



Grasping and Manipulation Performance Measures and Benchmarking

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Agenda

- Overview of NIST Benchmarking work
 - Grasping and Manipulation (elemental level)
 - Robotic Assembly (functional/task level)
- Participant discussion of related work
- Formulation of a unified effort



NIST Goals

- Develop metrics, test methods and artifacts with example datasets to characterize the performance of grasping and manipulation with emphasis on deployment for manufacturing tasks.
- Provide the robotics community with unbiased measurement methods for both elemental characteristics and function-level performance capabilities.
- Short Term: Provide researchers and developers insight for improving their hardware and software designs
- Long Term: Used to develop specifications that will help match capabilities to end-user manufacturing needs



NIST Testbed

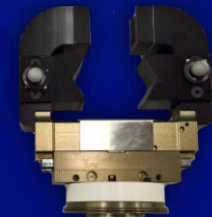
- Hands/Grippers
 - SCHUNK Dexterous Hand II
 - ROBOTIQ 3-Finger Gripper
 - Wonik Robotics Allegro Hand
 - Empire Robotics VERSABALL Gripper
 - Soft Robotics Inc.
 - Conventional parallel grippers



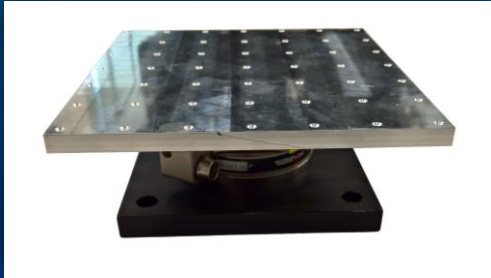
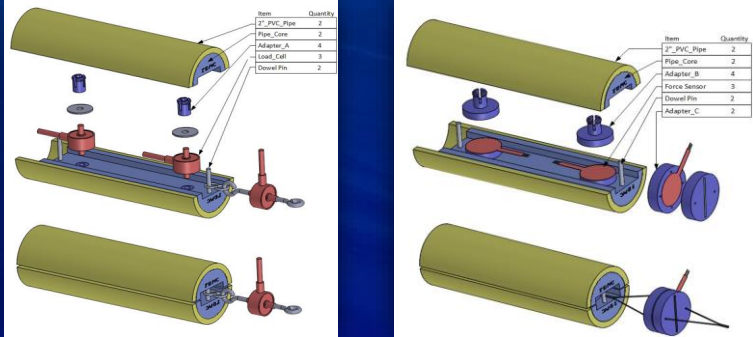

- Tactile Sensors
 - Syntouch BioTac, BioTac SP, & Numatac
 - OptoForce 3D Force sensors
 - ATI Industrial Automation Nano17 F/T transducers
 - Weiss Robotics Tactile sensors



- Arms
 - KUKA LWR 4+
 - Universal Robots UR5, UR10
 - ABB YuMi
 - Rethink Robotics Baxter



