

# Baidu Cloud Industry Quality Inspection Solution

Baidu Inc.

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#### **Highest Labor Cost in Complex Cosmetic Defect Inspections**





cannot solve this problem The complexity and variability of cosmetic defect

solution still

Previous machine vision automation

The complexity and variability of products' surface

Limitations of traditional rulebased machinevision algorithms

Human inspections

industry

daily output

current cycle time

labor amount

avg. labor cost

**Monthly inspection labor cost** 

% of inspection labor #

19 pcs/person/min

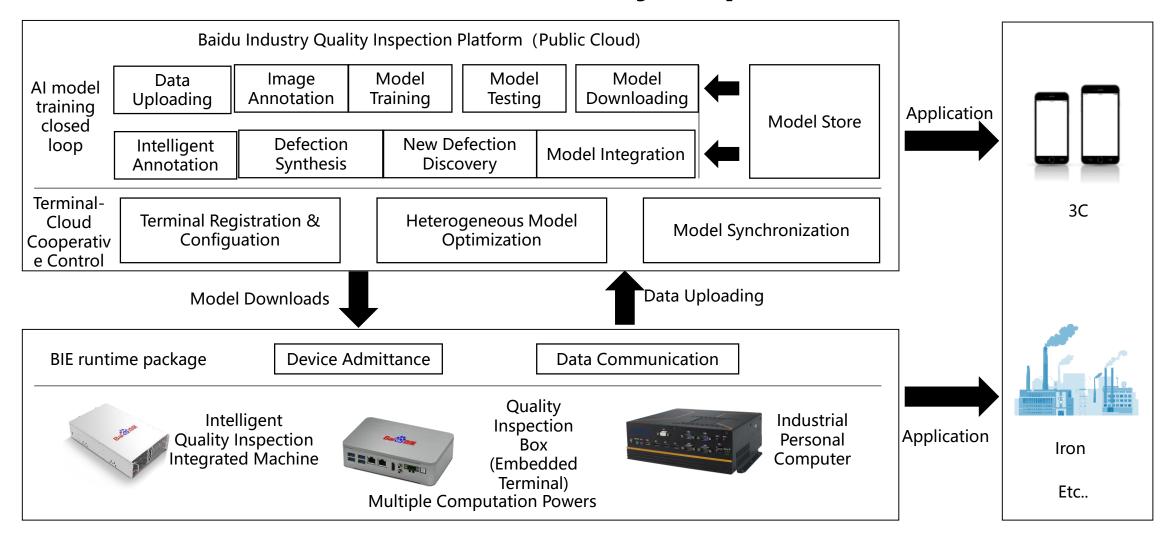
261

7800 RMB

2.03 million RMB

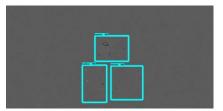
from 20% to 40% in past 3 yrs.

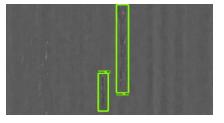
### **Unified Terminal-Cloud Quality Inspection Solution**



