

Distributed Multi-Sensor Data Fusion Over Named Data Networks

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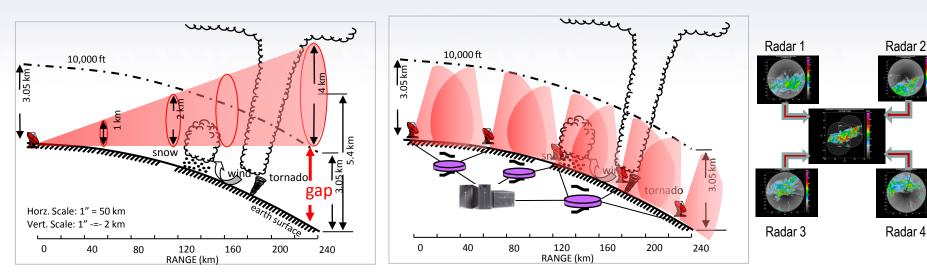
Contributions

Demonstrated applicability of Named Data Networking (NDN) for Distributed Collaborative Adaptive Sensing (DCAS) systems

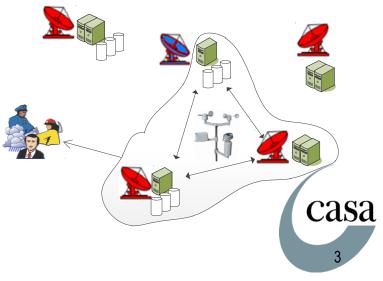
• Multi-user, multi-application, & multi-sensor systems



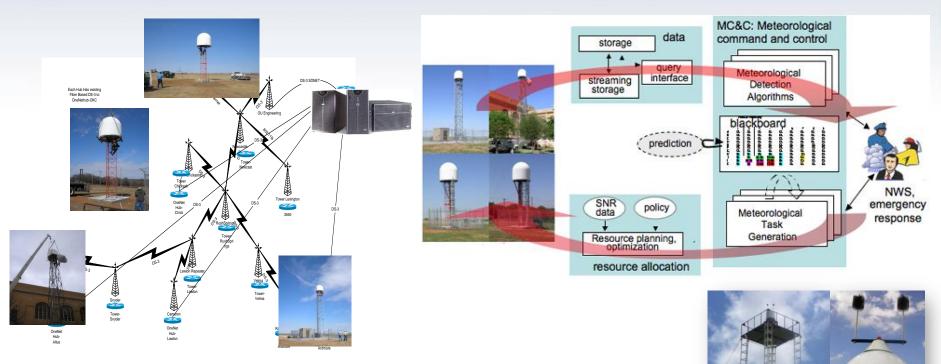
Collaborative Adaptive Sensing of the Atmosphere (CASA)



- Collaborating & adapting radars
 - Improved sensing, detection, & forecasting
- Aggregates distributed groups of resources as & when needed
 - $10,000\ \mathrm{radars}$ to cover U.S.
 - High data rate 800 Mbps
 - Heterogeneous, dynamic, & distributed
 - Real-time 30 sec heart beat



CASA Test Beds



- Oklahoma test bed
 - 7,000 km² \cdot 40 km range, 30 km spacing
 - Connected to the Internet
 - Data pull 30 sec heart beat
 - Being moved to Dallas-Fort Worth
- Puerto Rico student test bed
 - Solar powered
 - Wireless connections

CASA Applications & End Users

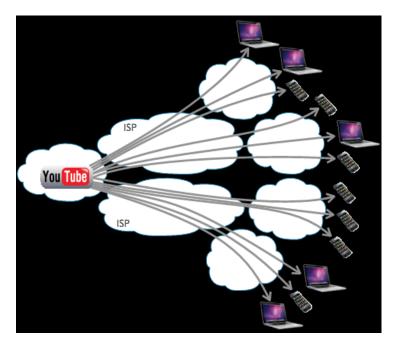
Application	Description	No of Radars	Data Type(s)
Reflectivity	Reflectivity of clouds	1	Reflectivity
Velocity	Wind velocity	2-3	Doppler velocity, reflectivity
Network-Based Reflectivity	Reflectivity of clouds detected using multiple radars	3+	Reflectivity
Retrieval (NBRR)			
Nowcasting	Short term (10-30 min) high resolution forecasts of	1-3	Reflectivity
-	active weather events		_
Tornado tracking	Detect & track a tornado as it forms & moves	2+	Doppler velocity, reflectivity