Elemental Test Methods

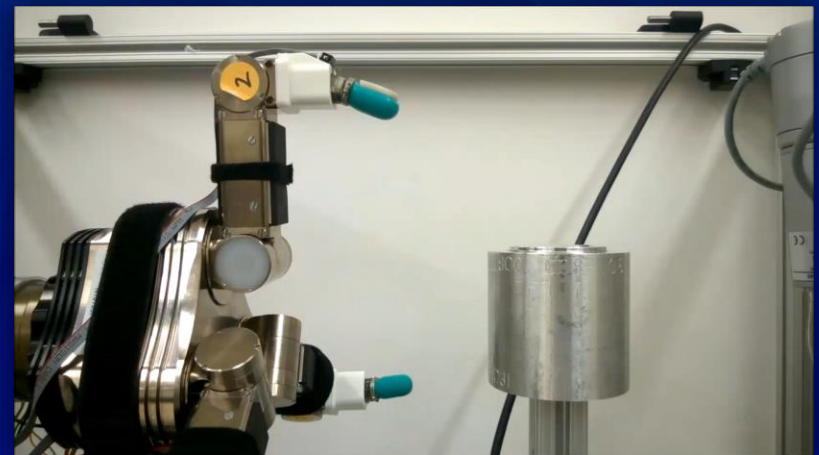
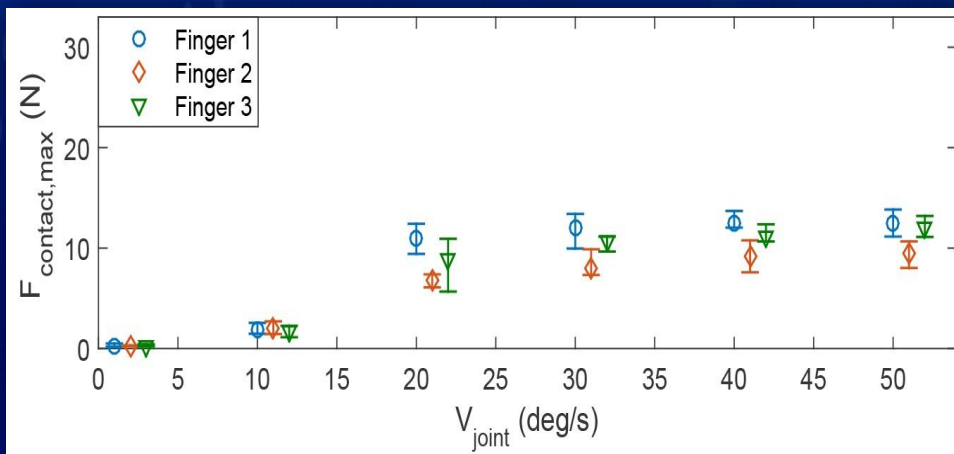
<i>Test Method</i>	<i>Measurement Instrument</i>																										
<p>Finger Strength</p> <p>Touch Sensitivity</p> <p>Finger Force Tracking</p> <p>Force Calibration</p>																											
<p>Grasp Strength</p> <p>Slip Resistance</p> <p>Grasp Efficiency</p> <p>Cycle Time</p>	 <table border="1" data-bbox="1271 743 1360 815"> <thead> <tr> <th>Item</th> <th>Quantity</th> </tr> </thead> <tbody> <tr> <td>2" PVC Pipe</td> <td>2</td> </tr> <tr> <td>Pipe Cone</td> <td>2</td> </tr> <tr> <td>Adapter_A</td> <td>4</td> </tr> <tr> <td>Load Cell</td> <td>3</td> </tr> <tr> <td>Drive Pin</td> <td>2</td> </tr> </tbody> </table> <table border="1" data-bbox="1682 772 1771 843"> <thead> <tr> <th>Item</th> <th>Quantity</th> </tr> </thead> <tbody> <tr> <td>2" PVC Pipe</td> <td>2</td> </tr> <tr> <td>Pipe Cone</td> <td>2</td> </tr> <tr> <td>Adapter_B</td> <td>4</td> </tr> <tr> <td>Force Sensor</td> <td>3</td> </tr> <tr> <td>Drive Pin</td> <td>2</td> </tr> <tr> <td>Adapter_C</td> <td>2</td> </tr> </tbody> </table>	Item	Quantity	2" PVC Pipe	2	Pipe Cone	2	Adapter_A	4	Load Cell	3	Drive Pin	2	Item	Quantity	2" PVC Pipe	2	Pipe Cone	2	Adapter_B	4	Force Sensor	3	Drive Pin	2	Adapter_C	2
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<http://www.nist.gov/el/isd/grasp.cfm>



