



# EXPAND

## EXtreme PerformANce testing of custom IoT workloaDs

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F4Fp\_SME\_NGI Experiment Review

# EXPAND



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## Experiment Description



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custom IoT workloaDs**

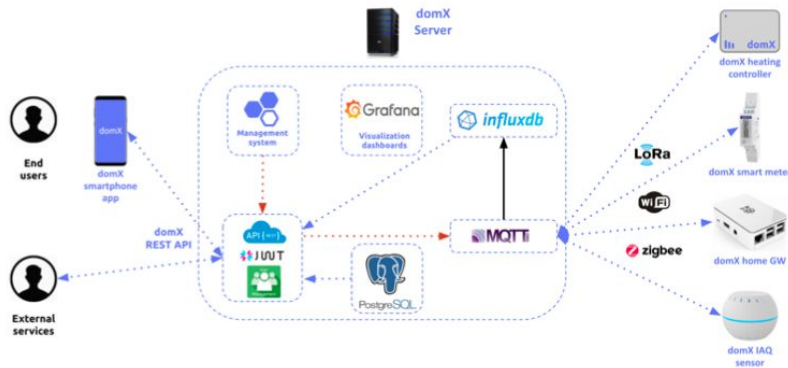
# Concept and objectives

In domX startup, we develop cost-effective and universal IoT products for the home environment, providing for:

- energy metering (electricity and gas)
- appliance control (HVAC controllers) improved living (automation gateway)
- climate monitoring (air quality sensors)

Continuous need for validating the performance, scalability and reliability of the entire platform.

However, achieving end-to-end testing of a complex IoT platform with production level characteristics is extremely hard, with the core difficulty arising from the fact that most test environments bear little resemblance to the real environment.



domX IoT platform architecture

# Concept and objectives

However, **EXPAND** experiment was ideal for testing and evaluating an emulated version of our production setup.

In EXPAND experiment, we managed to:

- emulate the domX production environment
- emulate the domX IoT device setup
- assess its performance under **realistic workloads and different configuration setups.**

We emulated the traffic load of domX IoT devices for MQTT and HTTP traffic, by using the open source:

- **Locust** load testing tool
- **Paho** MQTT library

We deployed the tailored performance testing implementation in a distributed setup of multiple machines to generate realistic IoT workloads.

# Background and Motivation

The experiments have been designed to characterize the impact of three different platform design choices, namely the:

- number of Virtual Machines (VMs)
- number of allocated CPUs
- number of employed platform replicas

Performance evaluation in terms of:

- number of simultaneously serviced clients
- average response time

Motivation:

- define the characteristics of a cost-effective platform setup able to cover our needs

**Experiment design:**

- **3 distinct groups**

**Group 1:**

- Multiple replicas in one VM
- Fixed number of CPUs per replica

**Group 2:**

- One VM - single replica
- Varying number of CPUs per replica

**Group 3:**

- Multiple replicas across VMs
- Fixed number of CPUs per replica

# Experiment setup

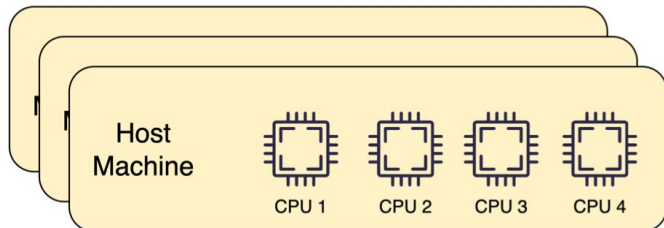
## VirtualWall 2 testbed:

- 1-3 Nodes for VerneMQ
- 4-8 Nodes for Locust

## Locust settings:

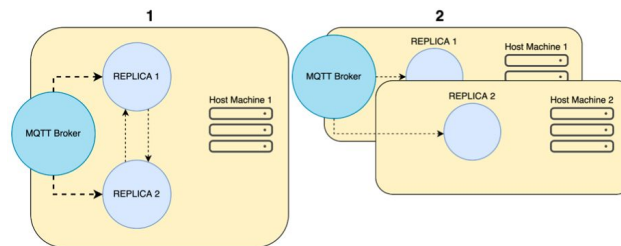
- **Locust Distributed Mode** utilizing 4 CPU cores on each VM and managed to generate 1300 concurrent clients
- Publishing to 21 different topics with varying publish intervals of 2, 10 and 60 seconds with Quality of Service (QoS 0) and varying message payloads.

