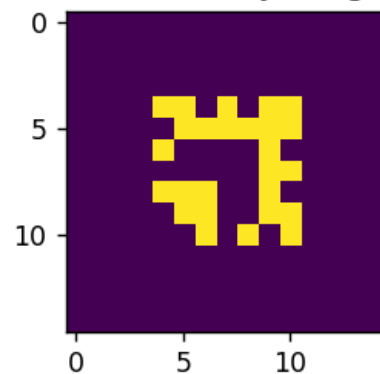
Shifted (dx=2, dy=-2, gen=2)



Shifted (dx=-4, dy=-4, gen=4)

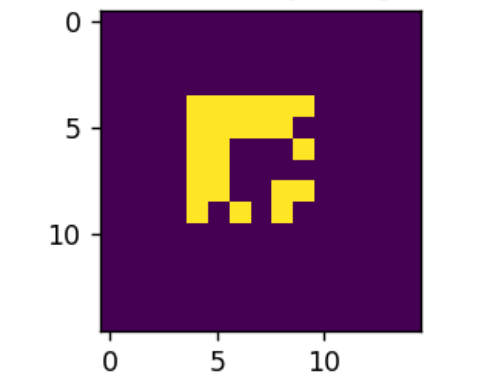
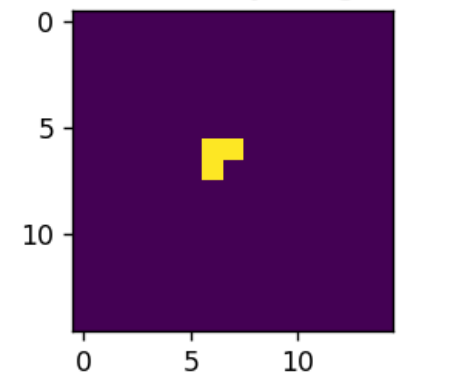
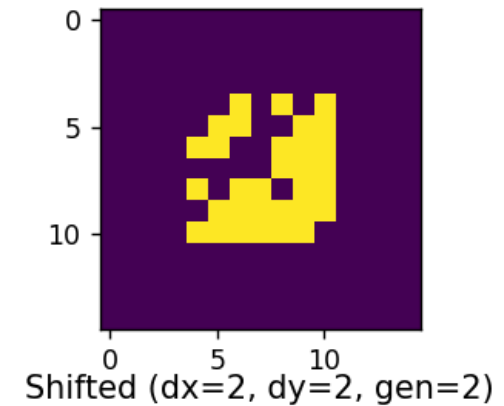
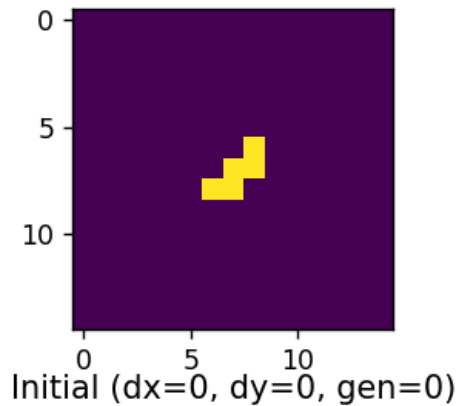
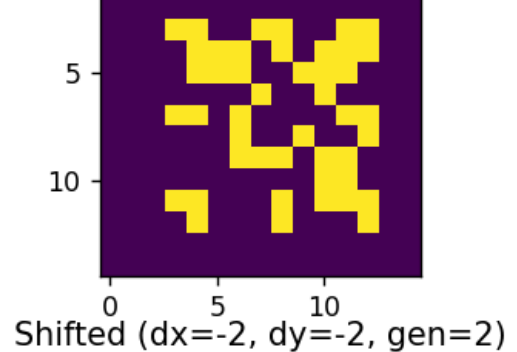
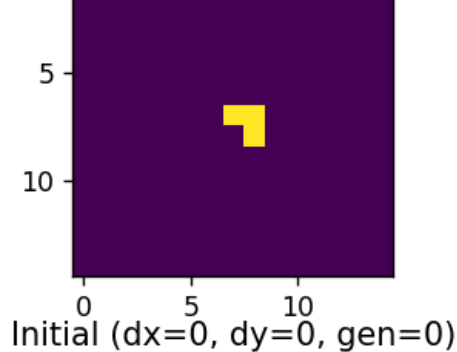


Shifted (dx=-2, dy=2, gen=2)



Shifted (dx=-4, dy=4, gen=4)