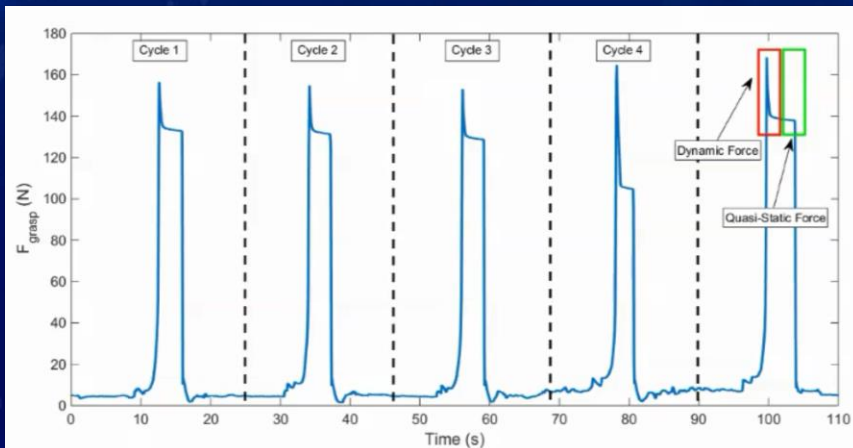
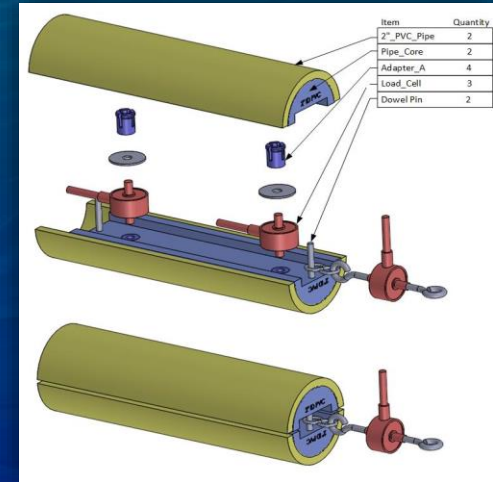
Touch Sensitivity

- What: A measure of the smallest, self-registered contact force exerted by a robotic finger on an object
- How: Measure maximum impact force at full finger extension at various joint speeds
- Why: Force dependent on speed, force maximized at full extension, minimize disturbance during object acquisition



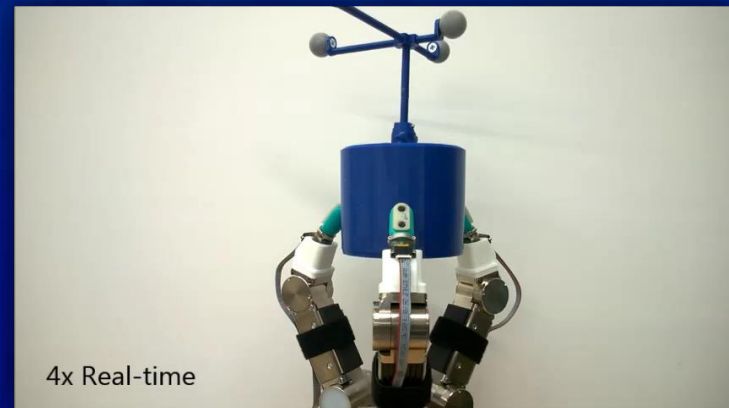
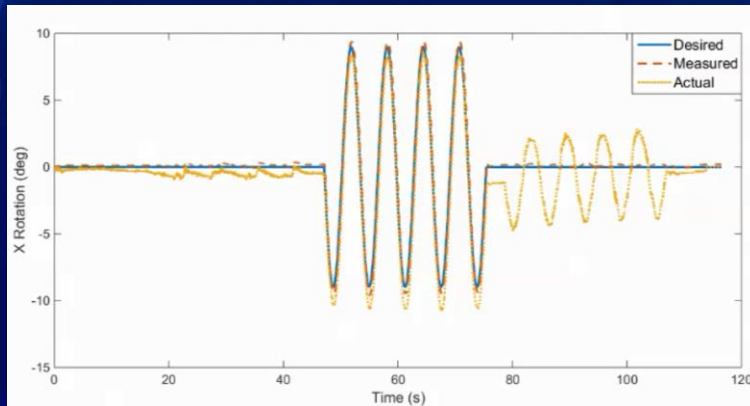
Grasp Strength

