

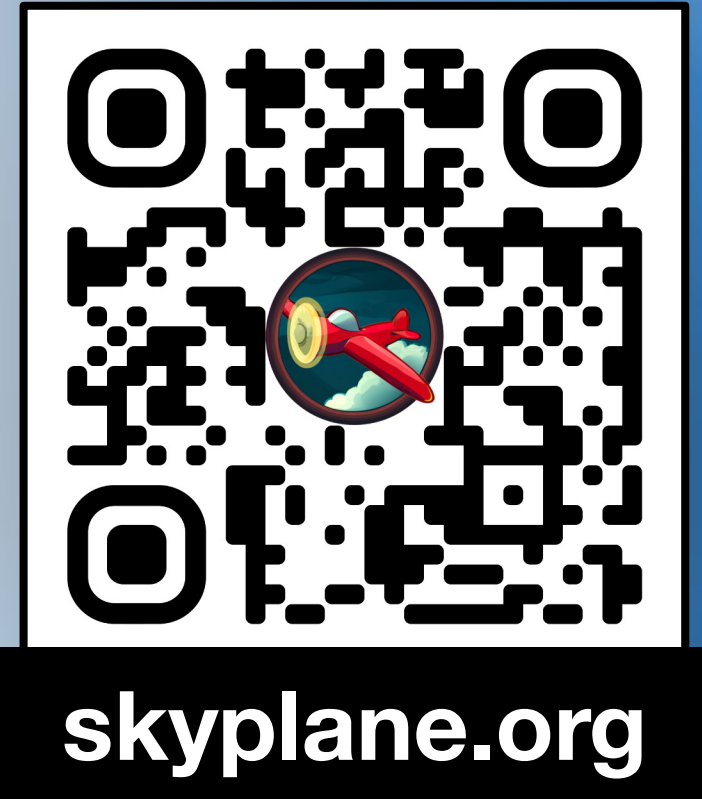
# Skyplane



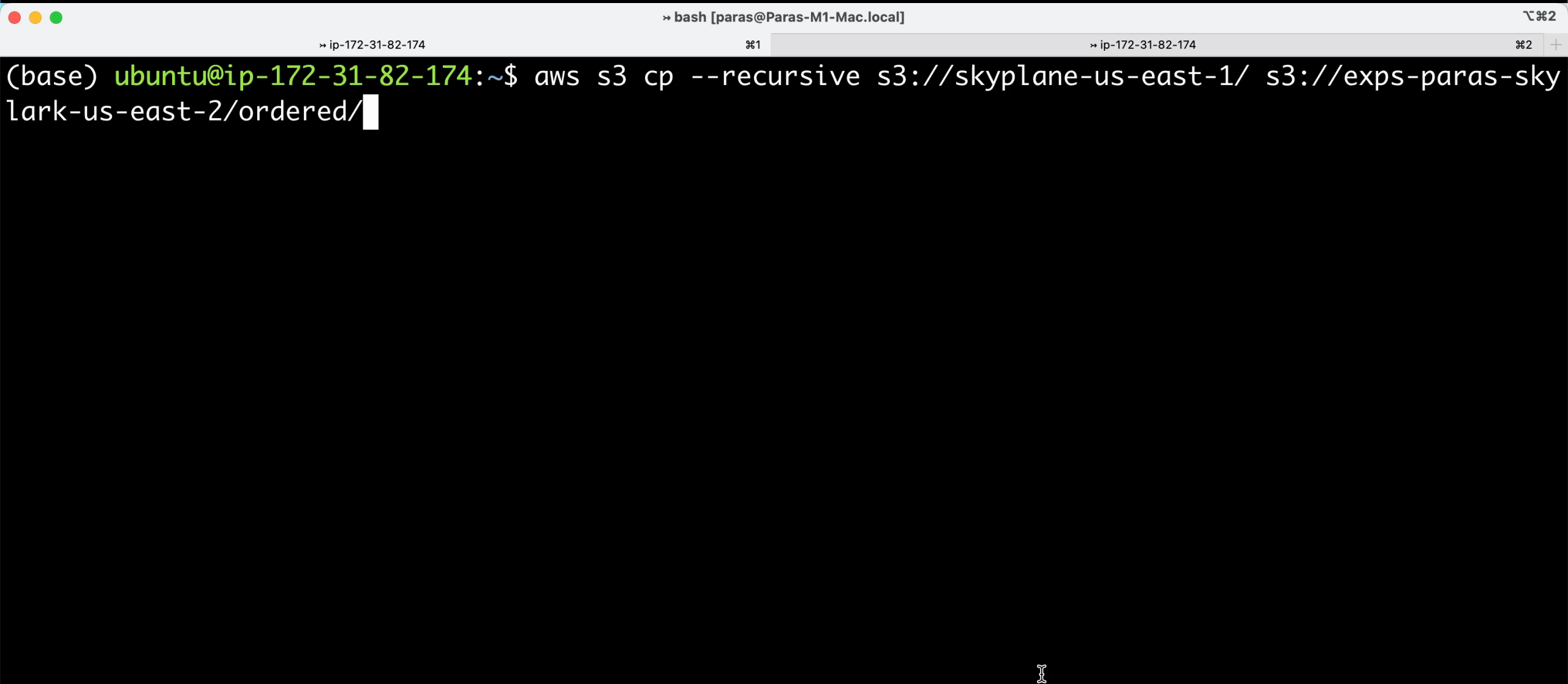
## **Skyplane: Optimizing Transfer Cost and Throughput Using Cloud-Aware Overlays**

**Paras Jain**, Sam Kumar, Sarah Wooders, Shishir G. Patil,  
Joseph E. Gonzalez, and Ion Stoica

NSDI 2023 at Boston, MA



# Working with data in the cloud is painful



A terminal window with a dark background and light text. The window title is "bash [paras@Paras-M1-Mac.local]". The terminal shows a prompt "(base) ubuntu@ip-172-31-82-174:~\$" followed by the command "aws s3 cp --recursive s3://skyplane-us-east-1/ s3://exps-paras-sky-lark-us-east-2/ordered/". The cursor is at the end of the command. The window has three colored window control buttons (red, yellow, green) in the top left corner. The terminal output area is empty.

```
→ ip-172-31-82-174                                ↵ #2  
→ ip-172-31-82-174                                ↵ #2 +  
(base) ubuntu@ip-172-31-82-174:~$ aws s3 cp --recursive s3://skyplane-us-east-1/ s3://exps-paras-sky-lark-us-east-2/ordered/
```

