# A Turing Complete SDS

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| State | Action  | if $x = 0$ goto | if $x > 0$ goto |
|-------|---------|-----------------|-----------------|
| 1     | Init    | 4               | 2               |
| 2     | DEC $x$ | 3               | 3               |
| 3     | INC $y$ | 4               | 2               |
| 4     | Halt    | 4               | 4               |

Table 1: Norma addition truth table

| В            | $\operatorname{Cod}$ | e Chunks                      | 41 |
|--------------|----------------------|-------------------------------|----|
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#### 1 Introduction

Run the code for the Multi-swarm solution with make code && python multi\_swarm\_solution.py and for the Two Agent solution with make code && python run\_two\_agent\_solution.py.

## 2 Preliminary assumptions

To go from something like NORMA2 to a new swarmy implementation, we need to know what things we can and cannot change.

Firstly, when designing a NORMA2 program, to perform addition for example, then an intelligent user still needs to determine the procedure themselves. This means we can get away with manually specifying the shape of the program, and should not expect the intended function to emerge without such careful initialisation. Because of this, I will often refer to the state table which defines a NORMA2 machine for addition (Table 1); in a properly swarmy system, there will not be an explicit state table, but the emergent behaviour will have to be similar to one, and this will largely have to be the result of manual configuration by a user.

Secondly, NORMA2 was given some registers of unlimited size which is fine in practise, but if I were to implement NORMA2, in Python for example, then I would need to include special routines for times when the value of the registers was larger than could fit into memory. This could be a function which stops the NORMA2 procedure before the register values become too big, and informs the user to go and install more memory into the machine. The point is, that any implementation I can do in a few minutes would

not be able to perform certain computations over a certain size. I therefore suggest that we should not expect the swarmy implementation to work for all cases either, though in theory it should.

Lastly, the capabilities of NORMA are incrementing, decrementing, branching, and comparison with zero. We will need either the same set of capabilities, or a similarly expressive set.

With these assumptions in mind, lets consider a few approaches.

## 3 Just copy NORMA2

If I implemented something exactly like NORMA2, then we know for sure that it would work, but we would be criticised for demonstrating something that is neither original or swarmy. So from this basis, what's the minimum change we could do to make a system that would still work, by virtue of its being almost identical to NORMA2, but with some swarmy aspect?

Imagine a swarm of one agent, where their behaviour was entirely determined by the state table. The agent would maintain a state and two register values, and update them according to the states. Again, this would definitely work, but not be sufficiently swarmy, as there is no agent-to-agent interaction, and the behaviour of the agent is explicit and complicated.

So we need more than one agent, is there any way that two agents could be used? Maybe if one agent simply maintained a boolean state depending on whether it held that x = 0. Then you could have one agent maintaining the registers and state, and branching depending on the state of the other agent. This could also certainly be made to work, but now we have the criticism that the two distinct types of agent makes this more of a multi-agent system rather than a swarm intelligence system.

So could it be done with two identical agents? One would need to maintain a state and the other would have to find the next state. The agent which found the next state would have to deactivate the other agent so the newly inactive agent may find the next state. They would go on leap-frogging each other. Let's see if that's at all viable.

#### 3.1 Two agent solution

First we'll import some bits, and define an Agent as something which has an activity and a hypothesis, and a 'Step' which defines a state of a computational procedure, representing the value of the X and Y registers and the current state it is in.

```
3  \( \text{two-agent-solution.py } 3 \) \( \sim \) import random
    from collections import namedtuple

Step = namedtuple('Step',['x','y','state'])
```

```
class Agent:
    def __init__(self):
        self.active = False
        self.hyp = None
```

This definition is continued in chunks 4–8. Root chunk (not used in this document).

Then we'll define a swarm as two of those agents, and define the function for generating new hypothesis, which in this case returns the initial Step, where X = 2, Y = 1, in State 1.

Now we need a diffusion phase. I've chosen to disallow self-selection, and use standard passive diffusion, and hypothesis transmission error, where the registers have a small chance of being perturbed and the state is chosen entirely random.

I previously had used context-sensitive to ensure both agents wouldn't remain active, but that event never occurs.

```
\langle two-agent-solution.py \ 3 \rangle + \equiv
5
       def diffuse(swarm):
           for agent_num, agent in enumerate(swarm):
               # No self selection.
               # The polled agent is always the other agent.
               other_agent = swarm[(agent_num+1)%2]
               if not agent.active:
                    if other_agent.active: # copy hyp noisily
                        x, y, state = other_agent.hyp
                        if random.random() < 0.3:</pre>
                             x += random.choice([-1,1])
                        if random.random() < 0.3:</pre>
                             y += random.choice([-1,1])
                        agent.hyp = Step(x, y, state=random.randint(1,4))
                    else:
                        agent.hyp = initial_hyp()
```

That all seems fairly safe, I should point out that the randomisation of state in the transmission error will be mitigated if each agent existed within a swarm that defined a single state. To clarify this, rather than a single homogeneous swarm, imagine a swarm of agents in each row of the state table, then each swarm would "know" what they were hypothesising as the next state.

