

## From development to production Accelerating robotic development with cloud computing

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### FROM DEVELOPMENT TO PRODUCTION - ACCELERATING ROBOTIC DEVELOPMENT WITH CLOUD COMPUTING







Functionality simulated for illustrative purposes.

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## **Developers wants the same experience**











Same highperformance infrastructure Same operational consistency

Same services and APIs Same automation, deployments, and security controls

Same pace of innovation as in the cloud

## **Cloud Computing Services**



### FROM DEVELOPMENT TO PRODUCTION - ACCELERATING ROBOTIC DEVELOPMENT WITH CLOUD COMPUTING

CONTAINER SERVICE

**STORE & RETRIEVE** 

DOCKER IMAGES

MANAGED

ANALYTICS STREAMING DATA EXCHANGE ETL DATA LAKE HADOOP/SPARK DATA PIPELINES INTERACTIVE, DATA WAREHOUSE SQL QUERIES ELASTICSEARCH VISUALIZATIONS	ANALYTICS	
	ANALYTICS DATA EXCHANGE DATA LAKE DATA PIPELINES DATA WAREHOUSE ELASTICSEARCH	STREAMING ETL HADOOP/SPARK INTERACTIVE SQL QUERIES VISUALIZATIONS

### AR + VR

AR/VR EXPERIENCES

### AWS COST MANAGEMENT

ANALYZE AWS COSTS COST & USAGE BUDGETS COST & USAGE REPORTS **RESERVED INSTANCES REPORTING** 

EMAIL	SEARCH
MESSAGE BROKER	TRANSCODING
QUEUEING & NOTIFICATIONS	WORKFLOW

### BUSINESS APPLICATIONS

EMAIL & CALENDARING	UNIFIED COMMUNICATIONS
ONLINE MEETINGS	VOICE-ENABLED
SHARING & COLLABORATION	WORKPLACE

### DEED BLOCKCHAIN





	Сомри
	COMPUTE AUTO SCALING
P/SPARK	BATCH JOBS
ETIVE <sub>9 in</sub> ERIES ZATIONS	EVENT-DRIVEN SERVERLESS COMPUTING INSTANCE TYPE
	MANAGED VIRT PRIVATE SERVE

1ANAGED REPOSITORY FOR SERVERLESS APPS RUN & MANAGE WEB APPS SERVERLESS VIRTUAL SERVERS

### B

### RELATIONAL DATABASE DATABASE BUILT GRAPH DATABASE FOR THE CLOUD IN-MEMORY CACHING MANAGED MARIADB MANAGED MYSQ STORE DATABASE MANAGED ORACLE LEDGER DATABASE MANAGED TIME SERIES POSTGRESQL DATABASE MANAGED SQL SERVER

### DEVELOPER TOOLS

### ANALYZE & DEBUG APPLICATION LIFECYCLE MANAGEMENT **BUILD & TEST** CONTAINERS DEVOPS RESOURCE MANAGEMENT ONE-CLICK APP DEVELOPMENT PIPELINE ORCHESTRATION **RESOURCE TEMPLATES** TRIGGERS © 2023, Amazon Web Services, Inc. or its affiliates. All rights reserved

END USER C	OMPUTING
PP STREAMING ESKTOP DMPUTING	MOBILE ACCESS STORAGE & COLLABORATION

### HYBRID ARCHITECTURE $\mathcal{L}$

SERVICES	INTEGRATED
REMISES	NETWORKING
INTEGRATION	INTEGRATED
	RESOURCE &
GRATED	DEPLOYMENT
CES &	MANAGEMENT
: 5151615	
GRATED	
TITY & ACCESS	UN AWS

### တို့တ္ GAME ТЕСН

DAT

EDG

CROSS-PLATFORM 3D GAME ENGINE GAME SERVER HOSTING

### ☆ INFRASTRUCTURE

AVAILABILITY ZONES CUSTOM HARDWARE DATA CENTER INFRASTRUCTURE GLOBAL NETWORK BACKBONE POINTS OF PRESENCE POWER INFRASTRUCTURE REGIONS