- What: The maximum force a robotic hand can impose on an object
- How: Artifact with intrinsic force sensing
- Why: Estimate payload



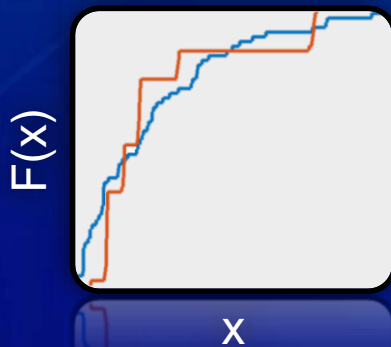
In-Hand Manipulation

- What: Measure of a robotic hand's ability to control the pose of an object
- How: MoCap system and objects with optical targets
- Why: Quantifies range-of-motion, frequency response, controller accuracy and repeatability, useful for functional-level tasks



Functional Performance Testing

- Quantify performance of a robotic system completing a task
- Tests target assembly operations: pick-place, insertion, fastening, meshing, wire harnessing, pulley belt routing
- Whole system-system testing
- Component testing



<https://www.nist.gov/programs-projects/performance-metrics-and-benchmarks-advance-state-robotic-assembly>



Test Design

- Assembly Operations
- Design for Assembly (DFA)
 - Human performance factor analysis
 - Parameterizes objects
 - Handling times
 - Insertion times
- Guide design space
- Direct human comparison

MANUAL INSERTION-ESTIMATED TIMES (s)

Key	After assembly no holding down required to maintain orientation and location (3)		Holding down required during subsequent processes to maintain orientation at location (3)					
	Easy to align and position during assembly (4)	Not easy to align or position during assembly (4)	Easy to align and position during assembly (4)	Not easy to align or position during assembly (4)				
	No resistance to insertion (5)	Resistance to insertion (5)	No resistance to insertion (5)	Resistance to insertion (5)				
	0	1	2	3	6	7	8	9
	1.5	2.5	2.5	3.5	5.5	6.5	6.5	7.5
	4	5	5	6	8	9	9	10
	5.5	6.5	6.5	7.5	9.5	10.5	10.5	11.5

Key	No screwing operation or plastic deformation immediately after insertion (long-term fits, etc.)		Plastic deformation immediately after insertion		Screw tightening immediately after insertion (5)					
	Easy to align and position with no resistance to insertion (5)	Not easy to align or position during assembly (5)	Plastic bending or section							
			Not easy to align or position during assembly (5)	Revisting or similar operation						
	0	1	2	3	4	5	6	7	8	9
	1.5	2.5	2.5	3.5	5.5	6.5	6.5	7.5	8.5	9.5
	4.5	7.5	6.5	7.5	8.5	9.5	10.5	11.5	8.5	10.5
	6	9	8	9	10	11	12	13	10	12

Key	Mechanical fastening processes (part(s) already in place but not secured immediately after insertion)		Non-mechanical fastening processes (part(s) already in place but not secured immediately after insertion)		Non-fastening processes					
	None or localized plastic deformation	Metalurgical processes	Metalurgical processes							
			Additional material required	Other processes						
	0	1	2	3	4	5	6	7	8	8
	4	7	5	12	7	8	12	12	9	12

Assembly process where all solid parts are in place	9	4	7	5	12	7	8	12	12	9	12
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Geoffrey Boothroyd, Peter Dewhurst, and Winston Knight. *Product Design for Manufacture and Assembly*. CRC press, 1994.