But now I need to determine a test phase. It would require checking if the other agent is active and if so, that your hypothesis is a valid transition (see function "is\_valid<sub>7</sub>"). There also needs to be the extra feature that the agents remain active once they've become active, and the surpress the activity of the other agent.

```
6
     \langle two\text{-}agent\text{-}solution.py 3 \rangle + \equiv
       def test():
           for agent_num, agent in enumerate(swarm):
                # Active agents do nothing, and stay active
                if not agent.active:
                     other_agent = swarm[(agent_num+1)%2]
                     if other_agent.active:
                         # Check if transition is valid.
                         valid = is_valid<sub>7</sub>(agent.hyp, other_agent.hyp)
                         agent.active = valid
                         if valid:
                              other_agent.active = False
                     else:
                         # Both agents are inactive.
                         # Go active if you have the initial state.
                         # This only runs once.
                         agent.active = agent.hyp == initial_hyp()
     Uses is_valid 7.
```

Here's the is\_valid7 function, which implements the state table manually.  $\langle two-agent-solution.py \ 3 \rangle + \equiv$ def is\_valid7(hyp, prev\_hyp): other\_x, other\_y, other\_state = prev\_hyp x, y, state = hypif other\_state == 1: if other\_x == 0: return  $x == other_x and y == other_y and state == 4$ else: return  $x == other_x and y == other_y and state == 2$ elif other\_state == 2: return  $x == other_x-1$  and  $y == other_y$  and state == 3elif other\_state == 3: if other\_x == 0: return  $x == other_x and y == other_y+1 and state == 4$ else: return  $x == other_x and y == other_y+1 and state == 2$ else: # other\_state == 4: return False Defines: is\_valid, used in chunk 6.

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Now to add a loop that does intialise, test, diffuse and halt. We'll halt when any active agent is in halt state 4.

```
\langle two-agent-solution.py \ 3 \rangle + \equiv
8
      def run():
          # Initialise
          for agent in swarm:
               agent.hyp = initial_hyp()
          previously_active_agent = 1
          for iteration in range(1000):
               test()
               diffuse(swarm)
               # Print to console when the inactive agent becomes active.
               active_agent = [agent.active for agent in swarm].index(True)
               if False or not (active_agent == previously_active_agent):
                   print(
                       format(iteration, '4'),
                        [(agent.hyp,agent.active) for agent in swarm],)
                   previously_active_agent = active_agent
               # Halting.
               if any(agent.hyp.state == 4 for agent in swarm if agent.active):
                   print(
                        'Answer is',
                       next(
                            agent.hyp
                            for agent
                            in swarm
                            if agent.active and agent.hyp.state == 4).y,
                       'in', iteration, 'iterations.')
                   break
           else:
               print('no convergence')
```

Here's a script to run the two agent solution. It works, but there are some potentially problematic aspects to it.

9  $\langle run\text{-}two\text{-}agent\text{-}solution.py }9 \rangle \equiv$  import two\_agent\_solution

two\_agent\_solution.run()

Root chunk (not used in this document).

## 3.2 Problems with the Two Agent solution

- 1. The complex logic in the test for validation.
- 2. The fact that there are only two agents, there's nothing swarmy.
- 3. Only inactive agents perform the test phase.

## 4 Multiple agent solution

The idea is to have one swarm for every state in the NORMA2 state table, plus two for every unique conditional branch destination.

Each swarm will also have a boolean convergence flag, which is initially false.

Initialisation could be achieved either by setting all the agents in the initial swarm to certain register values, and setting the convergence flag, or setting a single agent active with certain register values and waiting for convergence. Agents in the initial swarm will be set active and given register values.

Any swarm which has not converged will be polling connected swarms and diffusing perturbed hypotheses, which it will test as valid by checking that a random agent from the previous swarm is converged and the registers make sense with the polled agents registers.

When a swarm has full activity it sets its convergence flag, inviting activity from the subsequent swarms, and surpresses all activity in previous swarms by switching off its convergence flag. Convergence flags therefore surpress processing.

#### 4.1 Implementation

Let's start off with some imports.

```
import random
import sds
from collections import namedtuple
import functools
import sys
import itertools
import json

XY = namedtuple('XY',['x','y'])

def agent_repr(self):
    if self.active:
        return "{h}".format(h=self.hypothesis)
    else:
```

```
return "inactive" sds.Agent.__repr_ = agent_repr
This definition is continued in chunks 11-16, 18-22, 24b, 25, 27, 29-31, and 33-36. Root chunk (not used in this document).
```

Now I'll define some swarms, right now I'll just initialise them, I'll link them up later, as its much easier to link an acyclic graph once all nodes have been created.

I'm also including a 'converged' flag for each swarm, and rather than just having a raw boolean 'False', I've made it a boolean in a list '[False]' so I can zip the list and have something I can modify in place.

At the end of this chunk 'swarms' is a list of (swarm name, agent list, converged flag) tuples.

Now initialise all the agent in the first swarm as active at the initial step.

This action has to be considered carefully as it must be the case that this swarm never converges again. Once the convergence flag is on, it will stop processing, once the flag goes off again, there must never be any activity, so activity can't just come from the microtests. I therefore suggest that each agent in the init swarm selects an agent in the init swarm.

```
for agent in swarms['init']['agents']:
    agent.hypothesis = XY(x=10,y=10)
    agent.active = True

swarms['init']['converged'] = True
```

#### 4.2 Multi swarm definitions

I'll define everything manually, but afterwards I should be able to make a sexy functional programming solution.

