

# Economic Systems Design

Using Jupyter Notebook

**Nico Rodriguez**

Creator of CafeCosmos

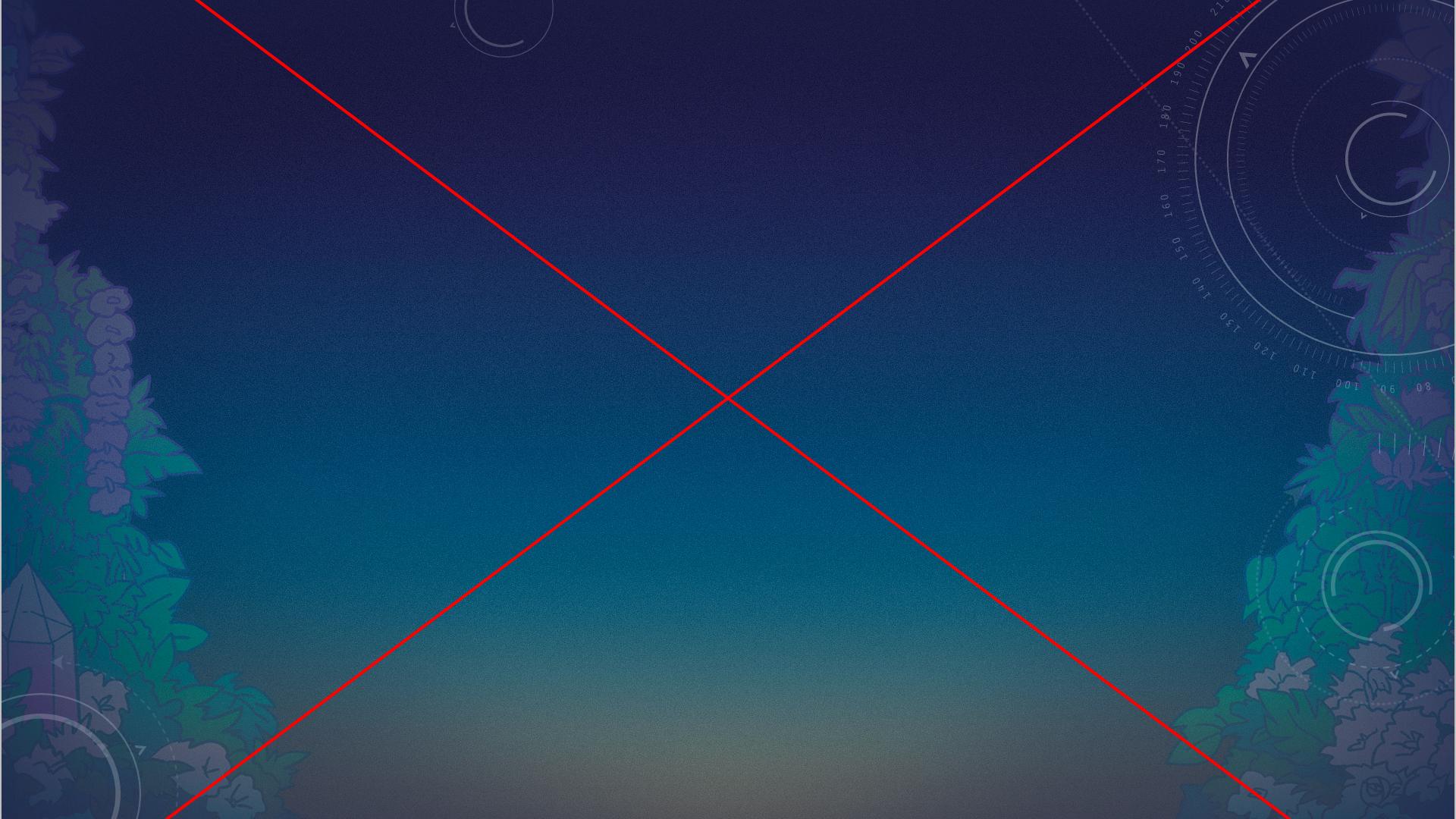


# COMPLEX SYSTEMS IN AW'S

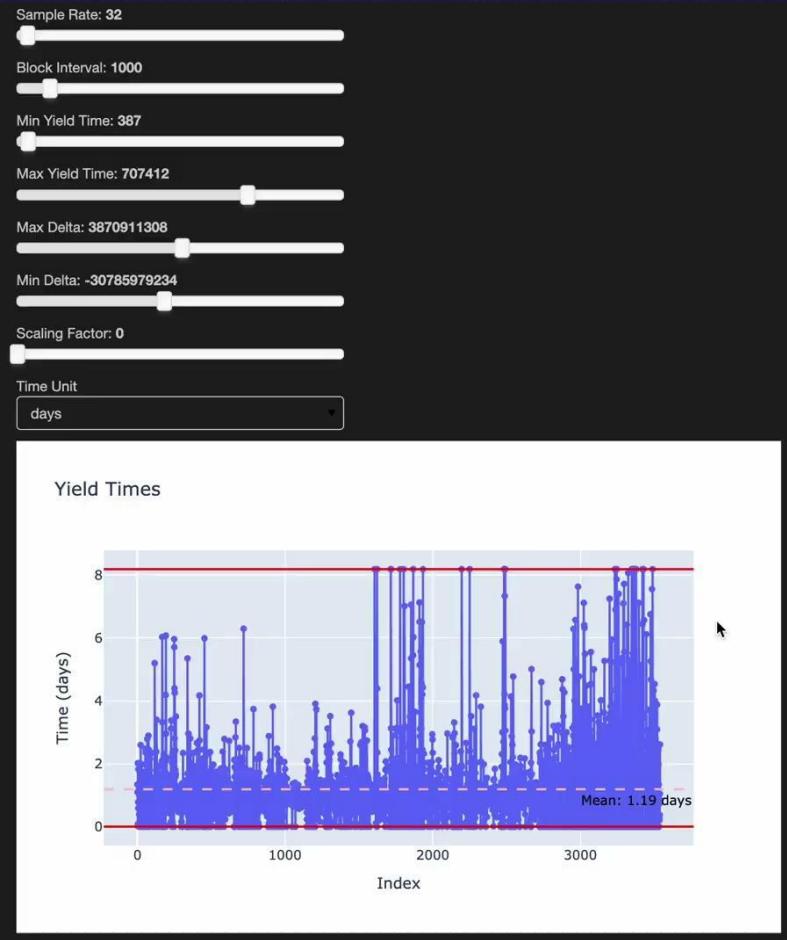
- Autonomous World's functionality as a collection of systems
- How do we build increasingly complex systems

Crafting, earning, exploring, trading, fighting,  
and more

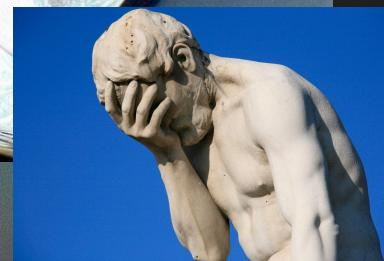
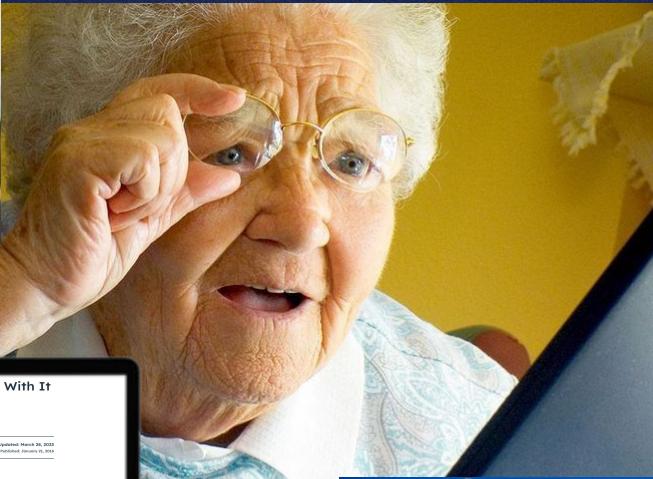
# **Every CafeCosmos system in 43 seconds**



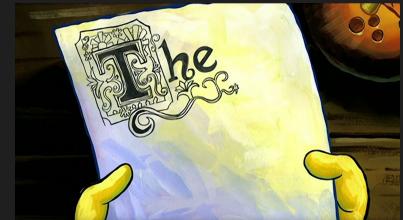
# How to make an Economic simulation for your complex system



# TRYING TO DESIGN SYSTEMS WHILE LOOKING AT A DARK IDE

A screenshot of a dark-themed code editor window titled "really\_complicated.sol". The code is as follows:

```
1 // SPDX-License-Identifier: UNLICENSED
2 pragma solidity ^0.8.0;
3
4
```

The background of the slide features a subtle floral pattern.

