notebook-experiment-shocks

February 9, 2021

1 Experiment Analysis: Controller parameter stability search

Perform shocks of ETH price to test controller parameter stability, without stochastic processes.

• See experiments/system_model_v3/experiment_shocks.py

2 Setup and Dependencies

```
[1]: # Set project root folder, to enable importing project files from subdirectories
from pathlib import Path
import os

path = Path().resolve()
root_path = str(path).split('notebooks')[0]
os.chdir(root_path)

# Force reload of project modules, sometimes necessary for Jupyter kernel
%load_ext autoreload
%autoreload 2

# Display framework versions for easy debugging
%pip show cadCAD
%pip show radcad
```

Name: cadCAD Version: 0.4.23

Summary: cadCAD: a differential games based simulation software package for research, validation, and Computer Aided Design of economic systems

Home-page: https://github.com/cadCAD-org/cadCAD

Author: Joshua E. Jodesty

Author-email: joshua@block.science

License: LICENSE.txt

Location: /home/bscholtz/workspace/reflexer/venv/lib/python3.8/site-packages

Requires: fn, funcy, pandas, pathos

Required-by:

Note: you may need to restart the kernel to use updated packages.

Name: radcad Version: 0.5.4

```
Summary: A cadCAD implementation, for dynamical systems modelling & simulation
    Home-page: None
    Author: Benjamin Scholtz
    Author-email: ben@bitsofether.com
    License: None
    Location: /home/bscholtz/workspace/reflexer/venv/lib/python3.8/site-packages
    Requires: boto3, pandas, ray, pathos, tables
    Required-by:
    Note: you may need to restart the kernel to use updated packages.
[2]: # Import all shared dependencies and setup
     from shared import *
     import plotly.express as px
     import plotly.graph_objects as go
     from plotly.subplots import make_subplots
     # import plotly.io as pio
     # pio.renderers.default = "pnq"
     from pprint import pprint
[3]: # Update dataframe display settings
     pd.set_option('display.max_columns', 100)
     pd.set_option('display.max_rows', 50)
        Load Results
    3
    Using the experiment logs, select the experiment of interest from the specific HDF5 store file (these
    datasets are very large, and won't be committed to repo):
[4]: # experiment_results = 'experiments/system_model_v3/experiment_controller_sweep/
     \rightarrow experiment_results.hdf5'
     experiment_results = 'experiments/system_model_v3/experiment_shocks/
      ⇔experiment_results.hdf5'
[5]: experiment results keys = []
     with pd.HDFStore(experiment_results) as store:
         experiment_results_keys = list(filter(lambda x: "results" in x, store.
      →keys()))
         exceptions_keys = list(filter(lambda x: "exceptions" in x, store.keys()))
[6]: # A list of all experiment result keys
```

