

# **Practical Federated Learning without a Server**

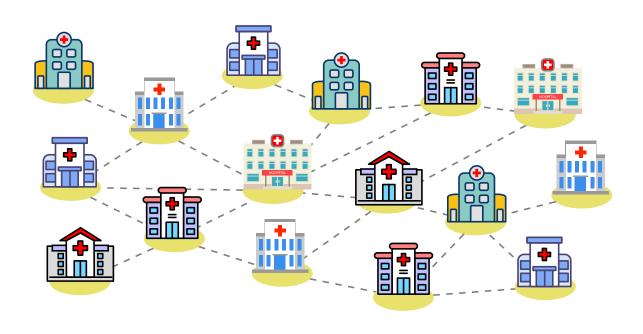
## Rishi Sharma EPFL

In collaboration with Akash Dhasade, Anne-Marie Kermarrec, Erick Lavoie, Johan Pouwelse, and Martijn de Vos.





# **Collaborative Machine Learning**





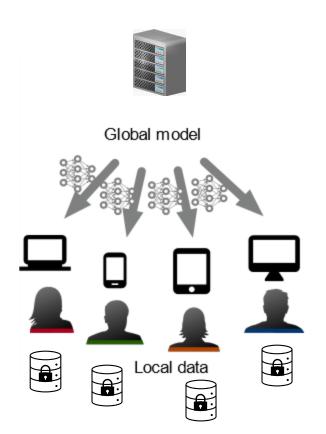
Shared model architecture

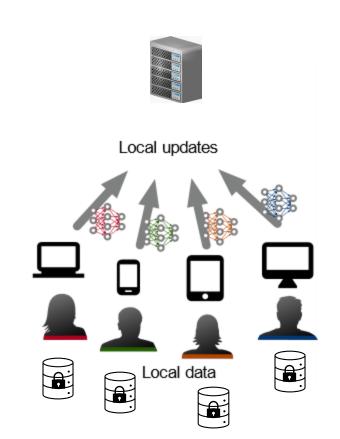


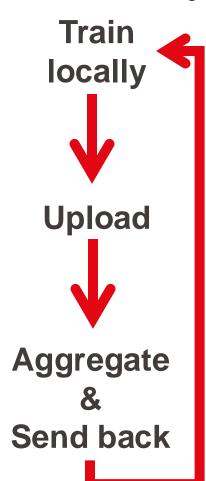
Private data



# **Federated Learning**

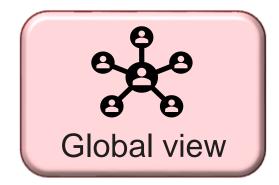




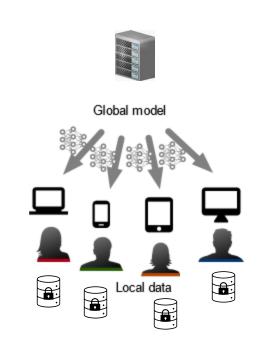


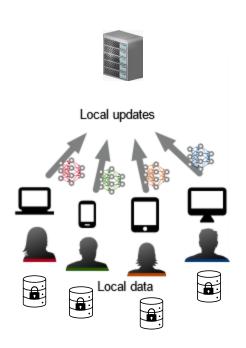


# **Federated Learning**



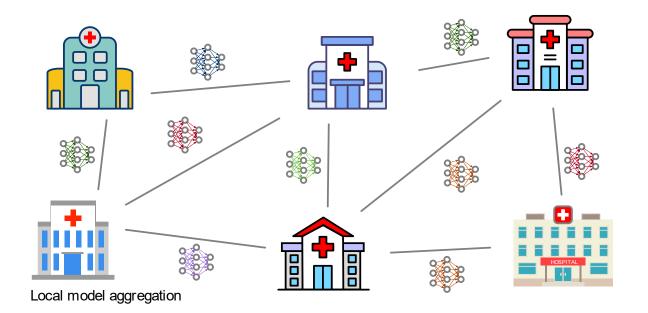


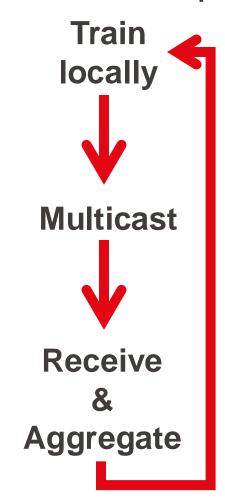






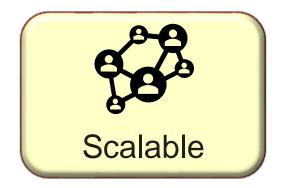
# **Decentralized Learning**



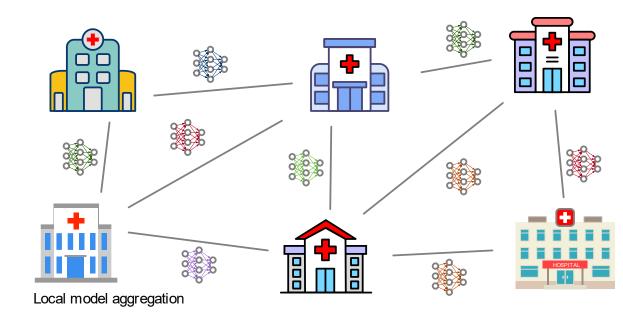




