



Quantum Stack Future

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HBO-ICT Technical Computing

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Table of contents

Quantum
Stack Future

Ed Kuijpers

New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- 1 New developments
- 2 QML theory
- 3 Practical Implementations
- 4 Ethics, Law and Social Aspects
- 5 Recap and discussion
- 6 Conclusion and further work



Recent developments and updates

Quantum
Stack Future

Ed Kuipers

New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Revolutionary qubit technology in Basel
- Pseudomagic quantum states
- New quantum technology
- Quantum communication via standard optic fiber Teleportation and noise
- Desktop quantum accelerator
- Scalable Majorana roadmap
- Quantum Gravity?



Topics not covered in detail

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Physics of qubits and gates
- Software quality and standards
- Ethics, Law, Social Aspects, e.g. [Ethics, Law and Social Aspects](#)
- ML and Quantum Stack
- and much more (in the Netherlands alone already at least 600 people working in the field)



Future of Digital Infrastructure event

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

Future of quantum internet event part of [Quantum meets 2024](#)





New details QKD systems

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Q-Bird next-generation Quantum Cryptography
- Quantum Industries
- 200-350 km on groundlinks, commercial products available



Quantum Optical computing

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- QuiX Quantum Photonic Quantum Computing
- reconfigurable interferometers with thermal control phase shifting(1 kHz range)



Mach-Zehnder interferometer

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New
developments

QML theory

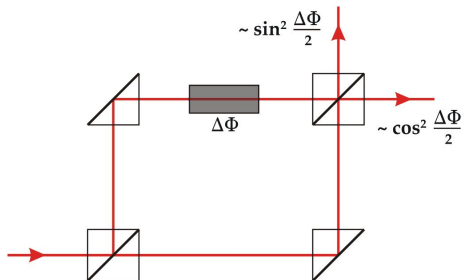
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





Quantum Network Explorer

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Stack Future

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Short workshop on QNE
- QuTech (P.o.C. Nico Seidler, A.V. Ravisankar)



Qruise

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Qruise
- Predictive models
- Development toolkit for accelerationo of quantum hardware



Software Engineering and Quantum Computing

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Stack Future

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Quantum software engineering: landscap and Horizons ([1])
- eScience Center guide
- Best practices ML software
- Five recommendations for FAIR software
- Victor Eijkhout's Art of High Performance Computing textbooks (includes parallel processing on supercomputers)



Software delivery projects

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Include library version, use “pip freeze > requirements.txt”
- Document the python version used
- Include webreferences to datasets used
- Include introduction and reflection in Jupyter notebooks
- Provide installation instructions and demo to check proper installation
- Write software with reuse by other people in mind (Personal names not included in directory names)
- Include professional flavour (use of badges, markdown, CI/unit-testing, show validation on real-data next to testing)



Relevance quantum stack

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

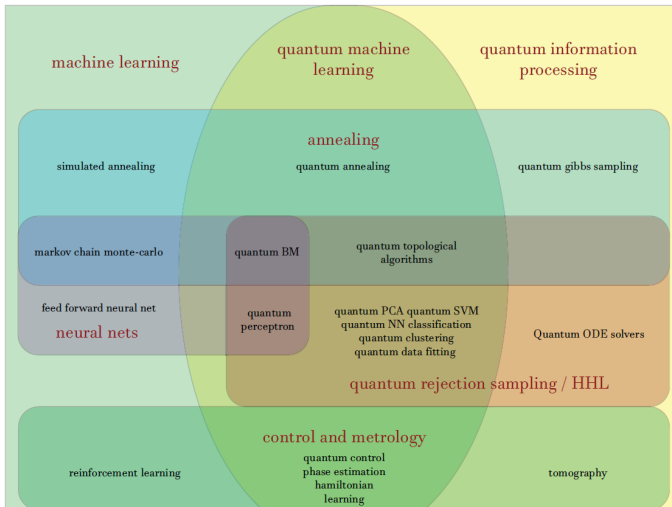
Conclusion
and further
work

References

- 1.) QML depending on underlying technology
- 2.) ML part of calibration and initialization
- 3.) Closely related to optimization