### 5 Key Features on Baidu Industry Quality Inspection

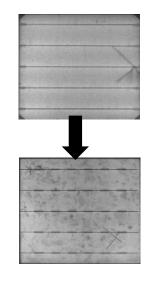
Intelligent Data Annotation





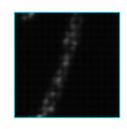
Over 80% Data Labeling Time Reduced

Defection Synthesis for New Product Line



Fast Product Line Translation

New Defect Discovery





Discovery Unclassified Defect

Heterogeneous Inference Engine

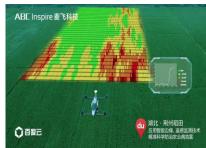




Best Performance-Cost Balance

Edge-Cloud Association

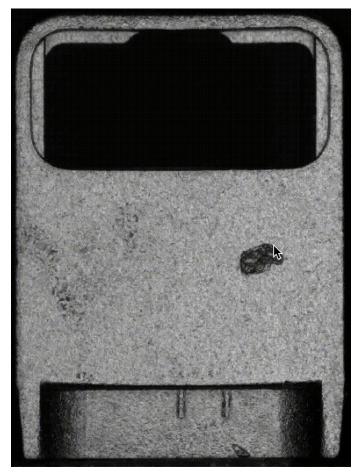




Model and Data Cycle

#### **Intelligent Data Annotation**

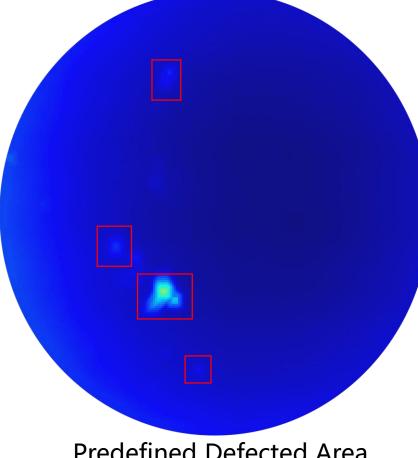
Annotation : Slow( usually > 50s per object)  $\rightarrow$  Potential Defect Suggestion ( > 80% precision ) Coarse (approximated polygon) → Automatically Segment Foreground (only 4 corners)



**Interactive Segmentation** 



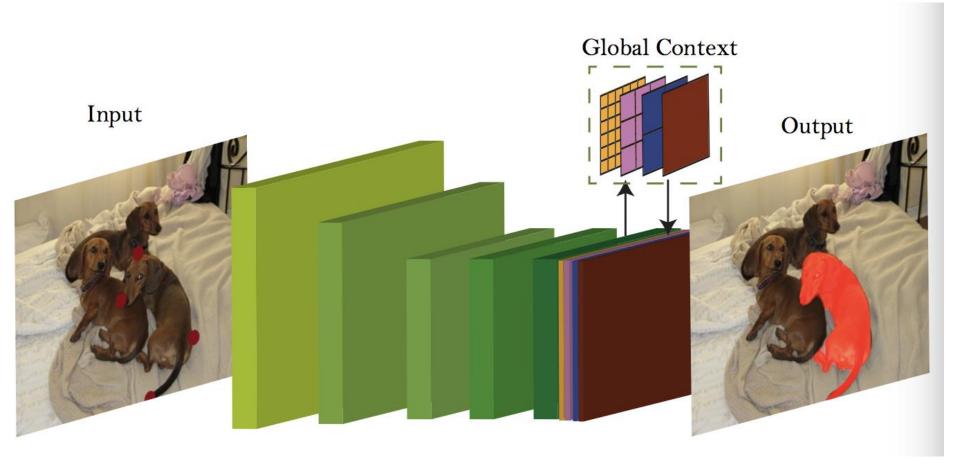
Input Image



**Predefined Defected Area** 

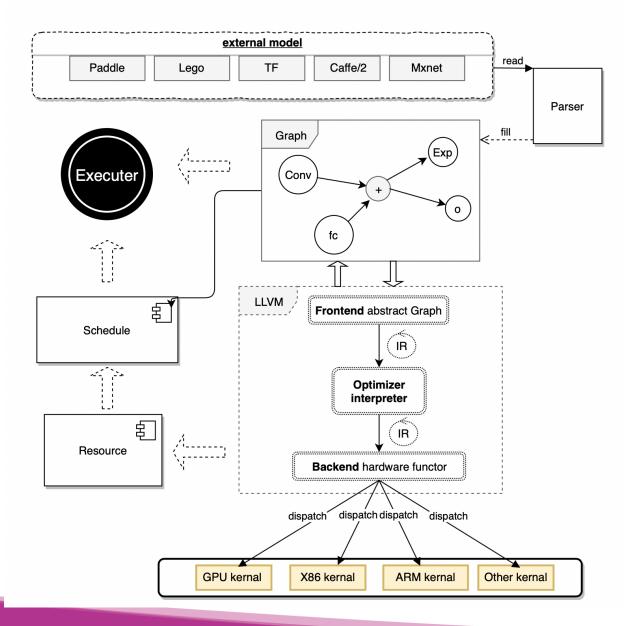
### **Intelligent Data Annotation-Interactive Segmentation**

Interactive Segmentation: class-agnostic semantic segmentation with global context heatmap to acquire high accuracy



