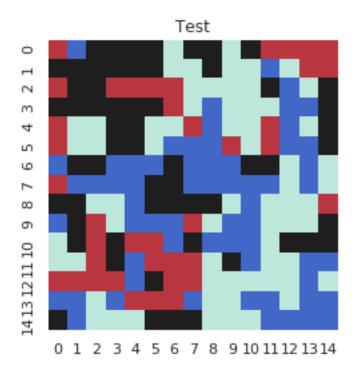
prelim

December 10, 2019

```
[2]: from itertools import product
    from time import sleep
    from typing import Callable, Optional
    import matplotlib.pyplot as plt
    import numpy as np
    from numpy.random import RandomState
    import seaborn as sns
[3]: q = 4
    RANDOM\_SEED = 42424
    WIDTH = 15
    J_c = 1 # ?
    h = 1
[4]: # Python type hinting; the code works well without this
    Interaction = Callable[[int, int], float]
[5]: def generate_correlated_field(rg: RandomState, correlation: float=0.3):
        field = np.array(rg.randint(q, size=[WIDTH, WIDTH]), dtype=np.int8)
        for i in range(field.shape[0]):
            for j in range(field.shape[1]):
                if i > 0 and j > 0 and rg.uniform() < correlation:</pre>
                    if rg.uniform() < 0.5:</pre>
                         field[i,j] = field[i-1,j]
                    else:
                         field[i,j] = field[i,j-1]
        return field
[6]: rg = RandomState(RANDOM_SEED)
    field = generate_correlated_field(rg, 0.5)
[7]: %matplotlib inline
    def show_field(field: np.ndarray, title: Optional[str]=None) -> None:
        ax = sns.heatmap(field, center=q/2, square=True, cbar=False)
        if title:
            ax.set_title(title)
```

```
ax.get_figure().savefig('field.png')
show_field(field, 'Test')
```



```
[8]: def kronecker(spin_1: int, spin_2: int) -> float:
    return float(spin_1 == spin_2)

def energy(field: np.ndarray, interaction: Interaction) -> float:
    energy = 0
    for i, j in product(range(WIDTH - 1), range(WIDTH)):
        energy += interaction(field[i, j], field[i + 1, j])

for i, j in product(range(WIDTH), range(WIDTH - 1)): # dim
        energy += interaction(field[i, j], field[i, j + 1])

return 2 * J_c * energy + h * field.sum()

energy(field, kronecker)
```

[8]: 687.0

```
[]: def calculate_interaction_of_one_spin(field: np.ndarray, x: int, y: int, u
→interaction: Interaction) → float:

# factor 2 ?!
energy = 0
if x > 0: # dim!!
```

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energy += interaction(field[x-1,y], field[x,y])
    if x < WIDTH - 1:
        energy += interaction(field[x,y], field[x+1,y])
        energy += interaction(field[x,y-1], field[x,y])
    if y < WIDTH - 1:</pre>
        energy += interaction(field[x,y], field[x,y+1])
    return 2 * J_c * energy
def calculate_energy_difference(field: np.ndarray, x: int, y: int, new_spin:u
 →int, interaction: Interaction) -> (float, np.ndarray):
    # positive return value: update would imply energetically less favorable_
 \rightarrowstate
    current_energy = calculate_interaction_of_one_spin(field, x, y, interaction)
    field_updated = field.copy() # Avoid side effects of function by copying
    field_updated[x,y] = new_spin
    updated_energy = calculate_interaction_of_one_spin(field_updated, x, y,_u
 →interaction)
    energy_difference = updated_energy - current_energy + h *_
 →(field_updated[x,y] - field[x,y])
    return (updated_energy - current_energy, field_updated)
def update_metropolis(field: np.ndarray, free_energy: float, interaction: u
 →Interaction, random_state: RandomState) -> (np.ndarray, float):
    random_x, random_y = random_state.randint(WIDTH, size=[2]) # dim
    random_spin = random_state.randint(q)
    energy_difference, field_updated = calculate_energy_difference(field,_
 →random_x, random_y, random_spin, interaction)
    if energy_difference < 0 or random_state.uniform():</pre>
        # free_energy_updated = free_energy - energy_difference
        return field_updated, free_energy
    else:
        return field, free_energy
free_energy = 0
rg = RandomState(RANDOM_SEED)
field = np.array(rg.randint(q, size=[WIDTH, WIDTH]), dtype=np.int8)
for i in range(100):
    for _ in range(10):
        field, free_energy = update_metropolis(field, free_energy, kronecker, __
    show_field(field, f'Free energy: {free_energy}')
    sleep(0.2)
```

Possible future extension: * Boundary conditions at will * Higher number of dimensions

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