experiment_results_keys

[6]: ['/processed_results_2021-02-08T19:20:25.053328',

'/processed_results_2021-02-08T19:45:15.538863',
'/processed_results_2021-02-08T20:05:35.827550',
'/processed_results_2021-02-08T22:54:43.005952',

```
'/processed_results_2021-02-08T23:20:54.834451',
      '/processed_results_2021-02-09T09:43:01.154807',
      '/results_2021-02-08T19:11:14.829535',
      '/results_2021-02-08T19:20:25.053328',
      '/results_2021-02-08T19:45:15.538863',
      '/results_2021-02-08T20:05:35.827550',
      '/results 2021-02-08T22:54:43.005952',
      '/results_2021-02-08T23:20:54.834451',
      '/results 2021-02-09T09:43:01.154807',
      '/results_2021-02-09T11:44:24.150805',
      '/results 2021-02-09T11:48:54.447990',
      '/results_2021-02-09T11:56:55.060726',
      '/results 2021-02-09T11:59:26.345803']
[7]: # A list of all experiment result exception keys
     exceptions_keys
[7]: ['/exceptions 2021-02-08T19:11:14.829535',
      '/exceptions_2021-02-08T19:20:25.053328',
      '/exceptions_2021-02-08T19:45:15.538863',
      '/exceptions_2021-02-08T20:05:35.827550',
      '/exceptions_2021-02-08T22:54:43.005952',
      '/exceptions_2021-02-08T23:20:54.834451',
      '/exceptions_2021-02-09T09:43:01.154807',
      '/exceptions_2021-02-09T11:44:24.150805',
      '/exceptions 2021-02-09T11:48:54.447990',
      '/exceptions_2021-02-09T11:56:55.060726',
      '/exceptions_2021-02-09T11:59:26.345803']
[8]: # Copy a results_ key from the above keys to select the experiment
     experiment_results_key = 'results_2021-02-09T11:59:26.345803' # 0r select last_\(\text{last}\)
     →result: experiment_results_keys[-1]
     experiment_timestamp = experiment_results_key.strip('results_')
     exceptions_key = 'exceptions_' + experiment_timestamp
     experiment_timestamp
[8]: '2021-02-09T11:59:26.345803'
[9]: df raw = pd.read hdf(experiment results, experiment results key)
     df_raw.tail()
[9]:
                                                    cdp_metrics optimal_values \
     518415 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                                                                           {}
    518416 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                                                                           {}
     518417 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                                                                           {}
     518418 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                                                                           {}
     518419 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                                                                           {}
```

```
timedelta
                               cumulative_time timestamp
                                                             blockheight
       sim_metrics
                          3600
518415
                {}
                                        5184000 2017-03-02
                                                                        0
                                                                        0
                {}
518416
                          3600
                                        5184000 2017-03-02
518417
                {}
                          3600
                                        5184000 2017-03-02
                                                                        0
                {}
518418
                          3600
                                        5184000 2017-03-02
                                                                        0
                {}
                          3600
                                        5184000 2017-03-02
                                                                        0
518419
        eth price
                   liquidity demand
                                     liquidity demand mean
            300.0
                                 0.0
518415
            300.0
                                 0.0
                                                         0.0
518416
518417
            300.0
                                 0.0
                                                         0.0
518418
            300.0
                                 0.0
                                                         0.0
518419
            300.0
                                 0.0
                                                         0.0
                                                       cdps eth_collateral
                                                            127527.405834
518415
                               locked
                                               drawn
           open
                 time
                               locked
                                               drawn
                                                            127527.405834
518416
           open
                 time
518417
           open
                 time
                               locked
                                               drawn
                                                            127527.405834
518418
                               locked
                                               drawn
                                                            127527.405834
           open
                 time
                                                            127527.405834
518419
           open time
                               locked
                                               drawn
                           eth_freed
                                      eth_bitten
                                                  principal_debt
           eth_locked
                                                                      rai_drawn
       154827.528922
                        27300.123088
                                             0.0
                                                     8.402860e+06
                                                                   1.268860e+07
518415
                        27300.123088
518416 154827.528922
                                             0.0
                                                     8.402860e+06
                                                                   1.268860e+07
518417
       154827.528922
                        27300.123088
                                             0.0
                                                     8.402860e+06
                                                                   1.268860e+07
518418
                                                                   1.268860e+07
       154827.528922
                        27300.123088
                                             0.0
                                                     8.402860e+06
518419 154827.528922 27300.123088
                                             0.0
                                                     8.402860e+06
                                                                   1.268860e+07
           rai_wiped rai_bitten accrued_interest
                                                      interest_dripped
        4.285738e+06
                              0.0
                                        6900.562442
                                                                      0
518415
                              0.0
                                                                      0
        4.285738e+06
518416
                                        6900.562442
                                                                      0
                              0.0
518417 4.285738e+06
                                        6900.562442
                              0.0
                                                                      0
518418 4.285738e+06
                                        6900.562442
518419
       4.285738e+06
                              0.0
                                        6900.562442
                                                                      0
        interest wiped
                         interest_bitten w_1 w_2 w_3
                                                          system revenue
518415
                      0
                                          0.0 0.0 0.0
                                                                      0.0
518416
                      0
                                         0.0 0.0 0.0
                                                                      0.0
518417
                      0
                                          0.0 0.0 0.0
                                                                      0.0
                      0
                                          0.0
                                               0.0 0.0
                                                                      0.0
518418
                                       0
518419
                      0
                                          0.0
                                               0.0
                                                    0.0
                                                                      0.0
        stability_fee market_price market_price_twap
                                                          target price
         1.585490e-10
                            4.547664
                                                                  3.14
518415
                                                4.547664
         1.585490e-10
                            4.547664
                                                                   3.14
518416
                                                4.547664
                            4.547664
518417
         1.585490e-10
                                                4.547664
                                                                   3.14
```

```
4.547664
                                                                            3.14
      518419
                1.585490e-10
                                                        4.547664
               target_rate
                             eth_return
                                          eth_gross_return
                                                              expected_market_price
      518415
                        0.0
                                     0.0
                                                                            4.680219
      518416
                        0.0
                                     0.0
                                                        1.0
                                                                            4.680219
      518417
                        0.0
                                     0.0
                                                        1.0
                                                                            4.680219
                        0.0
                                                        1.0
      518418
                                     0.0
                                                                            4.680219
                        0.0
      518419
                                     0.0
                                                        1.0
                                                                            4.680219
                                                   error star integral
               expected debt price
                                      error star
      518415
                               3.14
                                       -1.407664
                                                         -1.231163e+06
                               3.14
      518416
                                       -1.407664
                                                          -1.231163e+06
                               3.14
      518417
                                       -1.407664
                                                          -1.231163e+06
      518418
                               3.14
                                       -1.407664
                                                          -1.231163e+06
      518419
                               3.14
                                       -1.407664
                                                         -1.231163e+06
               secondary_market_slippage
                                                                            UNI_supply \
                                             RAI_balance
                                                              ETH_balance
      518415
                                                           127377.935231
                                                                            10000000.0
                                            8.402860e+06
      518416
                                            8.402860e+06
                                                            127377.935231
                                                                            1000000.0
      518417
                                            8.402860e+06
                                                           127377.935231
                                                                            10000000.0
      518418
                                            8.402860e+06
                                                            127377.935231
                                                                            10000000.0
      518419
                                            8.402860e+06
                                                           127377.935231
                                                                            10000000.0
                                                     uniswap oracle
                                                                      simulation subset \
      518415
               <models.system model v3.model.parts.uniswap or...</pre>
                                                                              0
                                                                                       3
                                                                                       3
               <models.system model v3.model.parts.uniswap or...</pre>
                                                                              0
      518416
      518417
               <models.system_model_v3.model.parts.uniswap_or...</pre>
                                                                              0
                                                                                       3
      518418
               <models.system_model_v3.model.parts.uniswap_or...</pre>
                                                                              0
                                                                                       3
      518419
               <models.system_model_v3.model.parts.uniswap_or...</pre>
                                                                              0
                                                                                       3
                    substep
                              timestep
                                         events
               run
                 5
      518415
                          14
                                   1440
                                            NaN
                 5
                          15
                                            NaN
      518416
                                   1440
                 5
      518417
                          16
                                   1440
                                            NaN
      518418
                 5
                          17
                                   1440
                                            NaN
      518419
                 5
                          18
                                   1440
                                            NaN
      Get experiment exceptions, tracebacks, and simulation metadata for further analysis:
[10]: exceptions_df = pd.read_hdf(experiment_results, exceptions_key)
      exceptions_df.head()
```