### Locust VMs



## VerneMQ settings:

- **Docker Swarm & VerneMQ Clustering** with one master node and multiple node replicas
- client authentication through user credentials and SSL certificates



### VerneMQ replicas: on a single VM and on multiple VMs

## Project Results



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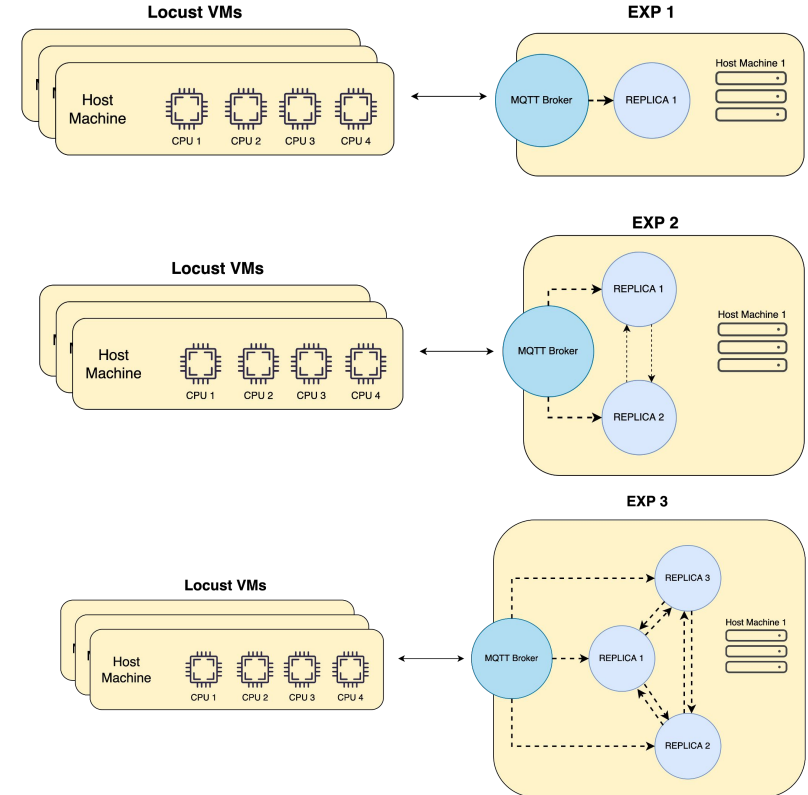
# Group 1 Experiment set-up

## VerneMQ Docker settings:

- 0.2 CPUs resource limit on each VerneMQ replica
- 4 GB RAM resource limit on each VerneMQ replica
- ***Increasing number of Replicas***

## Locust end-clients settings:

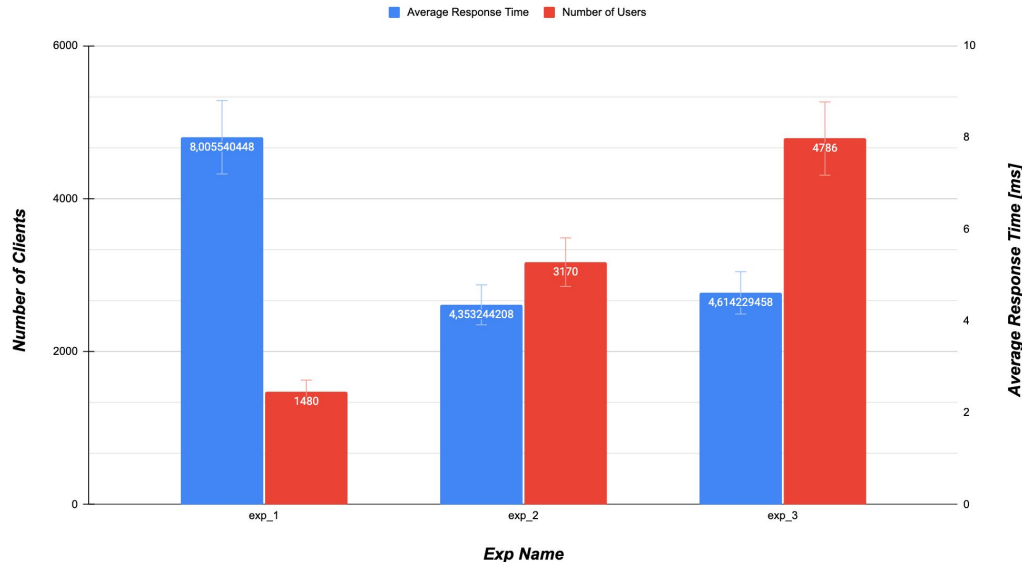
- 200 bytes payload on 2 sec interval
- 500 bytes payload on 10 sec interval
- 700 bytes payload on 60 sec interval