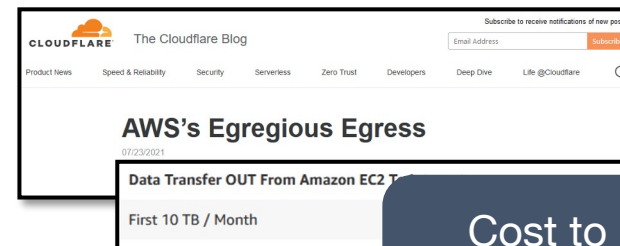
# The problem of “data gravity”

1. Slow transfers lock in data

```
ubuntu@ip-172-31-82-174: ~  
(base) ubuntu@ip-172-31-82-174:~$ aws s3 cp --recursive s3://skylane-us-east-1/ s3://exps-paras-skyllark-us-east-2/_  
copy: s3://skylane-us-east-1/00300.bin to s3://exps-paras-skyllark-us-east-2/_/00300.bin  
copy: s3://skylane-us-east-1/00303.bin to s3://exps-paras-skyllark-us-east-2/_/00303.bin  
copy: s3://skylane-us-east-1/00302.bin to s3://exps-paras-skyllark-us-east-2/_/00302.bin  
copy: s3://skylane-us-east-1/00301.bin to s3://exps-paras-skyllark-us-east-2/_/00301.bin  
copy: s3://skylane-us-east-1/00305.bin to s3://exps-paras-skyllark-us-east-2/_/00305.bin  
copy: s3://skylane-us-east-1/00304.bin to s3://exps-paras-skyllark-us-east-2/_/00304.bin  
Completed 48.0 MiB/~2.7 GiB (21.4 MiB/s) with ~338 file(s) remaining (calculating...)
```

70GiB dataset at 21MiB/s = 1 hour

2. High egress fees = \$\$\$



Cost to move 70GB dataset  
= running 34 instances (m5.xlarge)



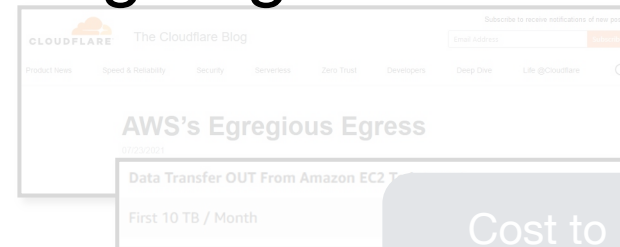
The problem of “data gravity”

# How to solve data gravity?

- 1) Slow transfer speeds
- 2) High egress fees

2. High egress fees = \$\$\$

```
ubuntu@ip-172-31-82-174: ~$ aws s3 cp --recursive s3://skyplane-us-east-1/ s3://exps-paras-skylark-us-east-2/_
```



Cost to move 70GB dataset  
= running **34 instances** (m5.xlarge)

# What is Skyplane?

**Problem:** Managing data across regions and across clouds is slow and expensive



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**Skyplane** is a system for fast, low-cost transfers between object stores.

```
skyplane cp {s3,gs,az}://... {s3,gs,az}://...
```



# What is Skyplane?

**Problem:** Managing data across regions and across clouds is slow and expensive

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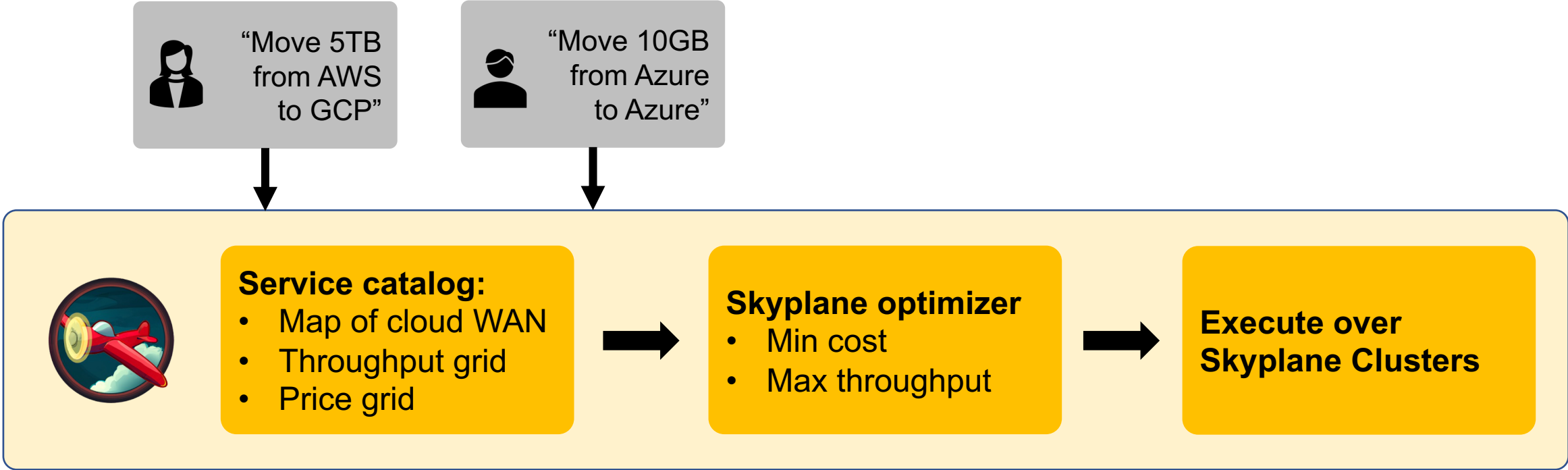
```
skyplane cp {s3,gs,az}://... {s3,gs,az}://...
```

## How does it work?

- 1. Profiling:** Probe cloud network throughput
- 2. Planning:** Centralized LP planner finds optimal transfer path
- 3. Execution:** Provision ephemeral gateway VMs from plan