Deep Segmentation from Extreme Points

### **Heterogeneous Inference Engine**



#### **Anakin- Baidu Heterogeneous Inference Engine**

1. Multiple Deep Learning Framework

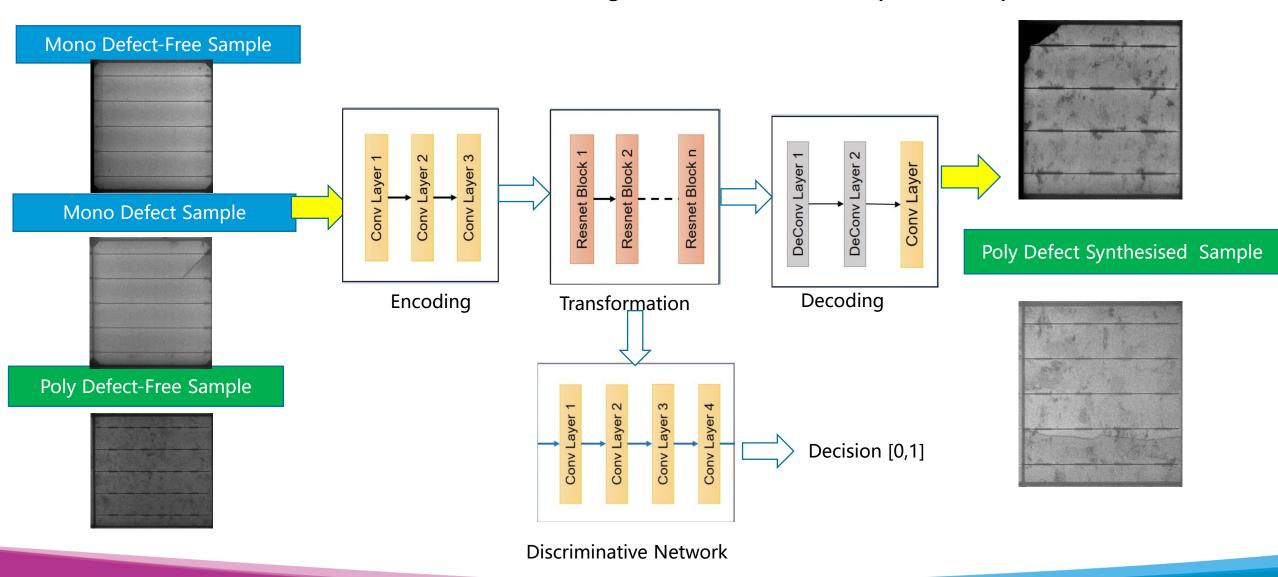
2. Graph Merging and memory re-using

3. Address Pre-Mapping

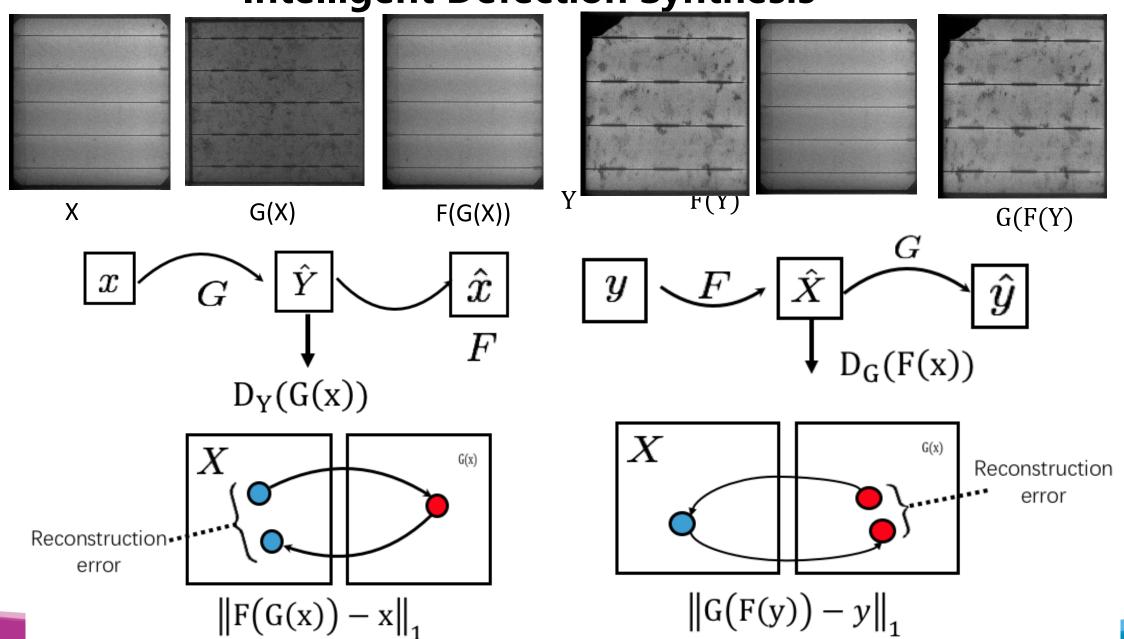
4. Heterogeneous Assembly Optimized

### **Intelligent Defection Synthesis**

**New Product Line Cold Start: Transfer time-consuming labeled data collection (> 3 months) to 30 minutes** 



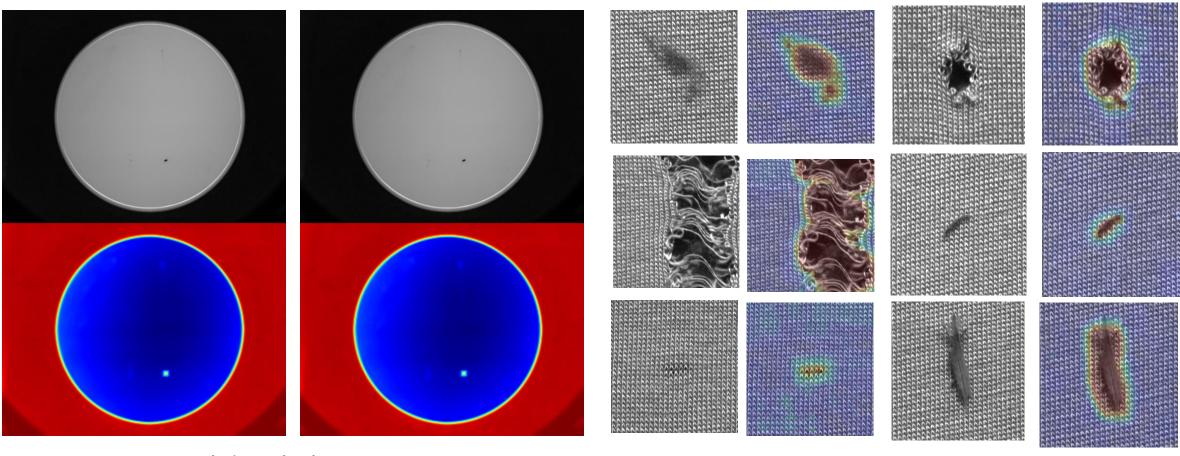