# INTRO: DIGITAL TWINS

"A digital copy of your system in a form you can easily simulate over and interact with" ...

...In this case, your system as a python class

The simulation will be how we manually or automatically interact with that system to acquire visual results



# INTRO: DIGITAL TWINS

State: The “mock” blockchain state

Onchain Functions: The functions on your smart contract

Display Function: How you visualize your results for your understanding

Simulation: How you quickly play with and achieve results from your system

State

Onchain Functions

Display Function

Simulation

```
1 CHUNK_SIZE = 15
2
3
4 class Land:
5
6     def __init__(self, lim_x=0, lim_y=0):
7         self.lim_x = lim_x
8         self.lim_y = lim_y
9         self.y_bound = []
10        self.plot = [[0] * lim_x for _ in range(lim_y)]
11
12    def add_chunk(self):
13        count = 0
14        for y in range(len(self.y_bound)):
15            for x in range(self.y_bound[y], self.lim_x):
16                self.initialize_slot(x, y)
17                self.y_bound[y] += 1
18            if(count == 1):
19                break
20            if(count == CHUNK_SIZE):
21                break
22
23
24
25    def initialize_slot(self, x, y):
26        self.plot[y][x] = 1
27
28    def expand_land(self, x2, y2):
29        for i in range(y2):
30            self.y_bound.append(0)
31
32        # Expand each existing row by x2
33        for row in self.plot:
34            row.extend([0] * x2)
35
36
37        # Add new rows increased by y2
38        new_rows = [0] * (self.lim_x + x2)
39        for _ in range(y2):
40            self.plot.append(new_rows[:]) # Create a copy of
41        new_rows
42
43        # Update the limits
44        self.lim_x += x2
45        self.lim_y += y2
46
47    def check_bounds(self, x, y):
48        return y < self.lim_y and x < self.y_bound[y]
49
50    def display_land(self):
51        for row in reversed(self.plot):
52            for element in row:
53                if element == 0:
54                    print("■ ", end=' ')
55                elif element == 1:
56                    print("■ ", end=' ')
57                else:
58                    print("? ", end=' ')
59            print()
60
61 land = Land()
62 land.expand_land(10, 10)
```

# WHY DO THIS:

Reduce perceived complexity while  
doing systems design

Give yourself a mental map of what  
you're doing

Visualization helps design

Faster iteration



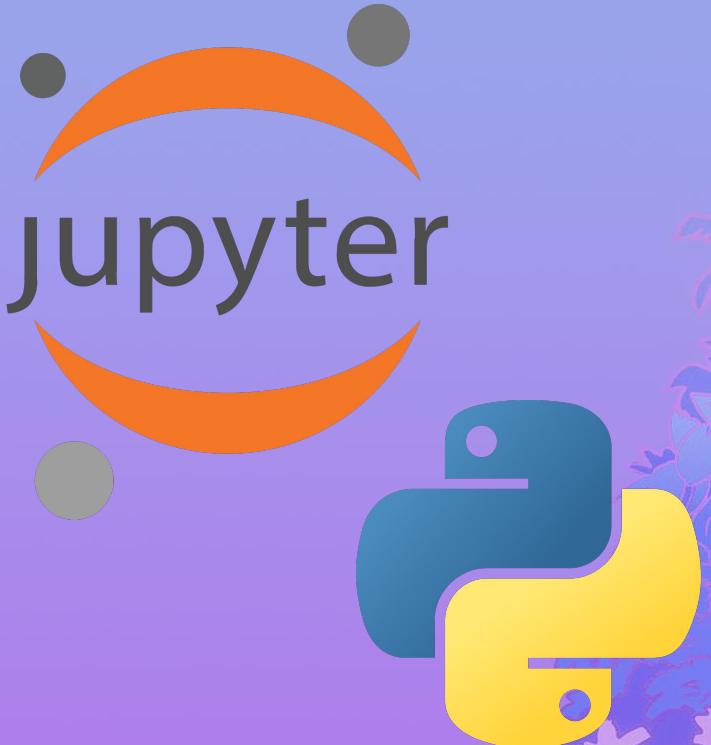
# WHY PYTHON:

Endless [interactive] data visualization  
libraries

Easy to read for others

Jupyter notebook allows for trains of  
thought through text and code

Easy to transcribe algorithms



Features  
&  
Criterion

Digital  
Twin



Iteration

Simulation



# + INTEGRATION AND A | B TESTING

Implementation



A | B Testing  
with Digital  
Twin

# DESIGNING YOUR SYSTEM: FEATURES AND CONSTRAINTS

	Feature Combination A	Feature Combination B	...
Constraint 1			
Constraint 2			
...			

# PROBLEM 1: PERLIN LAND GENERATION (MAP INITIALIZATION)

Instantiation 🐥



# PROBLEM 1: PERLIN LAND GENERATION

GENERATE ALL AT ONCE

	Load all at once
gas doesn't run out	
simple algorithm	✓
Looks good	✓



# PROBLEM 1: PERLIN LAND GENERATION

GENERATE ALL AT ONCE

```
function load_land(uint256 x_lim, uint256 y_lim, uint256 seed) internal
{
    for(uint256 y = 0; y < y_lim; y++){
        for(uint256 x = 0; x < x_lim; x++){
            uint256 itemInSlot = calculatePerlinAndGetItem(x, y, seed);
            landSlot.set(x, y, itemInSlot);
        }
    }
}
```



```
[1056943993] CounterTest::test_Increment()
└─ [1056936571] Counter::increment()
   └─ ← [OutOfGas] EvmError: OutOfGas
   ← [Revert] EvmError: Revert
```

# PROBLEM 1: PERLIN LAND GENERATION

GENERATE ALL AT ONCE

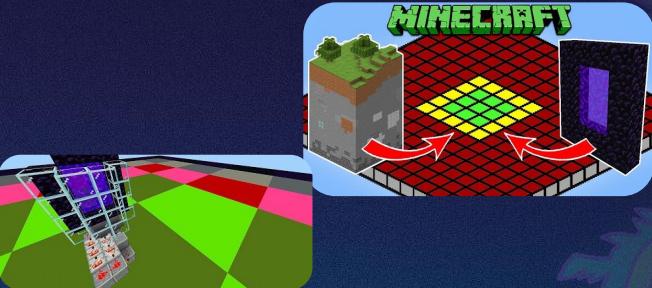
	Load all at once
gas doesn't run out	✗
simple algorithm	✓
Looks good	✓



```
[1056943993] CounterTest::test_Increment()  
└─ [1056936571] Counter::increment()  
   └─ ← [OutOfGas] EvmError: OutOfGas  
   ← [Revert] EvmError: Revert
```

# PROBLEM 1: PERLIN LAND GENERATION

STATIC SIZE + SQUARE CHUNK LOADING



	Load all at once	Static size + square chunk loading
gas doesn't run out	✗	~✓
simple algorithm	✓	
Looks good	✓	✓



# PROBLEM 1: PERLIN LAND GENERATION

STATIC SIZE + SQUARE CHUNK LOADING

MOCKING UP WITH JUPYTER NOTEBOOK

	Load all at once	Static size + square chunk loading
gas doesn't run out	✗	~✓
simple algorithm	✓	
Looks good	✓	✓



# YOU HAVE TO UNROLL THE SQUARE

TOO COMPLICATED?

