LiMo – An Intelligent Library Model

LiMo is a tool for creating Intelligent Library Models for digital applications. It enables the generation of datasets used to train the models, which in turn helps perform a more accurate timing analysis and build a robust signoff framework.

I. Content

LiMo is released with the following top-level directories:

- 1. bin
- 2. scripts
- 3. gates
- 4. output

The content of each directory is described below:

- 1. **bin:** It contains:
 - limo: This is the top level bash script to launch the tool
- 2. **scripts:** It contains:
 - **limo.tcl:** This is the top-level TCL script responsible for executing LiMo. It provides a TCL interface to the user. You should have TCL installed on your system to run the limo.

3. gates directory

The gates directory contains multiple subdirectories. Each subdirectory represents different digital logic gates (example, NAND2X1, NOR2X1, NAND3X1, NOR3X1, etc.), and a simulation.py file. Each subdirectory further contains:

- **Simulation/schematic:** Contains input files for SPICE simulation (netlist) and the simulation results (psf).
 - ✓ netlist: contains the spectre netlist and stimuli. Note that the netlistHeader
 and netlistFooter files are also needed in the same directory.
 - ✓ psf: created by Cadence Spectre simulator. Stores output data in a single or double precision binary or human-readable ASCII format. Widely supported

by many other simulators. Virtuoso design framework extensively uses PSF format.

- scripts: It contains various scripts for simulating and gathering data for characterizing, training and creating library models for a gate. Since, the way simulation is done and data is collected can vary for each gate, we have scripts that are gate-specific.
 - ✓ user_input: A script with user-defined input parameters for dataset generation.
 - ✓ script/data_gen_none.py: Generates data without optimization, including skew input points.
 - ✓ script/data_gen_skew_opt.py: Retains data points with variable delays and removes those causing constant delays during dataset generation.
 - ✓ script/data_gen_skew_slew_opt.py: Optimizes skew and slew, treating slew values as a binary search tree to achieve the desired delay consistency.
 - ✓ loadData.py: Loads a dataset from a specified CSV input file
 - ✓ infoData.py: Generates dataset information and saves it to a text file.
 - ✓ plotData.py: Creates plots and graphs to visualize the dataset.
 - ✓ splitData.py: Splits the dataset into training and testing.
 - ✓ preProcessData.py: Prepares and preprocesses the dataset for training or testing.
 - ✓ trainModel.py: Trains a machine learning model and generates the trained model for future use.
 - ✓ testModel.py: Tests a machine learning model on a dataset and generates a report.

Note: You can run the data_gen script for a specific gate using "python data_gen_none.py", "python data_gen_skew.py", and "python data_gen_skew_slew.py" from the corresponding gate directory (changes in input is done through input.json).

- **Simulation.py:** Used for multiprocessing.
- **4. Output:** The output directory contains the output files generated by the tool.

II. How to Install the tool?

- 1. Clone LiMo from github to your local machine
 - Let the installation directory be: INSTALL_DIR
- 2. Update the *PATH* to point to the *bin* directory of the in:
 - Assume bash shell, the following command will prepend the *bin* directory of the installation to the existing PATH (\$PATH).

```
export PATH="$INSTALL DIR/bin:$PATH"
```

- You can make the above change in ~/.bashrc also.
- 3. Run LiMo from any directory using the following command
 - LiMo

```
(base) [poojabe@edatools-server2 LiMo]$ LiMo

Welcome to LiMo!

LiMo - An Intelligent Library Model

LiMo is a tool for creating Intelligent Library Models for digital applications.

It enables the generation of datasets used to train the models, which in turn he lps perform a more accurate timing analysis and build a robust signoff framework.

Type 'help' for a list of available commands.

Type 'exit' to exit the tool.

Launching LiMo shell.
```

III. Commands and Options

LiMo provides an interactive shell where you can run various LiMo commands. Currently, the following commands are supported:

☐ **help:** Provides a list of available commands and their descriptions.

```
Shows available commands.
Lists available combinational logic gates in the directory $lm_gate_dir.
Reports the current value of the tool variable VAR_NAME.
Sets the given <Value> to the tool variable VAR_NAME.
Create empty folders in output directory with the same name as the gates in the gates direct
         help
getLibCells
getVar VAR_NAME
setVar VAR_NAME Value

Opens user_input.py file for a specified gate using gedit for reading/editing.
Initiates dataset generation for selected gates with options including multiprocessing and ogate NANDAY NORZXI - optimize none -num processes 2.
Opens the FILENAME file for a specific gate using the default CSV viewer.
Loads the FILENAME file for a specific gate using the default CSV viewer.
Generates plot to visualize the dataset.
Displays and saves data for the specified gate
Split the data of the FILENAME and saves it in a temporary directory for the specifed gate.
Preprocesses data for training for the specifed gate.
Preprocesses data for testing for the specifed gate.
Train a machine learning model for the specifed gate and save the trained model.
Tests a machine learning model for a gate and generates a report.
         setInput -gate GATENAME

genDataset -gate GATENAME OPTIMIZATION METHOD -num processes NUM OF CORES
cimization methods (none, skew.opt, skew.slew.op t). e.g usage : genDatasev
viewOutput -gate GATENAME file name FILENAME
loadData -gate GATENAME -file name FILENAME
.plotData -gate GATENAME -file name FILENAME
.infoData -gate GATENAME -file name FILENAME
.splitData -gate GATENAME -file name FILENAME
.preProcessData train -gate GATENAME
.preProcessData train -gate GATENAME
.trainModel -gate GATENAME -output MODELNAME
.trainModel -gate GATENAME -load MODELNAME
.testModel -gate GATENAME -load MODELNAME
.exit
getLibCells: Lists all available digital logic gates for dataset generation. It will list all the
      cells present in the gates directory. (For the gates directory in the release there are 42 cells)
        >> getLibCells
        Available Logic Gates : A0I21X1,0AI21X1,AND3X1,NOR2X1,NAND2X1,OR2X1,NOR3X1,AND2X1,NA
        ND3X1, OR3X1, NAND2X2, NAND2X4, NAND2X8, NAND2XL, NOR2X2, NOR2X4, NOR2X8, NOR2XL, OR2X2, OR2X4,
        OR2X8, OR2XL, AND2X2, AND2X4, AND2X8, AND2XL, OR3X2, OR3X4, OR3X8, OR3XL, NAND3X2, NAND3X4, NAND
        3X8, NAND3XL, AND3X2, AND3X4, AND3X8, AND3XL, NOR3X2, NOR3X4, NOR3X8, NOR3XL
        Total number of gates in lm_gate_dir: 42
getVar VAR NAME: Reports the current value of the tool variable VAR NAME. Currently,
      the following variables are supported: lm gate dir and lm out dir.
       >> getVar lm gate dir
       lm_gate_dir=/home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/gates
       >> getVar lm out dir
       lm_out_dir=/home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output
□ setVar VAR NAME Value: Sets the given <Value> to the tool variable VAR NAME.
      We can define gates directory path and output directory path using this command:
       >> setVar lm_gate_dir /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/gates
       >> getVar lm gate dir
       lm_gate_dir=/home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/gates
        >> setVar lm_out_dir /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output
        >> getVar lm_out_dir
       lm out dir=/home/poojabe/Desktop/PhD Research/src project/ml lib char/Limo/output
makeOutput: Create empty directories in the output directory with the same names as the
      cells defined in the gates directory.
```