**Intelligent Defection Synthesis** 



#### **New Defection Discovery**

Maintenance: Discovery un-classified defect for model optimization

Novel Defect discovery: discover un-predefined defect by modeling defect-free image



Apple iWatch Charger

**Textured Anomaly Dataset** 

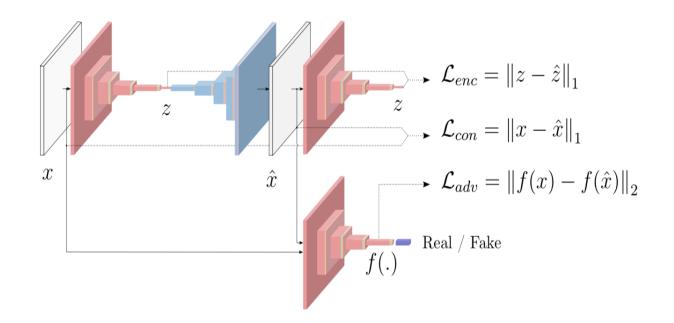
### **New Defection Discovery**

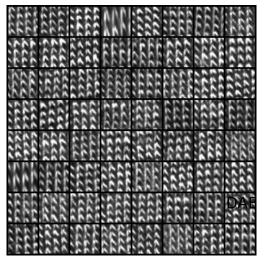
#### Network:

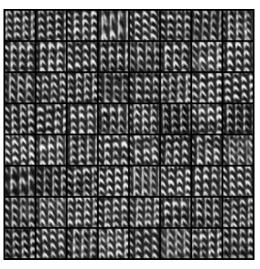
- Reconstruction Network: Denoising/Variation AutoEncoder
- Discrimination Network: Detect Anomaly Samples

#### Loss Function:

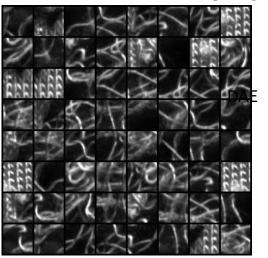
- Encoding Loss: latent variable loss
- Content Loss: Ensure the reconstructed image
- Adversarial Loss: Ensure the authenticity of samples generated

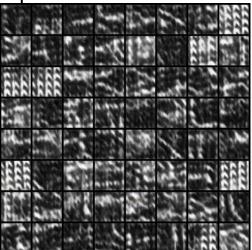






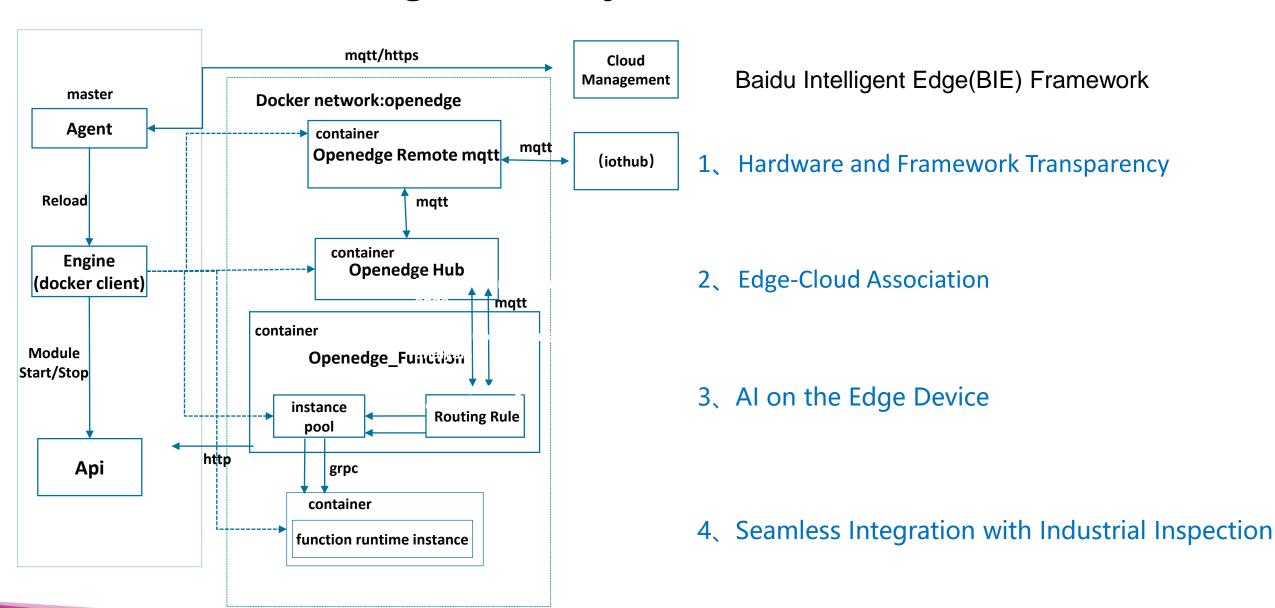
Normal samples





Anomaly samples

#### **Edge Cloud Synchronization**



#### **Baidu Cloud ABC Integrated Industrial Inspection**



High-Performance Industry Inspection Device		
Feature	Strictly Meet AQL and FP for super-star	
Scenario	Replace 100% labor + Computer Center + Quality Tracing Center	
Customer	Digital Industrial Inspection for large company ( > 200+, 1 millon RMB per Machine)	



High Performance-Cost Industry Inspection	
Feature	Basically Meet the AQL and FP
Scenario	Replace the Entire- workers(Verification worker reserved), rapidly deployment
Customer	Rapid labor-saving for small incorporation with sailing and renting (> 2000, renting for 10,000 per month)

## **THANKS**