### র্ণাচ **INTERNET OF THINGS (IOT)**

RULES ENGINE DEVICE ANALYTICS DEVICE GATEWAY DEVICE SDK DEVICE SHADOWS **EVENT DETECTION & RESPONSE** LOCAL COMPUTE LOCAL DATA COLLECTION MANAGEMENT & SECURITY MICROCONTROLLER OPERATING SYSTEM REGISTRY VISUAL APPLICATIONS DEVELOPMENT

ML FRAMEWORKS SAGEMAKER   DEEP LEARNING AMIS & CONTAINERS AUTOMATIC MC TUNING   HARDWARE ACCELERATION ML AT THE EDGE TENSORFLOW, PYTORCH, MXNET DATA LABELINI HOSTED NOTEI ML MARKETPLA MODEL HOSTIN MODEL OPTIMIZATION		
CHATBOTS MODEL TRAINI ENTITY EXTRACTION PRE-BUILT ALGORITHMS FACE ANALYTICS TOPIC MODELI FACE SEARCH DEEP LEARNIN FORECASTING MODELS IMAGE LABELING REINFORCEMEN NATURAL LANGUAGE PROCESSING SPOT INSTANC PERSONALIZATION & BATCH PREDIC RECOMMENDATION EAL-TIME SENTIMENT ANALYSIS PREDICTIONS SPEECH TRANSCRIPTION		
SENTIMENT ANALYSIS PREDICTIONS SPEECH TRANSCRIPTION		
TEXT TO SPECH TRANSLATION VIDEO & IMAGE ANALYSIS CONTENT MODERATION		
여기 MANAGEMENT &		

### (三) GOVERNANCE

ACTIVITY & API MONITORING USAGE TRACKING PROVISIONING CHATBOT RESOURCE TEMPLATES CONFIGURATION TRACKING GOVERNANCE RECOMMENDATIONS TRACKING MANAGEMENT LICENSE MANAGER SERVICE CATALOG MANAGE POLICIES SYSTEMS MANAGER MANAGE RESOURCES

### MARKETPLACE

MACHINE LEARNING DATA PRODUCTS NETWORKING DATABASES OPERATING SYSTEMS DEVOPS STORAGE

LIVE VIDEO TRANSPORT VIDEO PERSONALIZATION & MEDIA STORAGE VIDEO PROCESSING & DELIVERY VIDEO ORIGINATION VIDEO STREAMING & PACKAGING

APPLICATION MIGRATION DATABASE MIGRATION EXABYTE-SCALE MIGRATION ONLINE DATA TRANSFER SERVER MIGRATION TRANSFER FOR SFTP

OKS

API GATEWAY	MOBILE APP TESTIN
DEVELOPMENT FRAMEWORK	SINGLE INTEGRATED CONSOLE
IDENTITY	SYNC
MOBILE ANALYTICS	TARGETED PUSH

APPLICATION DELIVERY DEDICATED NETWORK CONNECTION DOMAIN NAME SYSTEM LOAD BALANCING MONITOR APIS MONITOR MICROSERVICES NETWORK TOPOLOGY NETWORKING HUB PRIVATE CONNECTION TO APPS SCALE VPC & ACCOUNT CONNECTIONS SERVICE DISCOVERY VIRTUAL PRIVATE CLOUD

CLOUD ROBOTICS

### SATELLITE

SATELLITE OPERATIONS

### ♣ COMPLIANCE

ACCESS CONTROL ASSESSMENT & REPORTING CONFIGURATION COMPLIANCE DDOS PROTECTION IDENTITY MANAGEMENT **KEY MANAGEMENT & STORAGE** MONITORING & LOGGING RESOURCE MANAGEMENT THREAT DETECTION WEB APPLICATION FIREWALL

### 周

ARCHIVE STORAGE **BACKUP & RESTORE** BLOCK STORAGE DATA TRANSFER EDGE PROCESSING & COMPUTING FILE STORAGE HIGH-PERFORMANCE FILE SYSTEM HYBRID CLOUD STORAGE **OBJECT STORAGE** WINDOWS FILE SYSTEM