# Group 1 Results



Number of clients and Average Response Time



Experiment Name	Number of replicas	CPUs per replica	Total CPU utilization
Exp 1	1	0,2	0,2
Exp 2	2	0,2	0,4
Exp 3	3	0,2	0,6

## Client capacity:

- Linear increase with # of replicas
- **2.14 X** client increase with **2** replicas
- **3.23 X** client increase with **3** replicas

## Response time:

- Significant decrease
- 45% decrease with **2** replicas
- similar decrease with **3** replicas

# Group 2 Experiment set-up

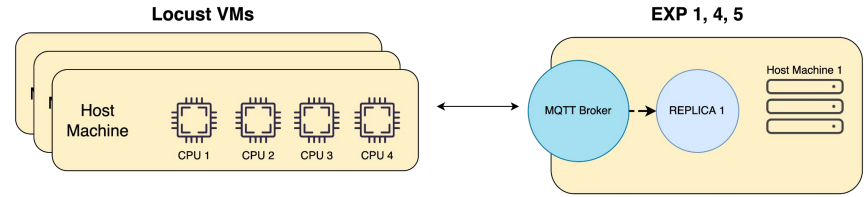


## VirtualWall 2 testbed:

- 1 Node for VerneMQ
- 8 Nodes for Locust

## VerneMQ Docker settings:

- 4 GB RAM resource limit on each VerneMQ replica
- ***Increasing number of CPUs per Replica***

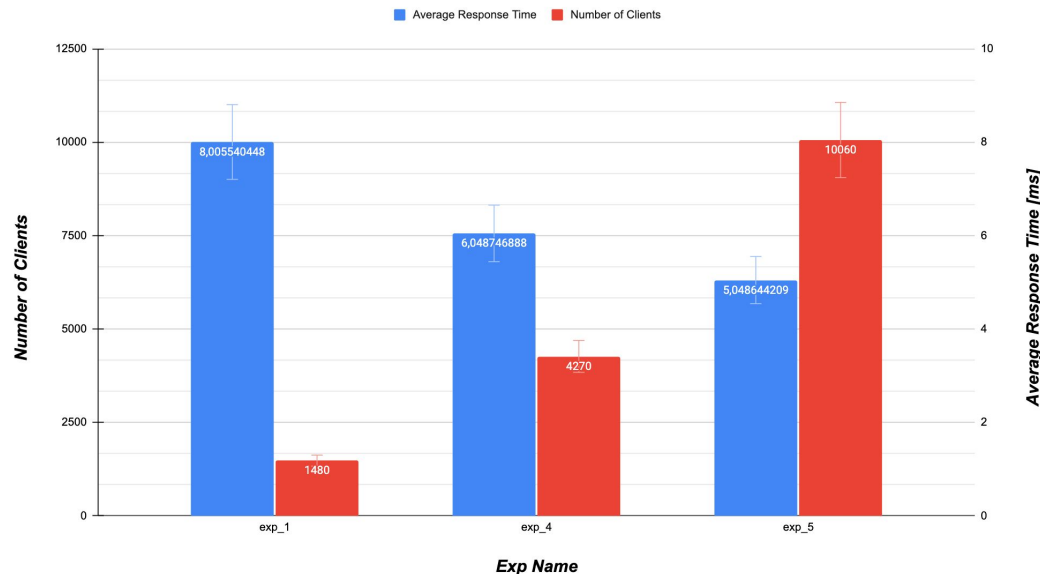


Experiment Name	Number of replicas	CPUs per replica	Total CPU utilization
Exp 1	1	0,2	0,2
Exp 4	1	0,4	0,4
Exp 5	1	0,6	0,6

# Group 2 Results



Number of clients and Average Response Time



Experiment Name	Number of replicas	CPUs per replica	Total CPU utilization
Exp 1	1	0,2	0,2
Exp 4	1	0,4	0,4
Exp 5	1	0,6	0,6