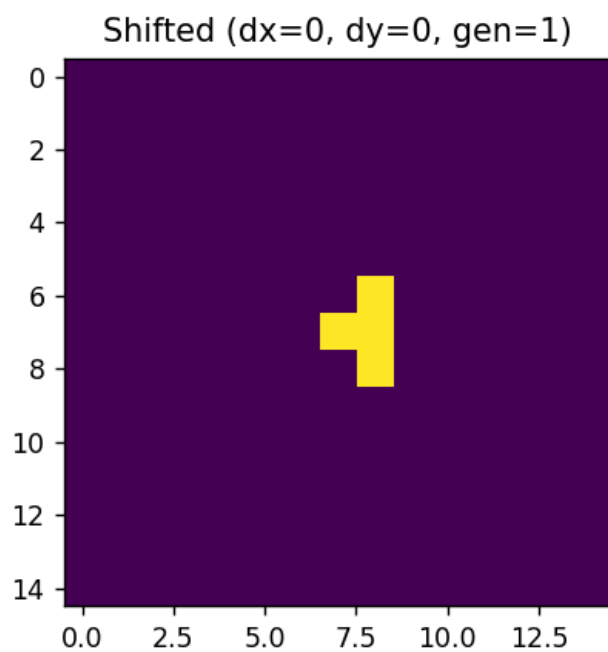
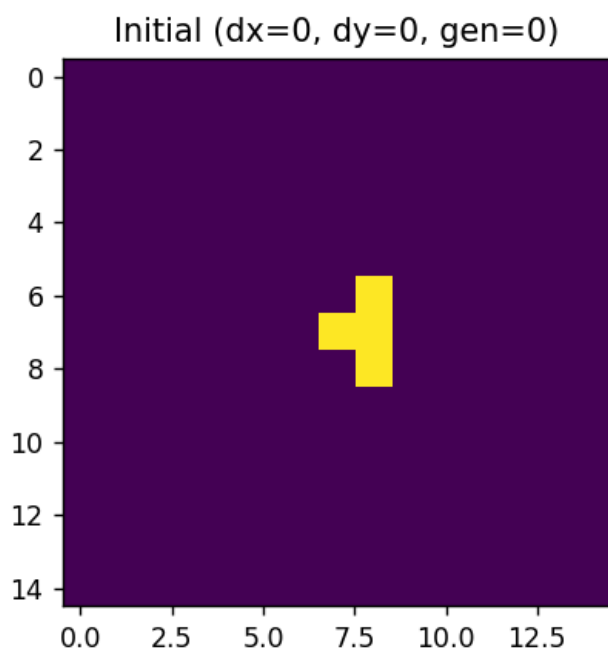
```
In [37]: rule_set = generate_rule_set(rng, 132, 235)
n_tries = 1000
config_size = 5, 5
max_gen = 8

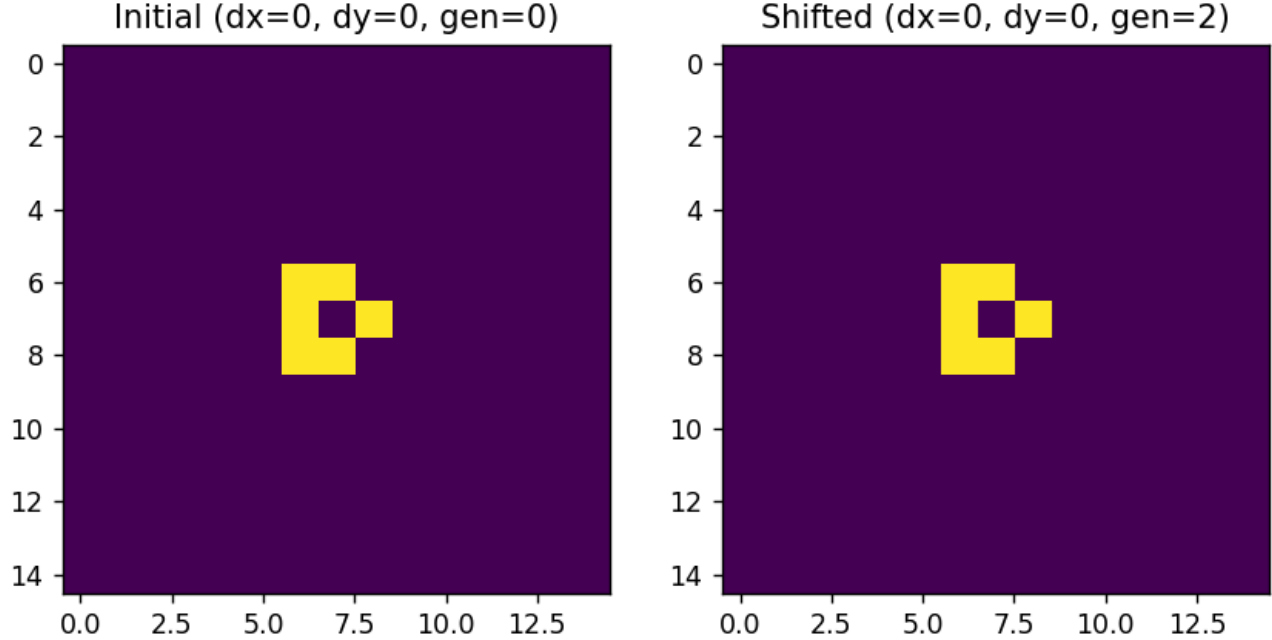
found_patterns, n_counts, n_unique = find_patterns(rng, n_tries, config_size, max_gen, r
plot_found_patterns(found_patterns)
```

```
Looking for patterns...
0/1000, counts=[0, 0, 0], unique=[0, 0, 0]
100/1000, counts=[6, 1, 0], unique=[1, 1, 0]
200/1000, counts=[19, 1, 0], unique=[1, 1, 0]
300/1000, counts=[32, 6, 0], unique=[1, 1, 0]
400/1000, counts=[38, 9, 0], unique=[1, 1, 0]
500/1000, counts=[49, 11, 0], unique=[1, 1, 0]
600/1000, counts=[55, 15, 0], unique=[1, 1, 0]
700/1000, counts=[60, 15, 0], unique=[1, 1, 0]
800/1000, counts=[64, 15, 0], unique=[1, 1, 0]
900/1000, counts=[75, 19, 0], unique=[1, 1, 0]
Finished! Found 1 still-lives, 1 oscillators, and 0 gliders.
```

```
Probability of still life: 0.078
Probability of oscillator: 0.023
Probability of glider: 0.0
```

```
Probability of unique: 0.002
Probability of duplicate: 0.099
```





```
In [38]: rule_set = generate_rule_set(rng, 412, 23)
n_tries = 1000
config_size = 5, 5
max_gen = 8