YUP

	Load all at once	Static size + square chunk loading
gas doesn't run out	✗	~✓
simple algorithm	✓	✗
Looks good	✓	✓

```
 1  def place_chunk(self):
 2      if self.ts_full():
 3          return False
 4
 5      # Try to find next available position
 6      row, col = self.next_position
 7      placed = False
 8
 9      while row < self.length and not placed:
10          while col < self.width and not placed:
11              if self.can_place_chunk(row, col):
12                  # Fill the chunk area with current_fill value
13                  for i in range(row, row + self.chunk_size):
14                      for j in range(col, col + self.chunk_size):
15                          self.grid[i][j] = self.current_fill
16
17                  placed = True
18                  # Update next position to try
19                  self.next_position = (row, col + self.chunk_size)
20                  if col + self.chunk_size >= self.width:
21                      self.next_position = (row + self.chunk_size,
22 0)
22
23                  else:
24                      col += 1
25
26                  if not placed:
27                      row += 1
28                      col = 0
29
30
31      return placed
```

```
After placing chunk:  
1 1 0 0 0 0  
1 1 0 0 0 0  
0 0 0 0 0 0  
0 0 0 0 0 0  
0 0 0 0 0 0  
  
After placing chunk:  
1 1 2 2 0 0  
1 1 2 2 0 0  
0 0 0 0 0 0  
0 0 0 0 0 0  
0 0 0 0 0 0  
  
After placing chunk:  
1 1 2 2 3 3  
1 1 2 2 3 3  
0 0 0 0 0 0  
0 0 0 0 0 0  
0 0 0 0 0 0  
  
After placing chunk:  
1 1 2 2 3 3  
1 1 2 2 3 3  
4 4 0 0 0 0  
4 4 0 0 0 0  
0 0 0 0 0 0  
  
After placing chunk:  
1 1 2 2 3 3  
1 1 2 2 3 3  
4 4 5 5 0 0  
4 4 5 5 0 0  
0 0 0 0 0 0  
  
After placing chunk:  
1 1 2 2 3 3  
1 1 2 2 3 3  
4 4 5 5 6 6  
4 4 5 5 6 6  
0 0 0 0 0 0  
  
Cannot place more chunks!
```

# PROBLEM 1: PERLIN LAND GENERATION

## STATIC SIZE + LINEAR CHUNK LOADING



	Load all at once	Static size + square chunk loading	Static size + Linear Loading
gas doesn't run out	✗	~✓	
simple algorithm	✓	✗	
Looks good	✓	✓	~✓

# PROBLEM 1: PERLIN LAND GENERATION

## STATIC SIZE + LINEAR CHUNK LOADING

Linear

```
● ● ●  
1  def add_chunk(self):  
2      count = 0  
3      for y in range(len(self.y_bound)):  
4          for x in range(self.y_bound[y],  
5 self.lim_x):    self.initialize_slot(x, y)  
6          self.y_bound[y] += 1  
7          count += 1  
8          if(count == CHUNK_SIZE):  
9              break  
10         if(count == CHUNK_SIZE):  
11             break  
12
```

Square

```
● ● ●  
1  def place_chunk(self):  
2      if self.is_full():  
3          return False  
4  
5      # Try to find next available position  
6      row, col = self.next_position  
7      placed = False  
8  
9      while row < self.length and not placed:  
10         while col < self.width and not placed:  
11             if self.can_place_chunk(row, col):  
12                 # Fill the chunk area with current_fill value  
13                 for j in range(row, row + self.chunk_size):  
14                     for i in range(col, col + self.chunk_size):  
15                         self.grid[i][j] = self.current_fill  
16  
17                 placed = True  
18                 # Update next position to try  
19                 self.next_position = (row, col + self.chunk_size)  
20                 if col + self.chunk_size >= self.width:  
21                     self.next_position = (row + self.chunk_size,  
22 0)  
23                 else:  
24                     col += 1  
25                 if not placed:  
26                     row += 1  
27                     col = 0  
28  
29     return placed
```

# PROBLEM 1: PERLIN LAND GENERATION

## STATIC SIZE + LINEAR CHUNK LOADING



```
1  def add_chunk(self):
2      count = 0
3      for y in range(len(self.y_bound)):
4          for x in range(self.y_bound[y],
5 self.lim_x):    self.initialize_slot(x, y)
6          self.y_bound[y] += 1
7          count += 1
8          if(count == CHUNK_SIZE):
9              break
10         if(count == CHUNK_SIZE):
11             break
12
```

	Load all at once	Static size + square chunk loading	Static size + Linear Loading
gas doesn't run out	✗	~✓	~✓
simple algorithm	✓	✗	✓
Looks good	✓	✓	~✓

# MAKING A DIGITAL TWIN!



State

Onchain  
Functions

Display  
Function

Initialization

```
1 CHUNK_SIZE = 15
2
3
4 class Land:
5
6     def __init__(self, lim_x=0, lim_y=0):
7         self.lim_x = lim_x
8         self.lim_y = lim_y
9         self.y_bound = []
10        self.plot = [[0]] * lim_x for _ in range(lim_y)]
11
12    def add_chunk(self):
13        count = 0
14        for y in range(len(self.y_bound)):
15            for x in range(self.y_bound[y], self.lim_x):
16                self.initialize_slot(x, y)
17                self.y_bound[y] += 1
18                count += 1
19                if(count == CHUNK_SIZE):
20                    break
21                if(count == CHUNK_SIZE):
22                    break
23
24
25
26    def initialize_slot(self, x, y):
27        self.plot[y][x] = 1
28
29    def expand_land(self, x2, y2):
30        for i in range(y2):
31            self.y_bound.append(0)
32
33        # Expand each existing row by x2
34        for row in self.plot:
35            row.extend([0] * x2)
36
37        # Add new rows increased by y2
38        new_rows = [0] * (self.lim_x + x2)
39        for _ in range(y2):
40            self.plot.append(new_rows[:]) # Create a copy of
41        new_rows
42
43        # Update the limits
44        self.lim_x += x2
45        self.lim_y += y2
46
47    def check_bounds(self, x, y):
48        return y < self.lim_y and x < self.y_bound[y]
49
50    def display_land(self):
51        for row in reversed(self.plot):
52            for element in row:
53                if element == 0:
54                    print(" ", end=' ')
55                elif element == 1:
56                    print("■", end=' ')
57                else:
58                    print("?", end=' ')
59            print()
60
61 land = Land()
62 land.expand_land(10, 10)
```

# PROBLEM 1: PERLIN LAND GENERATION

## STATIC SIZE + LINEAR CHUNK LOADING

notebooks > Chunks.ipynb > ...