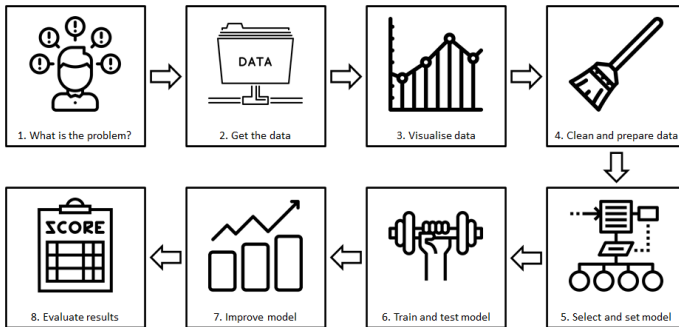


Relationship with architecture





Classical Machine Learning steps



CRISP-DM = Cross-Industry Standard Process for Data Mining Model for classic machine learning



Classical and Quantum combination

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QML theory

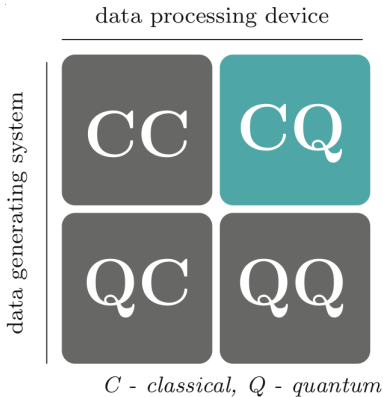
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





Multilayer Perceptron

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New
developments

QML theory

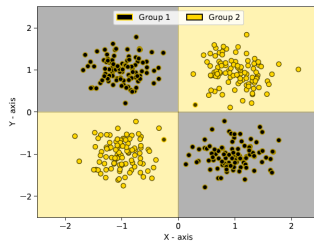
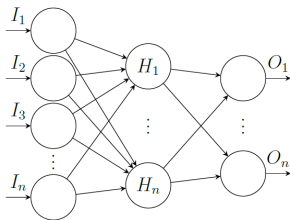
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

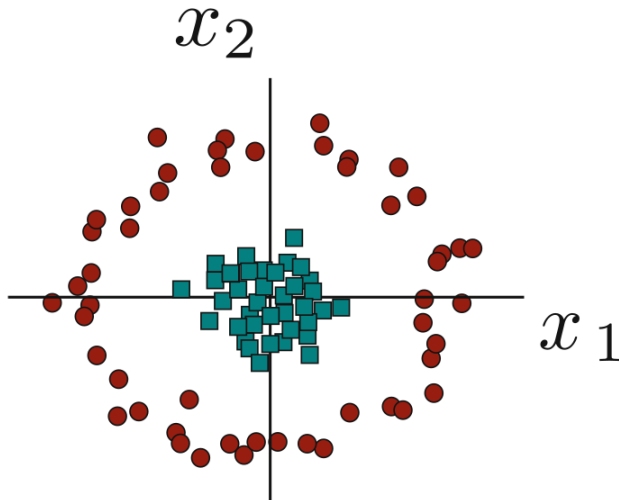
Conclusion
and further
work

References





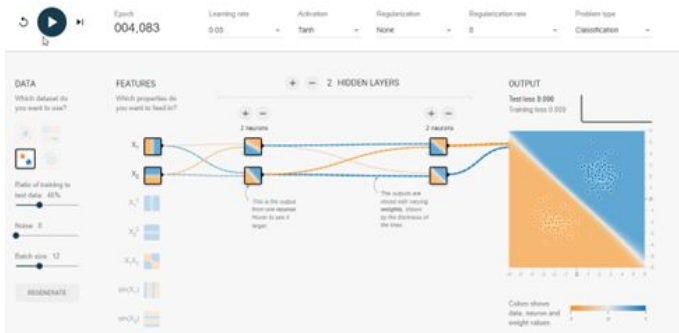
Need for non-linear





Playground introduction

See [Tensorflow playground](#)





Need for higher dimensions

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developments

QML theory

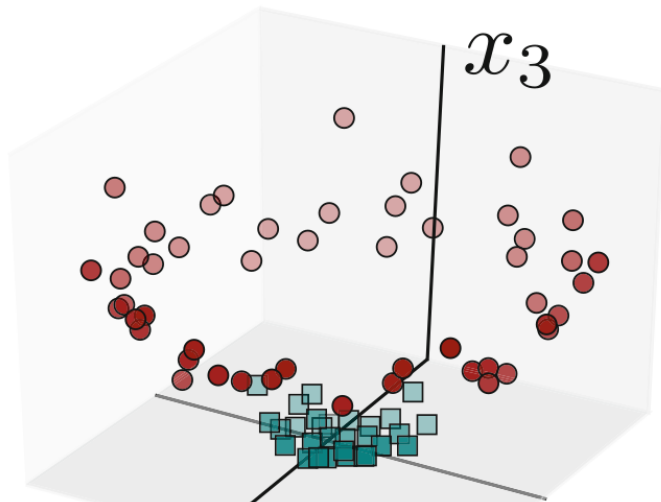
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





