Edge Computing on the Edge DeiC Konference 2021

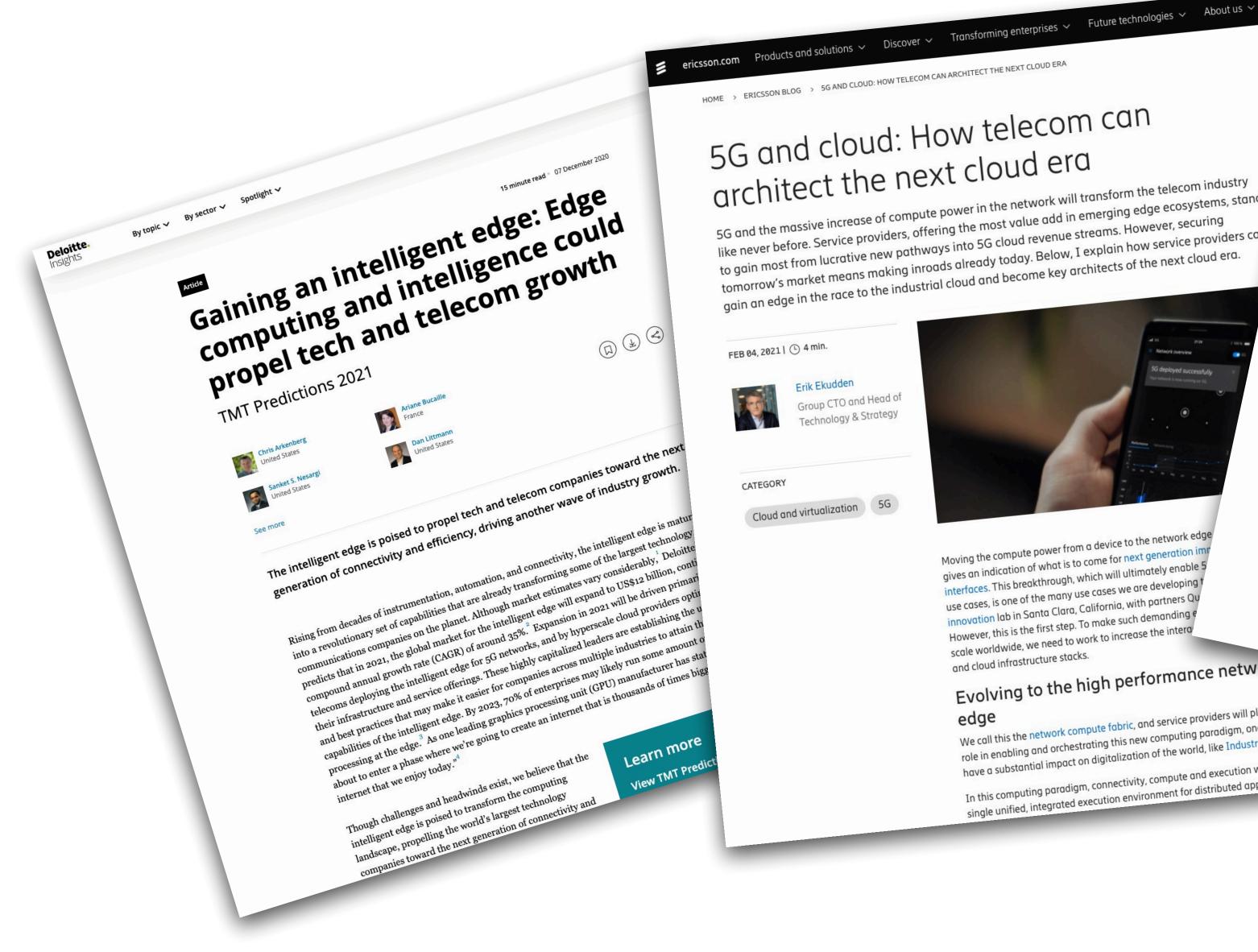
Anders E. Kalør, 4. november 2021 aek@es.aau.dk



AALBORG UNIVERSITET



Computing flytter sig mod kanten af netværket



About us 🗸

NOKIA

like never before. Service providers, offering the most value add in emerging edge ecosystems, stand to gain most from lucrative new pathways into 5G cloud revenue streams. However, securing tomorrow's market means making inroads already today. Below, I explain how service providers can



Moving the compute power from a device to the network edge gives an indication of what is to come for next generation im interfaces. This breakthrough, which will ultimately enable 5 use cases, is one of the many use cases we are developing t innovation lab in Santa Clara, California, with partners Qu However, this is the first step. To make such demanding e scale worldwide, we need to work to increase the intera

and cloud infrastructure stacks.

Evolving to the high performance network

We call this the network compute fabric, and service providers will play a critical role in enabling and orchestrating this new computing paradigm, one which will have a substantial impact on digitalization of the world, like Industry 4.0.