Performance Metrics

- Modes
 - Disassembly
 - Assembly
- Primary metrics
 - Speed → completion time
 - Reliability → probability of success
- Granularity
 - Per-part/operation
 - Whole board



Data Analytics

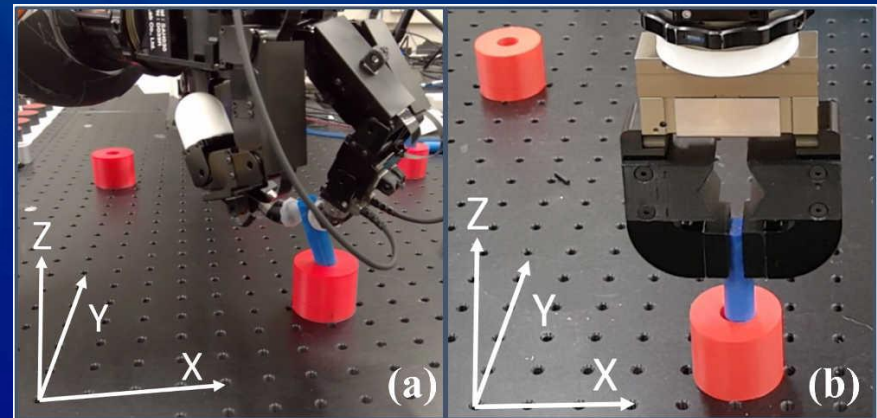
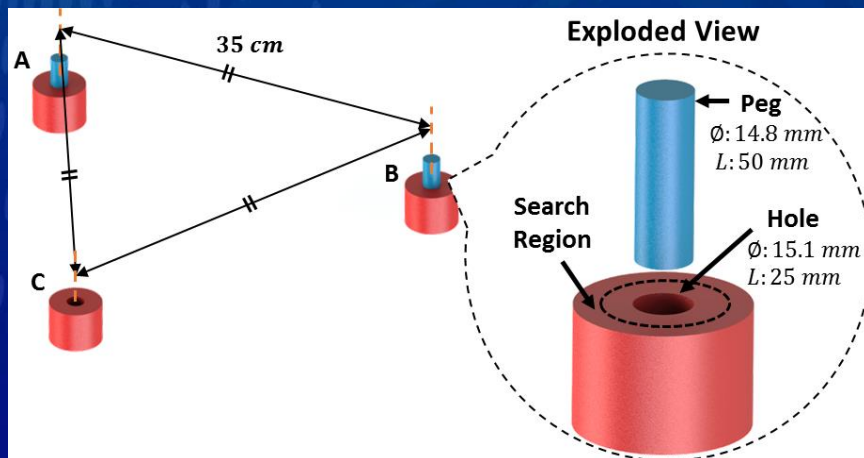
- Ordinal or Attribute Data
 - Detecting statistical difference in datasets – Kolmogorov-Conover
 - Check for differences as a whole or on a per rank basis
 - Primary performance measure: probability of success (PS)
- Continuous Data
 - Detecting statistical difference in datasets – Kolmogorov-Smirnov
 - Check for differences between sample means and variances
 - If no detectable differences, difference exists somewhere else (skewness, kurtosis)
- Matlab, R

<http://www.nist.gov/el/isd/software.cfm>



Example Peg-in-Hole

- Functional test method to measure the performance of robot systems at basic insertions
- Triangular design facilitates cyclical testing
- Peg-hole parameters, spacing based on human data