Generate + Code + Markdown | Run All | Restart | Clear All Outputs | Variables | Outline | ...

```
# Update the limits
self.lim_x += x2
self.lim_y += y2

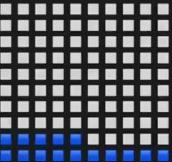
def check_bounds(self, x, y):
    return y < self.lim_y and x < self.y_bound[y]

def display_land(self):
    for row in reversed(self.plot):
        for element in row:
            if element == 0:
                print("■", end=' ')
            elif element == 1:
                print("■■", end=' ')
            else:
                print("?", end=' ')
        print()

land = Land()
land.expand_land(10, 10)
```

[24] ✓ 0.0s

...



```
land.add_chunk()
land.display_land()
```

[ ]

```
land.check_bounds(5, 9)
```

[20] ✓ 0.0s

... True

# PROBLEM 1: PERLIN LAND GENERATION

## STATIC SIZE + LINEAR CHUNK LOADING

	Load all at once	Static size + square chunk loading	Static size + Linear Loading
gas doesn't run out	✗	~✓	~✓
simple algorithm	✓	✗	✓
Looks good	✓	✓	~✓

# PROBLEM 1: PERLIN LAND GENERATION

## DYNAMIC SIZE + LINEAR CHUNK LOADING

	Load all at once	Static size + square chunk loading	Static size + Linear Loading	Dynamic size + Linear Loading + multiple tx's from frontend
gas doesn't run out	✗	~✓	~✓	✓
simple algorithm	✓	✗	✓	✓
Looks good	✓	✓	~✓	✓

# PROBLEM 1: PERLIN LAND GENERATION

## DYNAMIC SIZE + LINEAR CHUNK LOADING

```
1   function generateChunk(uint256 landId) public onlyLandOperator(landId)
2 {   uint256 count = 0;
3     uint256[] memory yBounds = LandInfo.getYBound(landId);
4     uint256 limitX = LandInfo.getLimitX(landId);
5
6     for (uint256 y = 0; y < yBounds.length; y++) {
7       uint256 ybound = yBounds[y];
8       for (uint256 x = ybound; x < limitX; x++) {
9         ybound = ybound + 1;
10        initialiseItem(landId, x, y);
11        LandInfo.updateYBound(landId, y, ybound);
12        count++;
13        break;
14      }
15      if (gasleft() < 10000) {
16        break;
17      }
18    }
19 }
```



# A | B TESTING

- Acquire same state in digital twin and implementation
- Create assertions to validate same results when running same functions

## Solidity



```
1 land.generateChunk(landId);
2 Assert(land.checkBounds(0,7))
```

## Python

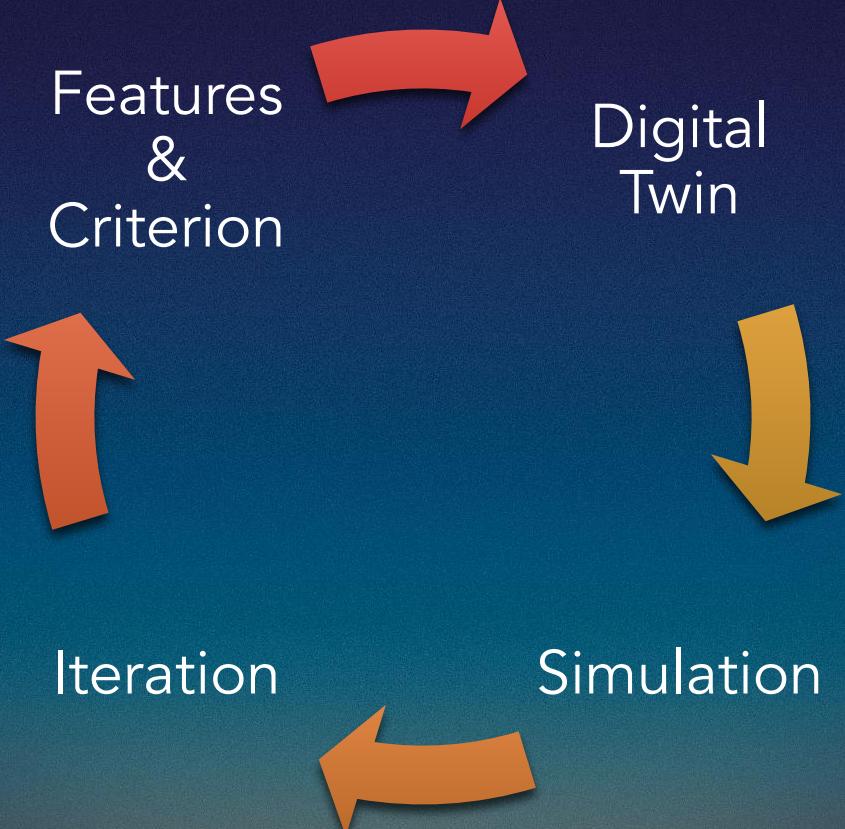


```
1 land.generateChunk(landId);
2 land.checkBounds(0,7)
3
4 >> True
```

Bringing it  
back...

Features  
&  
Criterion

Digital  
Twin



# + INTEGRATION AND A | B TESTING

Implementation



A | B Testing  
with Digital  
Twin

# PROBLEM 2: IN GAME ITEM INFLATION



## PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry
Bot resistant	✗
simple algorithm	✓
Looks good	✓
Feels natural	✓
Not too upsetting	✓
Doesn't require oracle	✓
Requires Strategy	✗

## PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry
Bot resistant	✗
simple algorithm	✓
Looks good	✓
Feels natural	✓
Not too upsetting	✓
Doesn't require oracle	✓
Requires Strategy	✗



## PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry	Food expiry + Tree disease at random
Bot resistant	✗	~✓
simple algorithm	✓	✗
Looks good	✓	✓
Feels natural	✓	✓
Not too upsetting	✓	✗
Doesn't require oracle	✓	✗
Requires Strategy	✗	✗



# PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry	Food expiry + Tree disease at random	Rain allows produce to grow at random
Bot resistant	✗	~✓	~✓
simple algorithm	✓	✗	✗
Looks good	✓	✓	✓
Feels natural	✓	✓	✓
Not too upsetting	✓	✗	✗
Doesn't require oracle	✓	✗	✗
Requires Strategy	✗	✗	✗



# PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry	Food expiry + Tree disease at random	Rain allows produce to grow at random	Plants require water to grow and the time of water well extraction is based on the derivate of gas with an oracle
Bot resistant	✗	~✓	~✓	✓
simple algorithm	✓	✗	✗	✗
Looks good	✓	✓	✓	✓
Feels natural	✓	✓	✓	✓
Not too upsetting	✓	✗	✗	~✓
Doesn't require oracle	✓	✗	✗	✗
Requires Strategy	✗	✗	~✗	✓

# PROBLEM 2: IN GAME ITEM INFLATION

	Food expiry	Food expiry + Tree disease at random	Rain allows produce to grow at random	Plants require water to grow and the time of water well extraction is based on the derivate of gas with an oracle	Plants require water to grow and the time of water well extraction is based on the derivate of eth with storage proofs
Bot resistant	✗	~✓	~✓	✓	✓
simple algorithm	✓	✗	✗	✗	~✓
Looks good	✓	✓	✓	✓	✓
Feels natural	✓	✓	✓	✓	✓
Not too upsetting	✓	✗	✗	~✓	~✓
Doesn't require oracle	✓	✗	✗	✗	✓
Requires Strategy	✗	✗	✗	✓	✓

- Plants require **water** to **grow** AND the time of water well extraction is based on the **derivative** of eth proven with storage proofs



# VARIABLES

- Block Intervals for TWAPs

Base fees (60s) = [\$5.69, \$4.75, \$4.49, \$4.51, \$4.56, \$4.61, \$7.69]