In this computing paradigm, connectivity, compute and execution will form a single unified, integrated execution environment for distributed applications –

Edge AI is the next of to ambient compu

^{s are} good you're being inundated with spam calls on a daily ^{ogne, ror one, believes that artificial intelligence will be a big part of the solution solution for the solution of the solu}

Pieves that artificial intelligence will be a big part of the solution to this problem, which is why the

wers to the user through real-time text transcription. The user can request ning calls with their own robot assistant. The AI answers and asks reject the call, send it to voicemail or accept it. e're trying to think of using technolr

ology in a way where it helps us, similar to if we had another person helping us," Dresident of engineering at Google. "Hopefully we're able to use technology to get control he of our incoming calls,"

Jitional artificial intelligence. Rather, it's made possible by edge AI – advanced

The cost, the profits, and the benefits

ng the process to the point of near



Om mig

- Ph.d.-studerende ved Aalborg Universitet (Connectivity-sektionen)
- Forsker i fremtidens (trådløse) kommunikationsteknologier:
 - Teknologier til at understøtte Internet of Things \bullet
 - Integration mellem kommunikation og computing
 - Intelligent kommunikation ved brug af AI/ML ۲

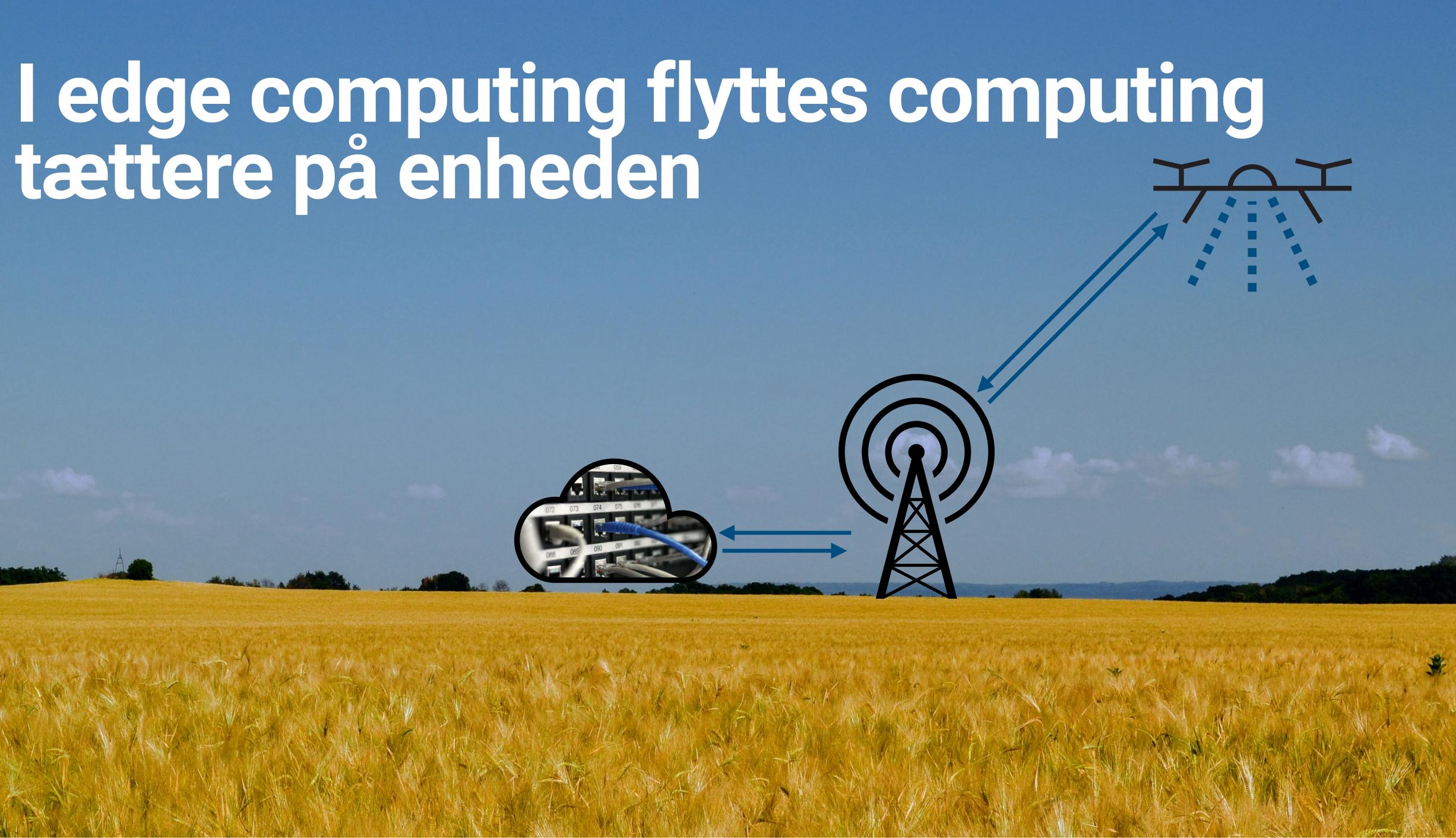




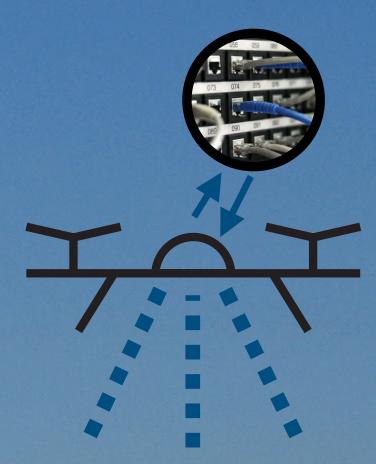
Traditionelt er skyen placeret centralt, langt fra enhederne







Helt op til enheden











Hvorfor edge computing?