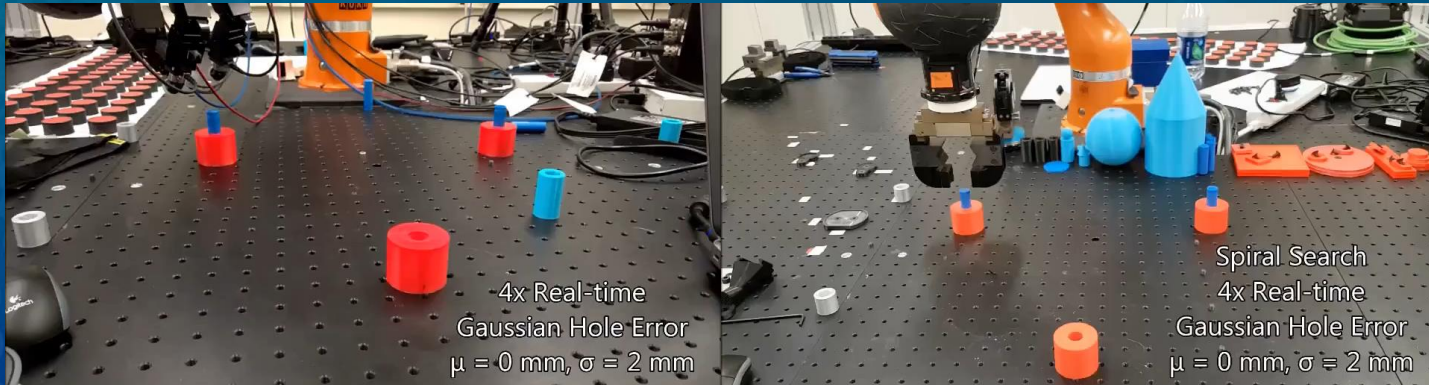
System 1

System 2

K. Van Wyk, M. Culleton, J. Falco, K. Kelley, "Comparative Peg-in-Hole Testing of a Force-based Manipulation Controlled Robotic Hand", *IEEE Transactions on Robotics*, 2018, DOI: 10.1109/TRO.2018.2791591.



Example Peg-in-Hole



System 1

System 2

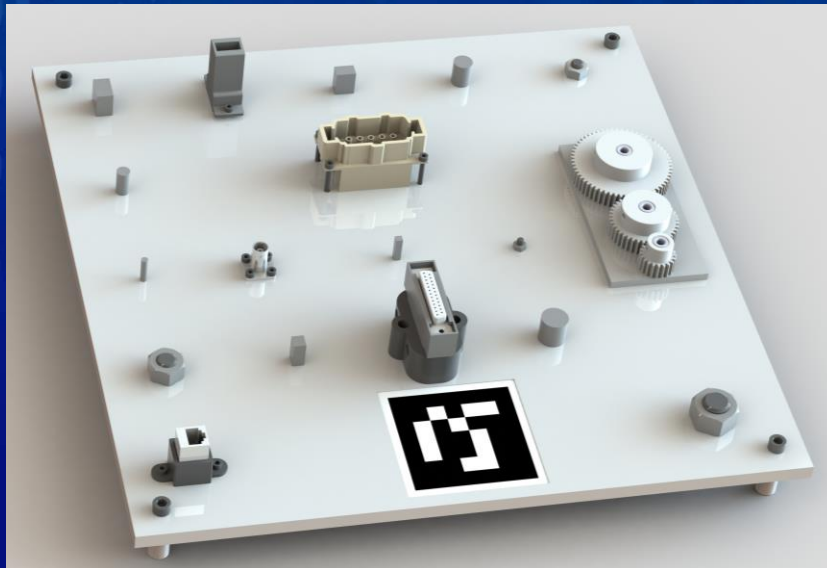
Robotic System	Correlation	KS	μ (s)	σ^2 (s)	PS (%)
System 1	0.01		18.31	107.3	87.6
System 2 <i>Spiral</i>	0.07	*	37.13*	399.6*	95.2
System 2 <i>Random</i>	-0.01	*	15.62	417.72	95.2
System 2 <i>Quasi-Random</i>	-0.11	*	8.2*	50.25*	95.2

*Indicates statistical significance in comparison with System 1.

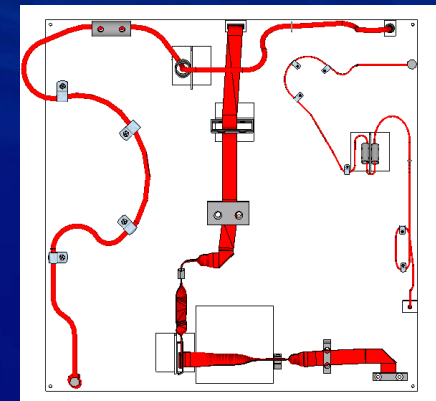
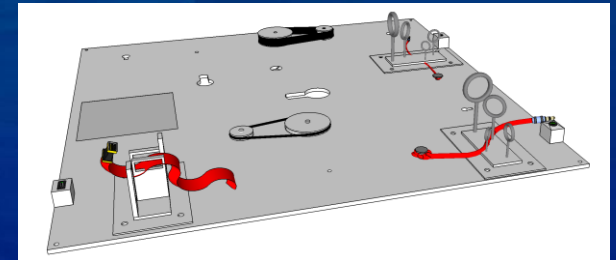


