Fitting drug response curves with sigmoid function

In [1]:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from scipy.optimize import curve_fit
from sklearn.metrics import r2_score
from tqdm import tqdm
import warnings
warnings.filterwarnings("ignore")
import os, sys
sys.path.insert(1, os.path.relpath("../functions"))
from fitting import *
from filtering import *

_FOLDER = "../data/"
_FOLDER_2 = "../figures/"
_FOLDER_3 = "../results/"
SAVE_FIGURES = False
```

Fitting data

In [2]:

```
drug_curves = pd.read_csv(_FOLDER+"normalised_dose_response_data.csv")
conc_columns= ["fd_num_"+str(i) for i in range(10)]
response_norm = ['norm_cells_'+str(i) for i in range(10)]
```

Comparison of fitting models

In [3]:

```
functions = [
    "fsigmoid",
    "sigmoid_2_param",
    "sigmoid_3_param",
    "sigmoid_4_param",
    "logistic_4_param",
    "I14_4_param",
    "I14R_4_param",
    "logLogist_3_param"]
```

Which function gives the best fitting?

```
In [4]:
```

```
%%time
df_123_04 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,2,3], ₩
                        response_columns = response_norm, ₩
                        first_points_lower_limit = 0.8, last_points_upper_limit = 0.4)
compare_fitting_functions(df_123_04, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
               | 0/2776 [00:00<?, ?it/s]
 0%
1st filtration (Ensure that all the response are less than 1): Filtered datase
t: (63325, 44)
2d filtration (Ensure that first and last points form plateus): Filtered datas
et: (6321, 46)
3d stage filtration (Specified location of the plateus): Filtered dataset: (27
76, 46)
(2776, 46)
fsigmoid
          2776/2776 [00:04<00:00, 561.98it/s]
100%
  2%
                | 44/2776 [00:00<00:06, 438.64it/s]
<function fsigmoid at 0x7ffe7f2cc9d8>
```

In [5]:

```
%%time
df_123_02 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,2,3], ₩
                       response_columns = response_norm, ₩
                       first_points_lower_limit = 0.8, last_points_upper_limit = 0.2)
compare_fitting_functions(df_123_02, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
  3%|
               69/2152 [00:00<00:03, 687.63it/s]
1st filtration (Ensure that all the response are less than 1): Filtered dataset:
(63325.44)
2d filtration (Ensure that first and last points form plateus): Filtered dataset:
(6321, 46)
3d stage filtration (Specified location of the plateus): Filtered dataset: (2152,
46)
(2152, 46)
     2152/2152 [00:03<00:00, 666.72it/s]
               74/2152 [00:00<00:02, 734.64it/s]
  3%|
<function fsigmoid at 0x7f86253c7598>
          2152/2152 [00:03<00:00, 713.55it/s]
100%
  2%
               | 50/2152 [00:00<00:04, 491.54it/s]
<function sigmoid_2_param at 0x7f86253c7510>
       2152/2152 [00:04<00:00, 442.53it/s]
               43/2152 [00:00<00:04, 429.58it/s]
  2%
<function sigmoid_3_param at 0x7f86253c7620>
100%
        2152/2152 [00:05<00:00, 384.74it/s]
  2%
               42/2152 [00:00<00:05, 417.61it/s]
<function sigmoid_4_param at 0x7f86253c76a8>
100%
         2152/2152 [00:05<00:00, 373.62it/s]
  2%||
               35/2152 [00:00<00:06, 343.92it/s]
<function logistic_4_param at 0x7f86253c7840>
100%
     2152/2152 [00:06<00:00, 307.90it/s]
  2%
               36/2152 [00:00<00:05, 355.00it/s]
<function | | 14_4_param at 0x7f86253c7730>
         2152/2152 [00:06<00:00, 316.71it/s]
100%
               32/2152 [00:00<00:06, 312.69it/s]
  1%|
<function | I4R 4 param at 0x7f86253c77b8>
100%| 2152/2152 [00:06<00:00, 336.80it/s]
<function logLogist 3_param at 0x7f86253c78c8>
```

	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	0.0	4.602484e-01	0.999899	2152.0	2135.0	2074.0
sigmoid_2_param	0.0	4.602485e-01	0.999899	2152.0	2135.0	2074.0
sigmoid_3_param	3.0	5.922767e-01	0.999926	2152.0	2139.0	2118.0
sigmoid_4_param	899.0	-4.195295e-07	0.999981	2133.0	2105.0	2094.0
logistic_4_param	218.0	6.016469e-01	0.999981	2152.0	2141.0	2126.0
II4_4_param	195.0	6.016469e-01	0.999981	2152.0	2141.0	2127.0
II4R_4_param	204.0	9.126042e-08	0.999981	2152.0	2139.0	2122.0
logLogist_3_param	633.0	4.998448e-01	0.999978	2152.0	2140.0	2122.0

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigm
570	910851	170	0.991346	0.991346	0.995994	
2311	1290724	268	0.948049	0.948049	0.985379	
3576	907064	180	0.988098	0.988098	0.996652	
138632	949174	272	0.728071	0.728071	0.878181	
7905	910549	272	0.589601	0.589601	0.592277	
4						•

CPU times: user 42.6 s, sys: 1.77 s, total: 44.4 s

Wall time: 43.7 s

In [6]:

```
%%time
df_1234_04 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,2,3,4], ₩
                       response_columns = response_norm, ₩
                       first_points_lower_limit = 0.8,
                       last_points_upper_limit = 0.4,
                       middle_points_limit = -0.2
compare_fitting_functions(df_1234_04, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
               | 72/2719 [00:00<00:03, 716.16it/s]
  3%
1st filtration (Ensure that all the response are less than 1): Filtered dataset:
(63325.44)
2d filtration (Ensure that first and last points form plateus): Filtered dataset:
(6321, 46)
3d stage filtration (Specified location of the plateus): Filtered dataset: (2776,
4th stage filtration (Cut off high ancedent points): Filtered dataset: (2719, 46)
(2719, 46)
100% | 2719/2719 [00:04<00:00, 667.08it/s]
  2%
               67/2719 [00:00<00:03, 666.17it/s]
<function fsigmoid at 0x7f86253c7598>
100%
     2719/2719 [00:03<00:00, 711.69it/s]
               | 53/2719 [00:00<00:05, 523.88it/s]
  2%
<function sigmoid_2_param at 0x7f86253c7510>
100%
              | 2719/2719 [00:05<00:00, 455.70it/s]
               43/2719 [00:00<00:06, 428.95it/s]
  2%
<function sigmoid_3_param at 0x7f86253c7620>
100% | 2719/2719 [00:07<00:00, 384.77it/s]
               42/2719 [00:00<00:06, 411.53it/s]
  2%
<function sigmoid_4_param at 0x7f86253c76a8>
100%| 2719/2719 [00:07<00:00, 375.27it/s]
  1%
              32/2719 [00:00<00:08, 313.67it/s]
<function logistic_4_param at 0x7f86253c7840>
100%
              [ 2719/2719 [00:08<00:00, 309.68it/s]
              | 33/2719 [00:00<00:08, 324.88it/s]
  1%
<function | | 4 param at 0x7f86253c7730>
100% | 2719/2719 [00:08<00:00, 320.17it/s]
               | 36/2719 [00:00<00:07, 353.97it/s]
  1%||
<function | | 14R_4_param at 0x7f86253c77b8>
100%| 2719/2719 [00:08<00:00, 337.15it/s]
<function logLogist_3_param at 0x7f86253c78c8>
```

	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	0.0	4.503432e-01	0.999899	2719.0	2671.0	2456.0
sigmoid_2_param	0.0	4.503431e-01	0.999899	2719.0	2671.0	2456.0
sigmoid_3_param	2.0	8.127070e-01	0.999926	2719.0	2719.0	2681.0
sigmoid_4_param	1109.0	-4.195295e-07	0.999981	2699.0	2680.0	2675.0
logistic_4_param	292.0	8.453735e-01	0.999981	2719.0	2719.0	2712.0
II4_4_param	257.0	8.453634e-01	0.999981	2719.0	2719.0	2712.0
II4R_4_param	269.0	9.126042e-08	0.999981	2719.0	2717.0	2708.0
logLogist_3_param	790.0	8.272879e-01	0.999978	2719.0	2719.0	2707.0

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigm
155787	1287706	1014	0.882047	0.882047	0.983959	
570	910851	170	0.991346	0.991346	0.995994	
74484	724878	268	0.982274	0.982274	0.993826	
82744	907172	344	0.998927	0.998927	0.999046	
107980	909706	182	0.971662	0.971662	0.988824	
4						•

CPU times: user 53.3 s, sys: 2.19 s, total: 55.5 s

Wall time: 54.6 s

In [7]:

```
%%time
df_1234_02 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,2,3,4], ₩
                       response_columns = response_norm, ₩
                       first_points_lower_limit = 0.8,
                       last_points_upper_limit = 0.2,
                       middle_points_limit = -0.2
compare_fitting_functions(df_1234_02, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
               64/2108 [00:00<00:03. 632.32it/s]
  3%
1st filtration (Ensure that all the response are less than 1): Filtered dataset:
(63325.44)
2d filtration (Ensure that first and last points form plateus): Filtered dataset:
(6321, 46)
3d stage filtration (Specified location of the plateus): Filtered dataset: (2152,
4th stage filtration (Cut off high ancedent points): Filtered dataset: (2108. 46)
(2108, 46)
100%
        2108/2108 [00:03<00:00, 655.88it/s]
  4%
               76/2108 [00:00<00:02, 758.43it/s]
<function fsigmoid at 0x7f86253c7598>
100%
     2108/2108 [00:02<00:00, 711.63it/s]
               49/2108 [00:00<00:04, 488.64it/s]
  2%
<function sigmoid_2_param at 0x7f86253c7510>
100%
              | 2108/2108 [00:04<00:00, 457.72it/s]
               43/2108 [00:00<00:04, 427.33it/s]
  2%
<function sigmoid_3_param at 0x7f86253c7620>
100% | 2108/2108 [00:05<00:00, 374.09it/s]
               | 37/2108 [00:00<00:05, 362.11it/s]
  2%
<function sigmoid_4_param at 0x7f86253c76a8>
100% | 2108/2108 [00:05<00:00, 377.98it/s]
  1%|
               | 31/2108 [00:00<00:06, 305.66it/s]
<function logistic_4_param at 0x7f86253c7840>
100%
              [ 2108/2108 [00:06<00:00, 311.18it/s]
               32/2108 [00:00<00:06, 314.78it/s]
  2%
<function | | 4 param at 0x7f86253c7730>
100% | 2108/2108 [00:06<00:00, 305.93it/s]
               | 34/2108 [00:00<00:06, 338.80it/s]
  2%
<function | | 14R_4_param at 0x7f86253c77b8>
100% | 2108/2108 [00:06<00:00, 342.47it/s]
<function logLogist_3_param at 0x7f86253c78c8>
```

	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	0.0	7.768212e-01	0.999899	2108.0	2105.0	2058.0
sigmoid_2_param	0.0	7.768212e-01	0.999899	2108.0	2105.0	2058.0
sigmoid_3_param	2.0	8.127070e-01	0.999926	2108.0	2108.0	2098.0
sigmoid_4_param	886.0	-4.195295e-07	0.999981	2090.0	2073.0	2070.0
logistic_4_param	213.0	8.453735e-01	0.999981	2108.0	2108.0	2103.0
II4_4_param	189.0	8.453634e-01	0.999981	2108.0	2108.0	2103.0
II4R_4_param	195.0	9.126042e-08	0.999981	2108.0	2106.0	2099.0
logLogist_3_param	623.0	8.272879e-01	0.999978	2108.0	2108.0	2100.0

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigm
155787	1287706	1014	0.882047	0.882047	0.983959	
570	910851	170	0.991346	0.991346	0.995994	
74484	724878	268	0.982274	0.982274	0.993826	
82744	907172	344	0.998927	0.998927	0.999046	
107980	909706	182	0.971662	0.971662	0.988824	
4						•

CPU times: user 41.8 s, sys: 1.76 s, total: 43.6 s

Wall time: 42.9 s

In [8]:

```
%%time
df_134_04 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,3,4], ₩
                       response_columns = response_norm, ₩
                       first_points_lower_limit = 0.8, last_points_upper_limit = 0.4,
                       middle points limit = -0.2)
compare_fitting_functions(df_134_04, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
 0%|
              62/18415 [00:00<00:30, 610.48it/s]
1st filtration (Ensure that all the response are less than 1): Filtered dataset:
(63325.44)
3d stage filtration (Specified location of the plateus): Filtered dataset: (1903
7.44)
4th stage filtration (Cut off high ancedent points): Filtered dataset: (18415, 4
(18415, 44)
100% | 18415/18415 [00:32<00:00. 570.94it/s]
  0%|
              68/18415 [00:00<00:27, 675.74it/s]
<function fsigmoid at 0x7f86253c7598>
     | 18415/18415 [00:26<00:00, 701.68it/s]
  0%
              41/18415 [00:00<00:45, 403.85it/s]
<function sigmoid_2_param at 0x7f86253c7510>
      | 18415/18415 [00:39<00:00, 465.47it/s]
100%
  0%|
              | 15/18415 [00:00<02:14, 136.67it/s]
<function sigmoid_3_param at 0x7f86253c7620>
100%
     18415/18415 [01:21<00:00, 225.60it/s]
  0%|
              | 32/18415 [00:00<00:58. 313.19it/s]
<function sigmoid_4_param at 0x7f86253c76a8>
100%
     | 18415/18415 [00:56<00:00, 328.81it/s]
  0%
              23/18415 [00:00<01:20, 228.15it/s]
<function logistic_4_param at 0x7f86253c7840>
100% | 18415/18415 [01:11<00:00, 259.17it/s]
              25/18415 [00:00<01:14, 247.52it/s]
  0%
<function II4_4_param at 0x7f86253c7730>
      18415/18415 [01:08<00:00, 268.64it/s]
  0%|
              20/18415 [00:00<01:32, 199.85it/s]
<function | | 14R_4_param at 0x7f86253c77b8>
100%| 18415/18415 [01:00<00:00, 305.08it/s]
<function logLogist_3_param at 0x7f86253c78c8>
```

	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	1.0	2.755202e-01	0.999938	18415.0	17174.0	14274.0
sigmoid_2_param	1.0	2.755201e-01	0.999938	18415.0	17172.0	14271.0
sigmoid_3_param	90.0	-2.047581e-04	0.999998	18414.0	18219.0	16928.0
sigmoid_4_param	5843.0	-7.220099e-06	0.999981	17333.0	16350.0	15635.0
logistic_4_param	1733.0	0.000000e+00	0.999981	18414.0	18270.0	17399.0
II4_4_param	1603.0	0.000000e+00	0.999981	18413.0	18268.0	17396.0
II4R_4_param	1488.0	-5.176513e-07	0.999981	18411.0	18262.0	17384.0
logLogist_3_param	7656.0	6.058932e-01	0.999996	18415.0	18372.0	17906.0

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigm
131092	909726	252	0.896614	0.896614	0.931205	
131122	753584	222	0.974394	0.974394	0.984243	
72	908449	273	0.989093	0.989093	0.994160	
65611	688010	134	0.921392	0.921392	0.940102	
65620	1330996	235	0.943544	0.943544	0.968856	
4						>

CPU times: user 7min 7s, sys: 19 s, total: 7min 26s

Wall time: 7min 17s

In [9]:

```
%%time
df_134_02 = filtering_sigmoid_curves(drug_curves, filtering_scenario=[1,3,4], ₩
                       response_columns = response_norm, ₩
                       first_points_lower_limit = 0.8,
                       last_points_upper_limit = 0.2,
                       middle_points_limit = -0.2)
compare_fitting_functions(df_134_02, functions, conc_columns, response_norm)
Original dataset: (225384, 44)
  1%|
              63/11997 [00:00<00:19. 627.27it/s]
1st filtration (Ensure that all the response are less than 1): Filtered dataset:
(63325.44)
3d stage filtration (Specified location of the plateus): Filtered dataset: (1235
5. 44)
4th stage filtration (Cut off high ancedent points): Filtered dataset: (11997, 4
(11997.44)
100%
     11997/11997 [00:18<00:00, 638.87it/s]
              | 68/11997 [00:00<00:17, 676.23it/s]
  1%|
<function fsigmoid at 0x7f86253c7598>
100%
      11997/11997 [00:17<00:00, 702.34it/s]
              | 45/11997 [00:00<00:26, 443.95it/s]
  0%|
<function sigmoid_2_param at 0x7f86253c7510>
     25/11997 [00:00<00:48, 244.99it/s]
  0%
<function sigmoid 3 param at 0x7f86253c7620>
100%
              | 11997/11997 [00:49<00:00, 243,46it/s]
              | 37/11997 [00:00<00:32, 363.75it/s]
  0%|
<function sigmoid_4_param at 0x7f86253c76a8>
100% | 100% | 11997/11997 [00:36<00:00, 326.06 it/s]
              21/11997 [00:00<00:57, 206.97it/s]
  0%
<function logistic_4_param at 0x7f86253c7840>
100% | 100% | 11997/11997 [00:46<00:00, 259.96it/s]
  0%
              26/11997 [00:00<00:46, 255.63it/s]
<function | | 4 param at 0x7f86253c7730>
100%
          | 11997/11997 [00:47<00:00, 251.97it/s]
              26/11997 [00:00<00:46, 256.27it/s]
  0%|
<function | I4R 4 param at 0x7f86253c77b8>
100% | 11997/11997 [00:41<00:00, 286.68it/s]
<function logLogist_3_param at 0x7f86253c78c8>
```

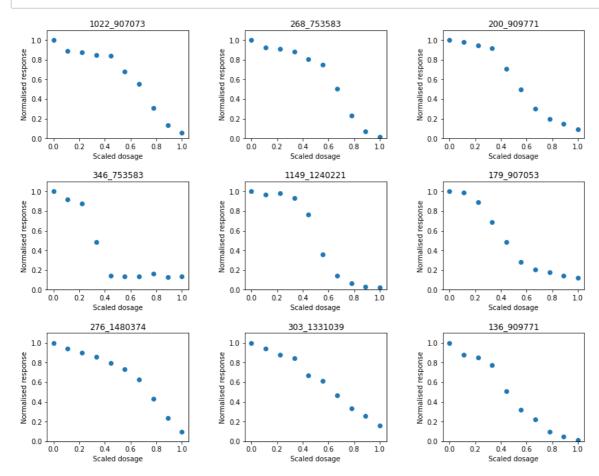
	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	0.0	2.788415e-01	0.999938	11997.0	11520.0	10282.0
sigmoid_2_param	1.0	2.788415e-01	0.999938	11997.0	11520.0	10282.0
sigmoid_3_param	61.0	-2.047581e-04	0.999998	11996.0	11927.0	11378.0
sigmoid_4_param	4271.0	-4.170810e-06	0.999981	11358.0	10828.0	10556.0
logistic_4_param	1109.0	5.782919e-01	0.999981	11997.0	11958.0	11603.0
ll4_4_param	1031.0	0.000000e+00	0.999981	11996.0	11957.0	11601.0
II4R_4_param	931.0	-5.176513e-07	0.999981	11994.0	11951.0	11592.0
logLogist_3_param	4593.0	7.085231e-01	0.999996	11997.0	11989.0	11840.0

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigm
131092	909726	252	0.896614	0.896614	0.931205	
98368	908443	225	0.797873	0.797873	0.904829	
72	908449	273	0.989093	0.989093	0.994160	
65639	907053	257	0.819013	0.819013	0.931013	
65655	1290801	346	0.969306	0.969306	0.970429	
4						•

CPU times: user 4min 35s, sys: 12 s, total: 4min 47s

Wall time: 4min 44s

In [10]:



What if don't use any filtering

In [11]:

%%time
compare_fitting_functions(drug_curves, functions, conc_columns, response_norm)

0%| | 0/225384 [00:00<?, ?it/s]

(225384, 44)

100%| 225384/225384 [06:30<00:00, 577.46it/s]

<function fsigmoid at 0x7f86253c7598>

100% | 225384/225384 [05:41<00:00, 660.18it/s]

<function sigmoid_2_param at 0x7f86253c7510>

100%| 225384/225384 [09:26<00:00, 397.85it/s]

<function sigmoid_3_param at 0x7f86253c7620>

100%| 225384/225384 [1:02:44<00:00, 59.88it/s]

<function sigmoid_4_param at 0x7f86253c76a8>

100% | 225384/225384 [3:21:50<00:00, 18.61it/s]

<function logistic_4_param at 0x7f86253c7840>

100%| 225384/225384 [33:00<00:00, 113.79it/s]

<function II4_4_param at 0x7f86253c7730>

100%| 225384/225384 [1:31:08<00:00, 41.22it/s]

<function | | 14R_4_param at 0x7f86253c77b8>

100%| 225384/225384 [38:13<00:00. 98.25it/s]

<function logLogist_3_param at 0x7f86253c78c8>

	best_fitting_count	min	max	r2>0	r2>0.8	r2>0.9
fsigmoid	34024.0	-794.650193	0.999988	154078.0	78135.0	53108.0
sigmoid_2_param	372.0	-8.680730	0.999988	147301.0	78052.0	53016.0
sigmoid_3_param	10074.0	-4.204919	0.999998	189861.0	94438.0	70277.0
sigmoid_4_param	30058.0	-0.051301	0.999981	168543.0	81792.0	65700.0
logistic_4_param	31543.0	-0.030124	0.999999	182648.0	101579.0	78979.0
II4_4_param	31552.0	-0.046189	1.000000	182050.0	101237.0	78843.0
II4R_4_param	33135.0	-0.716794	0.999998	183161.0	100964.0	78654.0
logLogist_3_param	54626.0	-7.161534	1.000000	167680.0	94818.0	75034.0

Examples of bad fitting with sigmoid_4_param (r2<0.61): 127328

	COSMIC_ID	DRUG_ID	fsigmoid_r2	sigmoid_2_param_r2	sigmoid_3_param_r2	sigmoid_4_
0	1290922	332	-0.356727	-0.356736	0.019575	2.1
1	1290922	257	0.816939	0.816947	0.878794	-4.0
4	1290922	192	-0.362288	-0.362288	0.215762	2.1
7	1290922	306	0.717135	0.717145	0.774391	-4.5
9	1290922	277	0.542245	0.542245	0.147251	-4.9
4						+

CPU times: user 1h 57min, sys: 7min, total: 2h 4min

$\overset{\text{Wall}}{\text{df}}_{-}^{1} \overset{\text{time:}}{\text{04}} \overset{\text{7h}}{\text{was}} \overset{\text{28min}}{\text{used}} \overset{\text{42s}}{\text{in the MSc project}}$

In [12]:

 $df = df_{123_04.copy()}$

In []: