### **TWENTY THIRD ANNUAL**

May 1 - 4, 2022

**TestConX** 

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### **Smart Manufacturing**

Edge Computing Inference Opportunities and Challenges in ATE

#### Eli Roth Pady Kannampalli Teradyne



Mesa, Arizona • March 6–9, 2022

### TERADYNE

TestConX Workshop

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# The World is Adopting Data Analytics and Artificial Intelligence

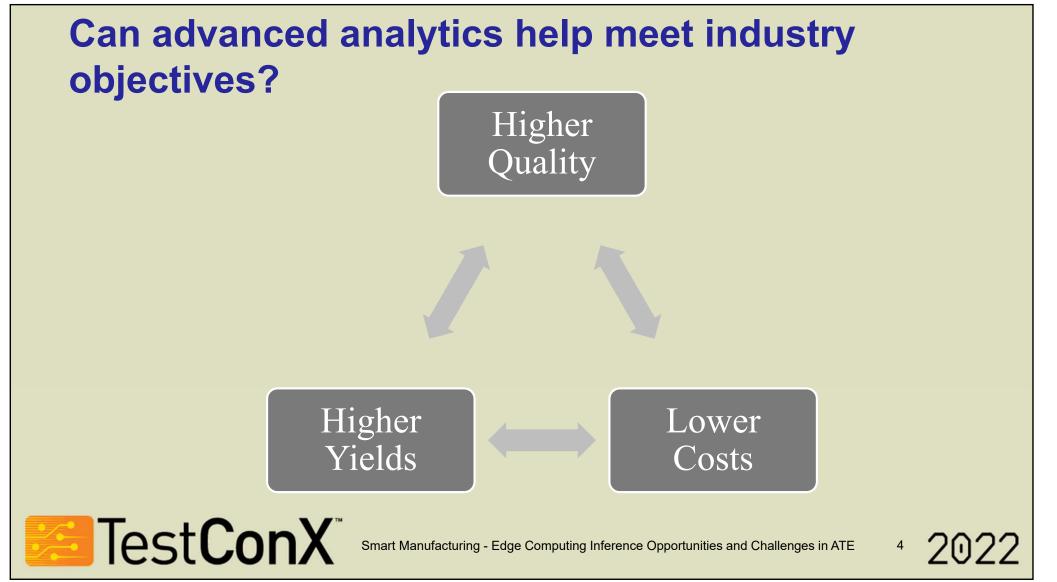


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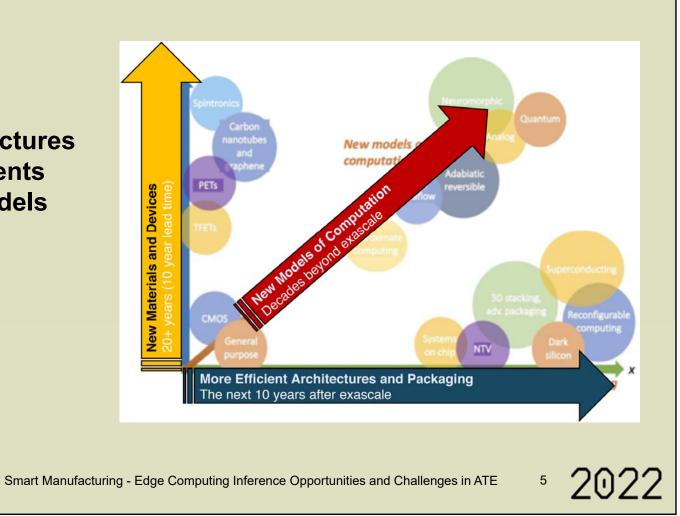
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## Increasing complexity is an industry wide challenge

- 1. Advanced Materials
- 2. New Devices
- 3. More Efficient Architectures
- 4. Packaging Improvements
- 5. New Computation Models