# VARIABLES

- Block Intervals for TWAPs

Block Interval = 3

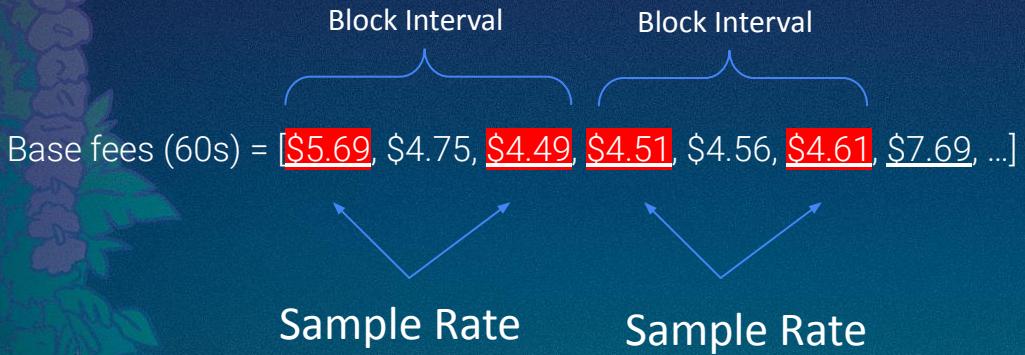
Block Interval      Block Interval

The diagram illustrates a sequence of fees: [\$5.69, \$4.75, \$4.49, \$4.51, \$4.56, \$4.61, \$7.69, ...]. Two blue curly braces group the first four fees and the last three fees respectively, labeled 'Block Interval' above each group. This visualizes how fees are aggregated over time intervals.

Base fees (60s) = [\$5.69, \$4.75, \$4.49, \$4.51, \$4.56, \$4.61, \$7.69, ...]

# VARIABLES

- Block Intervals for TWAP's
- Sample Rate for TWAP's



Block Interval = 3

Sample Rate = 2

# VARIABLES

- Block Intervals for TWAP's
- Sample Rate for TWAP's
- Min Yield Time
- Max Yield Time

How long can we bear at the slowest,  
How little can we wait at the fastest



# VARIABLES

- Block Intervals for TWAP's
- Sample Rate for TWAP's
- Min Yield Time
- Max Yield Time
- Min Delta
- Max Delta

How much change are we willing to tolerate at highest and at lowest?



# SET VARIABLES

```
1 NUM_SAMPLES = 32
2 BLOCK_INTERVAL = 1000
3 MIN_YIELD_TIME = 387
4 MAX_YIELD_TIME = 707412
5 MIN_DELTA = -54067095249
6 MAX_DELTA = 3870911308
7 OBSERVATION_PERIOD = BLOCK_INTERVAL*2*365
```

# STEP 0: LET'S GET SOME DATA!

# STEP 0: LET'S GET SOME DATA!

- Use Alchemy's API to download every basefee ever!

.. YES IT'S THERE

```
1 import csv
2
3 # Define the file path
4 file_path = './data/dl_fees.csv'
5
6 # Write the dl_fees_int array to the CSV file
7 with open(file_path, 'w', newline='') as file:
8     writer = csv.writer(file)
9     writer.writerow(dl_fees_int)
10
```

```
 1 def get_fees(blocks: int, latest_block: str):
 2     assert blocks < 1025
 3     payload = {
 4         "id": 1,
 5         "jsonrpc": "2.0",
 6         "method": "eth_feeHistory",
 7         "params": [blocks, latest_block]
 8     }
 9     headers = {
10         "accept": "application/json",
11         "content-type": "application/json"
12     }
13
14     response = requests.post(url, json=payload, headers=headers)
15
16     print(response.text)
17     data = response.json()
18
19     return (data['result'][0]['oldestBlock'], data['result'][0]['baseFeePerGas'])
20
21 def download_fees():
22     fees = []
23     cur_top = LATEST_BLOCK
24     for i in range(OBSERVATION_PERIOD//1024):
25         res = get_fees(1024, cur_top)
26         cur_top = hex(int(cur_top,16) - i*1024)
27         if(res[1][0]=="0x0"):
28             break
29         fees = fees + res[1]
30     print("fees array length: ", len(fees))
31     print("current block: ", int(cur_top,16))
32     print("Done!", int(cur_top,16), int(LATEST_BLOCK,16), (int(LATEST_BLOCK,16) - int(cur_top,16)))
33
34
```

# STEP 0: SAVE THE DATA TO A CSV

```
1 import csv
2
3 # Define the file path
4 file_path = './data/dl_fees.csv'
5
6 # Write the dl_fees_int array to the CSV file
7 with open(file_path, 'w', newline='') as file:
8     writer = csv.writer(file)
9     writer.writerow(dl_fees_int)
10
```

# ALGO 1: TWAP CALCULATION

```
1 def downsample_array(arr, block_interval=1000, sample_rate=32):
2     downsampled = []
3
4     for start in range(0, len(arr), block_interval):
5         end = start + block_interval
6         chunk = arr[start:end]
7
8         for i in range(0, len(chunk), sample_rate):
9             sample = chunk[i:i + sample_rate]
10            average = sum(sample) / len(sample) if sample else 0
11            downsampled.append(average)
12
13 return downsampled
```

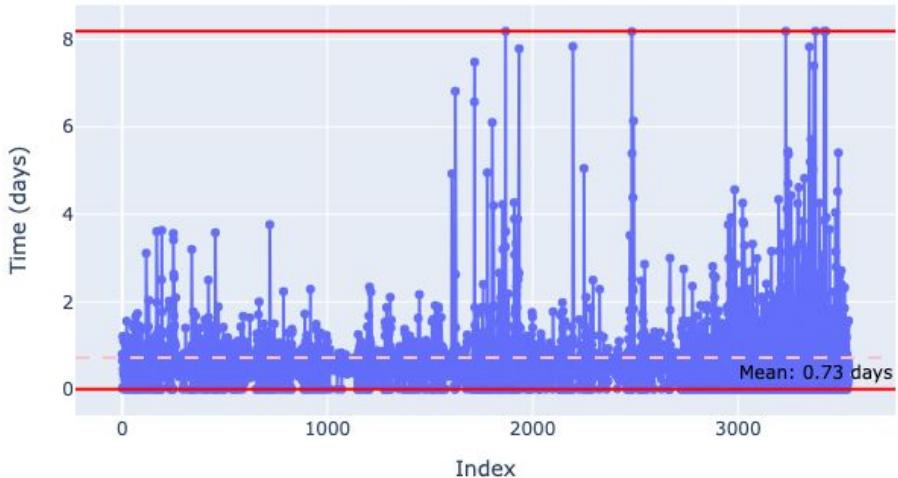
# ALGO 2: FROM TWAP'S TO YIELD TIMES

```
1 def map_delta_to_yield_time(delta, max_delta=MAX_DELTA, min_delta=MIN_DELTA, min_yield_time=MIN_YIELD_TIME,
2                             max_yield_time=MAX_YIELD_TIME):
3     # ensure delta is within the specified range
4     if delta < min_delta:
5         delta = min_delta
6     elif delta > max_delta:
7         delta = max_delta
8
9     # linear interpolation formula
10    #  $y = y_1 + (x - x_1) * ((y_2 - y_1) / (x_2 - x_1))$ 
11    #yield_time = min_yield_time + (delta - min_delta) * ((max_yield_time - min_yield_time) / (max_delta - min_delta))
12
13    #inverse
14    yield_time = max_yield_time - (delta - min_delta) * ((max_yield_time - min_yield_time) / (max_delta - min_delta))
15
16    return yield_time
17
18
19 def generate_yield_times(downscaled_data, max_delta=152e9, min_delta=-116e9, min_yield_time=MIN_YIELD_TIME,
20                         max_yield_time=MAX_YIELD_TIME):
21
22     deltas = [downscaled_data[i] - downscaled_data[i - 1] for i in range(1, len(downscaled_data))]
23     yield_times = [map_delta_to_yield_time(element, max_delta, min_delta, min_yield_time, max_yield_time) for element in deltas]
24
25     return yield_times
26
27
28 def fees_to_yields(fees, sample_rate, block_interval, min_yield_time_, max_yield_time_, min_delta_, max_delta_):
29
30     downsampled = downsample_array(fees, period=block_interval, sample_size=sample_rate)
31     yield_times = generate_yield_times(downscaled, min_yield_time=min_yield_time_, max_yield_time=max_yield_time_,
32                                       min_delta=min_delta_, max_delta=max_delta_)
33
34     return yield_times
```