Task Boards

- Series of themed boards
- Each instance focuses on particular assembly facets
- Design with reference to DFA
- Low-cost, internationally replicable
- Real components



Task Board #1

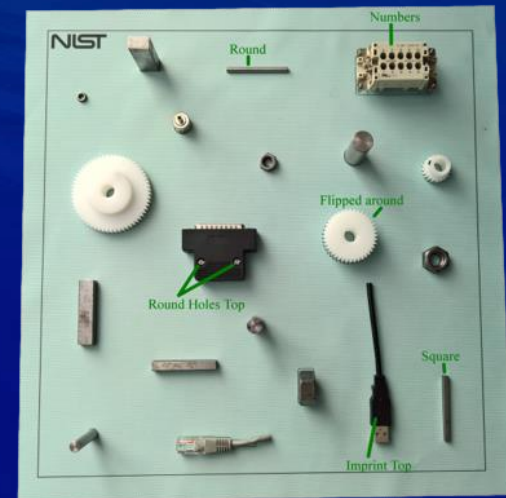
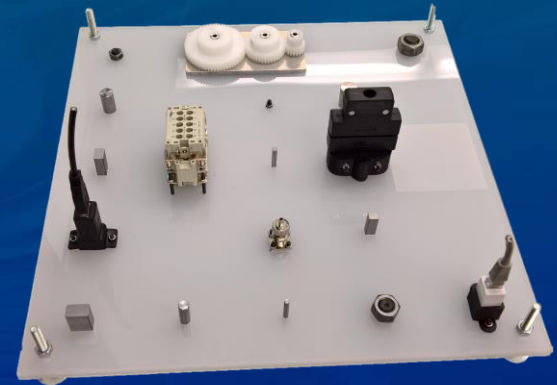


Concepts



Task Board #1

- Focuses simple insertions, nut threading, gear meshing, plug connections
- Design intersection
 - Spans DFA tables
 - Real components
 - Low-cost
 - Internationally replicable
- IROS 2017 competition
- Distribution



Documentation

- Grasping and Manipulation

<https://www.nist.gov/programs-projects/performance-metrics-and-benchmarks-advance-state-robotic-grasping>

- Robotic Assembly

<https://www.nist.gov/programs-projects/performance-metrics-and-benchmarks-advance-state-robotic-assembly>

- Working Publications – (*NIST Special Publication Format*):

Terminology document – Proposed Standard Terminology for Robotic Hands and Associated Performance Metrics

Test method document – Performance Metrics and Test Methods for Robotic Hands



Publications

- K. Van Wyk, M. Culleton, J. Falco, K. Kelley, “Comparative Peg-in-Hole Testing of a Force-based Manipulation Controlled Robotic Hand”, *IEEE Transactions on Robotics*, 2018, DOI: 10.1109/TRO.2018.2791591.
- J. Falco, K. Van Wyk, S. Liu, S. Carpin, “Robotic Grasping: Facilitating Replicable Performance Measures via Benchmarking and Standardized Methodologies”, *IEEE Robotics and Automation Magazine*, December 2015.
- Stefano Carpin, Shu Liu, Joe Falco, Karl Van Wyk, “Multi-Fingered Robotic Grasping: A Primer,” *arXiv* 1607.06620, online.
- Shneier, Michael, et al., “Measuring and Representing the Performance of Manufacturing Assembly Robots”, *NIST Interagency/Internal Report (NISTIR)-8090*, 2015.
- J. Falco, J. Marvel, R. Norcross, K. Van Wyk, “Benchmarking Robot Force Control Capabilities: Experimental Results”, *NIST IR 8097*, January, 2016.
- Falco, J., Marvel, J., Messina, E., A Roadmap to Progress Measurement Science in Robot Dexterity and Manipulation, *NISTIR 7993*, May 2014.
- Falco, Marvel, J., Messina, E., Dexterous Manipulation for Manufacturing Applications Workshop, *NISTIR 7940*, June 2013.



