

# Harnessing Conditional Generative Models for Synthetic Non-Life Insurance Premium Data

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**Al Image Generator** 

Synthetic data generation represents a transformative approach to addressing critical data challenges in non-life insurance, where privacy regulations, limited sample sizes, or incomplete coverage across risk segments often constrain traditional datasets.

Synthetic data offers a solution by creating artificial datasets that preserve original statistical properties and correlational structures.







### 2 Datasets to test

### Encoding Categorical Variables

## 4 Conditional Generative Models

### **Evaluation**





## Synthetic Data with Conditional Generative Models



Conditional Variational Autoencoders with Transformer Decoder



Conditional Variational Autoencoders





## Evaluation

Visualization Comparison Kolmogorov -Smirnov Test

PCA/UMAP Analysis

GLM Models Comparison Feature Importance Comparison



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## Conclusions

- The CGMM benchmark remains a good solution to follow for simplicity.
- ✓ Data from Deep Learning Generative Models requires architecture expert judgment.
- ✓ GANs were not used because they did not show a valuable output; they can be a better solution for classification tasks.
- LLMs were dropped as a solution because they can be computationally expensive and are prone to memorise a consistent portion of the dataset despite understanding patterns.
- ✓ Interesting solution is the personalisation of the CVAE with the Transformer Decoder.
- The next steps involve masking sensitive data and reducing the portion of the training set used to train the generative models.





## References

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- Data: <u>dutangc/CASdatasets</u>: <u>Datasets</u> for the book Computational Actuarial Science with R
- Github Repository: <a href="mailto:claudio1975/Generative\_Modelling">claudio1975/Generative\_Modelling</a>



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## Thank you

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