518418

[10]:

0

1

2

exception traceback

None

None

None

None

None

None

1.585490e-10

4.547664

4.547664

3.14

subset

0

1

2

timesteps

1440

1440

1440

run

0

0

0

0

0

simulation

```
3
             None
                        None
                                            0
                                                     3
                                                             1440
      4
                                                     0
                        None
                                                             1440
             None
                                                  parameters \
      0 {"0":{"debug":false, "raise_on_assert":true, "fr...
      1 {"0":{"debug":false, "raise_on_assert":true, "fr...
      2 {"0":{"debug":false, "raise_on_assert":true, "fr...
      3 {"0":{"debug":false, "raise_on_assert":true, "fr...
      4 {"0":{"debug":false, "raise_on_assert":true, "fr...
                                               initial state
      0 {'cdp_metrics': {}, 'optimal_values': {}, 'sim...
      1 {'cdp_metrics': {}, 'optimal_values': {}, 'sim...
      2 {'cdp_metrics': {}, 'optimal_values': {}, 'sim...
      3 {'cdp_metrics': {}, 'optimal_values': {}, 'sim...
      4 {'cdp_metrics': {}, 'optimal_values': {}, 'sim...
[11]: # Print the first 5 exceptions - indicating failed simulations
      pprint(list(exceptions_df['exception'])[:5])
```