> help vailable commands:

```
>> makeOutput
Available Logic Gates: A0I21X1, 0AI21X1, AND3X1, NOR2X1, NAND2X1, OR2X1, NOR3X1, AND2X1, NAND3X1, OR3X1, NAND2X2, NAND2X4, NAND2X8, NAND2X4, NOR2X8, NOR2X4, NOR2X8, NOR2X4, NOR2X8, NOR2X4, NOR2X8, NOR2X4, NOR2X8, NOR2X4, AND3X2, AND3X4, AND3X2, NOR3X4, NOR3X8, NOR3XL
Created empty output directory for A0I21X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/A0I21X1
Created empty output directory for A0I21X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/AND3X1
Created empty output directory for NOR2X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NOR2X1
Created empty output directory for NAND2X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NOR2X1
Created empty output directory for NOR3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NOR3X1
Created empty output directory for NOR3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NOR3X1
Created empty output directory for NOR3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NOR3X1
Created empty output directory for NAND3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND3X1
Created empty output directory for NAND3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X1
Created empty output directory for NAND3X1: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X2
Created empty output directory for NAND2X2: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X2
Created empty output directory for NAND2X3: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X2
Created empty output directory for NAND2X2: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Lim
```

□ **setInput -gate GATENAME:** Opens the *user_input.tcl* file for a specific gate using the default text editor. For example, **setInput -gate NAND2X1** opens the *user_input.tcl* file for the NAND2X1 gate.

```
>> setInput -gate NAND2X1
>>
```

user input.py will be opened for NAND2X1

☐ **genDataset:**Initiates dataset generation for selected gates with options including multipr ocessing and optimization methods (e.g., Constant delay, binary search tree).

Parameters:

- **-gate**: Specify the gate's name for which you want to generate datasets.
- -num processes: Specify the number of CPU cores to use for multiprocessing.

• **-optimize**: Specify the optimization method (none, skew_opt, skew_slew_opt) when generating datasets for selected gates.

Example:

genDataset -gate NOR2X1 ORX1 -optimize none -num_processes 2

```
>> genDataset -gate NAND2X1 NOR2X1 -optimize none -num_processes 2
DATASET GENERATION STARTED.....WAIT
```

Dataset generation will start and the generated dataset will get stored in the output/NAND2X1

□ viewDataset -gate GATENAME -file_name FILENAME: Opens the FILENAME file for a specific gate using the default CSV viewer. For example, viewDataset -gate NAND2X1 -file_name output.csv opens the output.csv file for the NAND2X1 gate. (file should be stored in the output directory of specific gate)

Dataset generated will get open

```
>> viewDataset -gate NAND2X1 -file_name GPr3_main_dataset_NAND2X1.csv
>>
```

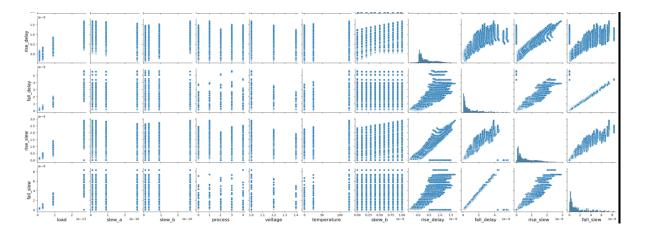
Α	В	С	D	E	F	G	Н	1
slew_b	process	voltage	temperature	skew_b	rise_delay	fall_delay	rise_slew	fall_slew
1E-10	tt	1.2	25	-5E-11	6.617191E-11	1.044875E-10	6.975976E-11	1.587261E-10
1E-10	tt	1.2	25	-1E-10	6.866095E-11	1.044054E-10	8.997469E-11	1.587498E-10
1E-10	tt	1.2	25	-1.5E-10	6.861683E-11	1.047041E-10	9.277512E-11	1.586782E-10
1E-10	tt	1.2	25	-2E-10	6.861753E-11	1.049208E-10	9.343995E-11	1.583989E-10
1E-10	tt	1.2	25	-2.5E-10	6.861409E-11	1.053662E-10	9.343134E-11	1.583925E-10
1E-10	tt	1.2	25	-3E-10	6.861444E-11	1.053571E-10	9.343238E-11	1.579159E-10
1E-10	tt	1.2	25	0	4.734633E-11	1.11313E-10	5.370394E-11	1.582336E-10
1E-10	tt	1.2	25	5E-11	6.694321E-11	1.053145E-10	6.8744E-11	1.571941E-10
1E-10	tt	1.2	25	1E-10	7.005137E-11	1.042009E-10	9.024171E-11	1.586768E-10
1E-10	tt	1.2	25	1.5E-10	6.999361E-11	1.044097E-10	9.449769E-11	1.585525E-10
1E-10	tt	1.2	25	2E-10	7.003639E-11	1.043248E-10	9.375075E-11	1.586456E-10
1E-10	tt	1.2	25	2.5E-10	7.003441E-11	1.042694E-10	9.372281E-11	1.591463E-10
1E-10	tt	1.2	25	3E-10	7.003434E-11	1.042668E-10	9.372297E-11	1.591967E-10