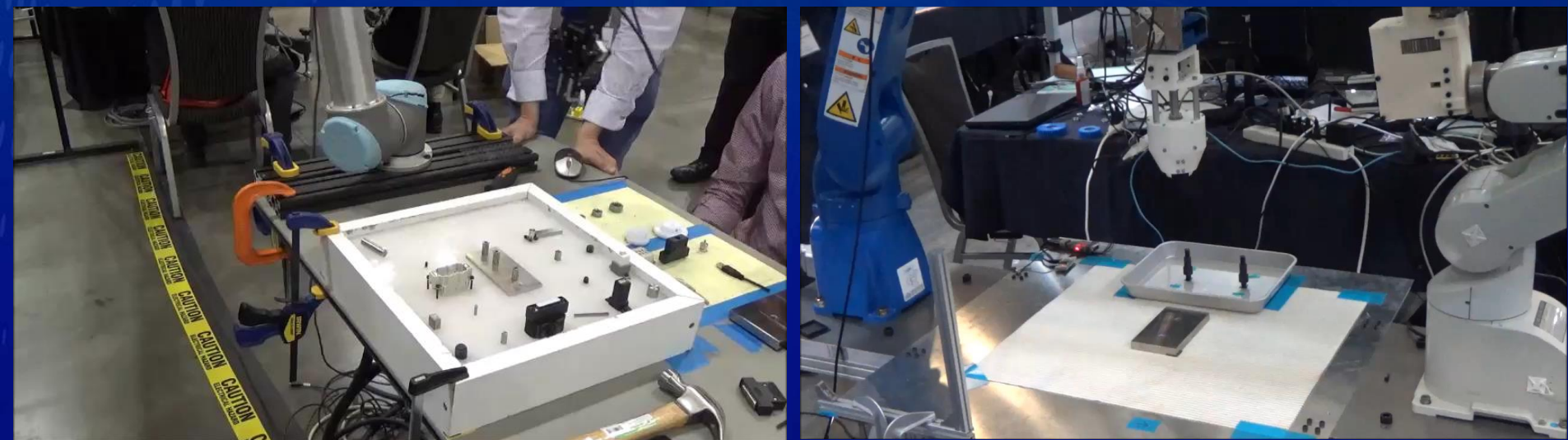
Competitions

- Mechanism for introducing benchmarking concepts to the research community in a competitive environment
- IROS 2016 household tasks with some manufacturing tasks introduced
- IROS 2017 dedicated manufacturing track
- World Robot Summit (WRS) Industrial Robotics 2018
- IROS 2019 - TBD
- WRS Industrial Robotics 2020
- European Robotics League



IROS 2017

- Robotic Grasping and Manipulation Competition: Manufacturing Track
<https://www.nist.gov/el/intelligent-systems-division-73500/robotic-grasping-and-manipulation-competition-manufacturing>



WRS 2018

- WRS 2018 World Robot Challenge (WRC) Industrial Robotics Category

<http://worldrobotsummit.org/en/wrc2018/industrial/>



Related Work

- Yale-CMU-Berkley (YCB) Object Benchmarks for Robotic Manipulation
- Advanced Robotics for Manufacturing (ARM) Institute
- Berkeley led open discussion of robot grasping benchmarks, protocols and metrics
- UMass Lowell – NERVE Center
- Other?



Formulation of Unified Effort

- Propose unifying efforts with regular meetings under IEEE RHGM TC
- Periodic NIST hosted online
 - What is an appropriate frequency?
 - Sub-focus areas/sub-working groups could meet independently
- Yearly face-to-face at an IEEE robotics conference
- Consensus on tests, metrics, analyses will facilitate benchmarking
- Working publications as precursors to standards efforts
- Competitions