### 巨社 CUSTOMER ENABLEMENT

ACCOUNT MANAGEMENT DASHBOARD PERSONALIZATION ENTERPRISE SUPPORT EXPERTS MARKETPLACE OPTIMIZATION GUIDANCE PARTNER ECOSYSTEMS SECURITY & BILLING REPORTS SOLUTIONS MANAGEMENT TRAINING & CERTIFICATION



)	DUCTION - ACC	ELERATING
	COMPUTE AUTO SCALING BATCH JOBS EVENT-DRIVEN SERVERLESS COMPUTING INSTANCE TYPES MANAGED VIRTUAL PRIVATE SERVERS MANAGED REPOSITORY FOR SERVERLESS APPS RUN & MANAGE	CONTAINTERS CONTAINER SERV MANAGED KUBERNETES STORE & RETRIEN DOCKER IMAGES
	WEB APPS SERVERLESS COMPUTE	
	VIRTUAL SERVERS	

### DEVELOPER TOOLS

## ANALYZE & DEBUG

### APPLICATION LIFECYCLE MANAGEMENT BUILD & TEST

- CONTAINERS DEVOPS RESOURCE MANAGEMENT ONE-CLICK APP DEVELOPMENT PIPELINE ORCHESTRATION
- RESOURCE TEMPLATES
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### INTERNET OF THINGS (IOT)

RULES ENGINE DEVICE ANALYTICS DEVICE GATEWAY DEVICE SDK DEVICE SHADOWS **EVENT DETECTION & RESPONSE** LOCAL COMPUTE LOCAL DATA COLLECTION MANAGEMENT & SECURITY MICROCONTROLLER OPERATING SYSTEM VISUAL APPLICATIONS DEVELOPMENT

### ↔ MACHINE LEARNING DEEP LEARNING AUTOMATIC MODEL AMIS & CONTAINERS TUNING HARDWARE DATA LABELING

HOSTED NOTEBOOKS ML AT THE EDGE ML MARKETPLACE PYTORCH, MXNET MODEL TRAINING PRE-BUILT ENTITY EXTRACTION FACE ANALYTICS TOPIC MODELING FACE SEARCH

DEEP LEARNING IMAGE LABELING REINFORCEMENT NATURAL LANGUAGE

SPOT INSTANCES RECOMMENDATION SENTIMENT ANALYSIS PREDICTIONS

TRANSCRIPTION TEXT & DATA EXTRACTION TEXT TO SPEECH TRANSLATION VIDEO & IMAGE ANALYSIS CONTENT MODERATION

### CLOUD ROBOTICS

## **Robotics development lifecycle**



# **Design and Develop**

teleoperation

# Kinesis Video Streams with WebRTC for teleoperation and supervision



control

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## **Remote command and control**









**Turbine Anomalies** 

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## The AWS AI/ML stack

AI SERVICES	SPECIALIZED	BUSINESS PROCESSES Amazon Personalize Amazon Forecast Amazon Fraud Detector Amazon Lookout for Metrics	SEARCH Amazon Kendra	CONVERSATION Amazon Lex Amazon Transcribe Call Analytics Contact Lens Voice ID		<b>CODE + DEVOPS</b> Amazon CodeGuru Amazon CodeWhisperer Amazon DevOps Guru	INDUSTRIAL Amazon Monitron Amazon Lookout for Equipment Amazon Lookout for Vision	<b>HEALTH</b> Amazon HealthLake Amazon Comprehend Medical Amazon Transcribe Medical Amazon Omics	
	CORE	<b>TEXT</b>   Amazon Translate Ama	zon Comprehend		SPEECH Amazon Polly Amazon	I Transcribe A	ISION nazon Textract Amazon Rekognit	tion AWS Panorama	

	CANVAS No-code ML for business analysts	STUDIO LAB	<b>GROUND TRUTH</b> Label data	(	)				
AMAZON SAGEMAKER				Prepare data	Geospatial ML CI/CD	Build with notebooks CD   GOVERNANCE   RE	Train models	Deploy in production	EDGE MANAGER Manage edge devices
				Store features			Tune parameters RESPONSIBLE ML	Manage and monitor	