## Client capacity:

- Non-linear increase with # of CPUs
- **2.9 x** client increase with 2 CPUs
- **6.8 x** client increase with 3 CPUs

## Response time:

- Significant decrease
- 24% decrease with **2** CPUs
- 36% decrease with **3** CPUs

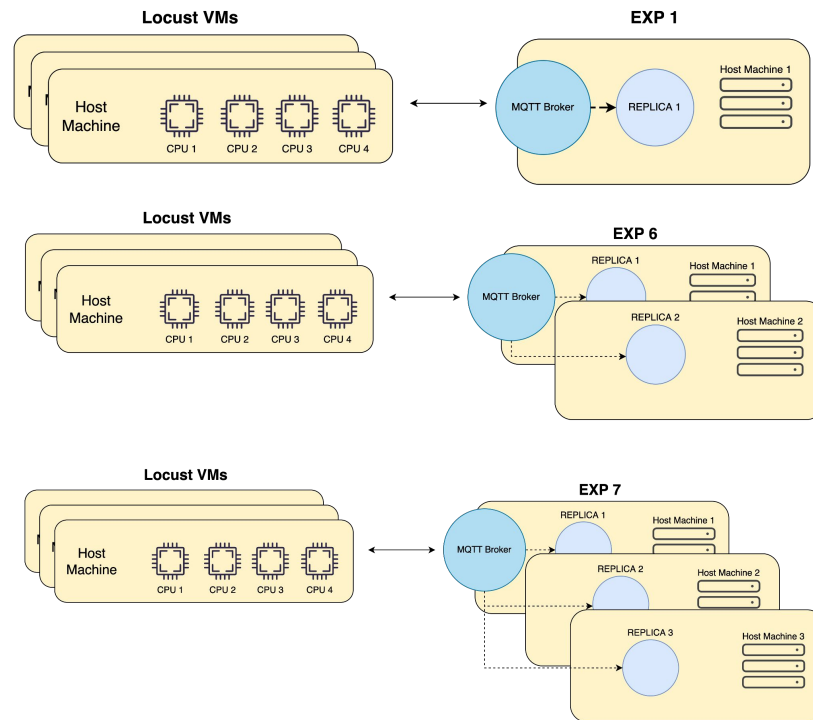
# Group 3 Experiment set-up

## VirtualWall 2 testbed:

- 3 Nodes for VerneMQ
- 4 Nodes for Locust

## VerneMQ Docker settings:

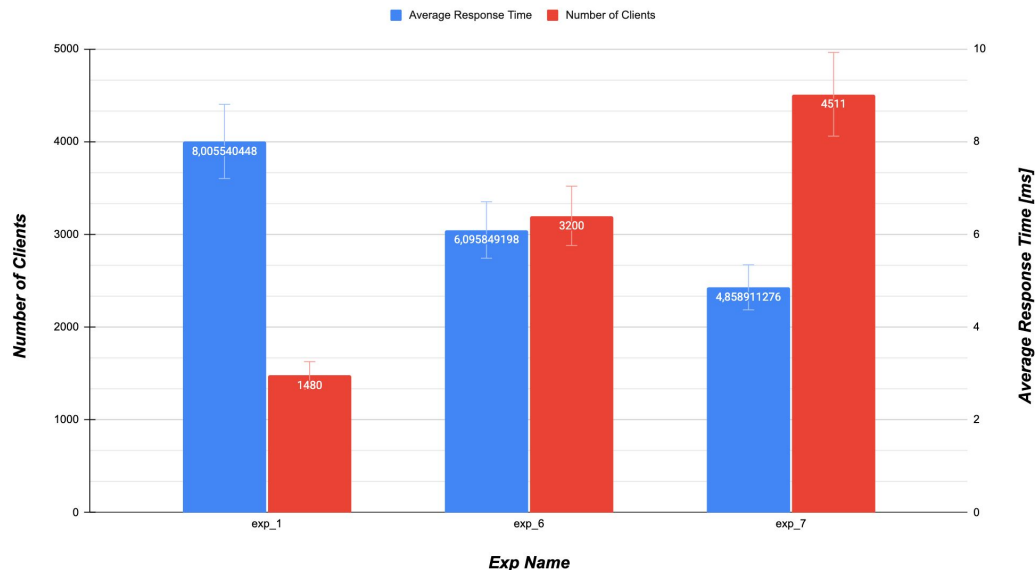
- 0.2 CPUs resource limit on each VerneMQ replica
- 4 GB RAM resource limit on each VerneMQ replica
- ***Increasing number of Replicas across multiple VMs***