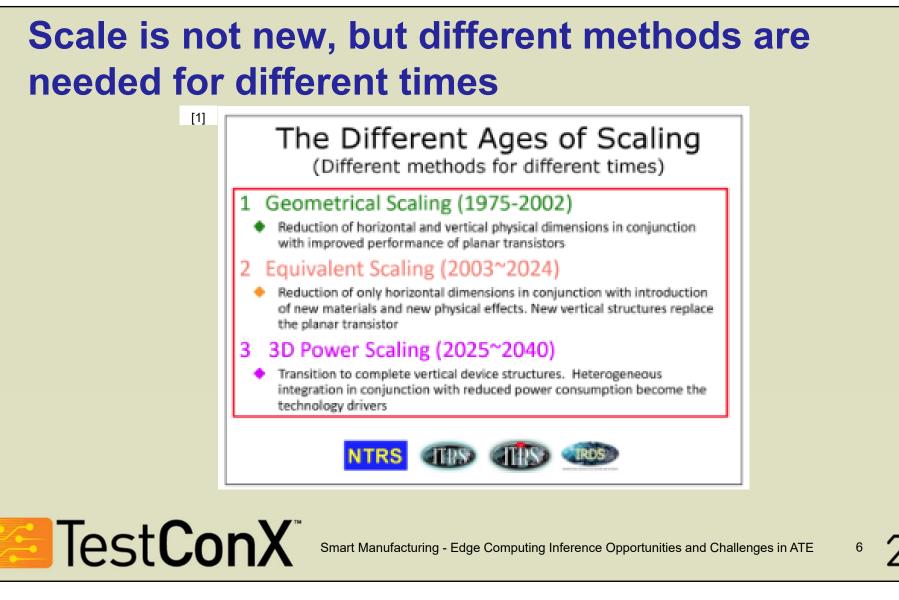
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## Scale is not new, but different methods are needed for different times

|                               | Improvement Paths          |                     |                |                      |                                |
|-------------------------------|----------------------------|---------------------|----------------|----------------------|--------------------------------|
| Improvement<br>Paths          | Algorithmic<br>improvement | Memory<br>bandwidth | Memory latency | Network<br>bandwidth | Fixed-function<br>acceleration |
| Application Area              |                            |                     |                |                      |                                |
| Big Data Analytics            |                            | х                   | X              | х                    | Х                              |
| Artificial<br>Intelligence    | х                          | х                   |                |                      | x                              |
| Discrete Event<br>Simulation  |                            | х                   | x              |                      |                                |
| Physical System<br>Simulation | Х                          | х                   | х              | х                    |                                |
| Optimization                  | х                          | x                   | X              |                      | х                              |
| Graphics/VR/AR                | х                          | х                   |                |                      | Х                              |
| Cryptographic codec           |                            | х                   |                |                      | x                              |



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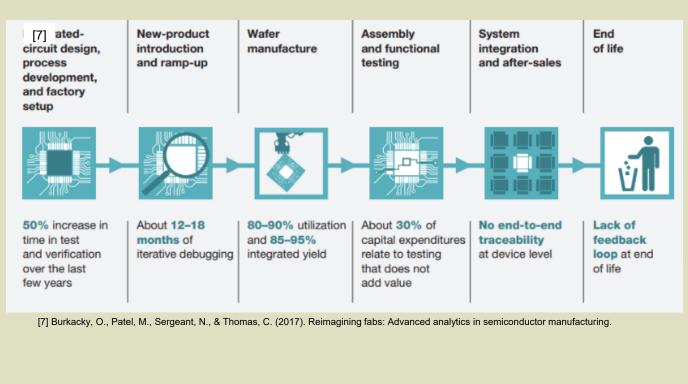
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# Current value chain is improving, but continuous improvement is required

#### Manual intervention with some degree of automation

Improving processes by creating analytical tools

- Replace guesswork and human intuition
- Fact-based knowledge
- Pattern recognition





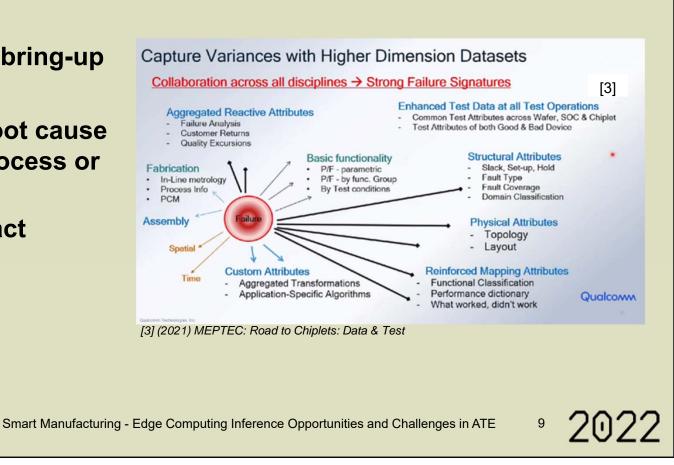
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# Existing and near-term solutions are a combination of automation, expert systems and advanced analytics

