

Research Proposal: Machine Learning Approaches to Assess Long-term Inclisiran Safety

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Significance of the research





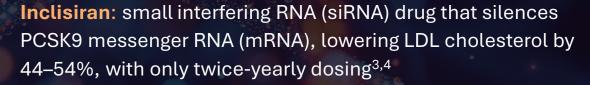
Adverse drug events (ADEs) remain a leading cause

of harm in healthcare¹



Cardiovascular disease (CVD)

causes 17.9 million deaths globally each year²



Clinical trials show generally safe profile, but follow-up limited to ~6 years⁵

ORION-4: international randomised controlled long-term trial, including 15,000 patients with established atherosclerotic CVD (ASCVD)⁶

^{1.} Kim, RH. et al. (2022) 'Analyzing adverse drug reactions using statistical and machine learning methods: a systematic review', Medicine, 101(25), p. e29387. Available at: doi.org/10.1097/MD.0000000000029387.

^{2.} World Health Organization (2023) Cardiovascular diseases (CVDs) fact sheet. Available at: https://www.who.int/news-room/fact-sheets/detail/cardiovascular-diseases-(cvds) (Accessed: 2 October 2025).

^{3.} Marrs, J.C. and Anderson, S.L. (2024) 'Inclisiran for the treatment of hypercholesterolaemia', Drugs in Context, 13, p. 2023-12-3. Available at: doi.org/10.7573/dic.2023-12-3.

^{4.} Ray, K.K., Wright, R.S., Kallend, D., et al. (2020) 'Two phase 3 trials of inclisiran in patients with elevated LDL cholesterol', New England Journal of Medicine, 382(16), pp. 1507–1519. Available at: doi.org/10.1056/NEJMoa1912387.

^{5.} Wrights, R.S., Ragu (1932) 4. Appendix of Cardiology, 82(24), a tendent of logical processing the effects of cardiology, 82(24), a tendent of logical processing the effects of incident of the Appendix of

Research question



Can Machine Learning (ML) uncover long-term inclisiran safety signals beyond standard analyses?



Data harmonisation (structured + unstructured)



Which ML models?



Added value from free-text?^{7,8}

Aims and Objectives

Apply ML to ORION-4 data for safety signal detection



Preprocessing data



Develop ML models (supervised/unsupervised)¹



Benchmark against

Cox regression &

disproportionality methods⁴



Validate signals with linked national datasets

Literature Review

Clinical Trials

- Statins first-line;
 PCSK9 monoclonal antibodies (mAbs) adjunct in high-risk groups^{9,10}
- Inclisiran approved by EMA 2020, FDA 2021³
- ORION-9/10/11 trials:
 ~50% LDL-C reduction, safe, injection-site AEs⁴
- ORION-3/8 trials: long-term safety confirmed⁵

Machine Learning

- ML in pharmacovigilance: structured
 ADE prediction^{1,8}
- NLP for free-text event extraction^{7,8}

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^{3.} Marrs, J.C. and Anderson, S.L. (2024) 'Inclisiran for the treatment of hypercholesterolaemia', *Drugs in Context*, 13, p. 2023-12-3. doi:10.7573/dic.2023-12-3.

^{4.} Ray, K.K., Wright, R.S., Kallend, D., et al. (2020) 'Two phase 3 trials of inclisiran in patients with elevated LDL cholesterol', New England Journal of Medicine, 382(16), pp. 1507–1519. Available at: doi.org/10.1056/NEJMoa1912387.

^{5.} Wright, R.S., Raal, F.J., Koenig, W., et al. (2023) 'Safety and tolerability of inclisiran for treatment of hypercholesterolaemia: pooled analysis of / clinical trials', Journal of the American College of Cardiology, 82(24), pp. 2251–2261. Available at: doi.org/10.1016/j.jacc.2023.10.00/

^{7.} Hu, X., Zhang, Y., Li, J., et al. (2023) 'Leveraging natural language processing and machine learning to identify adverse drug events in clinical text', Drug Safety, 45(9), pp. 815–829. Available at: doi.org/10.1001/s40264-024-01505-8. Murphy, R.M. et al. (2023) 'Adverse drug event detection using natural language processing: A scoping review of supervised learning methods', PloS One, 18(1), p. e0279842. Available at: doi.org/10.1371/journal.pone.0279842.

^{9.} Grundy, S.M., Stone, N.J., Bailey, A.L., et al. (2019) '2018 AHA/ACC guideline on the management of blood cholesterol', Journal of the American College of Cardiology, 73(24), pp. e285-e350. Available at: doi.org/10.1016/j.jacc.2018.11.003.

^{9.} Grundy, S.M., Stone, N.J., Bailey, A.L., et al. (2019) '2018 AHA/ACC guideline on the management of blood cholesterol', Journal of the American College of Cardiology, 73(24), pp. e285-e350. Available at: doi.org/10.1016/j.jacc.2011 (2019) '2019 ESC/EAS Guidelines for the management of dyslipidaemias', European Heart Journal, 41(1), pp. 111-188. Available at: doi.org/10.1093/eurheartj/ehz455.