[None, None, None, None, None]

4 Post Process Results

- * Number of timesteps: 1440 / 60.0 days
- * Timestep duration: 0.004 seconds
- * Control parameters: ['kp', 'ki', 'controller_enabled', 'rescale_target_price']
- * Approx. number of values per parameter: 1
- * Number of parameter combinations: 4
- * Expected experiment duration: 0.384 minutes / 0.0064 hours

Remove substeps, add set_params to dataframe, and add post-processing columns:

```
[34]: df = post_process_results(df_raw, params, set_params=['ki', 'kp', 

→'liquidation_ratio', 'controller_enabled', 'rescale_target_price'])
df
```

```
3
           54 {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
4
           72
               {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
28815
       518347
28816
       518365
                {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
                {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
28817
       518383
                {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
28818
       518401
                {'cdp_count': 1, 'open_cdp_count': 1, 'closed_...
28819
       518419
      optimal_values sim_metrics
                                    timedelta
                                                cumulative time
0
                   {}
                                {}
                                             0
                                                               0
                   {}
1
                                {}
                                          3600
                                                            3600
2
                   {}
                                {}
                                          3600
                                                            7200
3
                   {}
                                {}
                                          3600
                                                           10800
4
                   {}
                                {}
                                                           14400
                                          3600
                   {}
                                {}
28815
                                          3600
                                                         5169600
                   {}
                                {}
                                          3600
                                                         5173200
28816
                   {}
                                {}
28817
                                          3600
                                                         5176800
                                {}
28818
                   {}
                                          3600
                                                         5180400
                   {}
                                {}
                                          3600
28819
                                                         5184000
                            blockheight
                                                        liquidity_demand
                 timestamp
                                            eth_price
                                           294.069151
0
      2017-01-01 00:00:00
                                                                      1.0
1
      2017-01-01 01:00:00
                                           300.000000
                                                                      0.0
2
      2017-01-01 02:00:00
                                           300.000000
                                                                     -0.0
3
      2017-01-01 03:00:00
                                           300.000000
                                                                      0.0
4
      2017-01-01 04:00:00
                                           300.000000
                                                                     -0.0
28815 2017-03-01 20:00:00
                                                                     -0.0
                                        0
                                           300.000000
28816 2017-03-01 21:00:00
                                           300.000000
                                                                     -0.0
28817 2017-03-01 22:00:00
                                           300.000000
                                                                      0.0
28818 2017-03-01 23:00:00
                                           300.000000
                                                                      0.0
28819 2017-03-02 00:00:00
                                           300.000000
                                                                      0.0
       liquidity_demand_mean
0
                       1.0000
1
                       0.5000
2
                       0.2500
3
                       0.1250
4
                       0.0625
28815
                       0.0000
28816
                       0.0000
                       0.0000
28817
28818
                       0.0000
28819
                       0.0000
```

```
eth_collateral
                                                        cdps
0
                                                        None
                                                                154827.528922
1
                                                        None
                                                                154827.528922
2
                                                        None
                                                                105925.122117
3
                                                        None
                                                                105925.122117
4
                                                        None
                                                                105925.122117
                                                                      •••
28815
                                                                127527.405834
                                                        None
28816
                                                        None
                                                                127527.405834
28817
                                                        None
                                                                127527.405834
                               locked
                                                              127527.405834
28818
           open
               time
                                               drawn
28819
           open
                time
                               locked
                                               drawn
                                                              127527.405834
           eth_locked
                           eth_freed
                                       eth_bitten
                                                    principal_debt
                                                                        rai_drawn
0
       154827.528922
                            0.00000
                                              0.0
                                                      1.000000e+07
                                                                     1.000000e+07
1
                                              0.0
       154827.528922
                            0.00000
                                                      1.450000e+07
                                                                     1.450000e+07
2
                                              0.0
       154827.528922
                        48902.406805
                                                      1.012023e+07
                                                                     1.450000e+07
3
       154827.528922
                        48902.406805
                                              0.0
                                                      1.012023e+07
                                                                     1.450000e+07
4
                        48902.406805
                                              0.0
                                                                     1.450000e+07
       154827.528922
                                                      1.012023e+07
                                              0.0
28815
       154827.528922
                       27300.123088
                                                      8.402860e+06
                                                                     1.268860e+07
28816
       154827.528922
                       27300.123088
                                              0.0
                                                      8.402860e+06
                                                                     1.268860e+07
                                              0.0
28817
       154827.528922
                        27300.123088
                                                      8.402860e+06
                                                                     1.268860e+07
28818
       154827.528922
                        27300.123088
                                              0.0
                                                      8.402860e+06
                                                                     1.268860e+07
28819
       154827.528922
                       27300.123088
                                              0.0
                                                      8.402860e+06
                                                                     1.268860e+07
                      rai_bitten
                                   accrued_interest
                                                       interest_dripped
          rai_wiped
0
       0.000000e+00
                              0.0
                                            0.00000
                                                                       0