# Sky computing: Intercloud Broker for data transfer

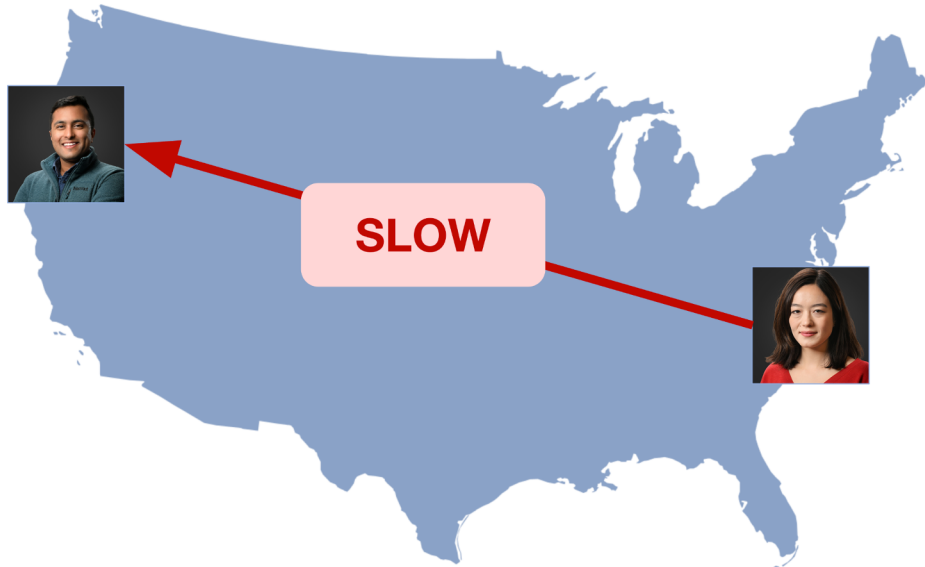




# This paper: high speed, low cost data transfers with the Skyplane transfer broker

```
→ bash [paras@Paras-M1-Mac.local]
→ ip-172-31-82-174
→ ip-172-31-82-174
(base) ubuntu@ip-172-31-82-174:~/skylark$ skyplane cp s3://exps-paras-skylark-us-east-1/fake_imagenet/ s3://skyplane-demo-us-east-1/imagenet
```

# Direct internet path between clouds are often slow

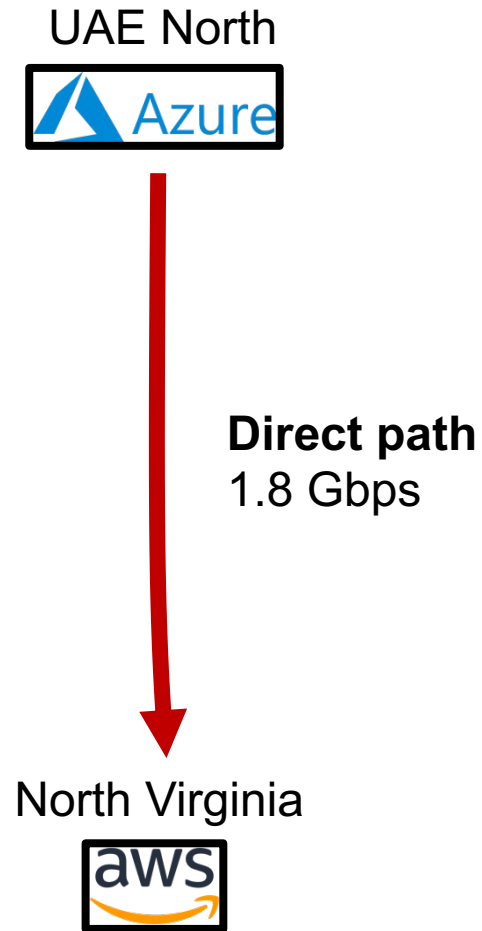


## Reasons for slow transfers

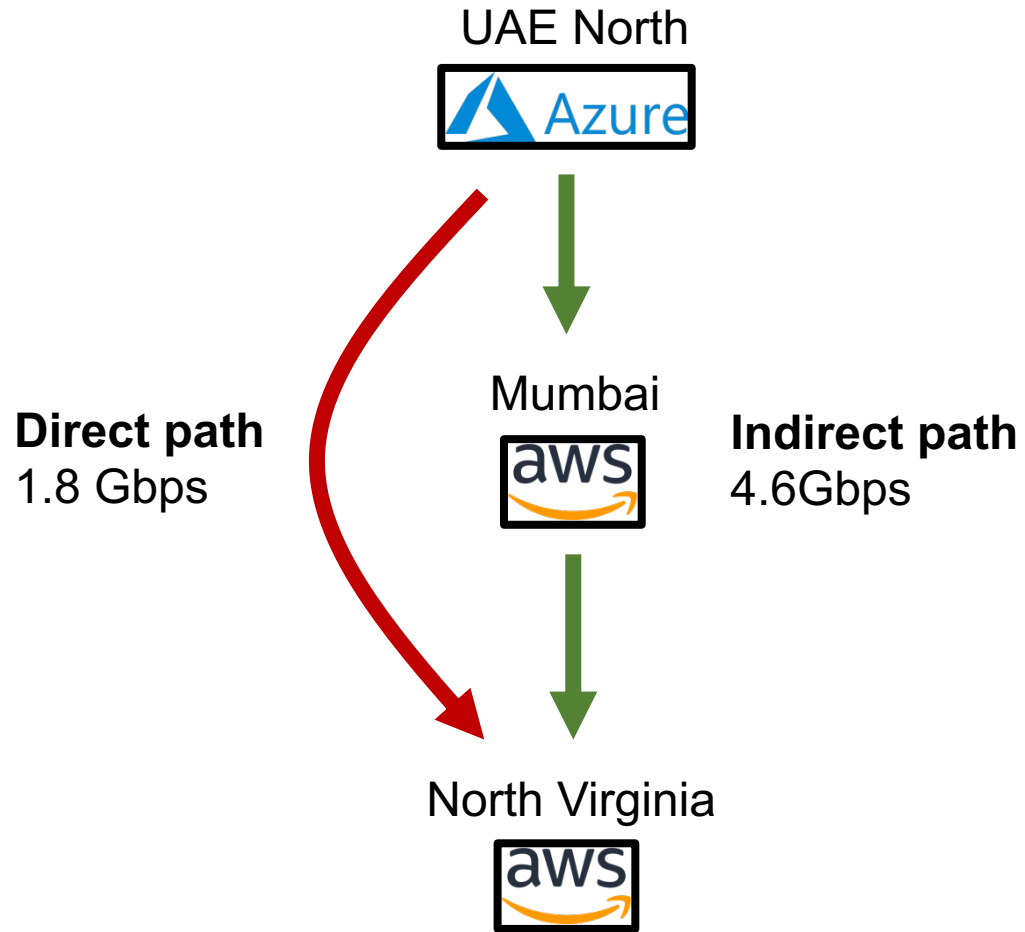
1. Congestion along direct path
2. Poor peering between providers
3. Packet loss from the physical layer
4. (surprising) Throttling from cloud providers



# Insight #1: overlay routing to circumvent slow links



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Overlay routing is  
a classic method

**RON** [SOSP 2001]  
**Chord** [SIGCOMM 2001]  
**Bullet** [SOSP 2003]  
**Akamai** [SIGOPS 2010]  
**Baidu BDS** [EuroSys 2018]  
and countless others...