# Group 3 Results



Number of clients and Average Response Time



Experiment Name	Number of replicas	CPUs per replica	Total CPU utilization
Exp 1	1	0,2	0,2
Exp 6	2	0,2	0,4
Exp 7	3	0,2	0,6

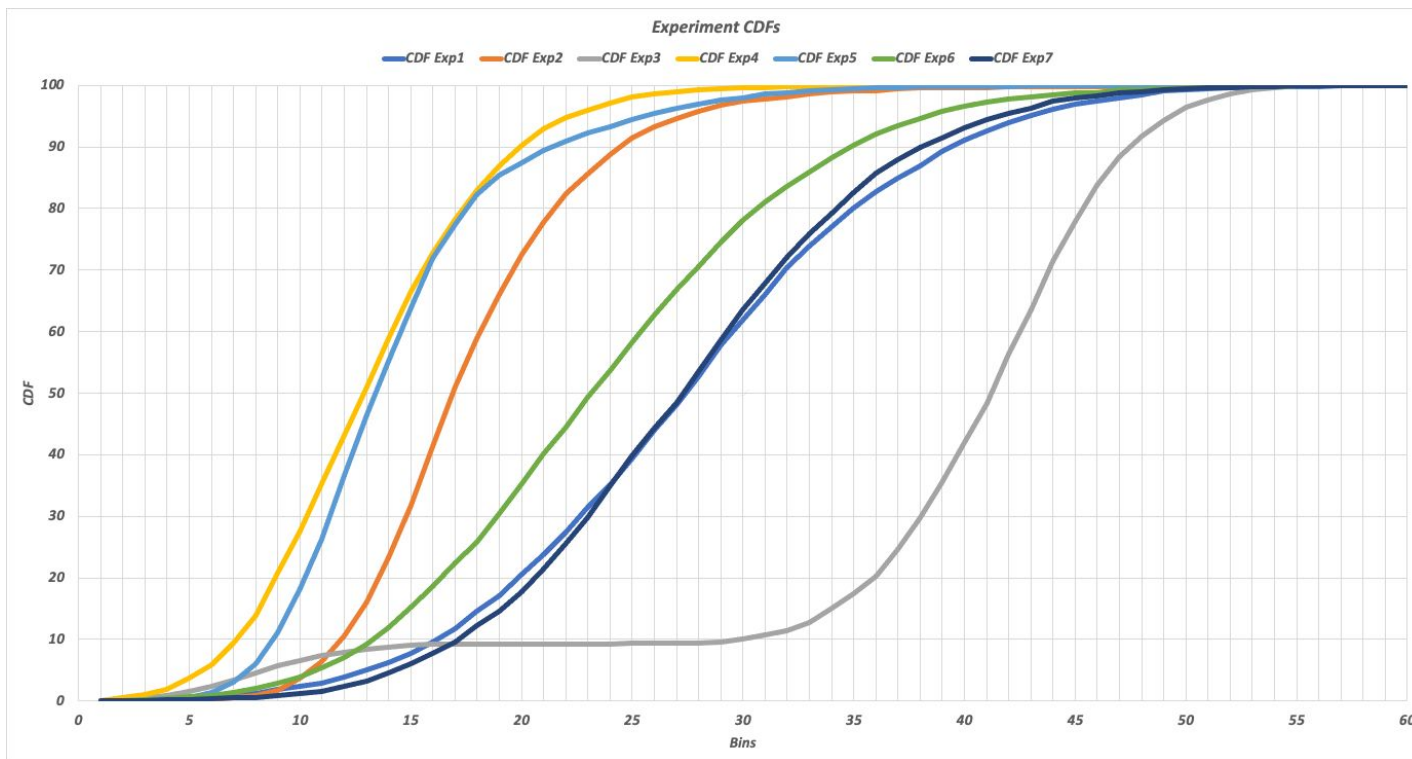
## Client capacity:

- Linear increase with # of replicas
- **2.16 x** client increase with **2** replicas
- **3.04 x** client increase with **3** replicas

