

Fast Congestion Planning and Floorplan QoR Assessment

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Executive Summary

- Current process for evaluating floorplan QoR often takes days to weeks.
- Machine Learning can predict timing slack and congestion without running Place and Route in the ASIC flow.
 - Achieves 80% accuracy in experiments with real-world SoCs
- Armed with predictive insights, designers can iterate and fix potential problems quickly.
 - Major customers starting internal ML efforts



Challenge: Complex SOC Implementation

- Selecting the best floorplan requires days to weeks to run Place & Route.
 - 1. Create Floorplans

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no.	NO.	

- 2. Explore Floorplans
- Goals: Meet performance & area targets
- Performed by highly experienced engineers

3. Pick the Best Floorplan









Solution: Predict Floorplan QoR without Place and Route



Deep Learning Framework





Feature Engineering

Design Representation

- Cut design into an XY grid
 Cell Density
- Total cells per XY

Pin Density

 Total pins of standard cells per XY



External Connectivity

 Total connections between cells within and cells outside an XY

Internal Connectivity

 Total connections between cells in an XY



Macro Regions

 Differentiate between hard macro regions and standard cell regions

Occupied Regions

 Differentiate between occupied and unused floorplan area.







Train Machine Learning (ML) Model

1. Create Floorplans

2. Derive Features

3. Train on Deep Learning Network

- <u>Design</u> <u>Exchange</u> <u>Format</u>
 DEF output from coarse placement database of 9 SOC designs.
- Extract data from multiple floorplans
- Gather 1000 datapoints



Formatted Training Data







Evaluate Trained ML Model



	Target	Achieved
Loss	~0.1	~0.4
Accuracy	80%	> 80%
	Table 1	

- WNS prediction model can learn and achieves up to 80% predictive accuracy.
 - Features are adequate.
 - Number of data samples are sufficient.

• Areas for improvement:

- More designs and more datapoints (> 1000) per design will improve model performance.
- More iterations will reduce Training Loss.





Improve ML Model Output

<u>Version 1</u>: "Yes / No" prediction too broad to accurately reflect QoR.

- Not precise enough for debugging.
- Hard to generalize across different SoC designs and/or process technologies.



Is TNS = -1000ns Good or Bad? <u>Version 2</u>: Highlight timing or congestion per XY.

- Populate each XY with color-coded WNS or congestion value.
- Predicted colors form "heatmap" to show floorplan quality.



Point-to-Point WNS or Congestion Prediction







Output: Detailed Heatmap Predictions

Floorplans #1 to #4: Best floorplan (#3) has fewest colors - least congestion and smallest negative slack.







Summary

- Machine Learning (ML) can predict timing slack and congestion without the need to run Place and Route.
 - Data from multiple designs used to train AI model.
 - Trained AI model shows 80% predictive accuracy.
- Customers can use this technology to:
 - iterate quickly with multiple floorplans
 - resolve problematic areas
 - save time and resources on running place and route.





Questions?