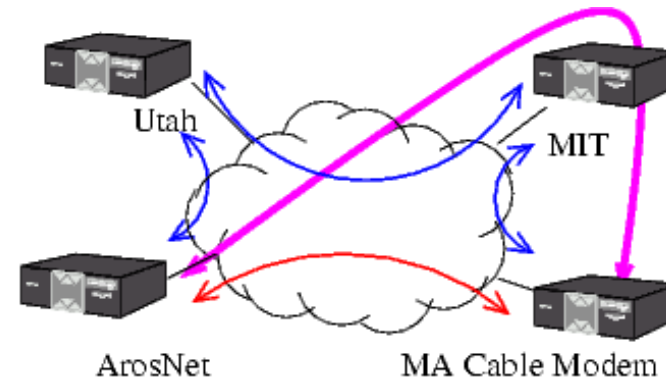


Figure from RON

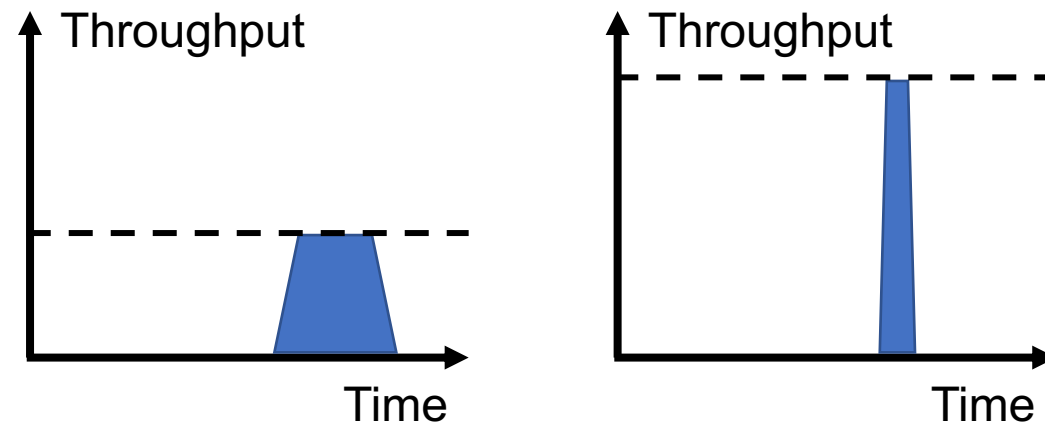


# Insight #1: classic overlay routing is not designed in the cloud

Overlay routing is a classic method

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and countless others...

**Novel problem space:** network + VM pricing



**In the cloud, you pay for the area under the curve**  
1Mbps for 40 days = 1Gbps for 1 hour



# Insight #1: classic overlay routing is not designed in the cloud

Overlay routing is  
a classic method

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## **Novel problem space: network + VM pricing**

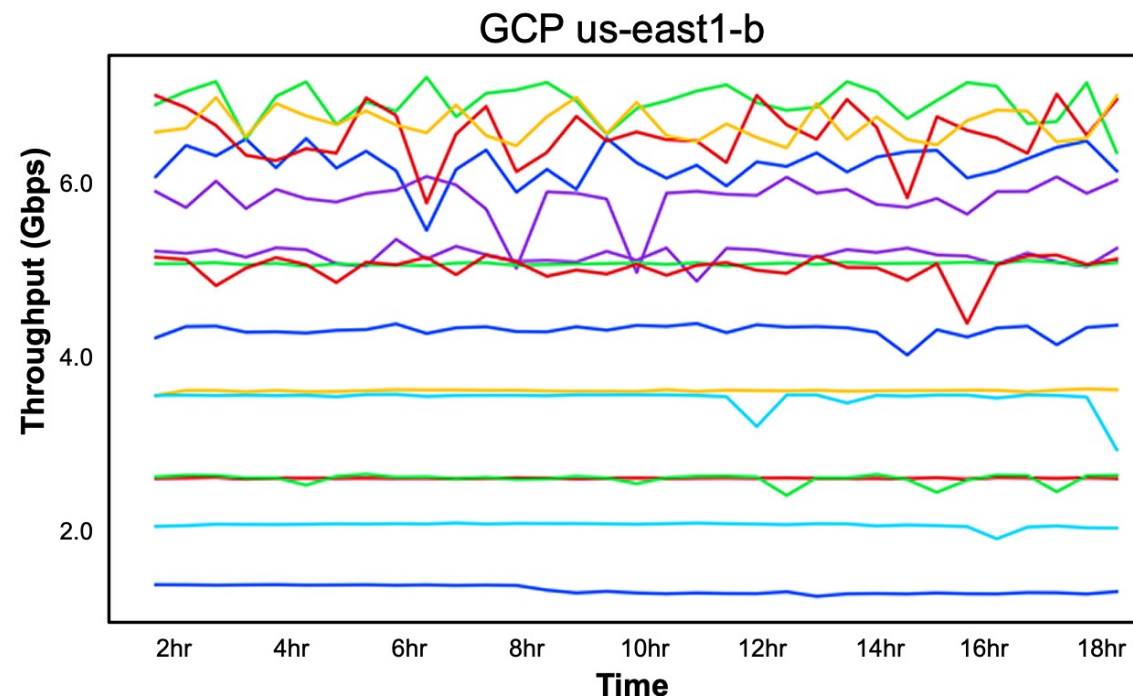
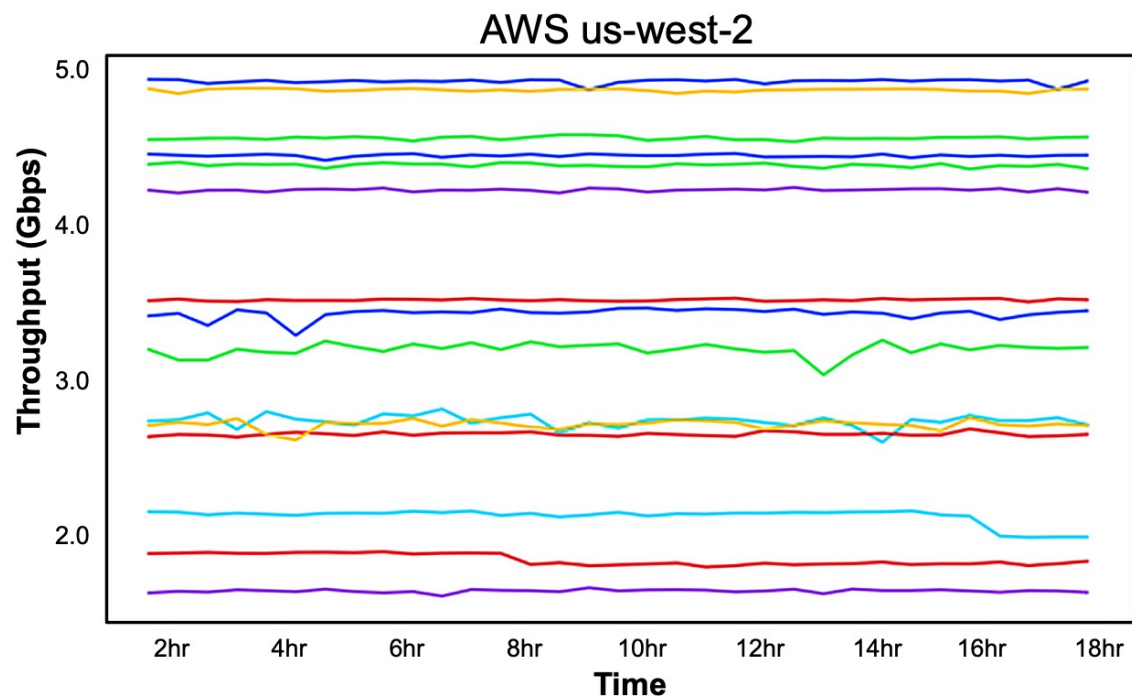
- Classic assumption: networks are free or priced by throughput
- Cloud is priced per unit volume (\$ per GB transferred)