Support Vector Machine SVM

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developments

QML theory

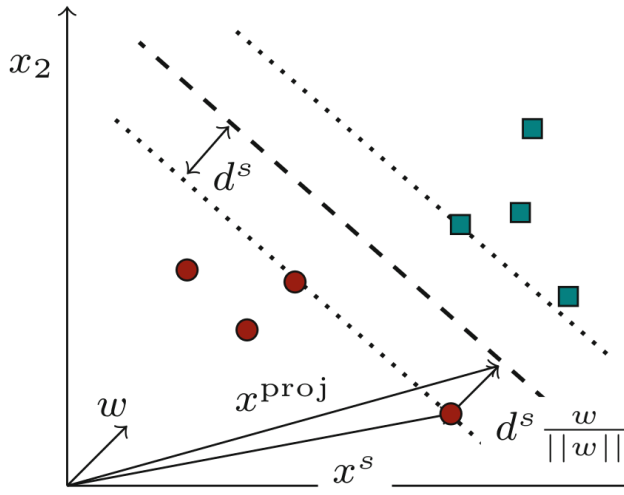
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





Clustering, unsupervised learning

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New
developments

QML theory

Practical Im-
plementations

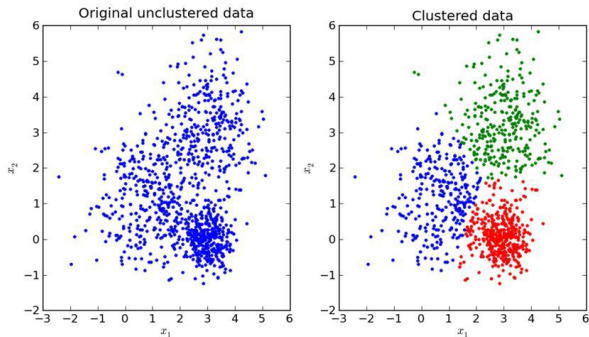
Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

Unsupervised Learning





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New
developments

QML theory

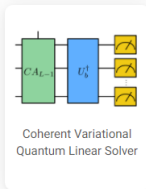
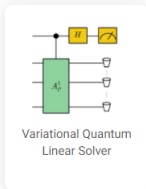
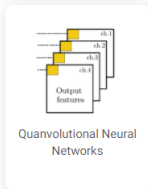
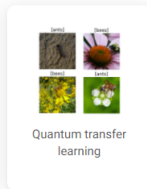
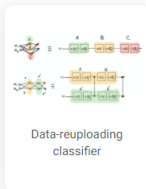
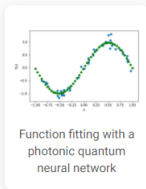
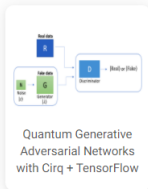
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

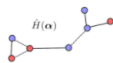
Recap and
discussion

Conclusion
and further
work

References



The Stochastic
Parameter-Shift Rule



The Quantum Graph
Recurrent Neural
Network



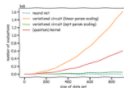
Optimizing a quantum
optical neural network



Quantum models as
Fourier series



Quantum computation
with neutral atoms



Kernel-based training of
quantum models with
scikit-learn



Learning to learn with
quantum neural
networks



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developments

QML theory

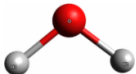
Practical Im-
plementations

Ethics, Law
and Social
Aspects

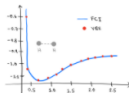
Recap and
discussion

Conclusion
and further
work

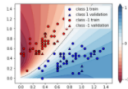
References



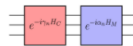
Quantum Chemistry
with PennyLane



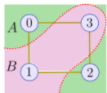
A brief overview of VQE



Variational classifier



Intro to QAOA



QAOA for MaxCut



Training a quantum
circuit with PyTorch



3-qubit Ising model in
PyTorch



PyTorch and noisy
devices



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developments

QML theory


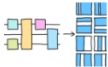










Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

 <p><small>Demo</small> Running GPU-accelerated quantum circuit simulations...</p>	 <p><small>Demo</small> Quantum Circuit Born Machines</p>	 <p><small>Demo</small> How to quantum just-in-time compile VQE with Catalyst</p>	 <p><small>Demo</small> How to optimize a QML model using Catalyst and...</p>
 <p><small>Demo</small> Symmetry-invariant quantum machine learning...</p>	 <p><small>Demo</small> Dropout in Quantum Neural Networks</p>	 <p><small>Demo</small> Learning shallow quantum circuits with local inversions...</p>	 <p><small>Demo</small> How to optimize a QML model using JAX and Optax</p>
 <p><small>Demo</small> How to optimize a QML model using JAX and JAXopt</p>	 <p><small>Demo</small> Circuits as Fourier series</p>	 <p><small>Demo</small> Contextuality and inductive bias in QML</p>	 <p><small>Demo</small> An equivariant graph embedding</p>