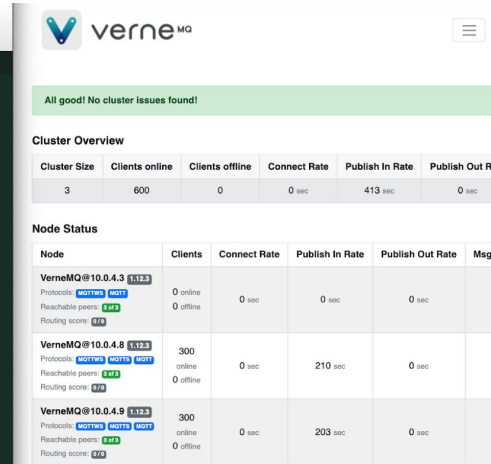
## Response time:

- Significant decrease
- 24% decrease with **2** replicas on **2** VMs
- 40% decrease with **3** replicas on **3** VMs

# Cumulative Distribution of Avg. Resp. Time



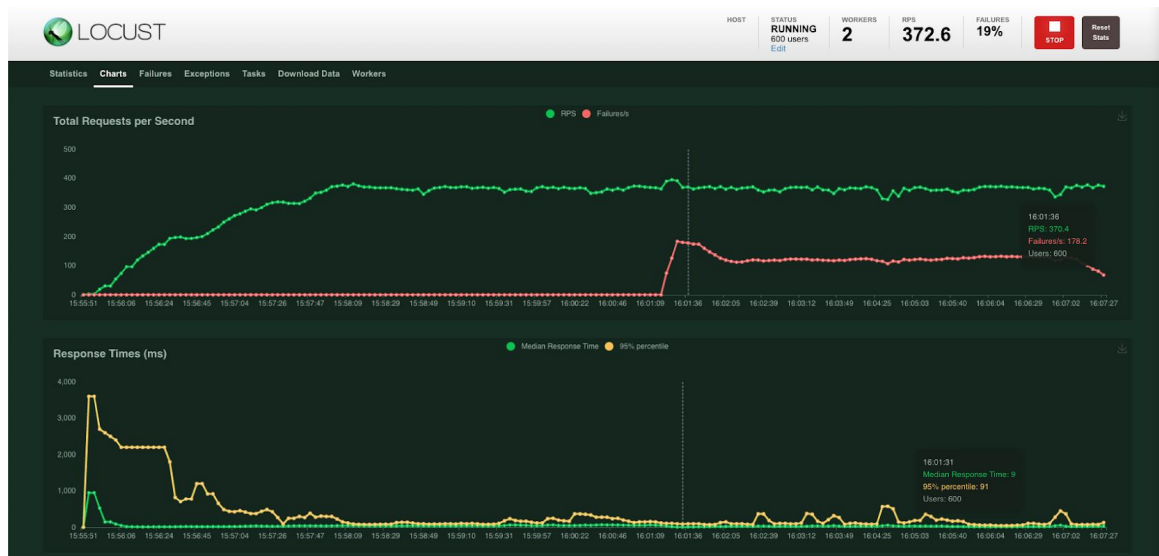
# Two Replicas across VMs (1/3)



- Benefits:**
- Fault tolerant setup
  - Possible migration of lost connections



# Two Replicas across VMs (2/3)



All good! No cluster issues found!

### Cluster Overview

Cluster Size	Clients online	Clients offline	Connect Rate	Publish In Rate	Publish Out Rate
2	487	-10	3 sec	249 sec	0 sec

### Node Status

Node	Clients	Connect Rate	Publish In Rate	Publish Out Rate	Msg
VerneMQ@10.0.4.3 1.12.3 Protocols: MQTTv3 MQTT Reachable peers: 2 of 2 Routing score: 0.76	0 online 0 offline	0 sec	0 sec	0 sec	
VerneMQ@10.0.4.8 1.12.3 Protocols: MQTTv3 MQTTv3 MQTT Reachable peers: 2 of 2 Routing score: 0.76	487 online -10 offline	3 sec	249 sec	0 sec	

Forced disconnection of first Replica from the MQTT cluster, resulting in a gradual migration of lost connections.

# Two Replicas across VMs (3/3)



All good! No cluster issues found!