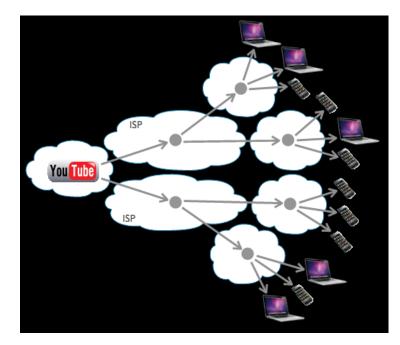
End user	Description	Applications	Rule Trigger	AOI	Sampling Interval
National Weather	Responsible for issuing	Reflectivity	Periodic	Counties under jurisdiction	1 min
Service (NWS)	warnings	Velocity			
		NBRR, nowcasting,	High reflectivity	Area of active weather	
		QPE			
		Tornado tracking	Rotating wind, ground spotters		
Emergency	Siren blowing, helping	Reflectivity	Periodic	Counties under jurisdiction	1 min
Managers (EMs)	first responders, act as	Velocity			
	spotters	NBRR, nowcasting,	High reflectivity	Area of active weather	2 min
		QPE			
		Tornado tracking	Rotating wind, ground spotters		1 min
Researchers	To understand physical	Reflectivity	Periodic	Area of active weather	1 min
	properties of weather	Velocity	High wind		30 sec
	events, test new	NBRR, nowcasting,	High reflectivity		1 min
	algorithms	QPE			
	-	Tornado tracking	Rotating wind		30 sec

• Same data accessed by multiple applications & end users

Named Data Networking (NDN)

- Internet was designed to share resources
- Today, Internet users value ability to access contents
 - End/location is irrelevant
 - Traffic aggregation, location dependence, & security





• V. Jacobson et al., "Networking named content," CoNEXT '09, Dec. 2009.

Named Data Networking (Cont.)

- Named Data Networking (NDN/CCN)
 - Access & route contents based on application-layer names
 - In-network caching, duplicate message suppression, & better security
 - On demand data generation

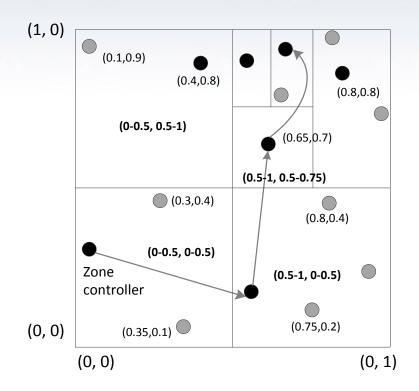
• Incremental deployments Interests packets - Indicate name of content

- /youtube.com/sports/NFL_finals.mpg/
- /youtube.com/sports/NFL_finals.mpg/HD/S3/
- /machine_room/sensor123/temp/sense/5min/

Data packet – Response to an interest

Content Store (CS)			\cap	
Name	Data			
			Face	
/youtube.com/videos/football.mpg/HD/s3/	010100101010110101	•		\checkmark
	•			
Pending Interests Table (F	PIT)	Index		
Name	Face(s)	2	121	- ×
		×	Face	•
/youtube.com/videos/football.mpg/HD/s7/	1	· ····		
		/	(_)	
Forwarding Information Base	e (FIB)	3		
Prefix	Face(s)	/		((q))
			m	Ĩ″
/youtube.com/videos/	1		Face	→ ^
/youtube.com/	1, 3			\cup
)	
				-

Content Addressable Network (CAN)



- *d*-dimensional torus (*d*-torus)
- $d \ge 2$
- Greedy routing, immune to voids (no local minima@asa
- S. Ratnasamy et al., "A scalable content-addressable network," ACM SIGCOMM '01, Aug. 2001.