ML FRAMEWORKS & INFRASTRUCTURE	PyTorch, Apache MXNet, TensorFlow	Amazon EC2	CPUs	GPUs	AWS Inferentia	AWS Trainium	Habana Gaudi	FPGA



## **Amazon Rekognition Image and Video**



**OBJECT, SCENE, AND ACTIVITY** 







**CUSTOM LABELS** 

**CONTENT MODERATION** 

TEXT



**PPE DETECTION** 

FACE DETECTION AND ANALYSIS

**FACE COMPARE & SEARCH** 



VIDEO SEGMENTS

LIVE STREAM VIDEO

PATHING

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## Case study: Robot Care Systems

## Problem

- Constrained hardware for intelligent capabilities on device
- Costly and time-consuming to build ML capabilities from scratch

## Solution

- Offload intelligent capabilities to the cloud
- Built a conversational interface with Amazon Lex
- Built a facial recognition capability with Amazon Rekgonition

## **Business benefits**

- Reduced robotic development from months to days
- Reduced hardware costs





Build, train, and deploy ML models for any use case with fully managed infrastructure, tools, and workflows

### END-TO-END ML JOURNEY



## Amazon SageMaker

### PREPARE

Geospatial: Visual geospatial data

**Ground Truth:** Create high quality datasets for ML

**Data Wrangler:** Aggregate and prepare data for ML

**Processing:** Built-in Python, BYO R/Spark

**Feature Store:** Store, catalog, search, and reuse features

**Clarify:** Detect bias and understand model predictions





### BUILD -

**Studio Notebooks & Notebook Instances:** Fully managed Jupyter Notebooks with elastic compute

**Studio Lab:** Free ML development environment

**Built-in Algorithms:** Integrated tabular, NLP, and vision algorithms

**JumpStart:** UI based discovery, training, and deployment of models, solutions, and examples

**Autopilot:** Automatically create ML models with full visibility

**Bring Your Own:** Bring your own container and algorithms

**Local Mode:** Test and prototype on your local machine

### TRAIN & TUNE

**Fully Managed Training:** Broad hardware options, easy to setup and scale

**Distributed Training Libraries:** High performance training for large datasets and models

**Training Compiler:** Faster deep learning model training

**Automatic Model Tuning:** Hyperparameter optimization

**Managed Spot Training:** Reduce training cost by up to 90%

**Debugger and Profiler:** Debug and profile training runs

**Experiments:** Track, visualize, and share model artifacts across teams

**Customization Support:** Integrate with popular open-source frameworks and libraries

Studio | RStudio Integrated development environment (IDE) for ML

MLOps: Pipelines | Projects | Model Registry Workflow automation, CI/CD for ML, central model catalog

**Canvas** Generate accurate machine learning predictions—no code required

**Governance** Model cards, Dashboard, Permissions

### DEPLOY & MANAGE

**Fully Managed Deployment:** Ultra low latency, high throughput inference

**Real-Time Inference:** For steady traffic patterns

**Serverless Inference:** For intermittent traffic patterns

**Asynchronous Inference:** For large payloads or long processing times

**Batch Transform:** For offline inference on batches of large datasets

**Multi-Model Endpoints:** Reduce cost by hosting multiple models per instance

**Multi-Container Endpoints:** Reduce cost by hosting multiple containers per instance

**Shadow Testing:** Validate model performance in production

**Inference Recommender:** Automatically select compute instance and configuration

Model Monitor: Maintain accuracy of deployed models

Kubernetes & Kubeflow Integration: Simplify Kubernetes-based ML

**Edge Manager:** Manage and monitor models on edge devices



Raw data is collected, pre-processed, and



## SageMaker Reinforcement Learning



WEB-BASED IDE FOR ML

AUTOMATICALLY BUILD AND TRAIN MODELS



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## Scaling Simulation Environments Faster training

Run a large number of simulations in parallel

## Run at faster than real-time speed





Episode N

Epoch N





# **Test and Verify**

## Release process stages



- Check-in source code
- Peer review new code
- Compile code
- Unit tests
- Style checkers
- Create container images and function deployment packages
- Integration testing with other systems
- Load testing
- UI testing
- Security testing

- Deploy to production environments
- Monitor code in production to quickly detect errors