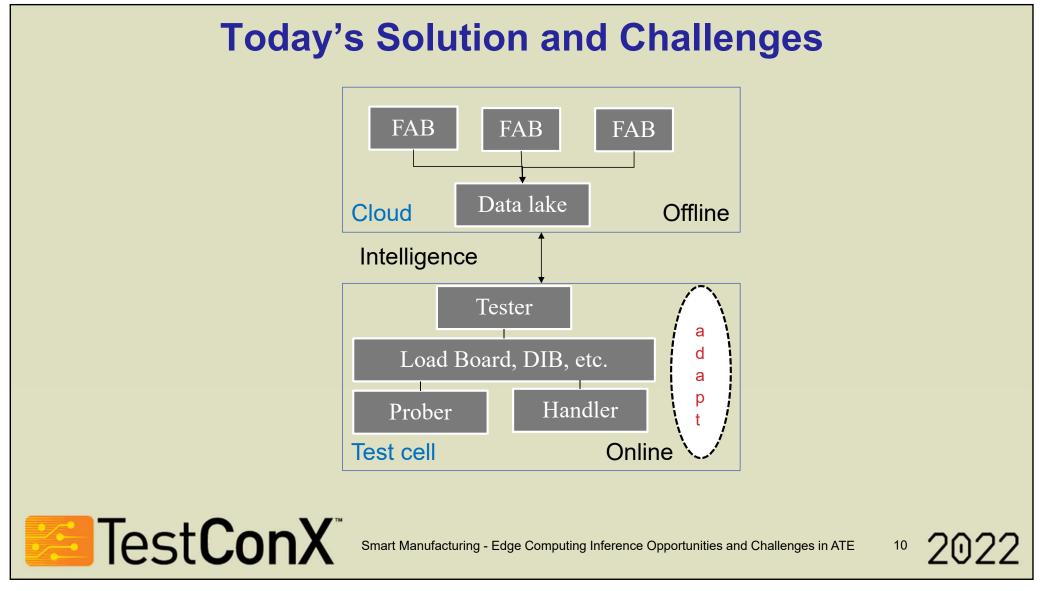
- 1. Expedite Test program bring-up
- 2. Shorten debug cycles
- 3. Accurately associate root cause failures with design, process or equipment issues
- 4. Minimize test time impact

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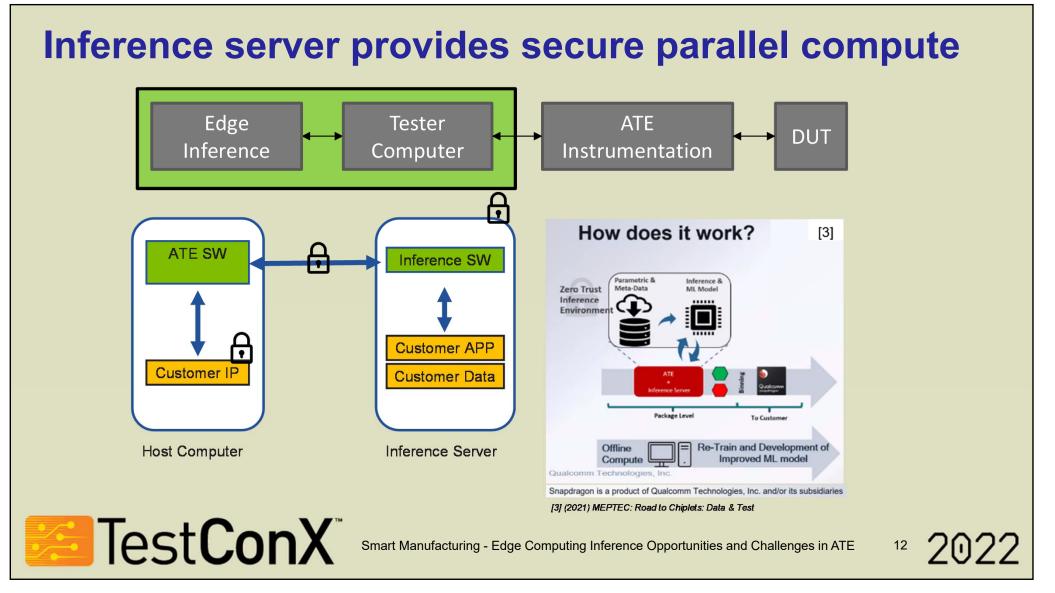
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#### **Today's Solution and Challenges**