Before doing any of the other functions, we have to have a function to probabilistically perturb a register.

```
12b
      \langle multi-swarm-solution.py 10 \rangle + \equiv
        def perturb(register): #PERTURB
             return register + random.choice((1,0,0,0,-1))
      This is for 'x > 0' swarm.
      \langle multi-swarm-solution.py 10 \rangle + \equiv
12c
        def xgt0_hyp(rng=random):
             for swarm_name in ('init', 'incy'):
                 if swarms[swarm_name]['converged']:
                     polled = rng.choice(swarms[swarm_name]['agents'])
                     polled_x, polled_y = polled.hypothesis
                     return XY(x=perturb(polled_x),y=perturb(polled_y))
             else:
                 return XY(x=0,y=0)
        def xgt0_test(hyp):
             for swarm_name in ('init', 'incy'):
                 if swarms[swarm_name]['converged']:
                     polled_agent = random.choice(swarms[swarm_name]['agents'])
                     break
             else:
                 return False
             if polled_agent.active:
                 polled_x, polled_y = polled_agent.hypothesis
                 return hyp.x == polled_x and hyp.y == polled_y and hyp.x > 0
             else:
                 raise RuntimeError('inactive agent polled')
```

```
This is for 'Decrement X' swarm.
      \langle multi-swarm-solution.py 10 \rangle + \equiv
13a
        def decx_hyp(rng=random):
            for swarm_name in ('xgt0',):
                 if swarms[swarm_name]['converged']:
                     polled = rng.choice(swarms[swarm_name]['agents'])
                     polled_x, polled_y = polled.hypothesis
                     return XY(x=perturb(polled_x),y=perturb(polled_y))
            else:
                return XY(x=0,y=0)
        def decx_test(hyp):
            if swarms['xgt0']['converged']:
                 polled_agent = random.choice(swarms['xgt0']['agents'])
                 if polled_agent.active:
                     polled_x, polled_y = polled_agent.hypothesis
                     result = hyp.x == polled_x-1 and hyp.y == polled_y
                     return result
                 else:
                     raise RuntimeError('inactive agent polled')
            else:
                print('dec x failed test as xgt0 is not converged')
                return False
      This is for 'Increment Y' swarm...
      \langle multi-swarm-solution.py 10 \rangle + \equiv
13b
        def incy_hyp(rng=random):
            for swarm_name in ('decx',):
                 if swarms[swarm_name]['converged']:
                     polled = rng.choice(swarms[swarm_name]['agents'])
                     polled_x, polled_y = polled.hypothesis
                     return XY(x=perturb(polled_x),y=perturb(polled_y))
            else:
                return XY(x=0,y=0)
        def incy_test(hyp):
            if swarms['decx']['converged']:
                polled_agent = random.choice(swarms['decx']['agents'])
                 if polled_agent.active:
                     polled_x, polled_y = polled_agent.hypothesis
                     result = hyp.x == polled_x and hyp.y == polled_y+1
                     return result
                 else:
                     raise RuntimeError('inactive agent polled')
            else:
                 print('incy failed test as decx is not converged')
                return False
```

```
This is for 'x = 0' swarm.
      \langle multi-swarm-solution.py 10\rangle + \equiv
14a
        def xeq0_hyp(rng=random):
            for swarm_name in ('init', 'incy'):
                 if swarms[swarm_name]['converged']:
                     polled = rng.choice(swarms[swarm_name]['agents'])
                     polled_x, polled_y = polled.hypothesis
                     return XY(x=perturb(polled_x),y=perturb(polled_y))
            else:
                return XY(x=0,y=0)
        def xeq0_test(hyp):
            for swarm_name in ('init', 'incy'):
                 if swarms[swarm_name]['converged']:
                     polled_agent = random.choice(swarms[swarm_name]['agents'])
                     break
            else:
                 return False
            if polled_agent.active:
                 polled_x, polled_y = polled_agent.hypothesis
                return hyp.x == polled_x and hyp.y == polled_y and hyp.x == 0
            else:
                raise RuntimeError('inactive agent polled')
      This is for the halt swarm.
      \langle multi-swarm-solution.py 10\rangle + \equiv
14b
        def halt_hyp(rng=random):
            for swarm_name in ('xeq0',):
                 if swarms[swarm_name]['converged']:
                     polled = rng.choice(swarms[swarm_name]['agents'])
                     polled_x, polled_y = polled.hypothesis
                     return XY(x=perturb(polled_x),y=perturb(polled_y))
            else:
                return XY(x=0,y=0)
        def halt_test(hyp):
            for swarm_name in ('xeq0',):
                 if swarms[swarm_name]['converged']:
                     polled_agent = random.choice(swarms[swarm_name]['agents'])
                     break
            else:
                return False
            if polled_agent.active:
                polled_x, polled_y = polled_agent.hypothesis
                return hyp.x == polled_x and hyp.y == polled_y
            else:
                raise RuntimeError('inactive agent polled')
```

Here's a data structure to keep it all together.