- Høj **latenstid** mellem enheden og skyen
- Bedre skalerbarhed når antallet af enheder og datamængden stiger
- Potentielt højere pålidelighed
- Mere **privatliv** til enheden



amazon



Latenstid

- At minimere latenstiden har været et centralt fokus i 5G (og er i 6G)
- Forbindelsen til skyen udgør i stigende grad en flaskehals
- Latenstiden kan minimeres ved at placere "en sky" hos teleudbyderen, eller helt ude ved mobilmasten





Skalerbarhed, pålidelighed

- Flere ting bliver forbundet til Internettet og afhænger af AI/ ML/lign.
- Mængden af data stiger
- Maskering af cloud (u)pålidelighed





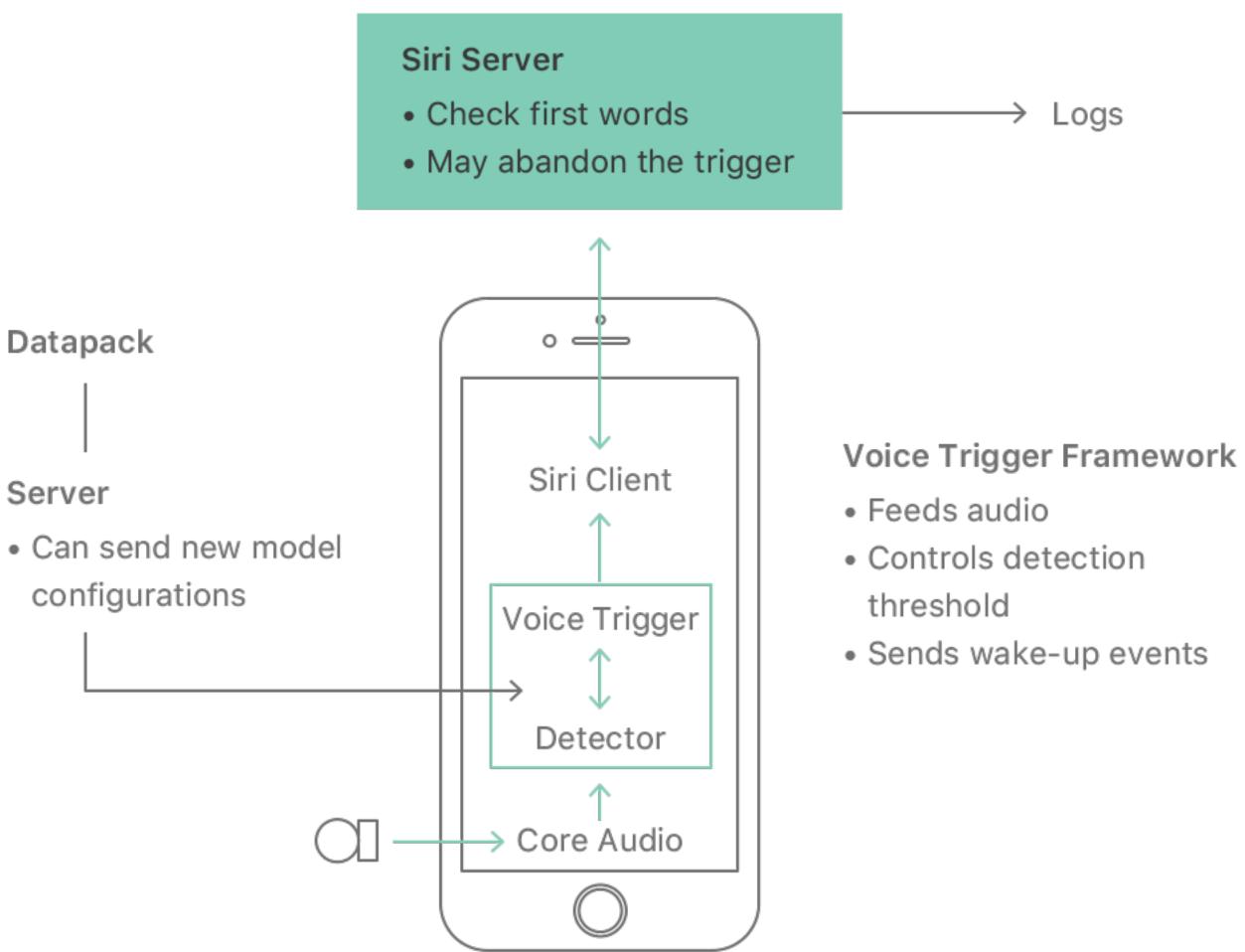
Privatliv

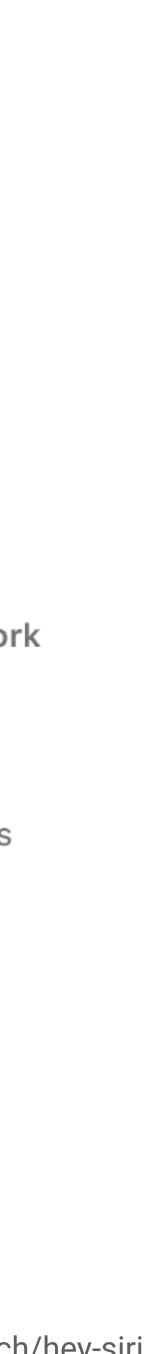
- IoT er blevet en del af vores hverdag
- Vi ønsker ikke at billeder, tale, osv. skal sendes til skyen