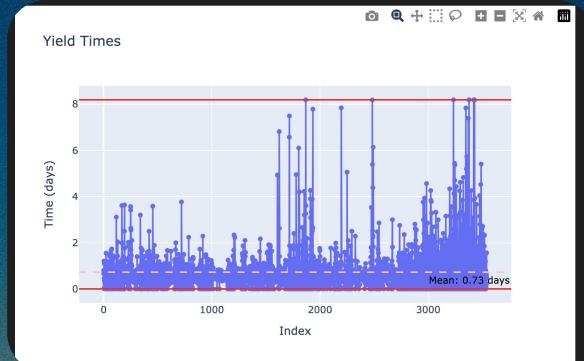
# SO, WHAT NOW

# VISUALIZATION

Yield Times

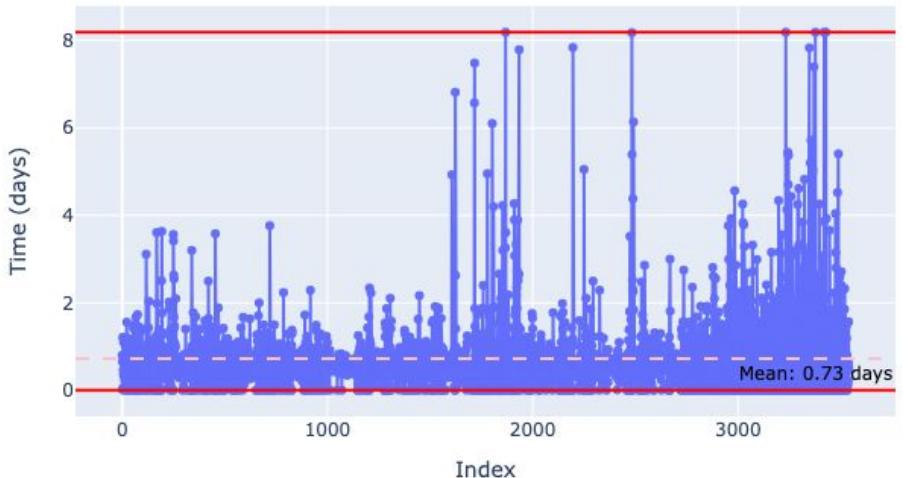


# VISUALIZATION



# VISUALIZATION

## Yield Times



```
1 # Create the plotting function
2 def plot_yield_times(sample_rate = NUM_SAMPLES, block_interval = BLOCK_INTERVAL, min_yield_time = MIN_YIELD_TIME, max_yield_time =
3     MAX_YIELD_TIME, max_delta = MAX_DELTA, min_delta=MIN_DELTA):
4     # Extracting fees from fees_int with your actual data
5     fees = d1_fees_int
6
7     yield_times = fees_to_yields(fees, sample_rate, block_interval, min_yield_time, max_yield_time, min_delta, max_delta)
8
9     fig.update(layouttitles='Yield Times', xaxis.title='Index', yaxis.title='Time (s)')
10    return fig
11
12 def plot_yield_times(sample_rate=NUM_SAMPLES, block_interval=BLOCK_INTERVAL,
13     min_yield_time=MIN_YIELD_TIME, max_yield_time=MAX_YIELD_TIME,
14     max_delta=MAX_DELTA, min_delta=MIN_DELTA, scaling_factor=1, time_unit='seconds'):
15    # Fetching the fees data (Replace d1_fees_int with your actual data)
16    fees = d1_fees_int
17
18    baseline = np.mean(fees)
19    fees = fees + (fees - baseline) * scaling_factor # scaling_factor > 0
20
21    fees = [int(x) for x in fees.tolist()]
22    # Fees = l1 - shift if l1 < baseline else l1 for l1 in fees
23
24    # Generating yield times based on the input parameters
25    yield_times = fees_to_yields(fees, sample_rate, block_interval, min_yield_time, max_yield_time, min_delta, max_delta)
26
27    time_factor = 1
28    # Convert yield-times to the specified time unit (seconds, hours, days)
29    if time_unit == 'seconds':
30        time_factor = 3600
31        yield_times = [y / time_factor for y in yield_times] # Converting seconds to hours
32    elif time_unit == 'hours':
33        time_factor = 3600
34        yield_times = [y / time_factor for y in yield_times] # Converting seconds to days
35        yaxis_title = 'Time (days)' # Setting the y-axis title to days
36    else:
37        yaxis_title = 'Time (s)' # Default y-axis title for seconds
38
39    # Creating a Plotly figure with the processed data
40
41    fig = go.Figure()
42    fig.add_trace(go.Scatter(y=yield_times, mode='lines+markers', name='Yield Times'))
43
44    # Updating the layout of the figure with appropriate titles
45    fig.update_layout(title='Yield Times', xaxis.title='Index', yaxis.title=yaxis_title)
46
47    fig.add_hline(y=min_yield_time/time_factor, line_color="red")
48    fig.add_hline(y=max_yield_time/time_factor, line_color="red")
49
50    mean_yield_time = np.mean(yield_times)
51    fig.add_hline(y=mean_yield_time, line_dash="dash", line_color="green", annotation_text="Mean Yield Time",
52                  annotation_position="bottom right")
53    annotation_text_f_mean = f"Mean Yield Time: {mean_yield_time:.2f} {time_unit}"
54    annotation_pos_f_mean = "bottom right"
55    annotation_text_c_mean = "black"
56
57
58    return fig
59
60 # Adding a new Panel widget for selecting the time unit
61 time_unit_selector = pn.widgets.Select(name='Time Unit', options=['seconds', 'hours', 'days'])
62
63 sample_rate_slider = pn.widgets.IntSlider(name='Sample Rate', start=1, end=BLOCK_INTERVAL, step=1, value=NUM_SAMPLES)
64 block_interval_slider = pn.widgets.IntSlider(name='Block Interval', start=1, end=10000, step=1, value=BLOCK_INTERVAL)
65 min_yield_time_slider = pn.widgets.FloatSlider(name='Min Yield Time', start=0, end=10000, step=1, value=MIN_YIELD_TIME)
66 max_yield_time_slider = pn.widgets.FloatSlider(name='Max Yield Time', start=10000, end=100000000, step=1, value=MAX_YIELD_TIME)
67 max_delta_slider = pn.widgets.FloatSlider(name='Max Delta', start=3100000000000, end=1000000000000, step=1, value=MAX_DELTA)
68 scaling_factor_slider = pn.widgets.FloatSlider(name='Scaling Factor', start=0, end=20, step=1, value=MAX_DELTA)
69
70 time_unit_selector = pn.widgets.Select(name='Time Unit', options=['seconds', 'hours', 'days'], value='days')
71
72
73 # Updating the interactive panel to include the time unit selection
74 pn.interact(plot_yield_times,
75             sample_rate=sample_rate_slider,
76             block_interval=block_interval_slider,
77             min_yield_time=min_yield_time_slider,
78             max_yield_time=max_yield_time_slider,
79             max_delta=max_delta_slider,
80             scaling_factor=scaling_factor_slider,
81             time_unit=time_unit_selector)
```

# VISUALIZATION

✿ Happy late night, Rico

Make Claude do it

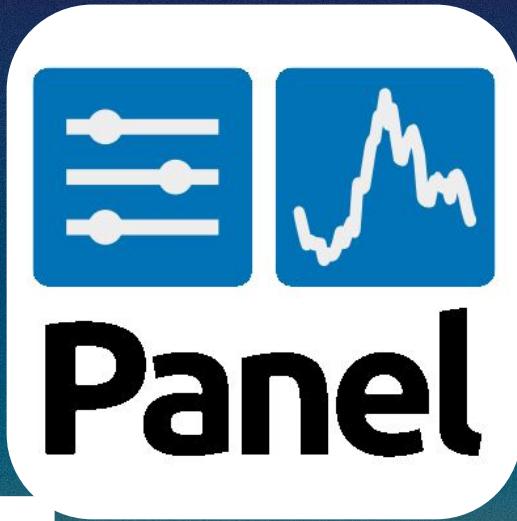
```
1 # Create the plotting function
2 def plot_yield_times(sample_rate = NUM_SAMPLES, block_interval = BLOCK_INTERVAL, min_yield_time = MIN_YIELD_TIME, max_yield_time =
3     MAX_YIELD_TIME, max_delta = MAX_DELTA, min_delta=MIN_DELTA):
4     # Example: fees.replace with your actual data
5     fees = d1_fees_int
6
7     yield_times = fees_to_yields(fees, sample_rate, block_interval, min_yield_time, max_yield_time, min_delta, max_delta)
8
9     fig.update_layout(title='Yield Times', xaxis.title='Index', yaxis.title='Time (s)')
10    return fig
11
12 def plot_yield_timessample_rate=NUM_SAMPLES, block_interval=BLOCK_INTERVAL,
13     min_yield_time=MIN_YIELD_TIME, max_yield_time=MAX_YIELD_TIME,
14     max_delta=MAX_DELTA, min_delta=MIN_DELTA, scaling_factor=1, time_unit='seconds'):
15    # Fetching the fees data (Replace d1_fees_int with your actual data)
16    fees = d1_fees_int
17
18    baseline = np.mean(fees)
19    fees = fees + ((fees - baseline) * scaling_factor) # scaling_factor > 0
20
21    fees = [l[1] - shift if l[0] == baseline else l[1] for l in fees]
22
23    # Generating yield times based on the input parameters
24    yield_times = fees_to_yields(fees, sample_rate, block_interval, min_yield_time, max_yield_time, min_delta, max_delta)
25
26    time_factor = 1
27    # Convert yield-times to the specified time unit (seconds, hours, days)
28    if time_unit == 'hours':
29        time_factor = 3600
30        yield_times = [y / time_factor for y in yield_times] # Converting seconds to hours
31        yaxis.title = 'Time (h)' # Setting the y-axis title to hours
32    elif time_unit == 'days':
33        yield_times = [y / time_factor * 86400 for y in yield_times] # Converting seconds to days
34        yaxis.title = 'Time (days)' # Setting the y-axis title to days
35    else:
36        yaxis.title = 'Time (s)' # Default y-axis title for seconds
37
38    # Creating a Plotly figure with the processed data
39
40    fig = go.Figure()
41    fig.add_trace(go.Scatter(y=yield_times, mode='lines+markers', name='Yield Times'))
42
43    # Updating the layout of the figure with appropriate titles
44    fig.update_layout(title='Yield Times', xaxis.title='Index', yaxis.title=yaxis.title)
45
46    fig.add_hline(y=min_yield_time/time_factor, line_color="red")
47    fig.add_hline(y=max_yield_time/time_factor, line_color="red")
48
49    mean_yield_time = np.mean(yield_times)
50
51    fig.add_hline(y=mean_yield_time, line_dash="dash", line_color="green", annotation_text="Mean Yield Time",
52    annotation_position="bottom right")
53    fig.add_annotation(y=mean_yield_time, line_dash="dash", line_color="pink",
54    annotation_text="Mean", yanc=mean_yield_time, xref="paper", x=0.25, yref="y"),
55    annotation_position="bottom right",
56    annotation_font_color="black")
57
58    return fig
59
60 # Adding a new Panel widget for selecting the time unit
61 time_unit_selector = pn.widgets.Select(name='Time Unit', options=['seconds', 'hours', 'days'])
62
63 sample_rate_slider = pn.widgets.IntSlider(name='Sample Rate', start=1, end=BLOCK_INTERVAL, step=1, value=NUM_SAMPLES)
64 block_interval_slider = pn.widgets.IntSlider(name='Block Interval', start=1, end=BLOCK_INTERVAL, step=1, value=BLOCK_INTERVAL)
65 min_yield_time_slider = pn.widgets.FloatSlider(name='Min Yield Time', start=0, end=10000, step=1, value=MIN_YIELD_TIME)
66 max_yield_time_slider = pn.widgets.FloatSlider(name='Max Yield Time', start=10000, end=100000000, step=1, value=MAX_YIELD_TIME)
67 min_delta_slider = pn.widgets.FloatSlider(name='Min Delta', start=0, end=100000000, step=1, value=MIN_DELTA)
68 max_delta_slider = pn.widgets.FloatSlider(name='Max Delta', start=100000000, end=100000000000, step=1, value=MAX_DELTA)
69 scaling_factor_slider = pn.widgets.FloatSlider(name='Scaling Factor', start=0, end=20, step=1, value=1)
70 time_unit_selector = pn.widgets.Select(name='Time Unit', options=['seconds', 'hours', 'days'], value='days')
71
72
73 # Updating the interactive panel to include the time unit selection
74 pn.interact(plot_yield_times,
75             sample_rate=sample_rate_slider,
76             block_interval=block_interval_slider,
77             min_yield_time=min_yield_time_slider,
78             max_yield_time=max_yield_time_slider,
79             min_delta=min_delta_slider,
80             max_delta=max_delta_slider,
81             scaling_factor=scaling_factor_slider,
82             time_unit=time_unit_selector)
```

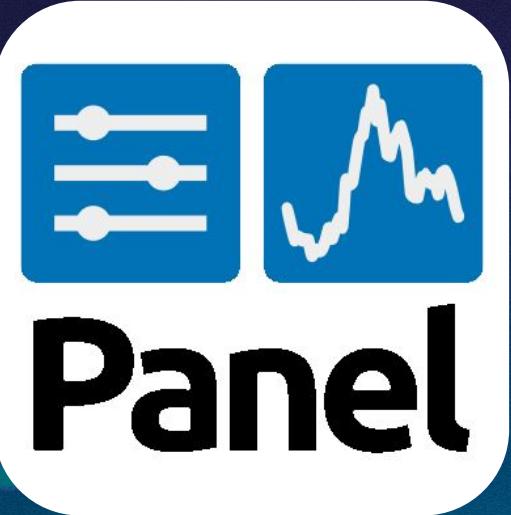
```
1 NUM_SAMPLES = 32
2 BLOCK_INTERVAL = 1000
3 MIN_YIELD_TIME = 387
4 MAX_YIELD_TIME = 707412
5 MIN_DELTA = -54067095249
6 MAX_DELTA = 3870911308
7 OBSERVATION_PERIOD = BLOCK_INTERVAL*2*365
```



## TUNING YOUR SYSTEM (PICKING THE PARAMETERS / VARIABLES)

# ENTER... PANEL





# Panel



... Sample Rate: **32**

Block Interval: **1000**

Min Yield Time: **387**

Max Yield Time: **707412**

Max Delta: **3870911308**

Min Delta: **-30785979234**

Scaling Factor: **0**

Time Unit

days



Sample Rate: 32

Block Interval: 1000

Min Yield Time: 387

Max Yield Time: 707412

Max Delta: 3870911308

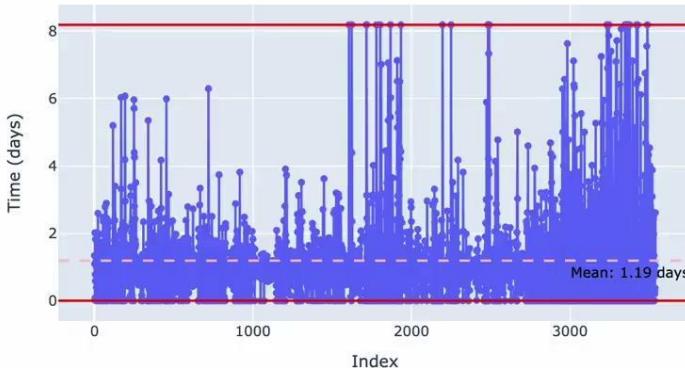
Min Delta: -30785979234

Scaling Factor: 0

Time Unit

days

### Yield Times



# + INTEGRATION AND A | B TESTING

Implementation



A | B Testing  
with Digital  
Twin

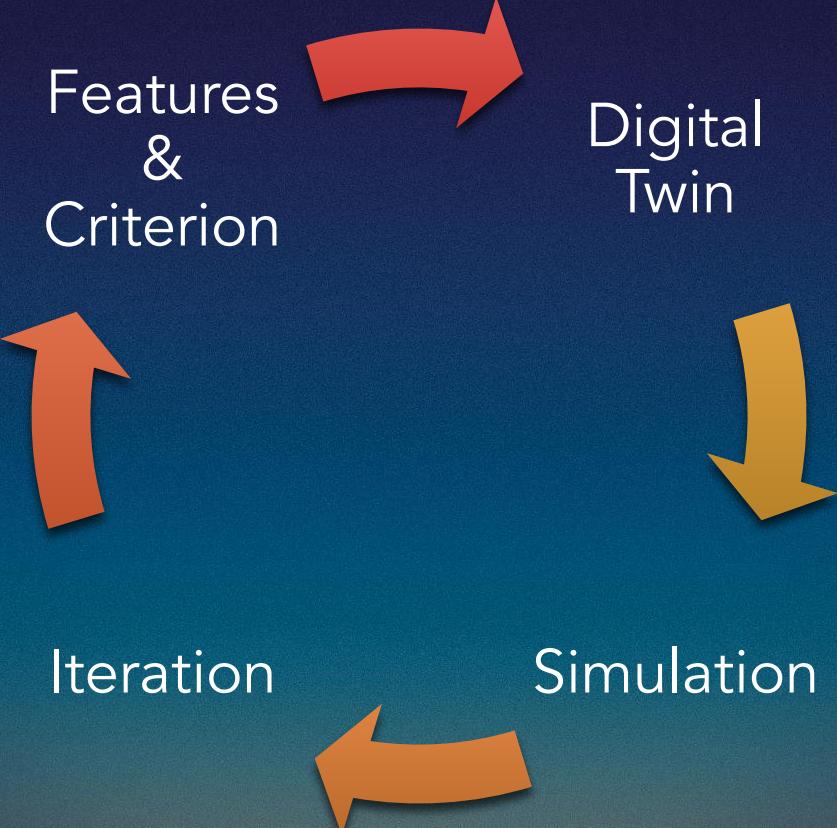
Take this away with  
you

Features  
&  
Criterion

Digital  
Twin

Iteration

Simulation





Congratulations!  
You have now officially made a complex system!

You are officially smart



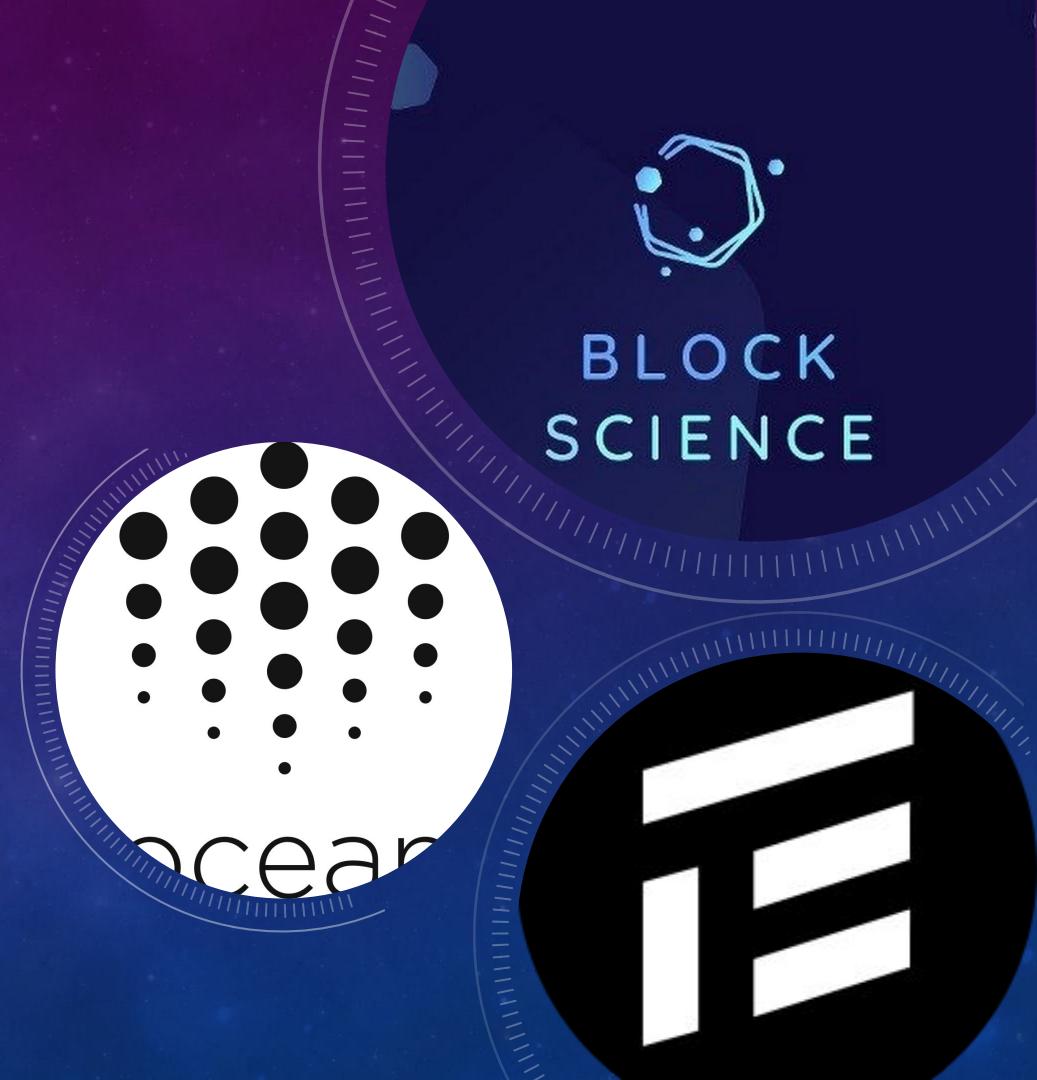
# INSPIRED BY

Trent McConaghy's:

[Ocean Market Balancer Simulations  
For TE Academy](#)

Shawn Anderson and Longtail  
Financial

The Token Engineering Academy  
BlockScience



# FURTHER READING



**cadCAD**  
by BlockScience

## cadCAD

An open-source Python package that assists in the processes of designing, testing and validating complex systems through simulation.

TRY  
IT

JOIN OUR  
COMMUNITY

# THANK YOU



Nico Rodriguez  
Creator of CafeCosmos  
[x.com/CafeCosmosHQ](https://x.com/CafeCosmosHQ)