# **Decentralized Learning**

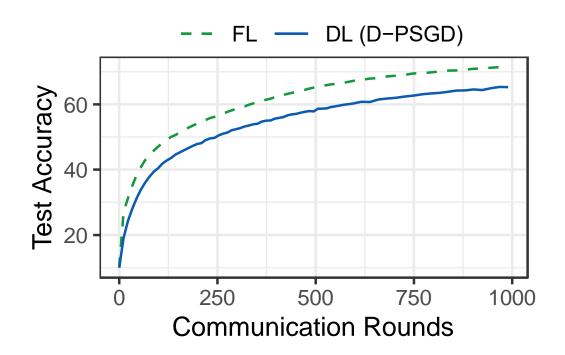








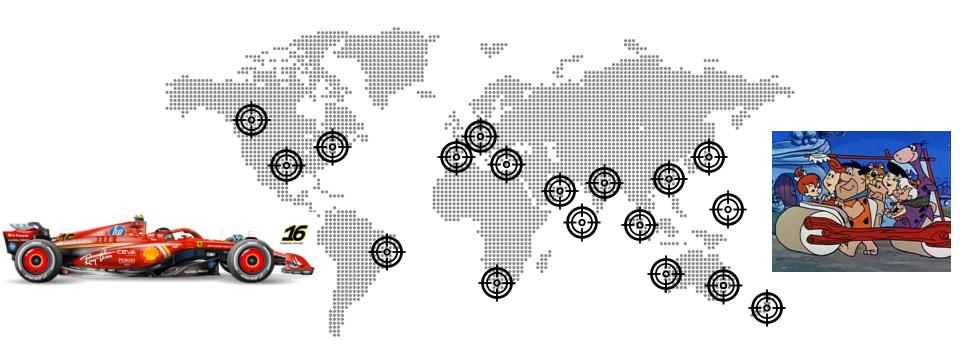
# **What FL Brings?**



**Global aggregation = Better convergence** 



## **Best of Both Worlds?**



## **Plexus: FL Without a Server**



Decentralized peer sampling



**Aggregator** selection



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Aggregate & Push

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# **Decentralized Peer Sampling**

Sample size **Active Nodes** Gossip Sort **Selected Team** (Current Sample)

Round

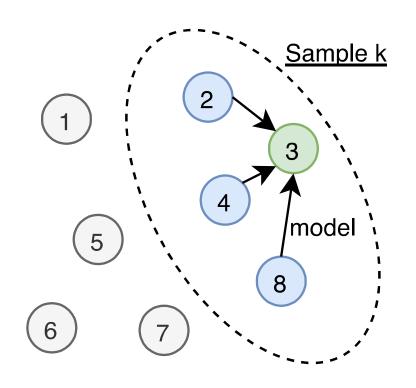
# **Aggregator Selection**

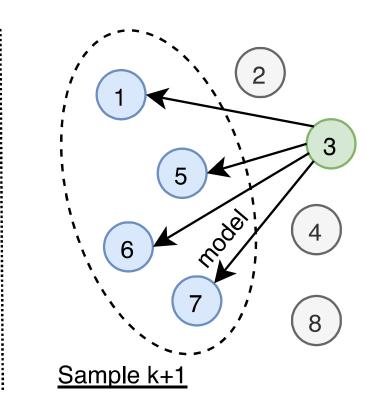


Highest bandwidth in the sample



# **Aggregate & Push**



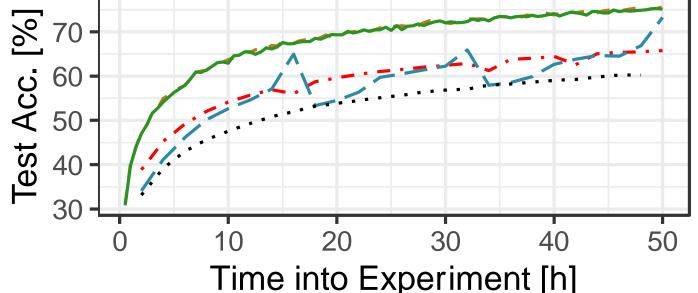




## **Results: Convergence**

1000 nodes; CIFAR-10; IID;