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New
developments

QML theory

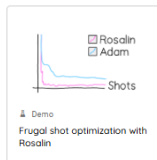
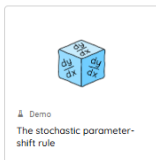
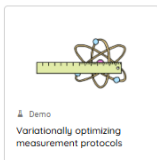
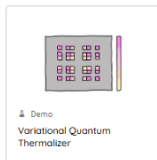
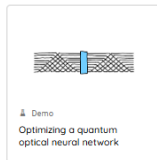
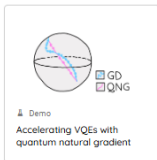
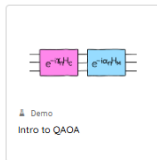
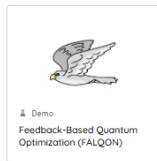
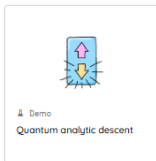
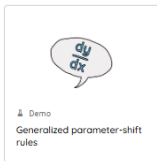
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





PennyLane III

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Stack Future

Ed Kuipers

New
developments

QML theory

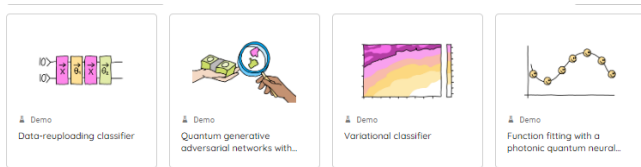
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References



Which algorithms were implemented in projects of the ACQ minor and are not demos in PennyLane? (regression? Diffusion? GAN?)



Code optimization

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developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- How to optimize python code? (numba JIT compiler, python compiler, etc.)
- How to develop Explainable models(XAI)?
- How to avoid bias?
- How to define performance metrics?
- How to select hardware and software platform?
- Relationships with optimization
- Etc.



Ethics, Law and Social Aspects

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Society Application in Quantum Delta program (incl. White papers to learn from past AI)
- Ethics, Law and Social Aspects
- Netherlands AI coalition
- 17 Sustainable development goals
- Rules of conduct professional organizations (ACM, IEEE)
- Philosophy



Recap and evaluation

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New
developments

QML theory

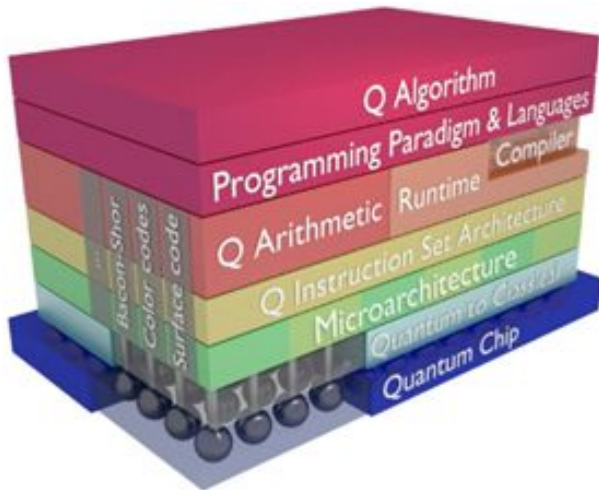
Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References





Conclusion

Quantum
Stack Future

Ed Kuipers

New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Lesson 1: Introduction topics
- Lesson 2: Programming Languages
- Lesson 3: Hardware, sensing
- Lesson 4: Transpiling and hardware
- Lesson 5: Information Theory
- Lesson 6: Quantum Internet and sensing
- Lesson 7: Recent developments, QML and stack



Assessment

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- 18 June presentation
- reading paper and final grading after checks
- resit opportunity August



Conclusion

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- Rapid developments for quantum computing
- AI algorithms currently more powerful than QML
- Many new developmets
- Many questions to be resolved



References I

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Stack Future

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New
developments

QML theory

Practical Im-
plementations

Ethics, Law
and Social
Aspects

Recap and
discussion

Conclusion
and further
work

References

- [1] Jianjun Zhao. *Quantum Software Engineering: Landscapes and Horizons*. 2020. arXiv: [2007.07047 \[cs.SE\]](#).