1
       0.00000e+00
                              0.0
                                                                       0
                                            5.707764
2
                                                                       0
       4.379765e+06
                              0.0
                                           11.484158
3
                              0.0
                                                                       0
       4.379765e+06
                                           17.260556
4
                                                                       0
       4.379765e+06
                              0.0
                                           23.036956
       4.285738e+06
                              0.0
                                         6881.362098
                                                                       0
28815
28816
       4.285738e+06
                              0.0
                                         6886.162180
                                                                       0
                                                                       0
28817
       4.285738e+06
                              0.0
                                         6890.962265
       4.285738e+06
                                                                       0
28818
                              0.0
                                         6895.762352
28819
       4.285738e+06
                              0.0
                                         6900.562442
                                                                       0
       interest_wiped
                         interest_bitten
                                                     w_1 w_2 w_3
0
                     0
                                        0
                                           0.000000e+00
                                                          0.0
                                                                0.0
1
                     0
                                                          0.0
                                                                0.0
                                        0
                                           8.276258e+00
2
                     0
                                        0
                                           4.723892e-06
                                                          0.0
                                                                0.0
3
                     0
                                           2.696510e-12
                                                          0.0
                                                                0.0
                     0
                                           0.00000e+00
4
                                                          0.0
                                                                0.0
```

```
28815
                     0
                                           0.000000e+00
                                                          0.0
                                                               0.0
                     0
                                                                0.0
28816
                                           8.881784e-16
                                                          0.0
28817
                     0
                                           0.000000e+00
                                                          0.0
                                                                0.0
                     0
28818
                                           8.881784e-16
                                                          0.0
                                                                0.0
                     0
                                           0.000000e+00
                                                          0.0
                                                                0.0
28819
       system_revenue
                         stability_fee
                                         market_price
                                                       market_price_twap
                                             3.140000
                                                                  0.00000
0
                   0.0
                          1.585490e-10
1
                   0.0
                                             3.140000
                                                                  0.00000
                          1.585490e-10
2
                   0.0
                          1.585490e-10
                                             1.525000
                                                                  0.00000
3
                   0.0
                          1.585490e-10
                                             3.133425
                                                                  0.000000
4
                   0.0
                          1.585490e-10
                                             3.133425
                                                                  0.00000
                                             4.547664
28815
                   0.0
                          1.585490e-10
                                                                  4.547664
28816
                   0.0
                          1.585490e-10
                                             4.547664
                                                                  4.547664
28817
                   0.0
                          1.585490e-10
                                             4.547664
                                                                  4.547664
                   0.0
                          1.585490e-10
                                             4.547664
                                                                  4.547664
28818
                   0.0
                          1.585490e-10
                                             4.547664
                                                                  4.547664
28819
                                     eth_return
       target_price
                      target_rate
                                                 eth_gross_return
0
           3.140000
                               0.0
                                       0.000000
                                                                0.0
1
           2.165517
                               0.0
                                       0.020168
                                                                1.0
2
           2.165517
                               0.0
                                       0.00000
                                                                1.0
3
                               0.0
           2.165517
                                       0.000000
                                                                1.0
4
           2.165517
                               0.0
                                       0.00000
                                                                1.0
28815
           3.140000
                               0.0
                                       0.000000
                                                                1.0
28816
           3.140000
                               0.0
                                       0.000000
                                                                1.0
28817
           3.140000
                               0.0
                                       0.000000
                                                                1.0
                               0.0
                                       0.00000
28818
           3.140000
                                                                1.0
           3.140000
                               0.0
                                       0.000000
28819
                                                                1.0
                                expected_debt_price
       expected_market_price
                                                       error_star
0
                     3.140000
                                                         0.00000
                                                3.14
1
                     3.231683
                                                3.14
                                                         3.140000
2
                     1.569093
                                                3.14
                                                         3.140000
3
                     3.224303
                                                3.14
                                                         3.140000
4
                     3.224444
                                                3.14
                                                         3.140000
•••
                     4.680218
                                                3.14
                                                        -1.407664
28815
                     4.680218
                                                3.14
                                                        -1.407664
28816
28817
                     4.680218
                                                3.14
                                                        -1.407664
28818
                     4.680218
                                                3.14
                                                        -1.407664
28819
                     4.680219
                                                3.14
                                                        -1.407664
       error_star_integral
                              secondary_market_slippage
                                                            RAI_balance
0
               0.000000e+00
                                                        0
                                                           1.000000e+07