found_patterns, n_counts, n_unique = find_patterns(rng, n_tries, config_size, max_gen, r
plot_found_patterns(found_patterns)

Looking for patterns...
0/1000, counts=[0, 0, 0], unique=[0, 0, 0]
100/1000, counts=[0, 0, 0], unique=[0, 0, 0]
200/1000, counts=[0, 0, 0], unique=[0, 0, 0]
300/1000, counts=[0, 0, 0], unique=[0, 0, 0]
400/1000, counts=[0, 0, 0], unique=[0, 0, 0]
500/1000, counts=[0, 0, 0], unique=[0, 0, 0]
600/1000, counts=[0, 0, 0], unique=[0, 0, 0]
700/1000, counts=[0, 0, 0], unique=[0, 0, 0]
800/1000, counts=[0, 0, 0], unique=[0, 0, 0]
900/1000, counts=[0, 0, 0], unique=[0, 0, 0]
Finished! Found 0 still-lives, 0 oscillators, and 0 gliders.

Probability of still life: 0.0
Probability of oscillator: 0.0
Probability of glider: 0.0

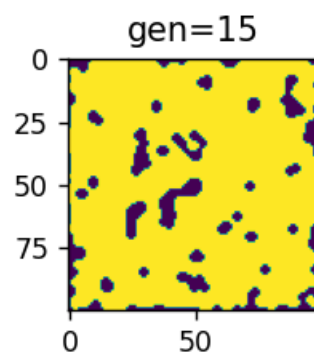
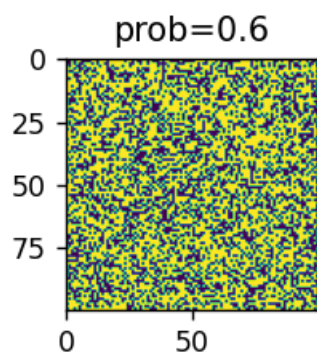
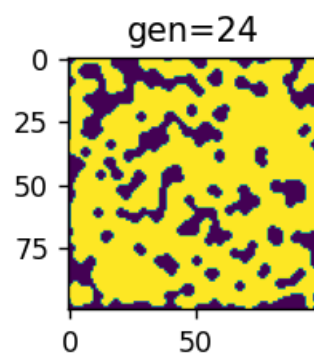
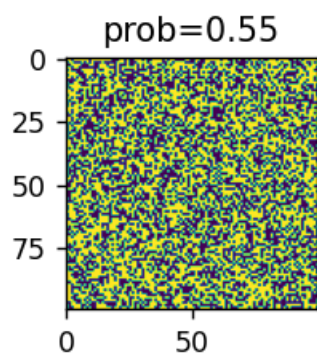
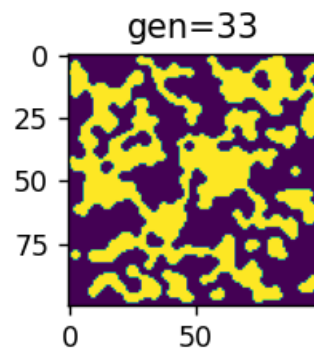
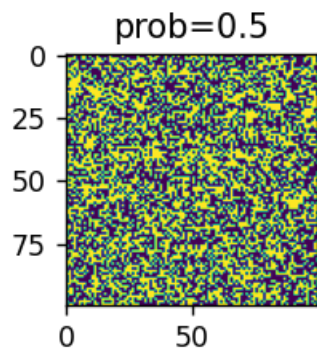
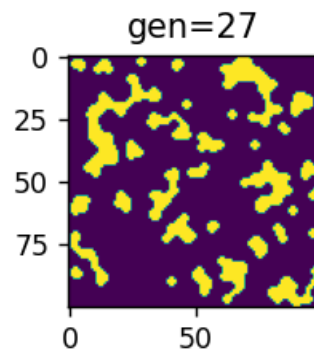
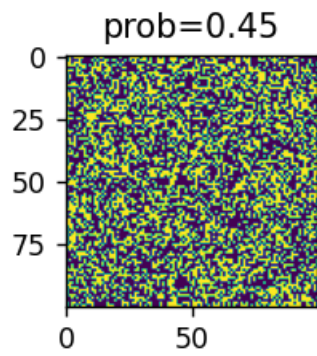
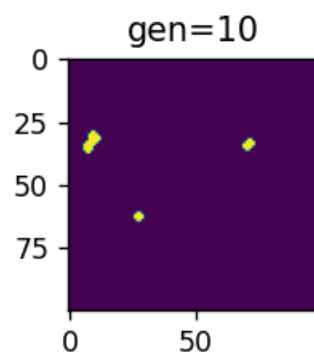
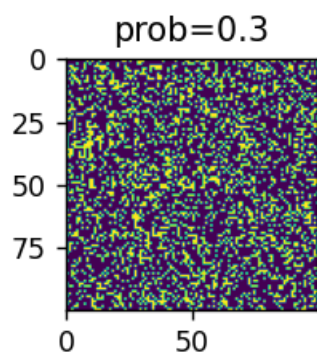
Probability of unique: 0.0
Probability of duplicate: 0.0
```