## **Novel solution space: elasticity**

- Classic assumption: fixed overlay locations each without parallelism
- Cloud supports elasticity in location and # of VMs



# Insight #1: Applying optimization to search the cost-throughput tradeoff space

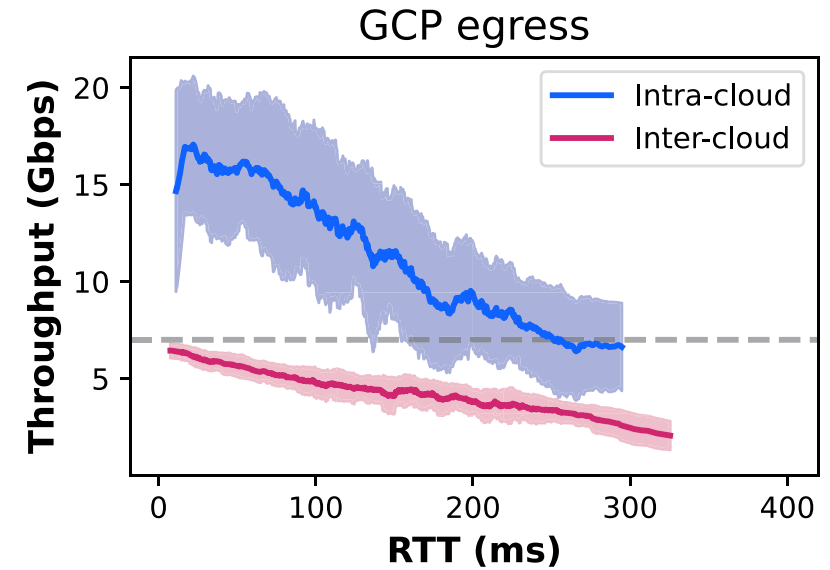
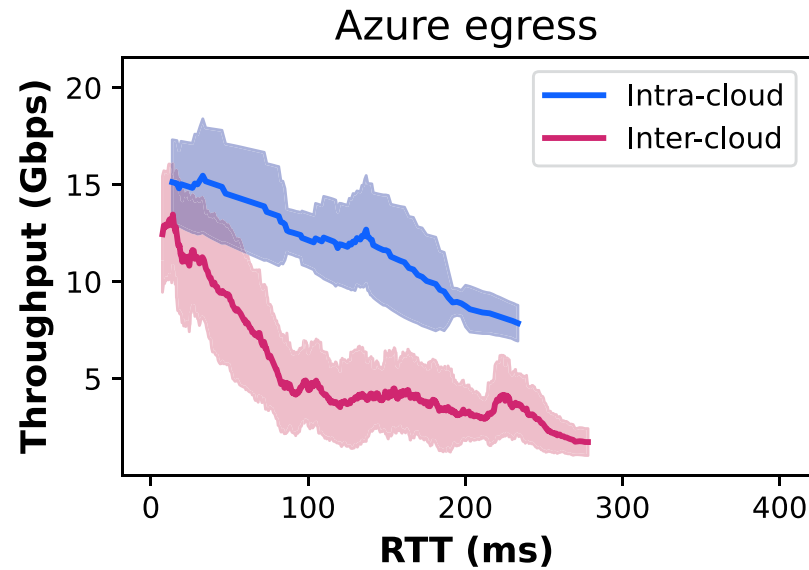
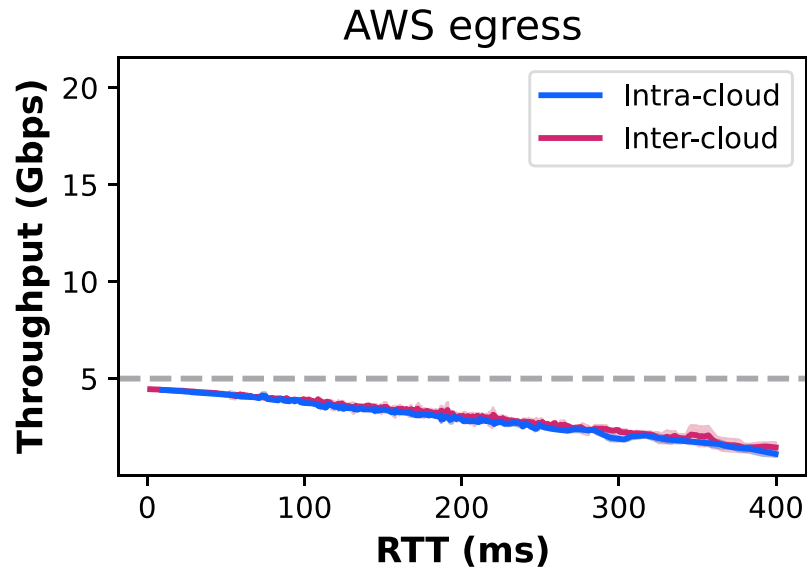


Egress speeds in the cloud are stable over a 24 hour period  
→ Centralized planning is feasible