Apple's Siri

- Lytter konstant efter "Hej Siri"
- Kun hvis det detekteres, sendes lydoptagelsen til en server i skyen
- Serveren kører optagelsen igennem en bedre model
- Lydoptagelserne i skyen bruges til træning

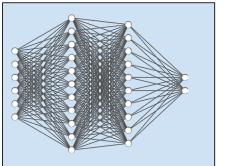




Computing Capacity







Prediction: "Rabbit"



Mobile Device

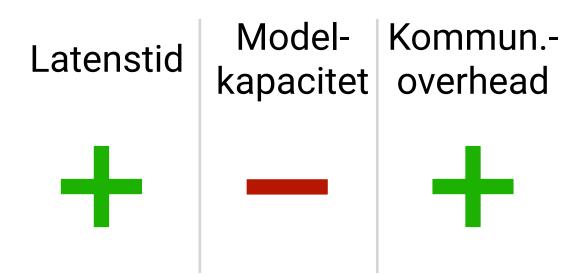


Wireless Communication

Matsubara, Yoshitomo, Marco Levorato, and Francesco Restuccia. "Split computing and early exiting for deep learning applications: Survey and research challenges." arXiv preprint arXiv:2103.04505 (2021).



Computing Capacity



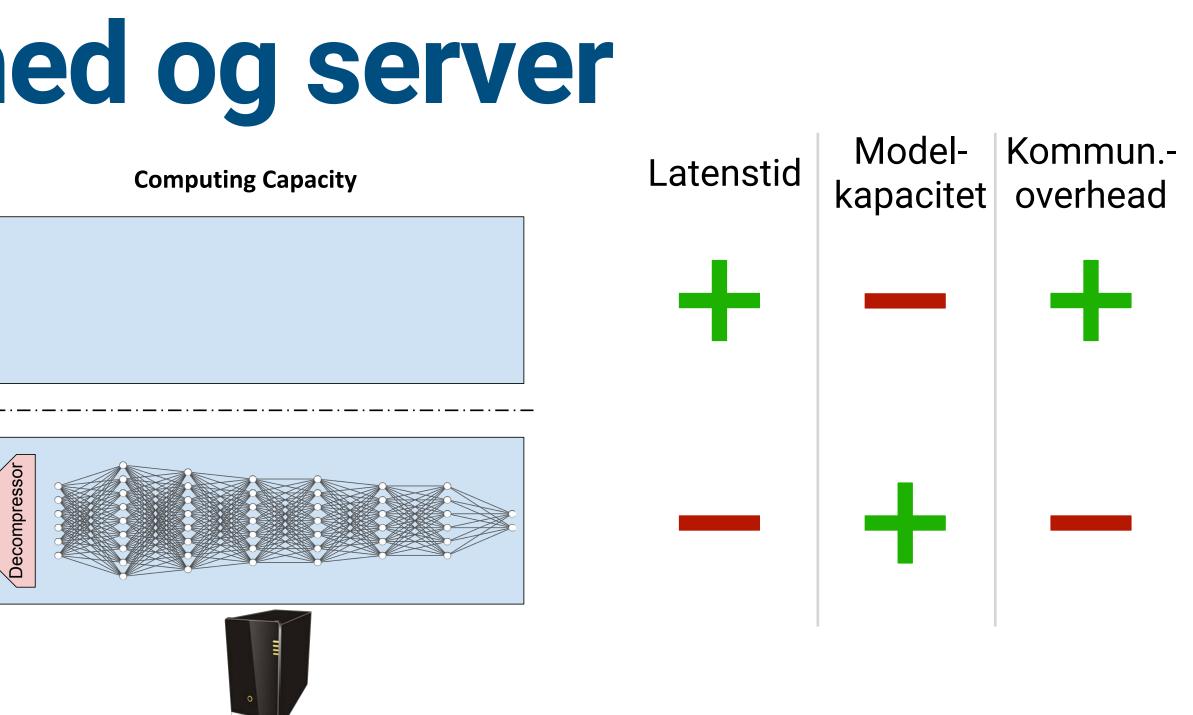


Edge Server



(c) by the prediction: "Rabbit" (c) by the prediction: "Rabbit"