## Cluster Overview

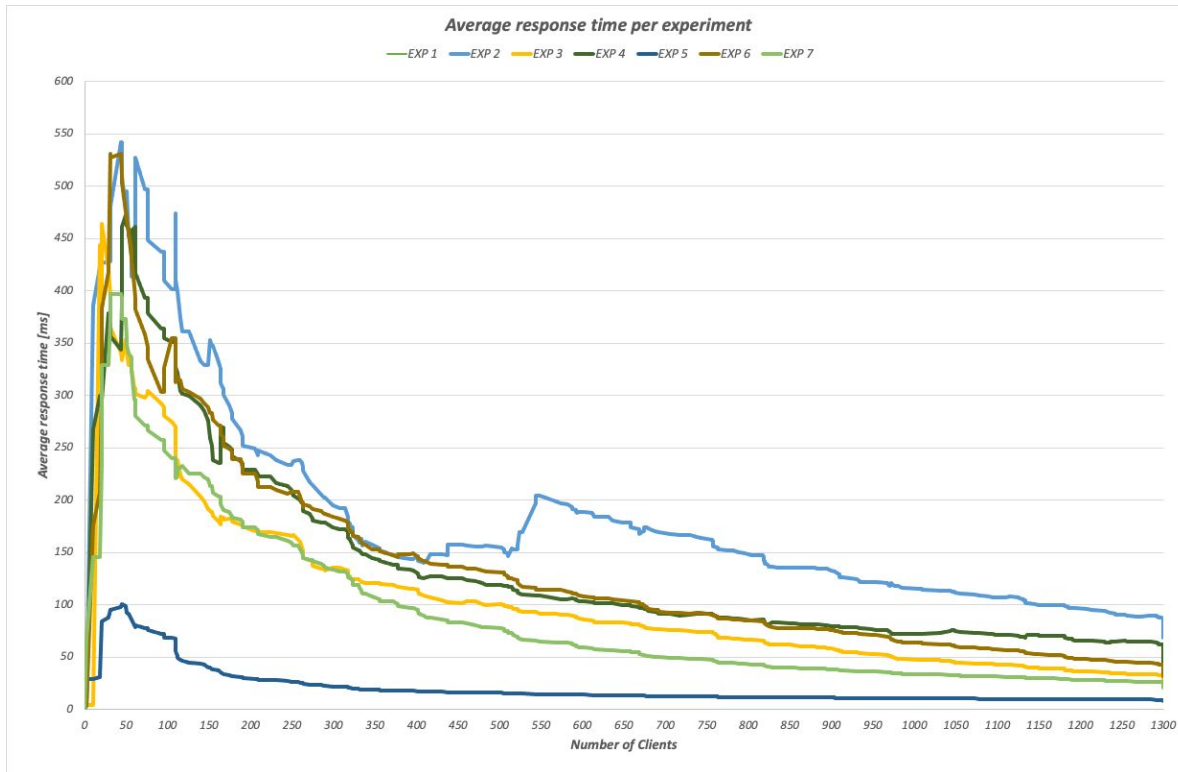
Cluster Size	Clients online	Clients offline	Connect Rate	Publish In Rate	Publish Out Rate
2	600	0	0 sec	370 sec	0 sec

## Node Status

Node	Clients	Connect Rate	Publish In Rate	Publish Out Rate	Msg
VerneMQ@10.0.4.3 1.12.3 Protocols: MQTTv5 MQTT Reachable peers: 2 on 2 Routing score: 0.8	0 online 0 offline	0 sec	0 sec	0 sec	
VerneMQ@10.0.4.8 1.12.3 Protocols: MQTTv5 MQTTv3 MQTT Reachable peers: 2 on 2 Routing score: 0.8	600 online 0 offline	0 sec	370 sec	0 sec	

Successful complete migration of clients to the second Replica

# Average Response Time



Average response time when forcing all clients to reconnect to a new Replica.

# Key findings

## Sweet spot:

- Increased number of replicas on a single VM induces coordination overhead
- The use of 2 replicas is enough to mitigate unexpected server downtimes
- No significant RAM utilization is required
- CPU allocation can be dynamically scaled

## Planned platform upgrade:

- Reserve 2 different VMs
- Deploy 2 replicas on with Docker Swarm & VerneMQ Clustering
- No need to increase RAM beyond 4 GBs
- Current setup can support > 10K devices
- Increase # of CPUs (2->3) only if needed