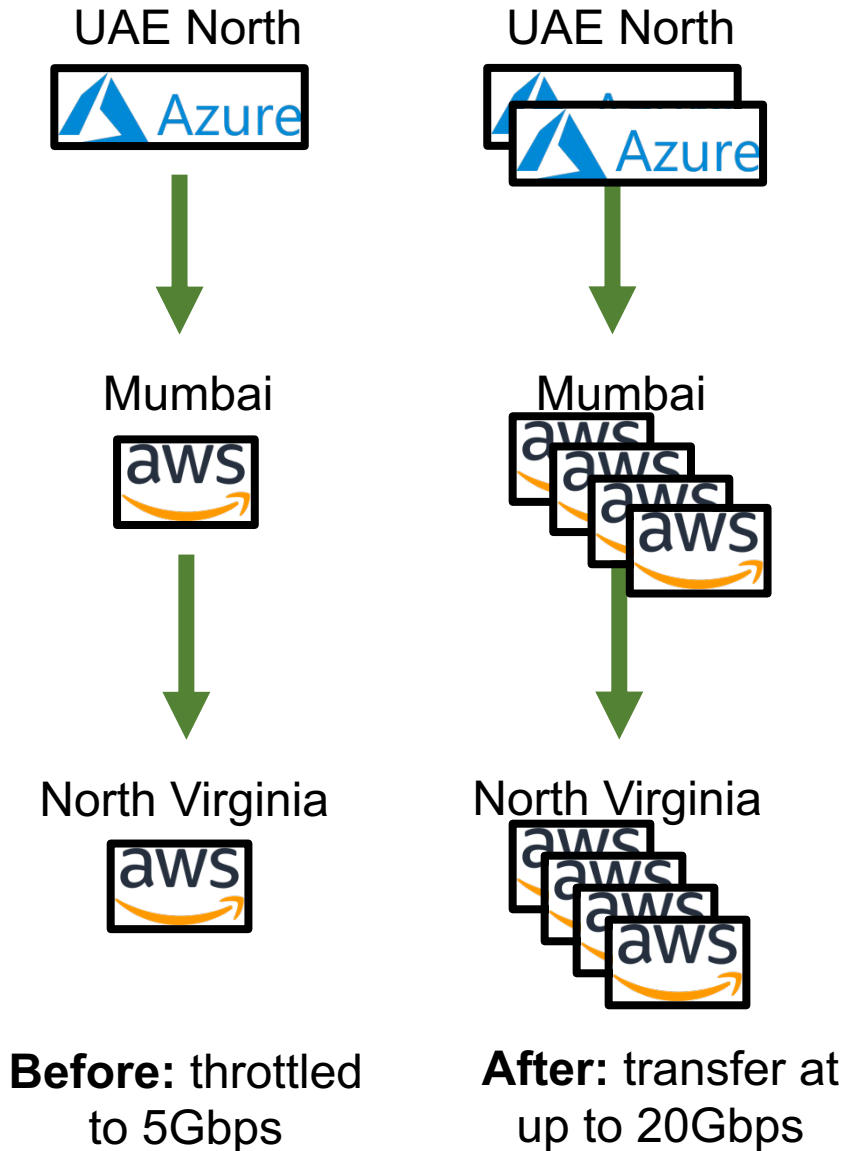
# Insight #2: parallel VMs per region to avoid provider throttling



**Clouds throttle egress speeds!**



# Insight #2: parallel VMs per region to avoid provider throttling



**Overlay routing**  
Longer indirect paths are worthwhile for slow links

**# of VMs per region**  
Access throughput beyond NIC, AWS and GCP throttle egress



# Insight #3: parallel TCP connections to improve goodput



**Overlay routing**  
Longer indirect paths are worthwhile for slow links

**# of VMs per region**  
Access throughput beyond NIC, AWS and GCP throttle egress

**# of parallel TCP connections**  
Inspired by GridFTP, but must consider VM and NIC limits



# Insight #4: cut cost with compression + network tiers



## Overlay routing

Longer indirect paths are worthwhile for slow links

## # of VMs per region

Access throughput beyond NIC, AWS and GCP throttle egress

## # of parallel TCP connections

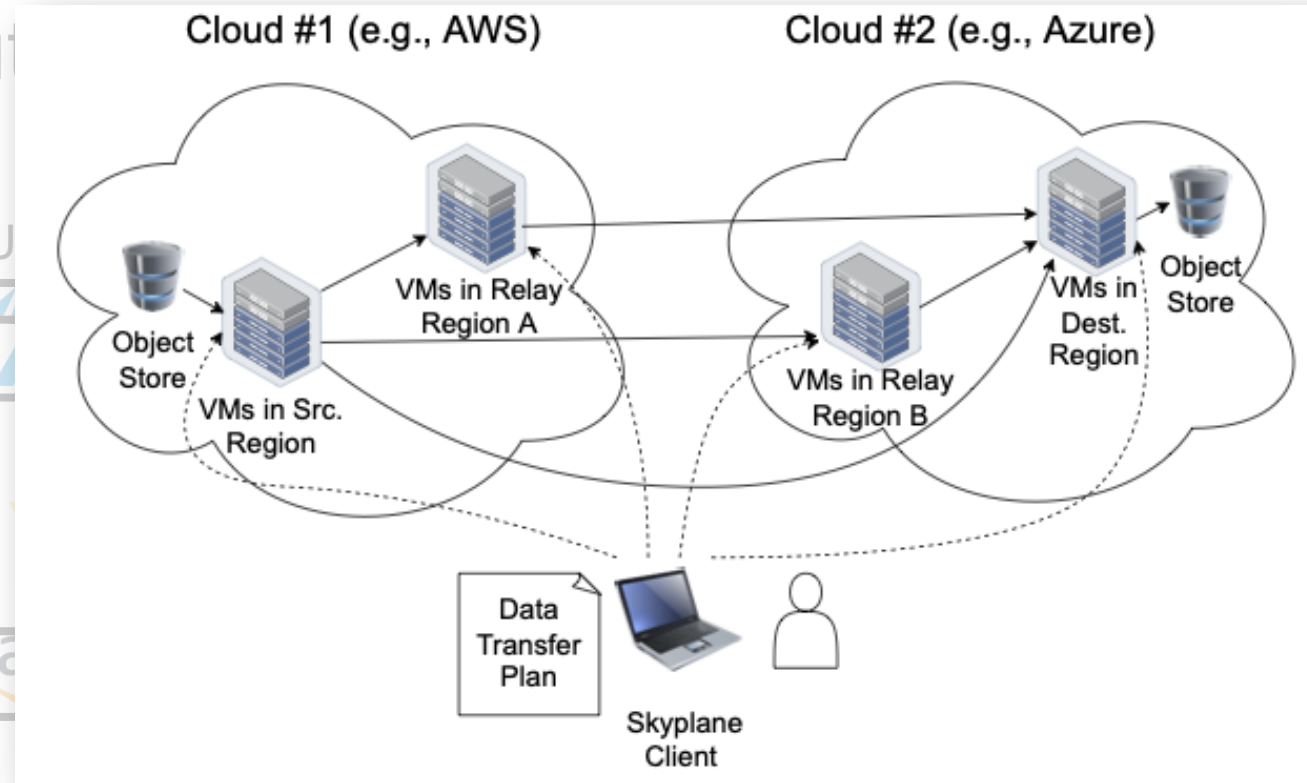
Inspired by GridFTP, but must consider VM and NIC limits