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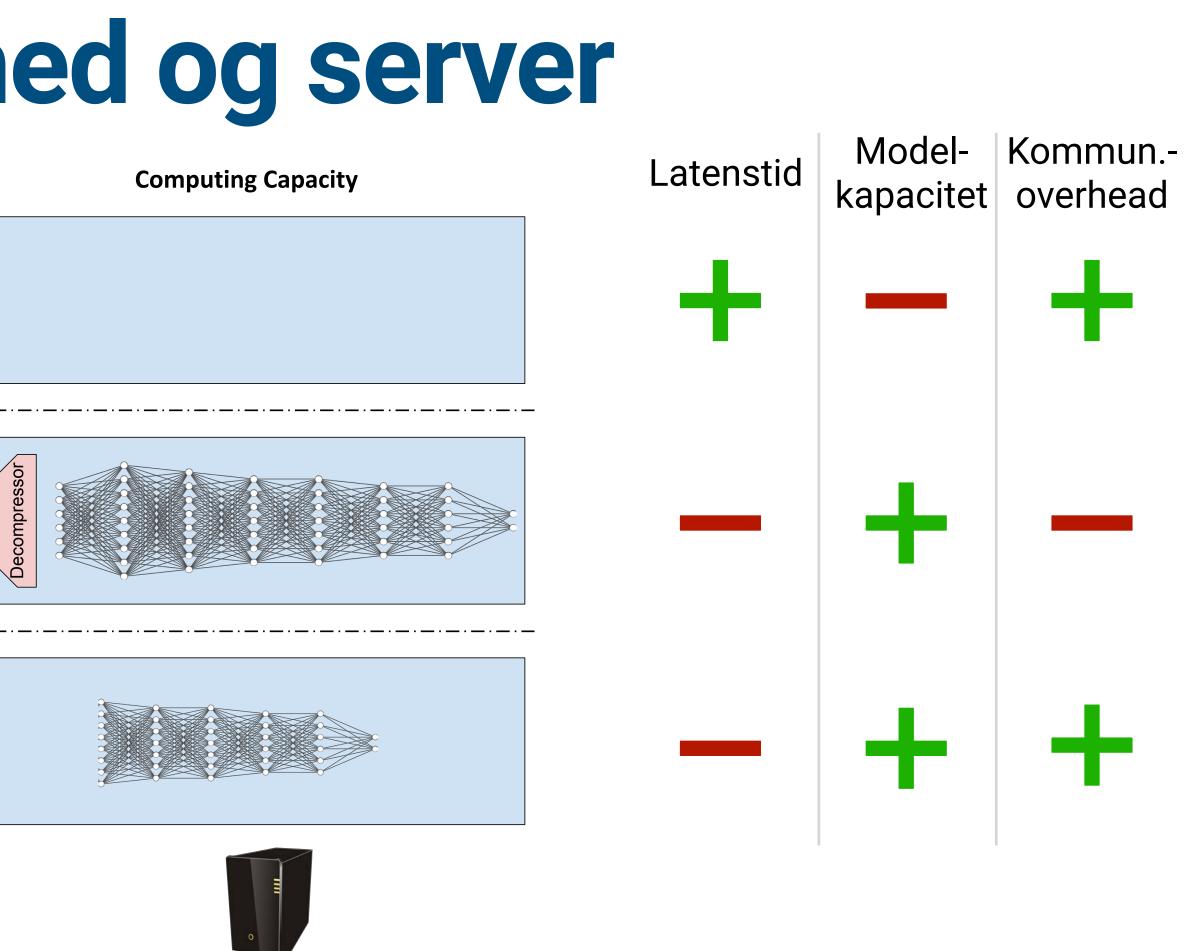
Edge Server



Computing Capacity Local Computing (a) Prediction: "Rabbit" (b) Edge Computing Sensor data al Compress Prediction: "Rabbit" (c) Split Computing Intermediate output Prediction: "Rabbit" $((\cdot))$ **Mobile Device Wireless Communication**