## **AWS RoboMaker**

## **Key features**

- Serverless container-based high fidelity simulations with an API
- GUI applications over a browser
- Batch simulation

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• CI/CD for robotics



## **Example Solution:** Robot Application CI/CD Pipeline with AWS



## Case study: Regression testing

## Problem

- Limited test coverage for different floor layouts and scenarios
- Costly and time-consuming to test
- Late bug discovery in the field

## Solution

- iRobot built a CI/CD pipeline for large-scale and automated testing using the AWS RoboMaker simulation service
- More than 40 automated tests on each code commit and more than 500 automated tests for each release candidate

## **Business benefits**

Much faster testing and release cycle (1 hour vs. 3 weeks for testing 70 complex localization scenarios)





# **Deploy and Update**

## **AWS IoT architecture**



## **AWS IoT Core**

AWS IoT Core is a managed service that lets connected devices easily and securely interact with cloud applications and other devices



To securely connect devices to the AWS cloud & other devices at scale



To route, process, and act upon data from connected devices



To enable applications to interact with devices even when they are offline



To fully integrate with other AWS services to reason on top of the data (Analytics, Databases, AI, etc.)

## **Device Shadow**

## Understand and control the status of your device at any time

Reporting the last known state of the device; e.g., the last known color of the light bulb is red

Changing the state of the device; e.g., change the color of the light bulb to blue

Real time notification of state changes using MQTT

Asynchronous communication with offline devices

Device SDK integration for easy implementation on devices

REST APIs for applications to interact with devices



## **Rules Engine**

Ingest large amounts of data at a low cost, pre-process it, and make it available to 20+ services for analytics, reporting, and visualization

**Transform** — built in functions for math, string manipulation, dates, Protobuf decoding, etc.

**Filter** — use the WHERE clause to capture only the data you want.

**Take actions** - specify what to do when a rule is triggered. For example, send you device's location data to Amazon Location Service.

**Route** — send your data to over 20 AWS services and third-party services like Salesforce, etc.



## **AWS IoT Greengrass**



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## **AWS IoT Greengrass Components**

### **Key features**

- Open source client software
- Device-side dev tools—iterate ٠ quickly with CLI and local console
- Portability across HW(ARM/x86), OS, languages (C/C++, Java, Python, JS/Node)
- Apps consist of modular • components-use pre-built components or your own software (new or legacy code)
- Software catalog on GitHub with components such as data streaming to Amazon KVS, Modbus TCP protocol support, local InfluxDB time-series database





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## AWS IoT Greengrass prebuilt components



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**Public components** are prebuilt; AWS provides components with common functionality that you can deploy to your robots

Examples of prebuilt AWS integrations to speed up development time



Edge ML inference frameworks With TensorFlow or Amazon SageMaker Neo Deep Learning Runtime (DLR)

Includes pretrained models for object detection and image classification



Log manager Automatically capture component logs in the cloud with Amazon CloudWatch Logs



Kinesis Video Streams Read video feeds from local cameras and publish them to Kinesis Video Streams



Secure tunnels Enable remote access to robots over secure tunneling



And more More than 20 public components are available today

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## AWS IoT Greengrass OTA software updates



Configurable deployment rate

Failure thresholds

Timeouts

Component rollback Conditional update workflow



## Deploying and managing software on robots



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## **Building cloud-enhanced robots with AWS**





### **CHALLENGE**

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Technology and engineering group ST Engineering wanted to migrate its infrastructure to the cloud so it could scale to support its RaaS business model and quickly develop a cloudbased robotic fleet management software.

### SOLUTION

ST Engineering migrated to the cloud and adopted AWS IoT Greengrass and Amazon Kinesis Video Streams, providing its robots with connectivity to the cloud and the capability to stream live video footage to customers.

### IMPACT

- Achieved a scalable infrastructure that supports its robotic fleets
- Developed a cloud-based robotics FMS solution
- Supports a virtually unlimited amount of simultaneous live video streams

"Amazon Kinesis Video Streams is very straightforward and easy to use." —Yoke Kong, principal engineer of the solution team, ST Engineering

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# Thank you!

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