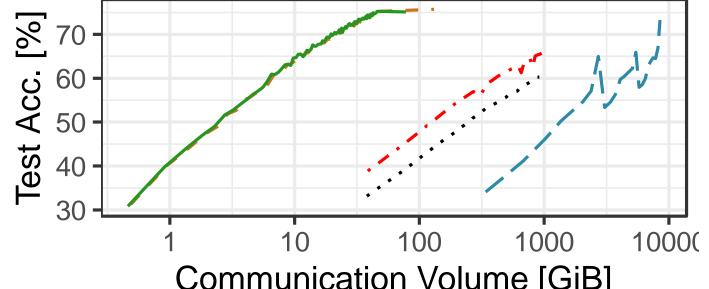
Plexus -- FL ···· GL ·-· D-PSGD (OP) -- D-PSGD (k-reg)



Time into Experiment [h]

FL in Decentralized!

Plexus -- FL ···· GL ·-· D-PSGD (OP) -- D-PSGD (k-reg)



Communication Volume [GiB]

FL in Decentralized!

More results in the paper...

# Plexus – Practical Federated Learning without a Server

- > Best of both worlds
- > Contributions:
  - Emulating the server in decentralized settings
- > Future work:
  - Nodes leaving and joining
  - Load balancing
  - Asynchronous learning



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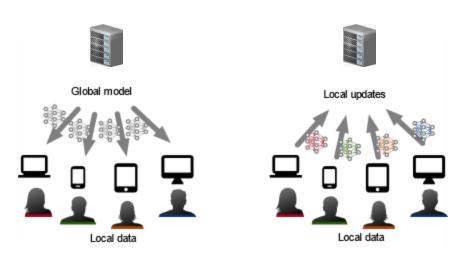


rishi-s8.github.io

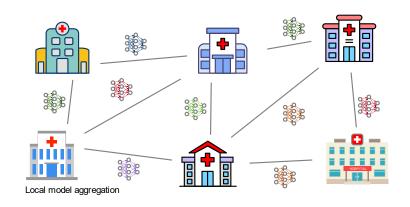


# **Backup Slides**

# **Collaborative Machine Learning**



Federated Learning (FL)

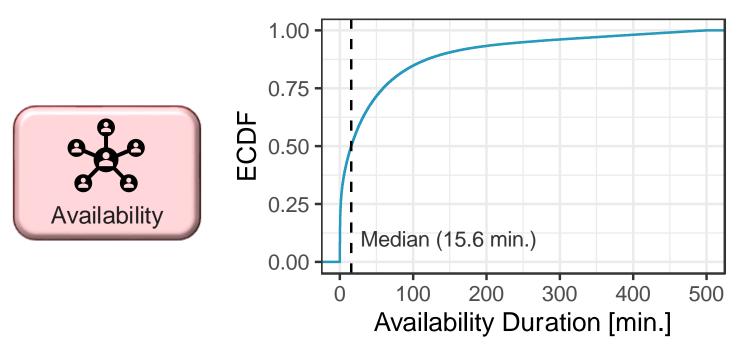


Decentralized Learning (DL)