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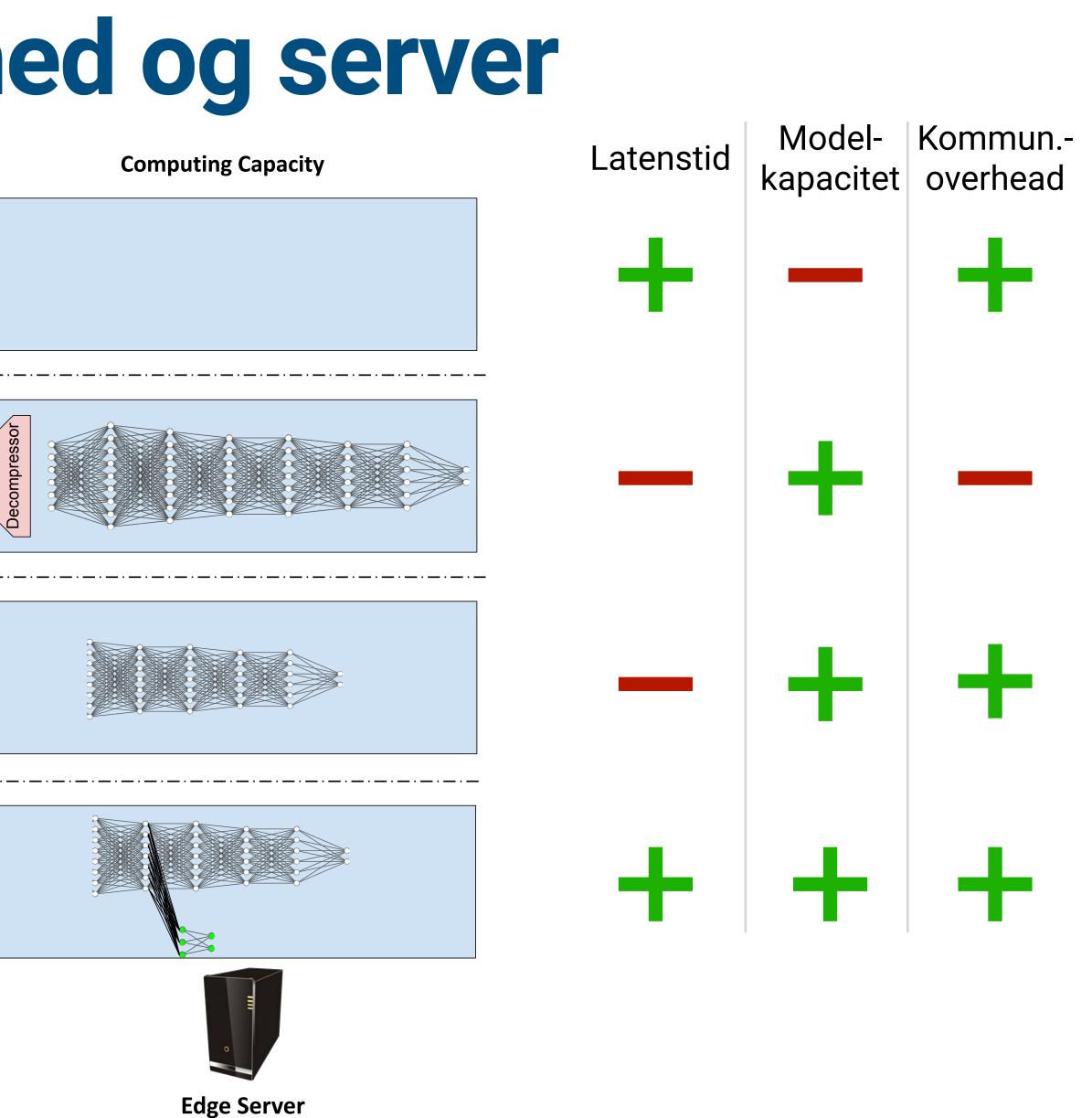
Edge Server





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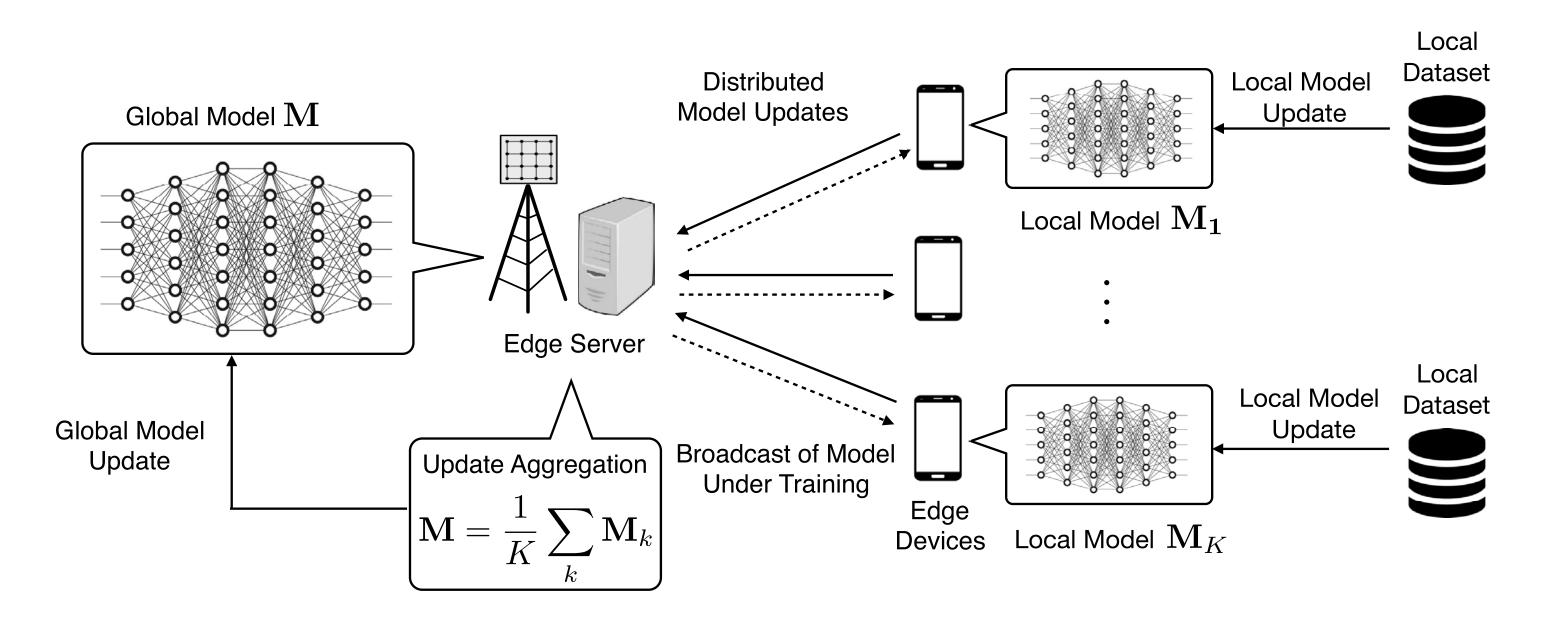
Matsubara, Yoshitomo, Marco Levorato, and Francesco Restuccia. "Split computing and early exiting for deep learning applications: Survey and research challenges." *arXiv preprint arXiv:2103.04505* (2021).