## Business Impact

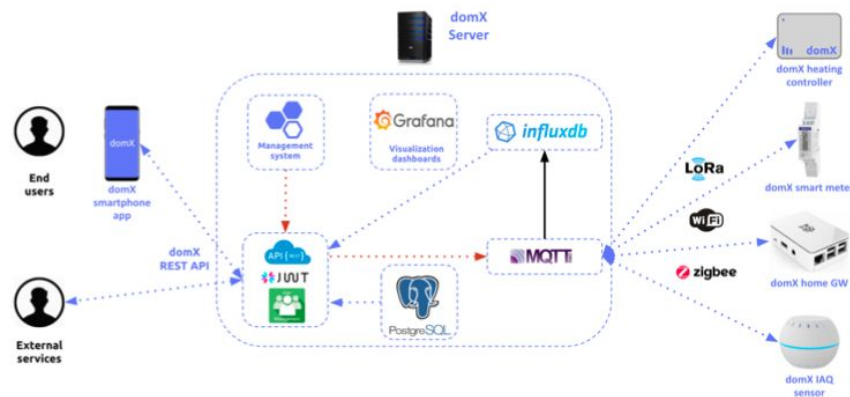


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# Business Impact

- EXPAND provided domX with pragmatic results for investigating future scalability pathways
- Experimented under realistic stress conditions without disrupting the performance of our connected clients
- Verified the ability of our system to cover current and short-term needs
- Developed a dosckerized load testing framework that emulates our production level environment!



domX IoT platform architecture

# Business Impact



EXPAND offered vast business impact:

- Identified the capacity limitations of our existing setup
- Identified the core platform specs that need to be adapted to deliver improved performance
- Developed our platform extension roadmap!
- Saved mission critical money to be invested in product development.

## Further plans

Planned follow-up experimental directions include:

- Stress test our platform under even more dynamic and extreme load conditions.
- Implement auto-scaling as well as auto-healing capabilities testing.

# Value perceived



The direct value of EXPAND for domX has been vast:

- **gained knowledge on experimenting with clustering technologies** of MQTT brokers, by deploying:
  - replicas on single VMs
  - replicas on separate VMs
- **experimented under realistic** workloads that consider traffic loads of own products
- **tested multiple configurations** on selecting configurations for ideal server setup
- **tested fault tolerant configurations** as mitigation strategies
- **Realized** the performance capabilities of our existing platform setup



Feedback



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# Feedback



## Experiment environment

1. We initially planned to use the CityLab testbed, but we faced firewall issues.
2. Migrated everything to the Virtual Wall 2 testbed and deployed the load generation as well VerneMQ configuration entirely.
3. Although the provided resources were more powerful than we anticipated, we integrated resource constraints

## Experiments execution

1. The collected results exceeded the initial expectations
  - provided results for future strategic planning
  - outweigh advantages and disadvantages of each configuration
2. Replication of own setup was smooth
3. Online documentation was minimal and can be improved
4. Great collaboration and support by Virtual Wall 2 testbed team

# Feedback



## User Tools

EXPAND utilized:

- **JFed** for deploying reproducible experiments
- **Docker & Docker-Compose**, for adaptive VM configuration
- **Docker swarm**, for MQTT Broker replication
- **Locust**, for realistic workload generation

## Testbed Resources

EXPAND employed Virtual Wall 2 available testbed resources:

- easy setup and configurable approaches
- constantly online and remotely accessible
- minimal time to set up and run the experiments
- minimal repetition on deployment

# Added value of Fed4FIRE+



## Usefulness

1. The Fed4FIRE+ offered experimentation platforms and tools are a great asset and perfectly match the company's experimentation needs.
2. The deployment of relevant resources by domX would not be affordable. In addition, the ability to financially support the execution of experiments is quite important especially for micro-SMEs like domX, which do not have the ability to finance R&D activities with their own funds.
3. Great environment and support required for promoting R&D of startups

## Key offerings

1. Availability of testbed resources
2. Heterogeneity of testbed facilities
3. Realistic experimentation conditions
4. Availability of experimentation tools
5. Continuous remote testbed availability
6. Technical support by expert people
7. Combined infrastructure types (IoT, Cloud servers etc)
8. Software interfaces to manage infrastructure (JFed)
9. Resources power (CPU, RAM etc)
10. Freedom of resource customization
11. Ease of experimentation setup
12. Availability of documentation & other resources (highly qualified testbed experts)

# Testimonial



“We are now more confident that our product has been stress-tested under realistic conditions. Through the wide set of executed experiments, we are now able to achieve better infrastructure and cost planning in the long term, along with better adaptation of platform specs to the prevailing IoT loads.”



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