Distributed Collaborative Adaptive Sensing (DCAS) Systems

- E.g., CASA, distributed radio telescopes
 - Heterogeneous, redundant, & distributed sensors
 - Multi-user, multi-application, & multi-sensor systems
- Data pull
 - End-user information needs determine how & what groups of system resources are used to generate & process data
- Sensor specific data names
 - Typically bind to sensor
 - "Reflectivity data from radar X"
- End users are concerned on an event(s) occurring within an Area Of Interest (AOI)

- "Reflectivity over Moratuwa" or "Wind in west Moratuwa"

 Reduce ability to utilize spatial & temporal locality in user interests & redundant sensors

Why NDN for CASA?

 Geographic location & weather event specific names Queries & data Aliases for same data 	 Content dependent names 2 packet types – Interests & data /Moratuwa/Reflectivity/10:32/ Multiple names
Decouple data, security, & access from sensor • Use any available sensor	Decouple identity, security, & access from end point
High temporal & spatial locality	Exploit temporal & spatial locality
 Pull based End-user information needs determine what & how resources are used 	Receiver driven communication • On demand data generation
Overlay routing	Multiple routing schemes
Load balancing, resilience, & security • Multi-path routing & mobility	Better reliability & securityMulti-path routing & mobility

NDN for DCAS – Naming Data

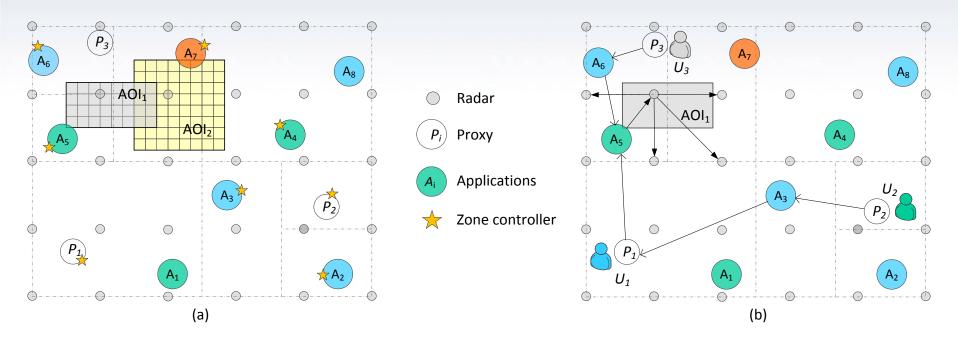
- End users specify an AOI, application, & time
 - /AOI/application/time/
 - Interest packet is looking for an application near AOI
 - Process data close to source \rightarrow Save bandwidth
 - AOI is typically expressed as a rectangular area
 - $/x_1/y_1/x_2/y_2/application/time$
 - Larger AOIs are broken into smaller ones
- Application needs to subscribe to $\operatorname{radars}^{\scriptscriptstyle(x_{\scriptscriptstyle 1},\,y_{\scriptscriptstyle 1})}$
 - CASA radars negotiate among themselves on how to provide data
 - $/x_1/y_1/x_2/y_2/radar/time/subscription/n/dataType$
- Application pull data from selected radars - $/x_R/y_R/x_R/y_R/radar/time/x_1/y_1/x_2/y_2/bitmap/dataType$

 (x_2, y_2)

Tiles

AOI₁

NDN for DCAS – Overlay Construction & Query Resolution



- Overlay routing Content Addressable Network (CAN)
 - Maps to 2D space while preserving locality
 - No local minimas as in other greedy routing solutions