Federated learning

Hvis dataen er hos enhederne, hvordan skal modellerne så trænes?



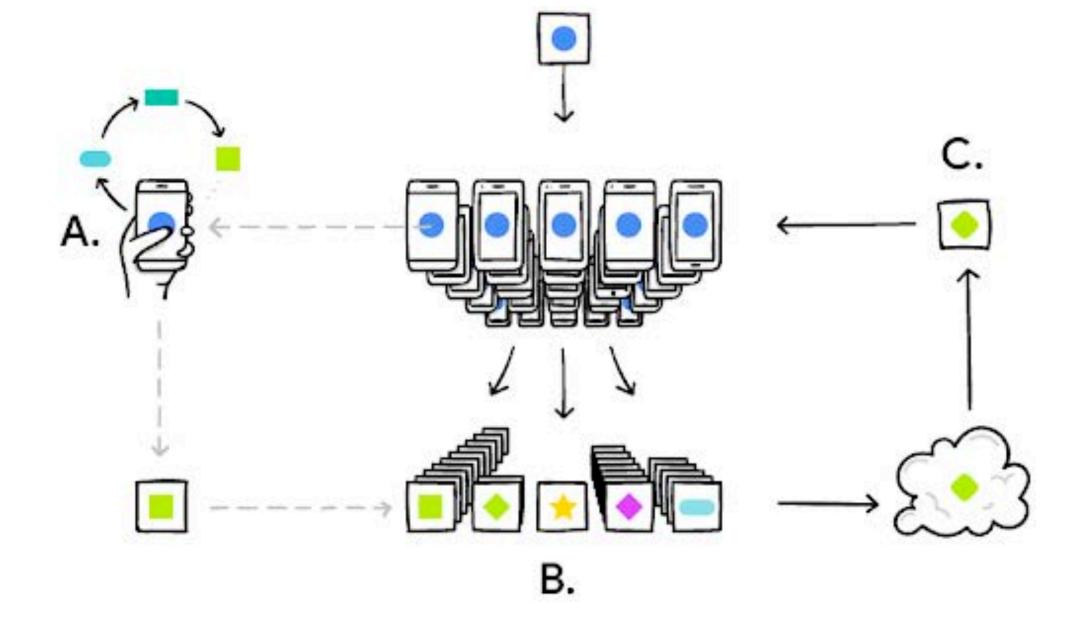
Zhu, Guangxu, Yong Wang, and Kaibin Huang. "Broadband analog aggregation for low-latency federated edge learning." IEEE Transactions on Wireless Communications 19.1 (2019): 491-506.



Google's Gboard tastatur

- A. Personalisering
- B. Aggregering af modeller (gradienter)
- C. Modelopdatering

> SMS I love you > so much too and w² e³ r⁴ t⁵ y⁶ u⁷ o[°] p dfghjkl a s z x c v b n m 🗵 ☺, ⊕ ?123 English