Methodology Overview





Structured data: demographics, prescriptions, hospitalisations, Serious Adverse Event (SAE) reports

<u>Unstructured data:</u> free-text notes
<u>analysed with NLP^{7,11}</u>

Supervised classifiers (random forests, gradient boosting, neural networks)⁸

Unsupervised clustering8

NLP (transformer models)8,11

Research Design





Harmonisation +
feature
engineering
across datasets



Cross-validation with held-out test sets



Benchmarks: Cox regression, disproportionality⁴



Performance
metrics:
AUROC,
precision-recall,
calibration



Explainability with SHAP to interpret outputs 12

Ethical Considerations & Risks



RISKS

Privacy

Subgroup bias

Spurious signals¹³



MITIGATIONS

GDPR pseudonymisation

Secure storage

Fairness audits

Expert review

Ethical approvals

Timeline











Review

Literature review & ethics approval

Preprocessing

Data preprocessing & NLP pipeline

Modelling

Model development & internal validation

Validation

Benchmark
comparison &
external validation

Write-up

Write-up & dissemination

MONTHS

4

10

13

Expected Contribution





First ML application to inclisiran safety^{3,5}
Anticipates ORION-4 final results in 2026⁶



Framework for multimodal ADE detection



Transferable to other RNAi therapies 14

^{3.} Marrs, J.C. and Anderson, S.L. (2024) 'Inclisiran for the treatment of hypercholesterolaemia', Drugs in Context, 13, p. 2023-12-3. Available at: doi.org/10.7573/dic.2023-12-3.

^{5.} Wright, R.S., Raal, F.J., Koenig, W., et al. (2023) 'Safety and tolerability of inclisiran for treatment of hypercholesterolaemia: pooled analysis of 7 clinical trials', Journal of the American College of Cardiology, 82(24), pp. 2251–2261. Available at: doi.org/10.1016/j.jacc.2023.10.007. (Cinical Trials.gov (2023) A randomized trial assessing the effects of inclisiran on clinical outcomes among people with cardiovascular disease (ORION-4). Available at: https://clinicaltrials.gov/study/NCT03705234 (Accessed: 2 October 2025). (Application of the American College of Cardiology, 82(24), pp. 2251–2261. Available at: doi.org/10.7573/dic.2024-3-1.





ML may provide earlier and deeper insights into long-term inclisiran safety



Inclisiran:
effective siRNA,
promising safety signals^{3,4}



Scientific gap: long-term safety unknown⁵

ORION-4:

unique dataset + robust causal framework⁶



ML may help detect hidden safety pattern¹

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ClinicalTrials.gov (2023) A randomized trial assessing the effects of inclisiran on clinical outcomes among people with cardiovascular disease (ORION-4). Available at: https://clinicaltrials.gov/study/NCT03705234 (Accessed: 2 October 2025).

Fazoli, R.T. et al. (2024) 'RNA interference therapy in cardiology: will new targets improve therapeutic goals?', Drugs in Context, 13, p. 2024-3-1. Available at: 10.7573/dic.2024-3-1.

Grundy, S.M. et al. (2019) '2018 AHA/ACC guideline on the management of blood cholesterol', Journal of the American College of Cardiology, 73(24), pp. e285-e350. Available cholesterol', New England Journal of Medicine, 382(16), pp. 1507-1519. Available at: at: 10.1016/j.jacc.2018.11.003.

Hu, X. et al. (2023) 'Leveraging natural language processing and machine learning to identify adverse drug events in clinical text', Drug Safety, 46(9), pp. 815–829. Available at: 10.1007/s40264-024-01505-6.

Kim, RH. et al. (2022) 'Analyzing adverse drug reactions using statistical and machine learning methods: a systematic review', Medicine, 101(25), p. e29387. Available at: 10.1097/MD.0000000000029387.

Li, Y. et al. (2024) 'Artificial intelligence-powered pharmacovigilance: A review of machine and deep learning in clinical text-based adverse drug event detection for benchmark datasets', Journal of Biomedical Informatics, 152, p. 104621. Available at: https://doi.org/10.1016/j.jbi.2024.104621.

Mach, F. et al. (2020) '2019 ESC/EAS Guidelines for the management of dyslipidaemias', European Heart Journal, 41(1), pp. 111-188. Available at: 10.1093/eurheartj/ehz455.

Marrs, J.C. and Anderson, S.L. (2024) 'Inclisiran for the treatment of hypercholesterolaemia', Drugs in Context, 13, p. 2023-12-3. Available at: 10.7573/dic.2023-12-3.

Murphy, R.M. et al. (2023) 'Adverse drug event detection using natural language processing: A scoping review of supervised learning methods', PloS One, 18(1), p. e0279842. Available at: https://doi.org/10.1371/journal.pone.0279842.

Rajkomar, A. et al. (2019) 'Ensuring fairness in machine learning to advance health equity', Annals of Internal Medicine, 169(12), pp. 866–872. Available at: 10.7326/M18-1990.

Ray, K.K. et al. (2020) 'Two phase 3 trials of inclisiran in patients with elevated LDL 10.1056/NEJMoa1912387.

Sadeghi, Z. et al. (2024) 'A review of Explainable Artificial Intelligence in healthcare', Computers and Electrical Engineering, 118, p. 109370. Available at: https://doi.org/10.1016/j.compeleceng.2024.109370.

World Health Organization (2023) Cardiovascular diseases (CVDs) fact sheet. Available at: https://www.who.int/news-room/fact-sheets/detail/cardiovascular-diseases-(cvds) (Accessed: 2 October 2025).

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Thank you