□ loadData -gate GATENAME -file_name FILENAME: Load data for a specific gate GATENAME from the output directory of that gate. (file should be stored in the output directory of specific gate)

```
loadData -gate NAND2X1 -file name GPr3 main dataset NAND2X1.csv
               load
                            slew_a
                                             rise_slew
                                                             fall slew
0
       1.000000e-14
                      1.000000e-11
                                            1.0727e-10
                                                        2.634633e-10
       1.000000e-14
                      1.000000e-11
                                          1.282581e-10
                                                        2.687251e-10
2
       1.000000e-14
                     1.000000e-11
                                          1.282457e-10
                                                        2.687909e-10
3
       1.000000e-14
                     1.000000e-11
                                          1.284229e-10
                                                        2.689014e-10
       1.000000e-14
                      1.000000e-11
                                          1.280337e-10
                                                        2.687603e-10
       9.000000e-14
                      3.000000e-11
                                          4.402192e-10
                                                        2.027187e-09
16352
16353
       9.000000e-14
                      3.000000e-11
                                          4.900718e-10
                                                        2.020665e-09
16354
       9.000000e-14
                     3.000000e-11
                                          5.420464e-10
                                                        2.027328e-09
16355
                                                        2.024796e-09
       9.000000e-14
                     3.000000e-11
                                          5.882184e-10
16356
       9.000000e-14
                     3.000000e-11
                                          6.413592e-10
                                                        2.027348e-09
[16357 rows x 11 columns]
```

□ plotData -gate GATENAME -file_name FILENAME: Generates plots to visualize the dataset for the specific gate GATENAME. Save the plot in the output directory of the specific gate. (file should be stored in the output directory of specific gate)

```
>> plotData -gate NAND2X1 -file_name GPr3_main_dataset_NAND2X1.csv
Plot saved in absolute_path: /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_ch
ar/Limo/output/NAND2X1/dataset_visualization.png
```



□ infoData -gate GATENAME -file_name FILENAME: Generates information for the mentioned FILENAME file stored in the output directory of the specific gate.

```
Launching Limo shell.
>> infoData -gate NAND2X1 -file_name GPr3_main_dataset_NAND2X1.csv
Last 5 rows of the data
                load
                              slew a
                                                rise slew
                                                                fall slew
load slew_a ... rise_slew fall_slew
31675 2.700000e-13 2.700000e-10 ... 1.380863e-09 4.947463e-09
31676 2.700000e-13 2.700000e-10 ... 1.420462e-09 4.947228e-09
      2.700000e-10
2.700000e-13
2.700000e-10
31677
                                            1.472363e-09 4.947519e-09
31678
       2.700000e-13
                       2.700000e-10
                                            1.533116e-09
                                                           4.946663e-09
31679 2.700000e-13
                                            1.576701e-09 4.946687e-09
                      2.700000e-10
[5 rows x 11 columns]
Information about data (number of rows, columns, data types)
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 31680 entries, 0 to 31679
Data columns (total 11 columns):
                   Non-Null Count
     Column
                                     Dtype
 Θ
     load
                  31680 non-null object
                  31680 non-null object
31680 non-null object
31680 non-null object
     slew_a
 2
     slew_b
     process
     voltage 31680 non-null object
     temperature 31680 non-null object
 6
                  31680 non-null object
     skew_b
     rise_delay 31680 non-null
fall_delay 31680 non-null
                                     object
 8
                                     object
                 31680 non-nutt object
31680 non-null object
     rise_slew
 9
   fall slew
dtypes: object(11)
memory usage: 2.7+ MB
```

```
Information about data statistics
                                          freq
            count unique
                                    top
load
            31680 4 1.000000e-14
                                          7920
                       4 1.000000e-11
4 1.000000e-11
slew_a
            31680
                                          7920
slew b
             31680
                                          7920
             31680
process
                                          6336
                             1.000000 10560
voltage
             31680
temperature 31680
                                    Θ
                                         10560
                                    0.0
skew_b
             31680
                                          2880
rise delay
            31680 25710 1.517615e-10
                                           22
fall_delay
            31680 29449 1.237862e-10
                                            q
rise_slew
fall_slew
             31680
                   27453
                                     0
                                           381
            31680 27041
                                     0
                                           381
Displaying data information and saving to
/home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X1/info.txt
```