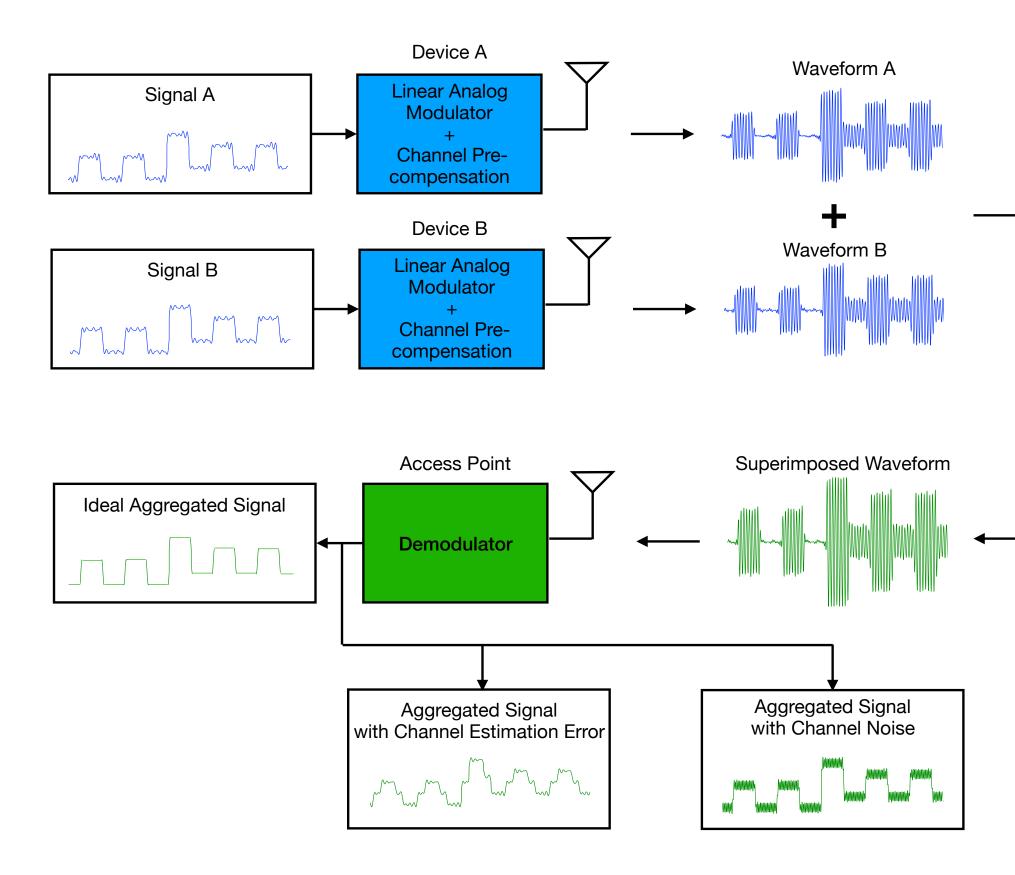


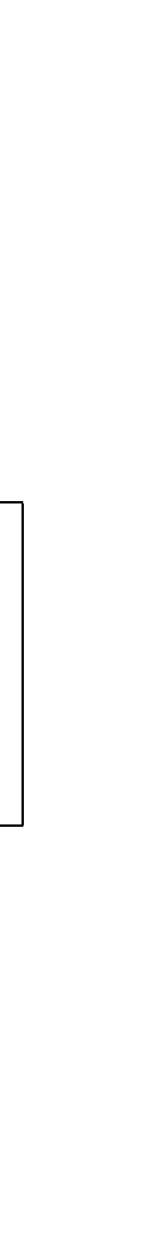
Hard, Andrew, et al. "Federated learning for mobile keyboard prediction." arXiv preprint arXiv:1811.03604 (2018).

Integration af kommunikation og edge computing Federated learning over kommunikationskanal

- Kan vi udnytte det trådløse medie til effektivt at aggregere modeller?
- I teorien meget effektivt
- Kræver nøjagtig synkronisering

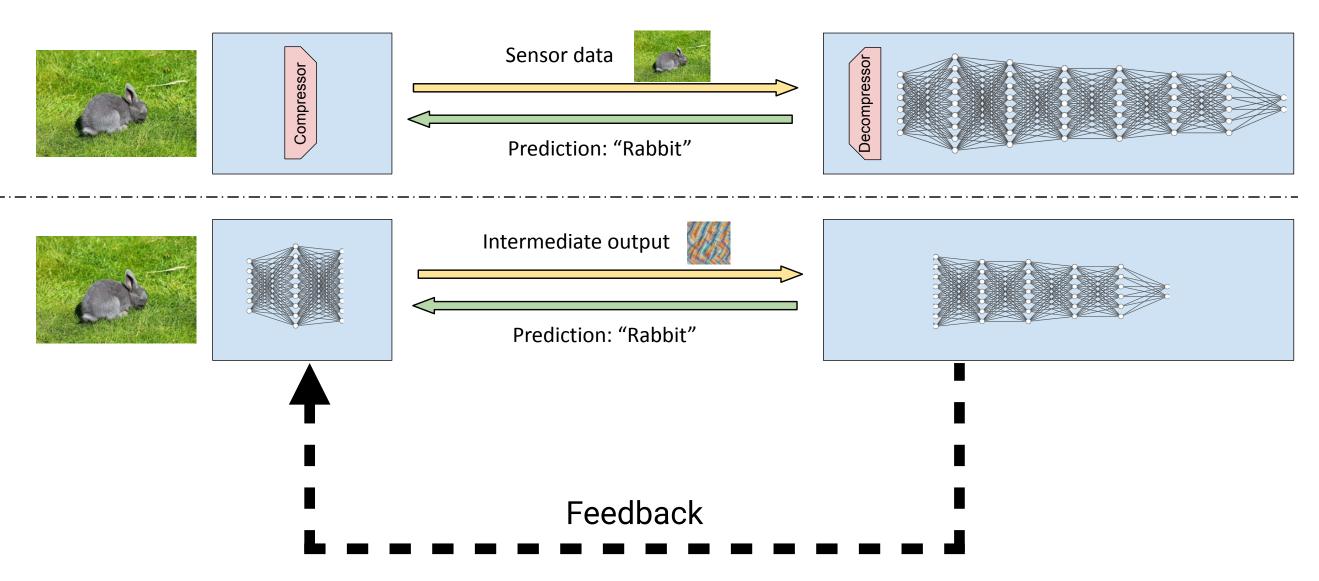
Zhu, Guangxu, et al. "Over-the-air computing for wireless data aggregation in massive IoT." *IEEE Wireless Communications* 28.4 (2021): 57-65.





Integration af kommunikation og edge computing Statistisk inferens over kommunikationskanal

- Traditionelt er kommunikationssystemer designet som en "bit-pibe"
- Hvad hvis vi ikke ved, hvad modtageren skal bruge, for at kunne dekode billedet?
- Hvad hvis vi har mulighed for feedback?



Opsummering

- Der er mange fordele ved at flytte skyen nærmere enheden
- Hvordan laver vi opgavefordeling mellem enheden og skyen/skyerne?
- Udviklingen er i fuld gang, særligt inden for ML/AI
- Integrationen mellem edge computing og kommunikation åbner nye muligheder