```

```
1
               5.652000e+03
                                                          0
                                                             1.450000e+07
2
               1.693200e+04
                                                          0
                                                             1.012023e+07
3
               2.816600e+04
                                                          0
                                                             1.012023e+07
4
               3.935400e+04
                                                             1.012023e+07
                                                             8.402860e+06
28815
              -1.231115e+06
                                                          0
28816
              -1.231127e+06
                                                          0
                                                             8.402860e+06
28817
              -1.231139e+06
                                                          0
                                                             8.402860e+06
              -1.231151e+06
                                                             8.402860e+06
28818
                                                          0
              -1.231163e+06
                                                             8.402860e+06
28819
          ETH_balance
                        UNI_supply
                        10000000.0
0
        106777.606153
1
         73708.353400
                        1000000.0
2
        105703.331685
                        1000000.0
3
        105703.331685
                        1000000.0
4
        105703.331685
                        10000000.0
28815
       127377.935231
                        1000000.0
28816
       127377.935231
                        1000000.0
        127377.935231
28817
                        10000000.0
        127377.935231
                        10000000.0
28818
28819
       127377.935231
                        10000000.0
                                              uniswap_oracle
                                                                simulation
                                                                              subset
0
                                                          None
                                                                          0
                                                                                   0
                                                                          0
                                                                                   0
1
                                                          None
2
                                                          None
                                                                          0
                                                                                   0
3
                                                          None
                                                                          0
                                                                                   0
4
                                                                          0
                                                                                   0
                                                          None
                                                                          •••
28815
                                                                          0
                                                                                   3
                                                          None
                                                                                   3
                                                                          0
28816
                                                          None
                                                                                   3
                                                                          0
28817
                                                          None
28818
        <models.system_model_v3.model.parts.uniswap_or...</pre>
                                                                        0
                                                                                 3
28819
        <models.system_model_v3.model.parts.uniswap_or...</pre>
                                                                        0
                                                                                 3
             substep
                                           eth_collateral_value
       run
                       timestep
                                  events
          1
                    0
                               0
                                                    4.553000e+07
0
                                     NaN
1
          1
                   18
                               1
                                     NaN
                                                    4.644826e+07
2
          1
                               2
                                                    3.177754e+07
                   18
                                      NaN
3
          1
                   18
                               3
                                     NaN
                                                    3.177754e+07
4
          1
                   18
                               4
                                     NaN
                                                    3.177754e+07
          5
                   18
                           1436
                                                    3.825822e+07
28815
                                      NaN
28816
          5
                                                    3.825822e+07
                   18
                            1437
                                      NaN
          5
28817
                   18
                            1438
                                      NaN
                                                    3.825822e+07
```

```
28818
               5
                       18
                                1439
                                         NaN
                                                      3.825822e+07
      28819
                                                      3.825822e+07
               5
                       18
                                1440
                                         NaN
             collateralization_ratio
                                                               liquidation_ratio \
      0
                            1.450000 -1.000000e-09
                                                     0.000001
                                                                             1.45
      1
                            1.479244 -1.000000e-09 0.000001
                                                                             1.45
      2
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
                            1.450000 -1.000000e-09 0.000001
      3
                                                                             1.45
      4
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
                            1.450000 -1.000000e-09 0.000001
      28815
                                                                             1.45
      28816
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
      28817
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
      28818
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
      28819
                            1.450000 -1.000000e-09 0.000001
                                                                             1.45
            controller_enabled rescale_target_price
                                                      target_price_scaled
      0
                          True
                                                True
                                                                     4.553
      1
                          True
                                                True
                                                                     3.140
      2
                          True
                                                True
                                                                     3.140
      3
                          True
                                                                     3.140
                                                True
      4
                          True
                                                True
                                                                     3.140
      28815
                         False
                                               False
                                                                     4.553
      28816
                         False
                                               False
                                                                     4.553
      28817
                         False
                                               False
                                                                     4.553
                         False
                                               False
      28818
                                                                     4.553
      28819
                         False
                                               False
                                                                     4.553
      [28820 rows x 58 columns]
[36]: %%capture
      # Save the processed results to the same HDF5 store file
      df.to_hdf(experiment_results, key=f'processed_results_{experiment_timestamp}')
         Control Parameters
[37]: from radcad.core import generate_parameter_sweep
      param_sweep = generate_parameter_sweep(params)
[38]: df_control_parameters = df[['subset', 'kp', 'ki']]
```