Exercise 4.8

```
In [39]: def generate_grid_with_p(rng, grid_size, prob):  
         return (rng.random(grid_size) < prob).astype('uint8')
```

```
In [40]: def simulate_majority_rule_for_prob(rng, grid_size, prob, fig, axes):  
         rule_set = np.array([[0, 0, 0, 0, 0, 1, 1, 1, 1],  
                               [0, 0, 0, 0, 1, 1, 1, 1, 1]], dtype='uint8')  
  
         grid = initial_grid = generate_grid_with_p(rng, grid_size, prob)  
         seen_states = set()  
  
         max_gen = 1000  
         final_gen = -1  
         for gen in range(1, max_gen):  
             if gen % 10 == 0:  
                 print(f"{gen}/{max_gen}")  
  
             grid = update_grid(grid, grid.shape, False, rule_set=rule_set)  
             grid_hash = tuple(grid.flatten())  
  
             if grid_hash in seen_states:  
                 print(f"Steady state reached after {gen} iterations")  
                 final_gen = gen  
                 break  
  
             seen_states.add(grid_hash)  
  
         if final_gen == -1:  
             print("No steady state found")  
             fig = plt.figure()  
             plt.imshow(grid)  
             return  
  
         ax1, ax2 = axes  
         #fig = plt.figure()  
         #fig.suptitle(f"gen={final_gen}, p={prob}")  
         ax1.imshow(initial_grid)  
         ax2.imshow(grid)  
         ax1.title.set_text(f"prob={prob}")  
         ax2.title.set_text(f"gen={final_gen}")
```

```
In [41]: grid_size = (100, 100)  
         probs = [0.3, 0.45, 0.5, 0.55, 0.6]  
         fig, axes = plt.subplots(len(probs), 2, figsize=(4, 10))  
         fig.tight_layout()  
  
         for i, prob in enumerate(probs):  
             simulate_majority_rule_for_prob(rng, grid_size, prob, fig, axes[i])
```



```
20/1000
Steady state reached after 27 iterations
10/1000
20/1000
30/1000
Steady state reached after 33 iterations
10/1000
20/1000
Steady state reached after 24 iterations
10/1000
Steady state reached after 15 iterations
```

In []: #