Run Below commands in sequence

□ splitData -gate GATENAME -file_name FILENAME -test_size TESTSIZE: This will split the dataset and save it in the output directory of the specified gate as X_train.csv, y_train.csv, X_test.csv, y_test.csv. (file should be stored in the output directory of specific gate)

>> splitData -gate NAND2X1 -file name GPr3 main dataset NAND2X1.csv -test size 0.2 X_train, Y_train, X_test, y_test is generated in folder: /home/poojabe/Desktop/PhD_Re search/src_project/ml_lib_char/Limo/output/NAND2X1 preProcessData train -gate GATENAME: will take X train and y train for specified gate from the output directory and pre-process data and save the pre-processed files for specified gate in the output directory as preprocessed X train.csv, preprocessed y train. >> preProcessData train -gate NAND2X1 preprocessed_X_train, preprocessed_Y_train is generated in /home/poojabe/Desktop/PhD Research/src_project/ml_lib_char/Limo/output/NAND2X1 preProcessData test -gate GATENAME: will take X test and y test for specified gate from the output directory and pre-process data and save the pre-processed files for specified gate in the output directory as preprocessed X test.csv, preprocessed y test. >> preProcessData_test -gate NAND2X1 preprocessed_X_test, preprocessed_Y_test is generated in /home/poojabe/Desktop/PhD_Re search/src_project/ml_lib_char/Limo/output/NAND2X1 ☐ trainModel **MODELNAME:** This will -gate **GATENAME** -output take preprocessed X train.csv, preprocessed y train from the specified gate in output directory and train the model over it and generate the trained model with MODELNAME. >> trainModel -gate NAND2X1 -output trained model NAND2X1 Iteration 1, loss = 0.01417635

```
Trained model is generated in /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Limo/output/NAND2X1
Iteration 2, loss = 0.00799877
Iteration 3, loss = 0.00643552
Iteration 4, loss = 0.00563481
Iteration 5, loss = 0.00509699
Iteration 6, loss = 0.00469148
Iteration 7, loss = 0.00443933
Iteration 8, loss = 0.00421123
Iteration 9, loss = 0.00409838
Iteration 10, loss = 0.00403701
Iteration 11, loss = 0.00398202
Iteration 12, loss = 0.00390548
Iteration 13, loss = 0.00387488
Iteration 14, loss = 0.00381056
Iteration 15, loss = 0.00382286
Iteration 16, loss = 0.00378937
Iteration 17, loss = 0.00376686
Iteration 18, loss = 0.00376803
Iteration 19, loss = 0.00375546
Iteration 20, loss = 0.00374834
Training loss did not improve more than tol=0.000100 for 10 consecutive epochs. Stopping.
```

```
Evaluation Results:
Fold 1:
MSE: 0.0006
RMSE: 0.0252
MAE: 0.0136
R2 Score: 0.9841
Fold 2:
MSE: 0.0008
RMSE: 0.0275
MAE: 0.0154
R2 Score: 0.9808
Fold 3:
MSE: 0.0007
RMSE: 0.0263
MAE: 0.0130
R2 Score: 0.9821
Fold 4:
MSE: 0.0007
RMSE: 0.0271
MAE: 0.0132
R2 Score: 0.9817
Fold 5:
MSE: 0.0006
RMSE: 0.0253
MAE: 0.0135
R2 Score: 0.9831
```