df_control_parameters = df_control_parameters.drop_duplicates(subset=['kp',__

→ 'ki'])

df_control_parameters

```
[38]: subset kp ki
0 0.000001 -1.000000e-09
```

6 Simulation Analysis

ETH price shocks (positive and negative step and impulse; one shock type for each run)



```
[]: fig = px.line(
    df.query('run == 1'),
    title="Price response for all control parameter subsets, first run",
    x="timestamp",
    y=["market_price", "market_price_twap", "target_price_scaled"],
    facet_col="ki",
    facet_row="kp",
    height=1000
)
fig.show()
```

Get the initial target price to test stability conditions:

```
[44]: initial_target_price = df['target_price'].iloc[0] initial_target_price
```

[44]: 3.14

Find all controller constant subsets where the price goes to zero:

```
[45]: df_market_price_zero = df.query("market_price <= 0.1*@initial_target_price")
df_market_price_zero[['subset', 'kp', 'ki']].drop_duplicates(subset=['kp', \cdot \cdo
```

[45]: Empty DataFrame
Columns: [subset, kp, ki]
Index: []

Find all controller constant subsets where the price goes to infinity:

```
[46]: df_market_price_infinity = df.query("market_price > 10*@initial_target_price")
df_market_price_infinity[['subset', 'kp', 'ki']].drop_duplicates(subset=['kp', \ \ \ \ 'ki'])
```

[46]: Empty DataFrame
Columns: [subset, kp, ki]
Index: []

Create dataframe of stable simulation scenarios.

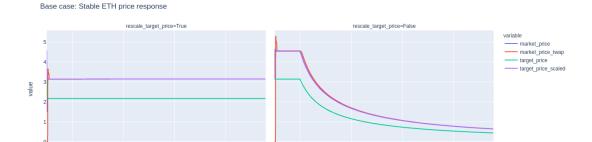
Stability is defined as: 1. The market price and scaled target price remaining within 0.1x and 10x the starting price, for all timesteps

```
[47]: array([0, 1, 2, 3])
```

```
fig = px.line(
    df_stable_price.query('run == 1 and controller_enabled == True'),
    title="Base case: Stable ETH price response",
    x="timestamp",
    y=["market_price", "market_price_twap", "target_price",
    "target_price_scaled"],
    facet_col="rescale_target_price",
    facet_col_wrap=2,
)

# fig.for_each_annotation(lambda a: a.update(text = f"kp={param_sweep[int(a. + text.split('=')[-1])]['kp']} ki={param_sweep[int(a. text. + split('=')[-1])]['ki']}"))

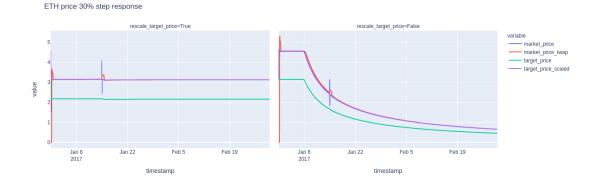
fig.show()
```