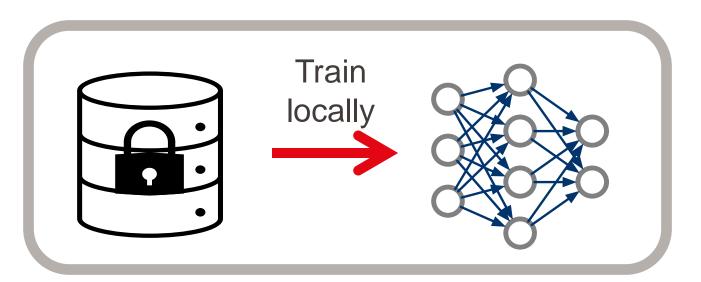
## **Federated in Decentralized?**





FedScale Traces

# **Decentralized Learning**



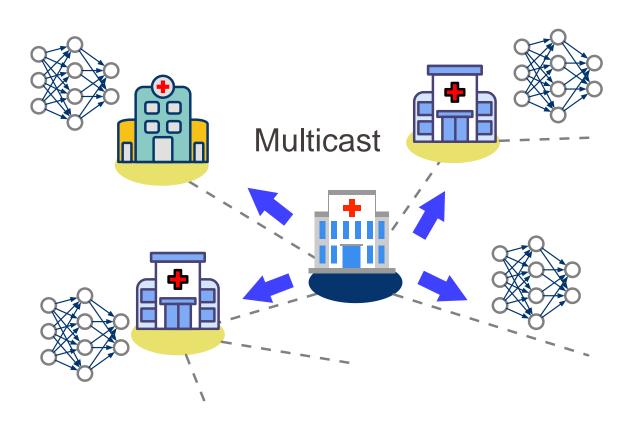


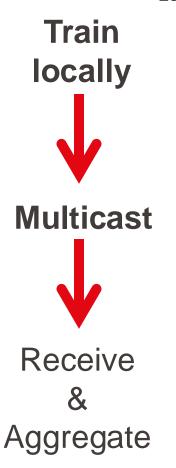


Receive & Aggregate

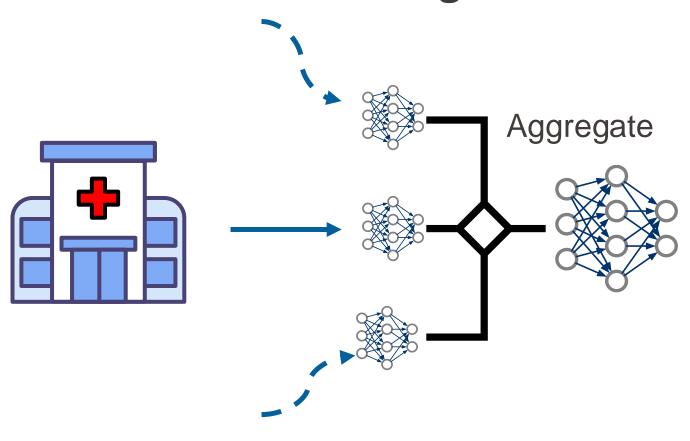


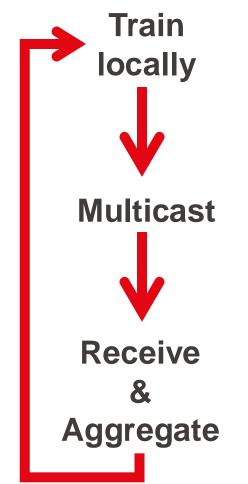
# **Decentralized Learning**





# **Decentralized Learning**







# **Communication Stragglers**

$C_{ap_e}$ $T_{O_{ND}}$		~ M. S		Stockholm		$M_{il_{a_{il}}}^{B_{a_{hr_{a_{in}}}}}^{S_{a_{0}}}P_{a_{ul_{0}}}^{P_{a_{ul_{0}}}}$			0	
	TOWN -	Tokyo Mi	unbai Sj	dney d	holm	$M_{il_{\partial I}}$ $B_{\partial i}$	hrain	Paulo	$O_{hi_0}$	regon
Cape Town		26.1	36.0	20.8	59.8	67.1	33.6	27.1	43.6	35.9
Tokyo -	354.0		89.3	112.1	42.1	48.1	66.8	39.3	85.8	108.8
Mumbai -	272.0	127.2		75.9	81.3	103.2	336.3	30.8	53.3	48.5
Sydney -	410.4	102.3	146.8		32.0	42.4	59.6	31.2	57.0	80.8
Stockholm -	179.7	241.2	138.9	295.7		404.6	81.8	48.2	94.7	67.6
Milan -	162.4	214.8	110.8	238.8	30.2		105.7	49.4	104.9	70.1
Bahrain -	287.0	164.3	36.4	179.2	137.9	108.2		29.9	49.4	38.7
Sao Paulo-	340.5	256.6	305.6	310.5	214.9	211.9	320.0		92.3	60.5
Ohio-	237.0	131.8	197.3	187.9	120.0	109.2	212.7	121.9		105.0
Oregon -	276.6	96.7	215.8	139.7	162.0	157.8	251.4	178.3	55.2	

Round trip time (ms)

20x

Diablo: A Benchmark Suite for Blockchains