15

#### 4.3 Multi-swarm execution

```
\langle multi-swarm-solution.py 10 \rangle + \equiv
16
       def fully_active(swarm):
           result = all(x.active for x in swarm)
           return result
       def iterate(solution):
           for swarm_name, swarm, microtest, hyp_function, previous_swarms in solution:
               if not swarm['converged']:
                   #print('processing',swarm_name)
                   # if swarm is not converged
                   sds.run(
                        swarm=swarm['agents'],
                        microtests=[microtest],
                        random_hypothesis_function=hyp_function,
                        max_iterations=100,
                        halting_function=fully_active,
                        halting_iterations=10,
                        report_iterations=None,
                   if not all(agent.active for agent in swarm['agents']):
                        #raise RuntimeError('I thought it would all be active by now')
                        #print(swarm_name,"didn't converge")
                        pass
                   else:
                        swarm['converged'] = True
                        print(swarm_name,'is now converged at',swarm['agents'][0].hypothesis)
                        if swarm_name == 'halt':
                            print('convergence in the halt swarm halts the process')
                            return True
                        for swarm_name, swarm, _, _, _ in solution:
                            for prev_swarm_name in previous_swarms:
                                if prev_swarm_name == swarm_name:
                                    if swarm['converged']:
                                        swarm['converged'] = False
                                        print(prev_swarm_name,'is no longer converged')
                                        for agent in swarm['agents']:
                                             agent.active = False
                                             agent.hypothesis = None
           #print('not halted yet')
           return False
       def do_naive_multiswarm_solution():
           for num, swarm_name in enumerate(swarm_names,start=1):
               print(num, swarm_name, swarms[swarm_name])
           while True:
```

## 5 Multi swarm solution with functional programming

I'll carry on editing the same file as there will be a lot of code sharing.

I need to make some 'intended action' functions to save me typing five different sets of logic.

```
\langle multi-swarm-solution.py 10 \rangle + \equiv
18
         def decrementX_{18}(hyp):
             hyp_x, hyp_y = hyp
             return XY(hyp_x-1, hyp_y)
         def decrementY_{18}(hyp):
             hyp_x, hyp_y = hyp
             return XY(hyp_x, hyp_y-1)
         def incrementX_{18}(hyp):
             hyp_x, hyp_y = hyp
             return XY(hyp_x+1, hyp_y)
         def incrementY<sub>18</sub>(hyp):
             hyp_x, hyp_y = hyp
             return XY(hyp_x, hyp_y+1)
         def noop<sub>18</sub>(hyp):
             hyp_x, hyp_y = hyp
             return XY(hyp_x, hyp_y)
         def Xeq0_{18}(x):
             return x == 0
         def Xgt0_{18}(x):
             return x > 0
         def Xdontcare<sub>18</sub>(x):
             return True
      Defines:
         decrementX, used in chunk 20b.
         decrementY, used in chunk 20b.
         incrementX, used in chunk 20b.
         incrementY, used in chunk 20b.
        noop, used in chunks 19 and 20b.
         Xdontcare, used in chunk 20b.
         Xeq0, used in chunk 20b.
         Xgt0, used in chunks 19 and 20b.
```

This is a function to make all the test function for all the swarms.

```
\langle multi-swarm-solution.py 10 \rangle + \equiv
19
        def make_test_fun<sub>19</sub>(swarms, linked_swarms,action,x_condition,rng=random):
            def generic_test_fun(
                 swarms,
                 previous_swarm_names,
                 intended_action_function,
                 x_condition_function,
                 rng,
                 hyp,
            ):
                 for swarm_name in previous_swarm_names:
                     if swarms[swarm_name]['converged']:
                          polled_agent = rng.choice(swarms[swarm_name]['agents'])
                 else:
                     return False
                 if polled_agent.active:
                     polled_x, polled_y = intended_action_function(polled_agent.hypothesis)
                          hyp.x == polled_x
                          and hyp.y == polled_y
                          and x_condition_function(hyp.x))
                 else:
                     raise RuntimeError('inactive agent polled')
            return functools.partial(
                 generic_test_fun,
                 swarms,
                 linked_swarms,
                 action,
                 x_condition,
                 rng,)
        #foo = make_hyp_fun<sub>20a</sub>(linked_swarms=['init','incy'],action=noop<sub>18</sub>,x_condition=XgtO<sub>18</sub>)
      Defines:
        make_test_fun, used in chunk 21.
      Uses make_hyp_fun 20a, noop 18, and Xgt0 18.
```

This is a function to make all the hyp functions for all the swarms.

```
\langle multi-swarm-solution.py 10 \rangle + \equiv
20a
          def make_hyp_fun<sub>20a</sub>(swarms, linked_swarms):
               def generic_hyp_fun(swarms, linked_swarms,rng=random):
                    for swarm_name in linked_swarms:
                          if swarms[swarm_name]['converged']:
                               polled = rng.choice(swarms[swarm_name]['agents'])
                               polled_x, polled_y = polled.hypothesis
                               return XY(x=perturb(polled_x),y=perturb(polled_y))
                    else:
                         return XY(x=0,y=0)
               return functools.partial(generic_hyp_fun, swarms, linked_swarms)
        Defines:
          make_hyp_fun, used in chunks 19 and 21.
        Here's are the functions to make the building blocks.
        \langle multi-swarm-solution.py 10\rangle + \equiv
20b
          swarm_types = {
               'init': (noop<sub>18</sub>, Xdontcare<sub>18</sub>),
               'xgt0':(noop<sub>18</sub>,Xgt0<sub>18</sub>),
               'xeq0':(noop_{18}, Xeq0_{18}),
               'incy': (incrementY<sub>18</sub>, Xdontcare<sub>18</sub>),
               'decy': (decrementY_{18}, Xdontcare_{18}),
               'incx': (incrementX<sub>18</sub>, Xdontcare<sub>18</sub>),
               'decx': (decrementX_{18}, Xdontcare<sub>18</sub>),
               'halt': (noop<sub>18</sub>, Xdontcare<sub>18</sub>),
          }
        Uses decrement X18, decrement Y18, increment X18, increment Y18, noop 18, Xdontcare 18, Xeq0 18,
          and Xgt0 18.
        Which can be used with a state table.
        \langle multi-swarm-solution.py 10 \rangle + \equiv
20c
          state_table = [
               ('A-init', 'init', ['halt']),
               ('B-xgt0','xgt0',['A-init','D-incy']),
               ('C-decx', 'decx', ['B-xgt0']),
               ('D-incy','incy',['C-decx']),
               ('E-xeq0', 'xeq0', ['A-init', 'D-incy']),
               ('halt', 'halt', ['E-xeq0']),
          ]
```