timestamp

```
fig = px.line(
    df_stable_price.query('run == 2 and controller_enabled == True'),
    title="ETH price 30% step response",
    x="timestamp",
    y=["market_price", "market_price_twap", "target_price",
    ''target_price_scaled"],
    facet_col="rescale_target_price",
    facet_col_wrap=2,
)
fig.show()
```

timestamp



```
[65]: fig = px.line(
    df_stable_price.query('run == 3 and controller_enabled == True'),
    title="ETH price 30% impulse response",
    x="timestamp",
    y=["market_price", "market_price_twap", "target_price",
    \times"
    \times" target_price_scaled"],
    facet_col="rescale_target_price",
    facet_col_wrap=2,
```

```
fig.show()
```

ETH price 30% impulse response

rescale_target_price=True

rescale_target_price=False

variable

market_price

market_price

target_price_scaled

and target_price scaled

and target_price scaled

target_price scaled

target_price scaled

target_price scaled

target_price scaled

target_price scaled

```
fig = px.line(
    df_stable_price.query('run == 4 and controller_enabled == True'),
    title="ETH price negative 30% step response",
    x="timestamp",
    y=["market_price", "market_price_twap", "target_price",
    "target_price_scaled"],
    facet_col="rescale_target_price",
    facet_col_wrap=2,
)
fig.show()
```

```
ETH price negative 30% step response

rescale_target_price=True

rescale_target_price=False

variable

market_price

market_price

market_price

target_price_scale

target_price

targe
```

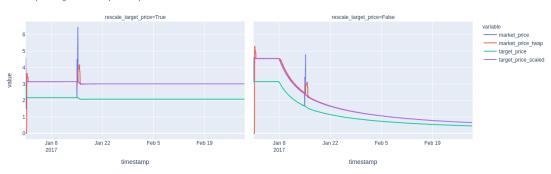
```
[67]: fig = px.line(
    df_stable_price.query('run == 5 and controller_enabled == True'),
    title="ETH price negative 30% impulse response",
    x="timestamp",
```

```
y=["market_price", "market_price_twap", "target_price",

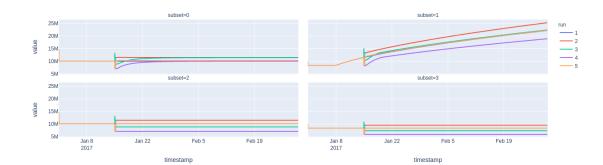
→"target_price_scaled"],
  facet_col="rescale_target_price",
  facet_col_wrap=2,
)
fig.show()
```

ETH price negative 30% impulse response

Reflexer principal debt



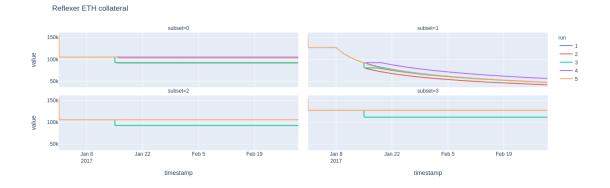
```
[68]: fig = px.line(
    df_stable_price,
    title="Reflexer principal debt",
    x="timestamp",
    y=["principal_debt"],
    color='run',
    facet_col="subset",
    facet_col_wrap=2
)
fig.show()
```



```
fig = px.line(
    df_stable_price,
    title="Secondary market RAI balance",
    x="timestamp",
    y=["RAI_balance"],
    color='run',
    facet_col="subset",
    facet_col_wrap=2
)
fig.show()
```



```
[70]: fig = px.line(
         df_stable_price,
         title="Reflexer ETH collateral",
         x="timestamp",
         y=["eth_collateral"],
         color='run',
         facet_col="subset",
         facet_col_wrap=2
)
fig.show()
```



```
[71]: fig = px.line(
    df_stable_price,
    title="Secondary market ETH balance",
    x="timestamp",
    y=["ETH_balance"],
    color='run',
    facet_col="subset",
    facet_col_wrap=2
)
fig.show()
```