|        |         |   | <u> </u>  |         |
|--------|---------|---|---|---------|
|        |         | SOLUTIONS   | CHALLENGES  |         |
|        | Offline | <ul> <li>Data collected from multiple<br/>OSATs is analyzed to identify<br/>systematic issues</li> <li>Recommendations to test teams<br/>of potential causes of variance</li> </ul>                                       | <ul> <li>A knowledge network to<br/>augment analytics and provide<br/>optimal, robust &amp; usable<br/>recommendations</li> <li>Security and latency deploying<br/>intelligence to the test cell</li> </ul> |         |
|        | Online  | <ul> <li>Secure inference compute connected to tester, e.g., Edge inference</li> <li>Low latency and does not add to floor space</li> <li>Integrates with ATE OS / test program to minimize test time overhead</li> </ul> | <ul> <li>Capture data variance from test cell equipment</li> <li>Update intelligence in real time</li> <li>Scalability at OSATs</li> </ul>  |         |
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#### Inference server provides secure parallel compute

- 1. On-the-fly machine learning scoring/decision making
- 2. Zero Trust Environment
- 3. Minimum Latencies
- 4. Easy model integration with test programs and ATE Control



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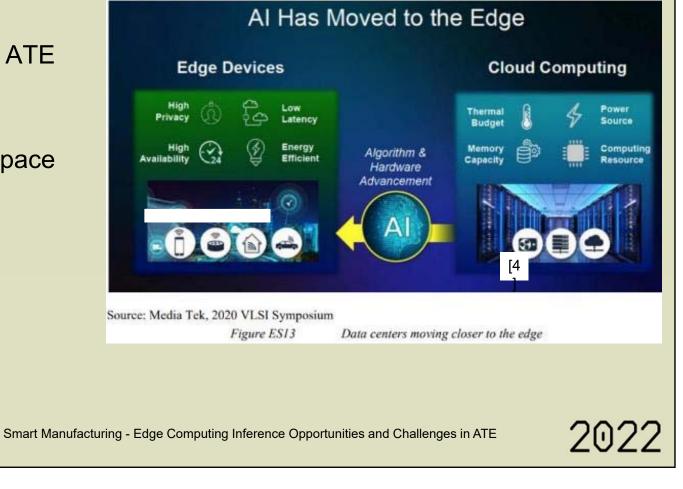
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#### **Test Cell Edge Inference Compute Requirements**

#### BENEFITS

- 1. Secure communication to ATE OS
- 2. Low latency
- 3. Does not consume floor space

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#### **Test Cell Edge Inference Compute Requirements**

#### Challenges

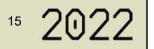
- 1. Inference limited test time
- 2. Adds to test cell infrastructure capital cost
- 3. Combines knowledge and data analytics for inference

| Table AB-4 AI/ML Deployment Platforms and Constraints |                                |                                      |  |  |  |
|---|--------------------------------|--------------------------------------|--|--|--|
| Deployment Platforms                                  | High<br>Performance<br>(Cloud) | Real Time<br>Inference<br>(IoT Edge) | Resource-<br>constrained<br>Inference<br>(IoT Edge<br>MCU/IOT) |  |  |
| Training System                                       | Cloud                          | Cloud                                | Cloud  |  |  |
| Inference System                                      | Cloud                          | IoT Edge<br>Computer                 | IoT Edge<br>Microcontroller                                    |  |  |
| Training Speed  | High                           | High                                 | High   |  |  |
| Inference Throughput<br>(pages/second)                | High                           | Medium                               | Low  |  |  |
| Inference Latency<br>(milliseconds)                   | High                           | Low                                  | Low  |  |  |
| Compute   | High                           | Medium                               | Low  |  |  |
| Cost  | High                           | Medium                               | Low  |  |  |
| Power   | High                           | Medium                               | Low  |  |  |

IEEE: 2021 International Roadmap for Devices and Systems



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#### Conclusion

Advanced analytics coupled with automation and knowledge systems can facilitate in addressing the upcoming challenges

- Advanced analytics are needed
- Security, infrastructure and latency will be balanced between offline and online analytics
- Data
  - Collaboration, and sharing data and intelligence between design and test cell equipment vendors is necessary
  - Data variances will be used to build algorithms for inference



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