Now let's try to build a multi swarm solution from the table.  $\langle multi$ -swarm-solution.py  $10 \rangle + \equiv$ 21 def build\_solution21(state\_table,initial\_x,initial\_y): swarms = { name: { 'converged': False, 'agents': [sds.Agent() for \_ in range(agent\_count)] for name, swarm\_type, linked\_swarms in state\_table } solution = [] for name, swarm\_type, linked\_swarms in state\_table: if swarm\_type == 'init': swarm = swarms[name] for agent in swarm['agents']: agent.hypothesis = XY(x=initial\_x,y=initial\_y) agent.active = True swarm['converged'] = True action, x\_condition = swarm\_types[swarm\_type] test\_fun = make\_test\_fun<sub>19</sub>(swarms, linked\_swarms,action,x\_condition,random) hyp\_fun = make\_hyp\_fun<sub>20a</sub>(swarms, linked\_swarms) solution.append((name,swarms[name],test\_fun, hyp\_fun, linked\_swarms)) return solution Defines: build\_solution, used in chunk 22.

Uses make\_hyp\_fun 20a and make\_test\_fun 19.

```
def do_functional_multiswarm_solution():
    functional_solution = build_solution<sub>21</sub>(state_table,initial_x=1000,initial_y=1000)
    while True:
        if iterate(functional_solution):
            break

        _,halt_swarm,_,_, = next(x for x in functional_solution if x[0] == 'halt')
        answer = halt_swarm['agents'][0].hypothesis.y
        print('Answer is',answer)
        #print('done. Answer is',['halt']['agents'][0].hypothesis.y)

#do_functional_multiswarm_solution()
Uses build.solution 21.
```

## 6 Quorum sensing

The previous multi swarm version relied on a flag for each swarm which determined whether or not it was executing. We now hope to replace that flag, with a two-phase behaviour of agents, which implement the effect of the flag once they determine their swarm has converged.

So agents are either (i) polling the previous swarm to check whether their registers are correct, or (ii) remain active, while polling the previous swarm to suppress activity there.

So each agent needs to maintain an internal variable, which is used for quorum sensing.

Here's my take on Bish's pseudocode.

```
23a
       \langle quorum \ test \ phase \ 23a \rangle \equiv
         if agent.quorum_count > quorum_threshold:
              inhibit_mode(linked_swarms)
         else:
              polled = random.choice(swarm)
              if (
                  polled.quorum_count > quorum_threshold
                   and check_registers(agent.hyp, polled.hyp)
              ):
                   agent.quorum_count += 1
              else:
                   agent.quorum_count = 0
       Root chunk (not used in this document).
23b
       \langle quorum\ inhibit\ mode\ 23b \rangle \equiv
         def inhibit_mode(linked_swarms):
              random_swarm = random.choice(linked_swarms)
              polled = random.choice(swarm)
              polled.quorum_count = 0
       Root chunk (not used in this document).
```

## 6.1 Agent activity

We need a new record of activity.

An agent is active, inactive and with a counter for quorum threshold.

```
24b \langle multi\text{-}swarm\text{-}solution.py 10} \rangle + \equiv Activity = namedtuple("Activity",['active','count'])
```

## 6.2 Quorum test function

```
\langle multi-swarm-solution.py 10\rangle + \equiv
25
       def quorum_test_phase<sub>25</sub>(
            swarm,
           linked_swarms,
           quorum_threshold,
           swarm_test_function,
           error_prob,
           rng=random
       ):
           for agent_num, agent in enumerate(swarm):
                random_swarm = random.choice(linked_swarms)
                polled = random.choice(random_swarm)
                if agent.active.count < quorum_threshold:</pre>
                    if polled.active.count >= quorum_threshold:
                         if swarm_test_function(agent, polled):
                             agent.active = Activity(
                                 True,
                                 agent.active.count,)
                             #agent.active = Activity(
                                 True,
                                 agent.active.count+1,)
                         else:
                             agent.active = Activity(False, 0)
                             #next_count = agent.active.count - 1
                             #agent.active = Activity(next_count > 0, next_count)
                    #else:
                    #
                         next_count = agent.active.count - 1
                         agent.active = Activity(next_count > 0, next_count)
                else:
                    polled.active = Activity(False,0)
                if rng.random() < error_prob:</pre>
                    new_active = not agent.active.active
```

```
if new_active:
                  agent.active = Activity(True, agent.active.count)
              else:
                  agent.active = Activity(False, agent.active.count)
     #for agent_num, agent in enumerate(swarm):
     #
          if agent.active.count == quorum_threshold:
     #
              continue
          random_swarm = random.choice(linked_swarms)
     #
      #
          polled = random.choice(random_swarm)
     #
          # polled is quorate
          if polled.active.count == quorum_threshold:
     #
              if swarm_test_function(agent, polled):
      #
                  agent.active = Activity(
      #
                      True,
      #
                      agent.active.count,)
              else:
     #
      #
                  # Inactivity due to test failing with a
      #
                  # polled quorate agent
      #
                  agent.active = Activity(False, 0)
      #
          else:
     #
              # Inactivity due to failure to poll a quorate agent.
              agent.active = Activity(False, 0)
     #
     #
          if rng.random() < error_prob:</pre>
              agent.active = Activity(True, agent.active.count)
Defines:
 quorum_test_phase, used in chunk 33.
```