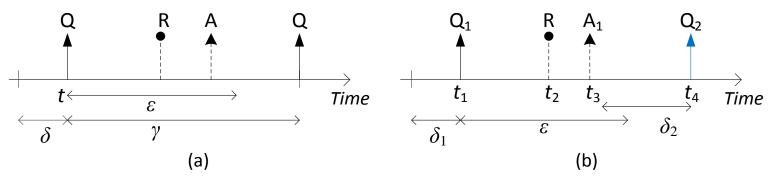
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• End users connect to overlay using a set of proxies

Subscription & Caching

- Subscription scheme for periodic queries
 - Adjust interest issue time at a proxy

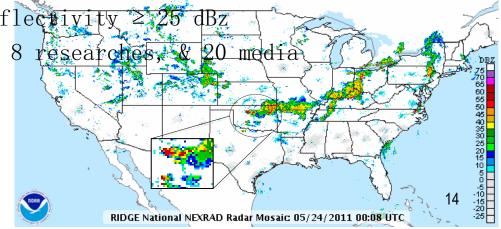


- Oldest First Caching (OFC)
 - Users interested in recent data
 - Less important with time
 - When cache is full remove the oldest data packet

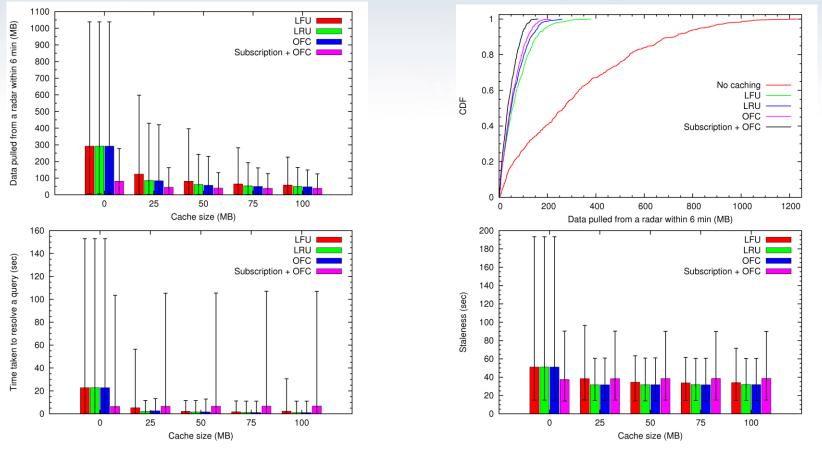


NDN for DCAS – Simulation Setup

- Parameters from CASA IP1 test bed
 - 121 radars placed on a 300 km x 300 km area, 30 km apart, 40 km range
 - 30 PPI scans, unsynchronized radars
 - 4 bytes per data type per tile (tile 100 m x 100 m)
 - 5 proxies, 16 x 2 reflectivity & velocity, & 4 x 3 NBRR, nowcasting, & QPE
 - 1 Gbps links
- Reflectivity data from a large-scale weather event over Oklahoma
 - 05/23/2011 10:00pm to 05/24/2011 2:00am
 - AOI Active weather if reflectivity ≥ 25 dBz
 - End users 2 NWS, 30 EMs, 8 researches, & 20 media



NDN for DCAS – Performance Analysis



Bandwidth requirements are reduced •

- Subscription scheme 61%, Oldest First Caching (OFC) 87%
- Better load distribution
- casa Better quality data - Waiting time & staleness is reduced • Waiting time - 88%, Staleness - 69%

Summary & Future Work

- Multi-user, multi-application, & multi-sensor DCAS system implemented on top of an overlaid NDN
- Reduce resource requirements & enhance quality
 - Enable bandwidth reduction & load balancing
 - Reduce response time & staleness
- Significant performance gains → Applicability of NDN for other DCAS systems
- Aggregate data from heterogeneous sensors in NDN
 - Integrate other sensors & enhance event-specific queries
 - Supporting event specific queries
 - "find all locations where wind speed is 60 km/h or higher"
 - Reference implementation based on $\ensuremath{\text{CCNx}}$





Questions/Comments

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