## Network tiering + compression

Hot potato routing up to 40% cheaper than cold potato



# Insight #4: cut



**No cooperation required from clouds!**

Skyplane only uses public APIs + runs in your cloud VPC



# Insight #4: cut cost with compression + network tiers

Open source project!

```
$ pip install skyplane[aws]
```



[skyplane.org](https://skyplane.org)

# of VMs per region

AWS and GCP throttle egress

IP connections

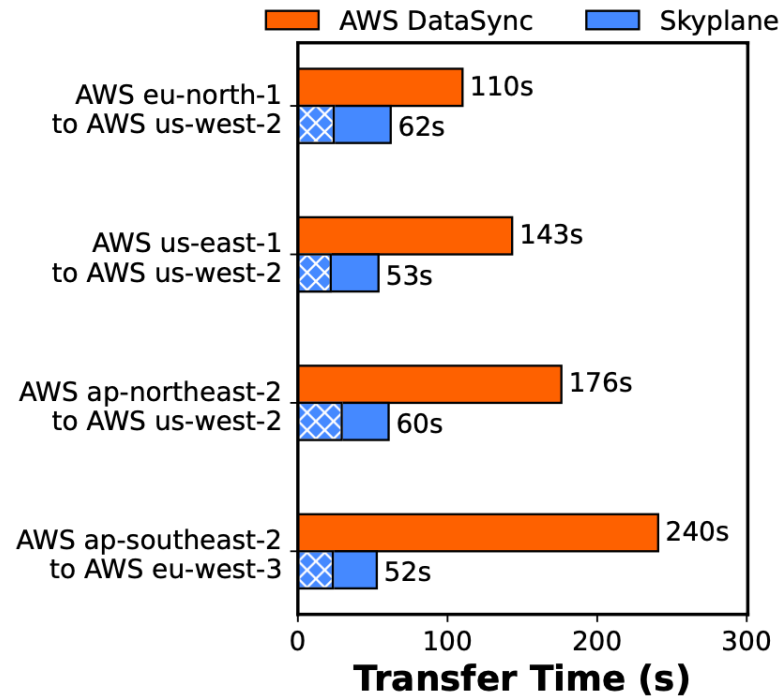
consider VM and NIC limits

+ compression

5x cheaper than cold potato

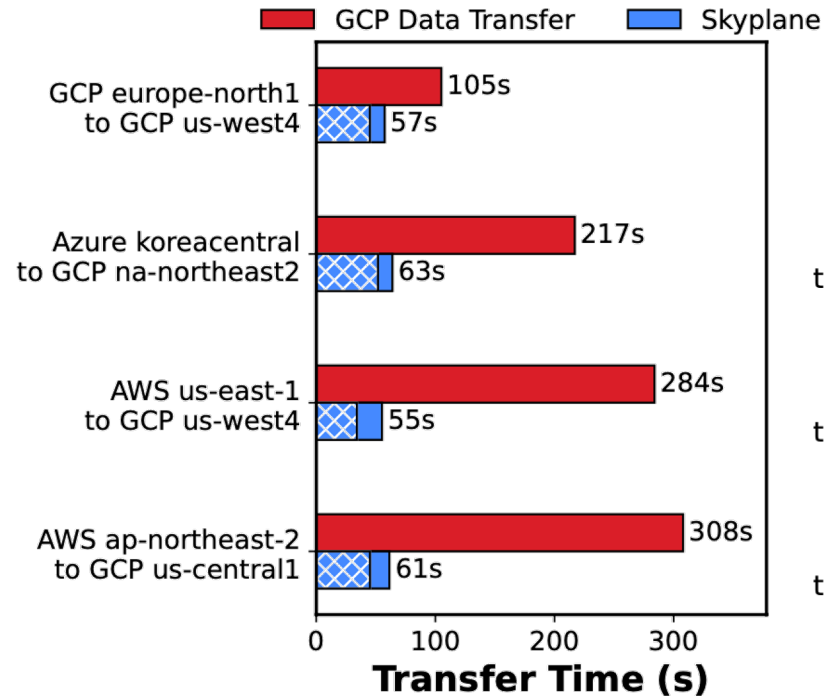


# Evaluation: End-to-end comparison against cloud providers



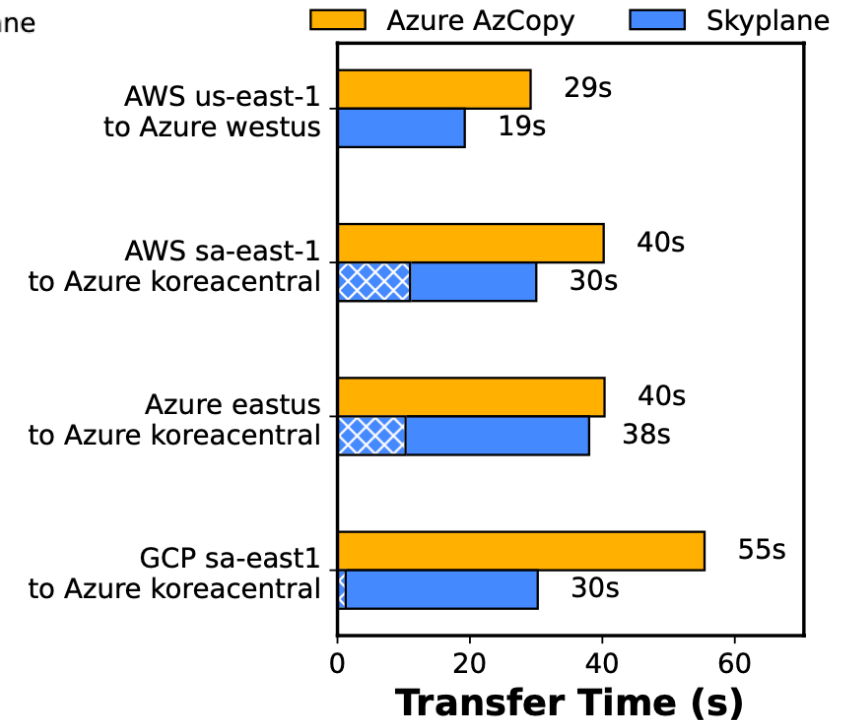
## Versus AWS Datasync:

- Up to 4.6x faster for AWS-AWS
- DataSync did not support intercloud



## Versus GCP Data Transfer:

- Up to 1.8x faster for GCP-GCP
- Up to 5.0x faster for AWS to GCP
- GCP egress not supported



## Versus Azure AzCopy

- Similar speeds for Azure-Azure
- Up to 1.8x faster for GCP to Azure
- Why? AzCopy leverages compute inside Azure Blob



# Evaluation: Comparison to Resilient Overlay Networks

Method	Time	Throughput	Cost
Skyplane w/ RON routes (4 VMs) [8]	21s	6.02 Gbps	\$2.27
Skyplane (throughput optimized, 4 VMs)			

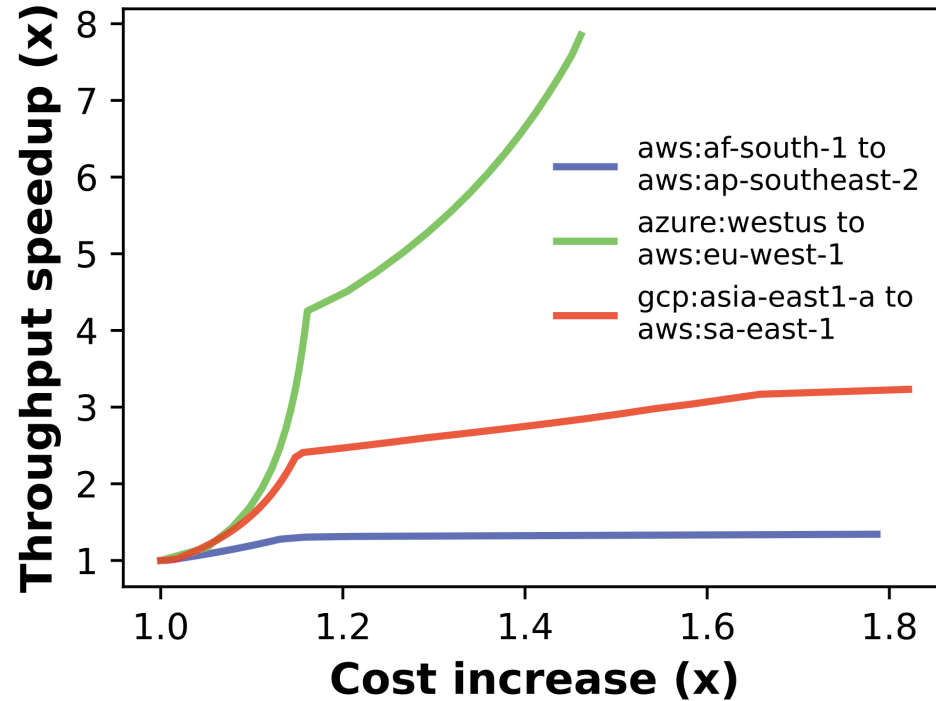
To compare with RON, we implemented the route from RON's optimizer in Skyplane

- 16GB transfer from Azure East US to AWS ap-northeast-1
- Compression + tiering disabled for these experiments
- **Result:** 1.3x speedup at 30% lower cost than RON





# Evaluation: Visualizing the cost-throughput space




**Skyplane can achieve substantial improvements in transfer speeds with minimal cost increases**

4x throughput improvement for a 20% premium



# Try out Skyplane's optimizer

 Skyplane optimizer Star 743

## Visualize Skyplane plans


Source region: `azure:canadacentral` Destination region: `gcp:asia-northeast1-a` Number of instances: 2

### Direct replication path

Path chosen: `azure:canadacentral` → `gcp:asia-northeast1-a`

Throughput: 12.34 Gbps

Cost: \$0.087/GB (USD)



```
graph LR; AzureBlob[Azure Blob] --> Azure0[azure/canadacentral:0]; AzureBlob --> Azure1[azure/canadacentral:1]; Azure0 -- 6.17 Gbps --> GCP0[gcp/asia-northeast1-a:0]; Azure1 -- 6.17 Gbps --> GCP1[gcp/asia-northeast1-a:1]; GCP0 --> GCS[GCS]; GCP1 --> GCS;
```

The diagram illustrates a direct replication path. It starts with an 'Azure Blob' source. Two parallel paths lead to two instances in the source region: 'azure/canadacentral:0' and 'azure/canadacentral:1'. Each instance then replicates data to a corresponding instance in the destination region: 'gcp/asia-northeast1-a:0' and 'gcp/asia-northeast1-a:1'. Both destination instances then replicate the data to a final 'GCS' destination. The throughput for each leg of the path is 6.17 Gbps, resulting in a total throughput of 12.34 Gbps.

<https://optimizer.skyplane.org/>



# Open-source adoption

 skyplane-project / skyplane Public

Approaching 1/2 PiB transferred!

Apache 2.0 licensed project

<https://github.com/skyplane-project/skyplane>

Gridware 

 Berkeley  
UNIVERSITY OF CALIFORNIA

 BROAD  
INSTITUTE

 NASA EARTHDATA  
Powered by EOSDIS

 VOXEL

Stanford  
University

 ATlassian

kaliberai™

and many more users + contributors!



# Skyplane team

A big team effort at UC Berkeley Sky computing



Shu Liu



Sam Kumar



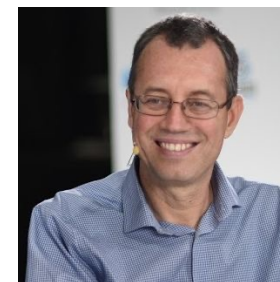
Sarah Wooders



Paras Jain



Shishir Patil



Ion Stoica



Joey Gonzalez



Vincent Liu



Daniel Kang



Asim Biswal



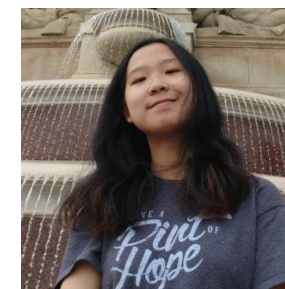
Jason Ding



Anton Zabreyko



Xuting Liu



Hailey Jang



Simon Mo



# Skyplane

Optimizing Transfer Cost and Throughput  
Using Cloud-Aware Overlays

**Problem:** cross-region and cross-cloud transfers are slow and expensive

Skyplane accelerates cloud transfers while reducing egress costs

Open-source tool – please share feedback, use cases or collaborations!

```
$ pip install skyplane[aws,azure,gcp]
$ skyplane init
$ skyplane cp -r s3://... gcs://...
```



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[parasj@berkeley.edu](mailto:parasj@berkeley.edu)