### 6.3 Quorum diffusion function

 $\langle multi-swarm-solution.py 10 \rangle + \equiv$ 

27

```
def quorum_diffusion_phase(
    swarm,
   allow_self_selection,
   quorum_threshold,
   hyp_function,
   error_prob,
   rng,
):
    # Quorum diffusion phase
   for agent_num, agent in enumerate(swarm):
        local_polled = random.choice(swarm)
        while (not allow_self_selection) and local_polled is agent:
            local_polled = random.choice(swarm)
        if not agent.active.active:
            # Agent is inactive
            if local_polled.active.active:
                # Local polled is active, copy hypothesis.
                agent.hypothesis = local_polled.hypothesis
                # If local polled is also quorate then go active as well.
                if local_polled.active.count >= quorum_threshold:
                    agent.active = Activity(True,agent.active.count)
            else:
                # Local polled is inactive, random hyp from linked swarm.
                agent.hypothesis = hyp_function(random)
        elif agent.active.active and agent.active.count < quorum_threshold:
            #Agent is active, but not quorate
            if local_polled.active.active:
                #Polled is active or quorate
                if (local_polled.hypothesis == agent.hypothesis):
                    # If registers match then be active and increment count
                    agent.active = Activity(True,min(agent.active.count+10,quorum_thres
                else:
```

# If registers don't match go inactive

```
agent.active = Activity(False,0)
            # Maybe I should suppress activity here if
            # count reaches 0
            #new_count = agent.active.count-1
            #new_activity = new_count > 0
            #agent.active = Activity(new_activity,max(new_count,0))
            # stay active if count reaches zero
            # agent.active = Activity(True,max(agent.active.count-1,0))
    else:
        # Agent is active, but local polled is inactive, decrement count,
        # go inactive if count is 0
        # Maybe I should suppress activity here if
        # count reaches 0
        new_count = agent.active.count-1
        new_activity = new_count > 0
        agent.active = Activity(new_activity,max(new_count,0))
if rng.random() < error_prob:</pre>
    agent.active = Activity(agent.active.active,agent.active.count + random.cho
```

#### 6.4 Quorum microtest

Consider making it so the other agent is passed in, not polled in this function.

This used to make agents go inactive if they polled an inactive agent in a linked/previous swarm.

```
if (
          (polled.active < quorum_threshold)
          or registers_not_right
):
        return 0
else:
        return agent.active + 1</pre>
```

but this means that any swarm polling from two swarms will go inactive half the time.

This function can do with a big cleanup, it probably should just be doing registers checking. It looks a bit complicated, but it saves me writing a 'registers are ok' function for each swarm.

```
29
     \langle multi-swarm-solution.py 10 \rangle + \equiv
       def quorum_make_test_fun29(
            swarms,
            linked_swarm_names,
            action,
            x_condition,
            rng=random,
       ):
            def quorum_generic_test_fun(
                linked_swarms,
                intended_action_function,
                x_condition,
                rng,
                agent,
                polled,
            ):
                next_x, next_y = intended_action_function(polled.hypothesis)
                hyp = agent.hypothesis
                # return True if registers are good. False otherwise.
                return (hyp.x == next_x and hyp.y == next_y and x_condition(hyp.x))
            linked_swarms = [
                swarms[swarm_name]
                for swarm_name
                in linked_swarm_names]
            return functools.partial(
                quorum_generic_test_fun,
                linked_swarms,
                action,
                x_condition,
                rng,)
     Defines:
       quorum_make_test_fun, used in chunk 31.
```

## 6.5 Quorum new hypothesis

```
def quorum_make_hyp_fun<sub>30</sub>(swarms, linked_swarm_names):
    def quorum_generic_hyp_fun(linked_swarms, rng=random):
        random_swarm = rng.choice(linked_swarms)
        polled = rng.choice(random_swarm)
        polled_x, polled_y = polled.hypothesis
        return XY(x=perturb(polled_x),y=perturb(polled_y))

linked_swarms = [
        swarms[swarm_name]
        for swarm_name
        in linked_swarm_names]

return functools.partial(quorum_generic_hyp_fun, linked_swarms)

Defines:
    quorum_make_hyp_fun, used in chunk 31.
```

### 6.6 Quorum build new solution

```
\langle multi-swarm-solution.py 10\rangle + \equiv
31
       def quorum_build_solution31(
           state_table,
           initial_x,
           initial_y,
           agent_count,
           quorum_threshold,):
           swarms = {
                name:[sds.Agent() for _ in range(agent_count)]
                for name,_,_ in state_table
           }
           for name, swarm_type, linked_swarms in state_table:
                if swarm_type == 'init':
                    for agent in swarms[name]:
                         agent.hypothesis = XY(x=initial_x,y=initial_y)
                         agent.active = Activity(True,quorum_threshold)
                else:
                    for agent in swarms[name]:
                         agent.active = Activity(False,0)
                         agent.hypothesis = XY(x=0,y=0)
           solution = []
           for swarm_name, swarm_type, linked_swarm_names in state_table:
                action, x_condition = swarm_types[swarm_type]
                test_fun = quorum_make_test_fun<sub>29</sub>(
                    swarms,
                    linked_swarm_names,
                    action,
                    x_condition,)
                hyp_function = quorum_make_hyp_fun<sub>30</sub>(swarms, linked_swarm_names)
                previous_swarms = [
                    swarms[name]
                    for name
```

```
in linked_swarm_names]
          swarm_solution = (
               swarm_name,
               swarms[swarm_name],
               test_fun,
               hyp_function,
               previous_swarms)
          solution.append(swarm_solution)
      return solution
 quorum_build_solution, used in chunk 36.
Uses quorum_make_hyp_fun 30 and quorum_make_test_fun 29.
```

Defines:

#### 6.7 Quorum iterate

#

33

At this point, 'microtest' is a function which takes two agents (the 'current' agent, and a randomly polled agent) and returns whether their registers are valid (e.g. their x registers are the same and the y register is of 'current' is one larger than the y register of 'polled')

```
and that the 'current' agent has the correct value in its x register, which is either x=0,
x > 0 or 'dont care'.
\langle multi-swarm-solution.py 10 \rangle + \equiv
 def quorum_iterate33(solution, quorum_threshold, error_prob, allow_self_selection, rng=
      for swarm_name, swarm, microtest, hyp_function, previous_swarms in solution:
          quorum_diffusion_phase(
              swarm,
              allow_self_selection,
              quorum_threshold,
              hyp_function,
              error_prob,
              rng,
          )
          #for agent_num, agent in enumerate(swarm):
              if agent.active.active is False: # agent is inactive
                   local_polled = random.choice(swarm)
          #
                   if local_polled.active.active: # polled is active or quorate
                       agent.hypothesis = local_polled.hypothesis
                   else:
                       agent.hypothesis = hyp_function(random)
          #
              elif agent.active.count < quorum_threshold: # agent is active
          #
                   local_polled = random.choice(swarm)
          #
                   while (not allow_self_selection) and local_polled is agent:
                       local_polled = random.choice(swarm)
                   if local_polled.active.active and agent.hypothesis == local_polled.hypothesis
                       # polled is active and agent and polled share hypotheses
                       # agent becomes more active capped at quorum threshold
```

agent.active = Activity(

True,

#

```
#
                                  min(quorum_threshold,agent.active.count+1))
                     elif agent.active.count >= quorum_threshold: # agent is quorate
                #
                         # suppress a random agent from a random linked swarm
                #
                #
                         random_linked_swarm = random.choice(previous_swarms)
                         linked_polled = random.choice(random_linked_swarm)
                         linked_polled.active = Activity(False,0)
                #Quorum test phase
                quorum_test_phase<sub>25</sub>(
                     swarm,
                    previous_swarms,
                     quorum_threshold,
                    microtest,
                     error_prob,
                    rng,)
            # Halting condition
            halt_swarm = next(swarm for name,swarm,_,_, in solution if name == 'halt')
            # Halt if all agents in the halt swarm are quorate
            return all(
                (x.active.active and x.active.count >= quorum_threshold)
                for x
                in halt_swarm
            )
     Defines:
       quorum_iterate, used in chunk 36.
      Uses quorum_test_phase 25.
      \langle multi-swarm-solution.py 10\rangle + \equiv
34
       def report_swarms34(solution):
            return tuple(
                (
                    name,tuple((agent.hypothesis, agent.active)
                    for agent
                     in swarm)
                for name, swarm, _,_,_
                in solution
            )
     Defines:
       report_swarms, used in chunk 36.
```

```
\langle multi-swarm-solution.py 10\rangle + \equiv
35
         {\tt def solution\_to\_json_{35}(solution):}
             return tuple(
                   (name,
                  tuple(
                        (
                            agent.hypothesis.x,
                            agent.hypothesis.y,
                            agent.active.active,
                            agent.active.count,
                       )
                       for agent
                        in swarm
                  ))
                  for name, swarm,_,_,_
                  in solution
             )
      Defines:
         \verb"solution_to_json", used in chunk 36.
```

#### 6.8 Quorum execute

```
\langle multi-swarm-solution.py 10\rangle + \equiv
36
       def do_quorum_sensing_solution<sub>36</sub>(
            quorum_threshold,
            initial_x,
            initial_y,
            agent_count,
            error_prob,
            allow_self_selection,
            max_iterations,
       ):
            if max_iterations is None:
                repeat_generator = itertools.count()
            else:
                repeat_generator = range(max_iterations)
            solution = quorum_build_solution<sub>31</sub>(
                state_table,
                initial_x=initial_x,
                initial_y=initial_y,
                agent_count=agent_count,
                quorum_threshold=quorum_threshold,)
            iteration_states = []
            for num, repeat in enumerate(repeat_generator,start=1):
                iteration_states.append(solution_to_json<sub>35</sub>(solution))
                if quorum_iterate33(
                     solution,
                     quorum_threshold,
                     error_prob,
                     allow_self_selection,
                ):
                     halt_swarm = next(
                         swarm
                         for name, swarm,_,_,_
                         in solution
                         if name == 'halt')
                     print('Finished at iteration {r}. Answer is {a}.'.format(
                         r=repeat,
                         a=next(
                              agent
                              for agent
                              in halt_swarm
```

```
if (
                          agent.active.active
                          and agent.active.count >= quorum_threshold
                 ).hypothesis.y
             ))
             break
    else:
        print("Maximum iterations reached ({i}). No answer.".format(
             i=num
        ))
    iteration_states.append(solution_to_json<sub>35</sub>(solution))
    print(report_swarms<sub>34</sub>(solution))
    print(solution_to_json<sub>35</sub>(solution))
    return iteration_states
def get_anim(x,y,quorum_threshold,max_iterations):
    raise NotImplementedError("""\
This is out of date, use a third file to make the anim then call animate.\
""")
    animation = do_quorum_sensing_solution<sub>36</sub>(quorum_threshold, x, y,max_iterations=max_
    return animation
if __name__ == "__main__":
    animations = []
    animation_count = 10
    initial_x = 1000
    initial_y = 0
    agent_count = 10
    quorum_threshold = 100
    error_prob=0.01
    allow_self_selection = False
    max_iterations = 1000000
    for animation_num in range(animation_count):
        animation = do_quorum_sensing_solution<sub>36</sub>(
             initial_x=initial_x,
             initial_y=initial_y,
             agent_count=agent_count,
```

```
quorum_threshold=quorum_threshold,
              error_prob=error_prob,
              allow_self_selection=allow_self_selection,
              max_iterations=max_iterations,)
          metadata = {
              'num':animation_num,
              'x':initial_x,
              'y':initial_y,
              'agent count':agent_count,
              'quorum threshold':quorum_threshold,
               'error prob':error_prob,
              'allow self selection':allow_self_selection,
               'max iterations':max_iterations,
          }
          animations.append((metadata,animation))
          print('done animation {n}'.format(n=animation_num))
      with open('multi-swarm-animation.json','w') as f:
          for animation in animations:
              f.write(json.dumps(animation))
              f.write("\n")
          #json.dump(animations,f)
Defines:
 do_quorum_sensing_solution, never used.
Uses quorum_build_solution 31, quorum_iterate 33, report_swarms 34, and solution_to_json 35.
```

### 6.9 OLD Quorum summary pseudocode

39  $\langle pseudo\ quorum\ sensing\ 39 \rangle \equiv$  Do until an agent in the halt swarm hits quorum

For each swarm

For each agent # Diffusion phase

if agent's quorum count is 0 # polling is inactive

poll an agent from the same swarm

if polled agent's quorum count > 0

polling agent copies hypothesis from polled agent else

polling agent generates random hypothesis by polling a random agent from a random linked swarm and copying the hypothesis with peturbation.

For each agent # Test phase

poll an agent from a linked swarm

if polling agent has not hit quorum threshold

if polled agent has hit quorum threshold

if polling agent's registers are accurate

agent increments quorum count

else

agent sets quorum count to zero

else

do nothing

else:

 $$\operatorname{\textsc{polled}}$  agent's quorum count becomes zero Root chunk (not used in this document).

#### 6.10 Quorum summary pseudocode

 $\langle pseudo\ quorum\ sensing\ 2\ 40 \rangle \equiv$ 40 Do until an agent in the halt swarm hits quorum For each agent in swarm # Diffusion phase if agent is inactive poll an agent from local swarm if locally polled is active or quorate agent copies hypothesis from local\_polled agent else agent generates random hypothesis by copying the hypothesis, with peturbation, of remotely polled agent. else if agent is active locally poll an agent from the same swarm if locally polled is active or quorate agent becomes quorate else if agent is quorate remotely polled agent becomes inactive For each agent in swarm # Test phase if agent is quorate continue remotely poll a random agent from a random linked swarm if remotely polled agent is quorate if agent's registers are accurate agent becomes active else

 $\label{eq:agent_becomes inactive} \ensuremath{\mathsf{Root}}$  chunk (not used in this document).

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## B Code Chunks

 $\begin{array}{l} \langle \textit{multi-swarm-solution.py} \ 10 \rangle \ \ \underline{10}, \ \underline{11a}, \ \underline{11b}, \ \underline{12a}, \ \underline{12b}, \ \underline{12c}, \ \underline{13a}, \ \underline{13b}, \ \underline{14a}, \ \underline{14b}, \ \underline{15}, \ \underline{16}, \ \underline{18}, \\ \underline{19}, \ \underline{20a}, \ \underline{20b}, \ \underline{20c}, \ \underline{21}, \ \underline{22}, \ \underline{24b}, \ \underline{25}, \ \underline{27}, \ \underline{29}, \ \underline{30}, \ \underline{31}, \ \underline{33}, \ \underline{34}, \ \underline{35}, \ \underline{36} \\ \langle \textit{pseudo quorum sensing } 39 \rangle \ \ \underline{39} \\ \langle \textit{pseudo quorum sensing } 2 \ 40 \rangle \ \ \underline{40} \\ \langle \textit{quorum diffusion phase } 24a \rangle \ \ \underline{24a} \\ \langle \textit{quorum inhibit mode } 23b \rangle \ \ \underline{23b} \\ \langle \textit{quorum test phase } 23a \rangle \ \ \underline{23a} \\ \langle \textit{run-two-agent-solution.py } 9 \rangle \ \ \underline{9} \\ \langle \textit{two-agent-solution.py } 3 \rangle \ \ \underline{3}, \ \underline{4}, \ \underline{5}, \ \underline{6}, \ \underline{7}, \ \underline{8} \\ \end{array}$