□ **testModel -gate GATENAME –load MODELNAME –report REPORTNAME**: This will load the trained model and evaluate model over preprocessed_X_test, preprocessed_y_test from the output directory and generate report with the REPORTNAME.

```
>> testModel -gate NAND2X1 -load trained_model_NAND2X1.pkl -report report_NAND2X1.txt

Reports is generated in /home/poojabe/Desktop/PhD_Research/src_project/ml_lib_char/Li
mo/output/NAND2X1

Evaluate Model on Test data for gate NAND2X1
{'MSE': 0.0007211174381096025, 'RMSE': 0.026853629887030217, 'MAE': 0.013714699789492
706, 'R2 Score': 0.9816434822004674}
```

exit: Exits the LiMo tool.

```
>> exit
Exiting Limo shell.
```

IV. How to create your own setup for Limo?

This release contains a directory named *gates*. The *gates* directory contains subdirectories for each logic gate for which an intelligent library model needs to be created. If you want to create a setup for

your own library cells, you need to create a directory similar to *gates*. Then, using the *setVar* command, set the tool variable *lm gate dir* to the created directory.

The created *gates* library should contain the following information:

- 1. **subdirectories in** *gates***:** Create subdirectories for each logic gate in your library. For example: NAND2X1, NOR2X1, NAND3X1, NOR3X1, etc.
- 2. **gates/simulation/schematic:** Contains input files for simulation (netlist) and simulation results (psf) for each gate.
 - **netlist:** contains the spectre netlist and stimuli. Change the netlist, netlistHeader and netlistFooter with your netlist files. In netlist define the value as variable by using place holders like this:

```
// Library name: combCell45nm
// Cell name: NAND2X1
// View name: schematic
PM1 (Y B VDD VDD) g45p1svt w=(390n) l=45n nf=1 as=54.6f ad=54.6f ps=1.06u \
        pd=1.06u nrd=358.974m nrs=358.974m sa=140n sb=140n sd=160n \
        sca=114.89040 scb=0.09003 scc=0.01377 m=(1)
PM0 (Y A VDD VDD) g45p1svt w=(390n) l=45n nf=1 as=54.6f ad=54.6f ps=1.06u \
       pd=1.06u nrd=358.974m nrs=358.974m sa=140n sb=140n sd=160n \
        sca=114.89040 scb=0.09003 scc=0.01377 m=(1)
NM1 (net7 A VSS VSS) g45n1svt w=(260n) l=45n nf=1 as=36.4f ad=36.4f \
        ps=800n pd=800n nrd=538.462m nrs=538.462m sa=140n sb=140n sd=160n \
        sca=144.98299 scb=0.10251 scc=0.01780 m=(1)
NMO (Y B net7 VSS) g45nlsvt w=(260n) l=45n nf=1 as=36.4f ad=36.4f ps=800n \
        pd=800n nrd=538.462m nrs=538.462m sa=140n sb=140n sd=160n \
        sca=144.98299 scb=0.10251 scc=0.01780 m=(1)
CO (Y VSS) capacitor c=cap
```

Also in stimuli define the value as variable by using place holders like this:

```
vB (B 0) vsource dc=VDD val0=0 val1=VDD period=20n delay=3000ps+skew_b rise=slew_b fall=<mark>slew_b</mark> width=10n type=pulse vA (A 0) vsource dc=VDD val0=0 val1=VDD period=20n delay=3000ps rise=slew_a fall=slew_a width=10n type=pulse vVDD (VDD 0) vsource dc=VDD type=dc vVSS (VSS 0) vsource dc=0 type=dc
```