#### A New Regime of High Energy Density (HED) Physics: Coupling High-Rep-Rate Lasers with Cognitive Simulation

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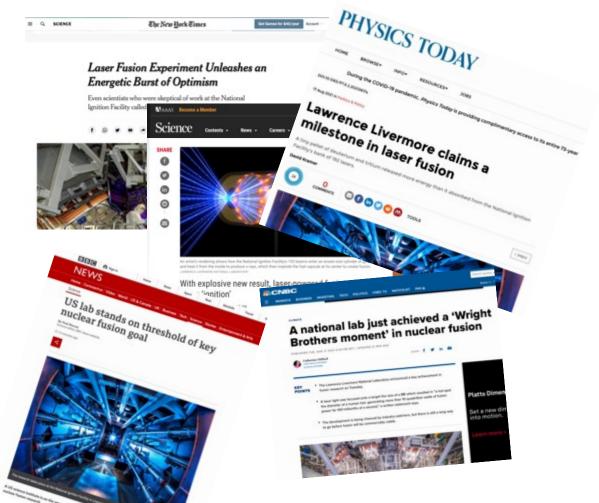


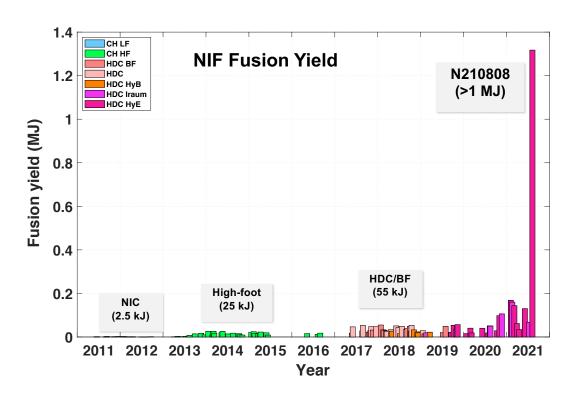
#### **Outline**

- High Energy Density (HED) experimental physics is starting to move towards high repetition rate
- Next-gen, high-rep-rate (HRR) laser facilities are already coming online around the world
  - HRR laser science is an opportunity to accelerate the rate of knowledge acquisition in HED
- An integrated HED experimental capability means feedback control loops within the laser, experiment, and simulation to simultaneously optimize the entire system in real-time
- Many emerging technologies are being leveraged to make this vision a reality
  - Suite of HRR diagnostics, automated analysis, and active feedback being developed
  - Novel cognitive simulation techniques will push the forefronts of scientific machine learning
  - Collaborations with scientists inside and outside the field
  - Setting the stage for Inertial Fusion Energy



#### We recently demonstrated more than 1.3 MJ of fusion yield on the NIF – a significant advance in ICF research





This shot was ~8x higher yield than the previous NIF record, and was the first NIF shot to achieve capsule gain (yield/absorbed energy) ~5+, and propagating burn!



# The National Ignition Facility (NIF) is the world's most energetic laser enabling the study of extreme HED conditions





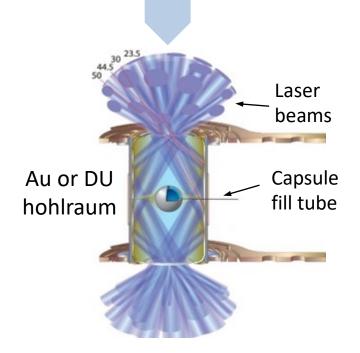




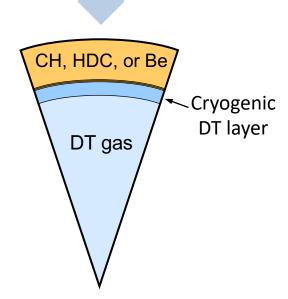


#### NIF uses a laser driven hohlraum to compress a fuel pellet to achieve the conditions for ignition

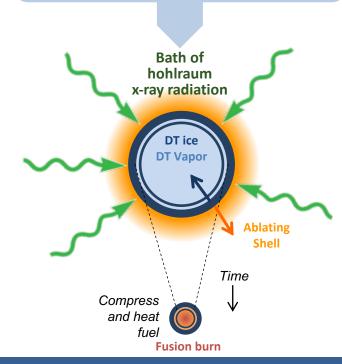
The hohlraum is a cylindrical cavity that serves as an x-ray "oven"



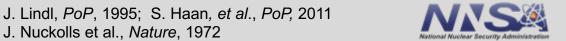
The fuel capsule consists of an ablator surrounding DT ice and gas

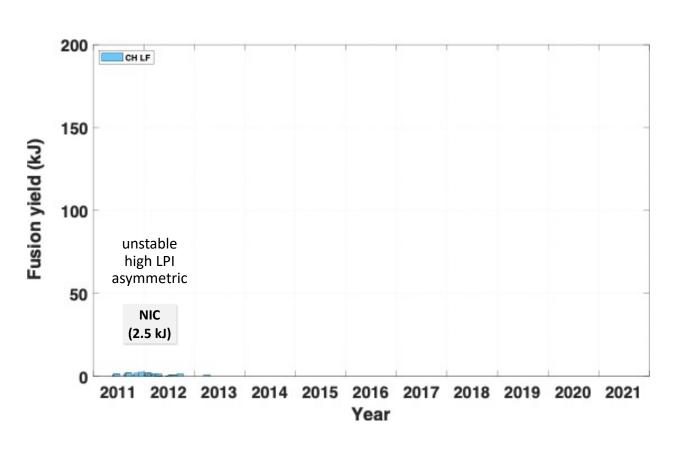


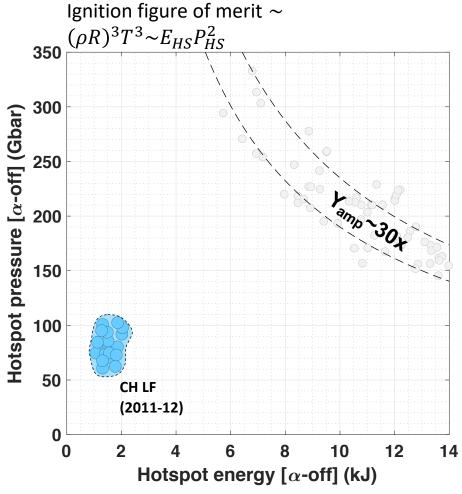
Turn 100 million atmospheres of pressure into 300 billion

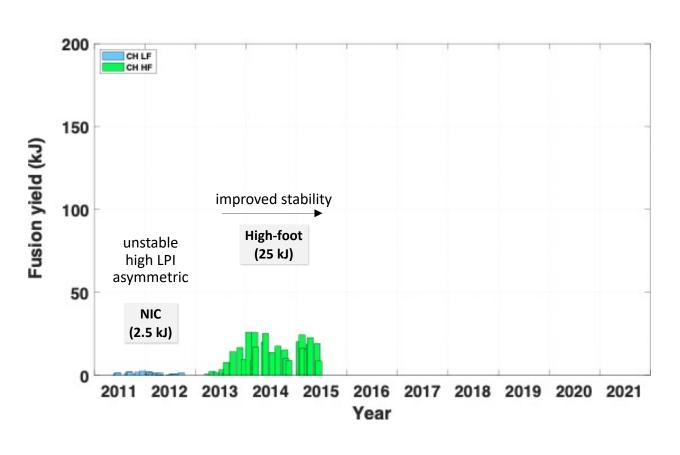


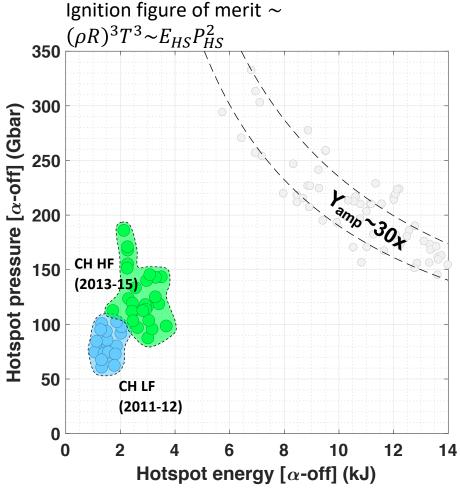
Achieving the conditions for ignition demands precise control of laser and target parameters for a high convergence implosion with low ablator fuel mix

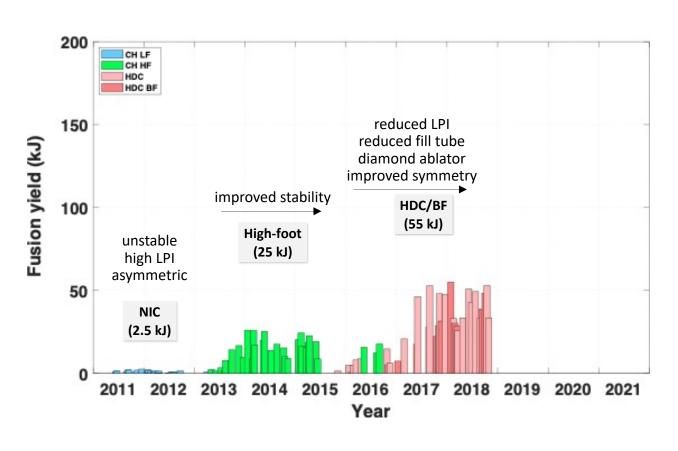


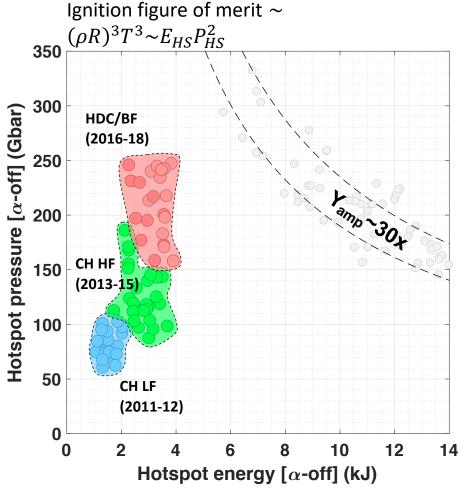


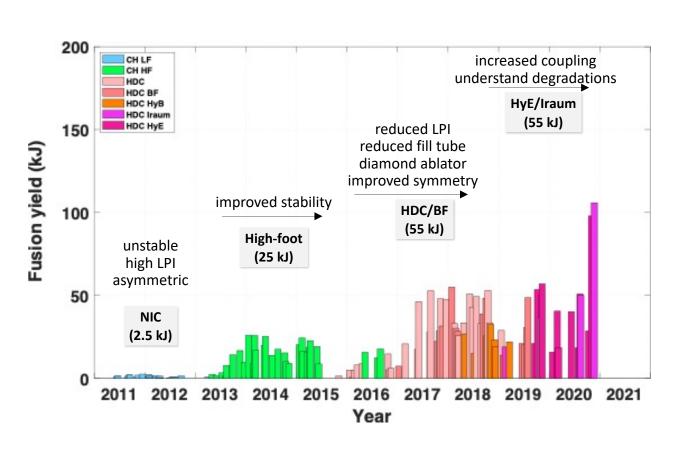


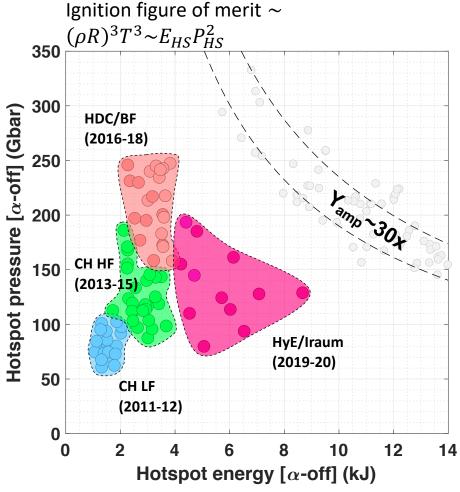


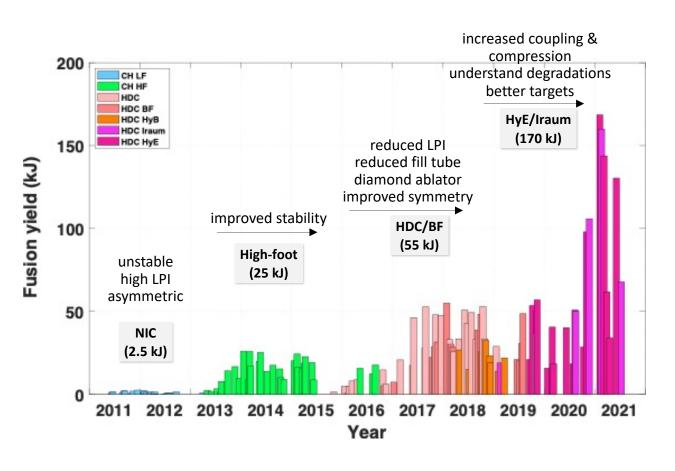


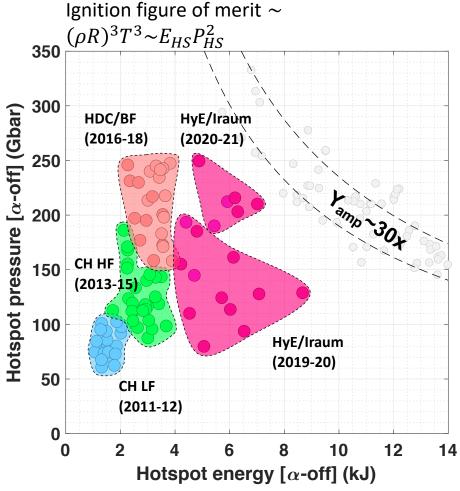


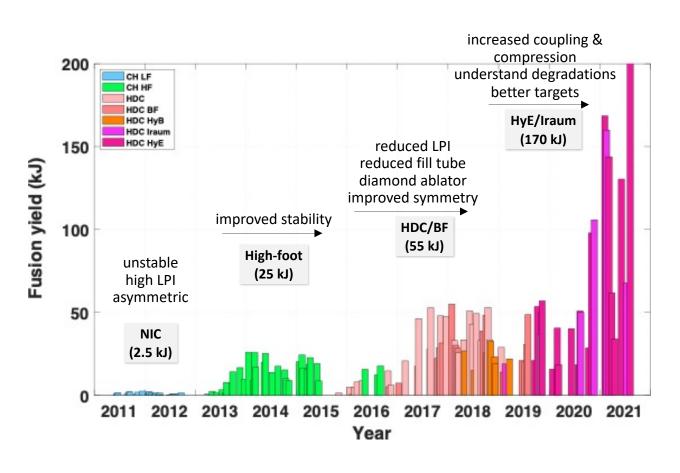


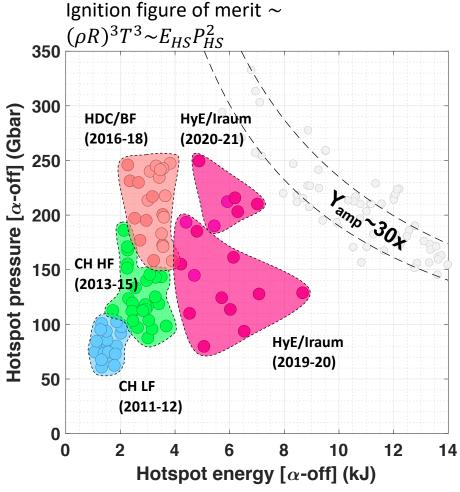


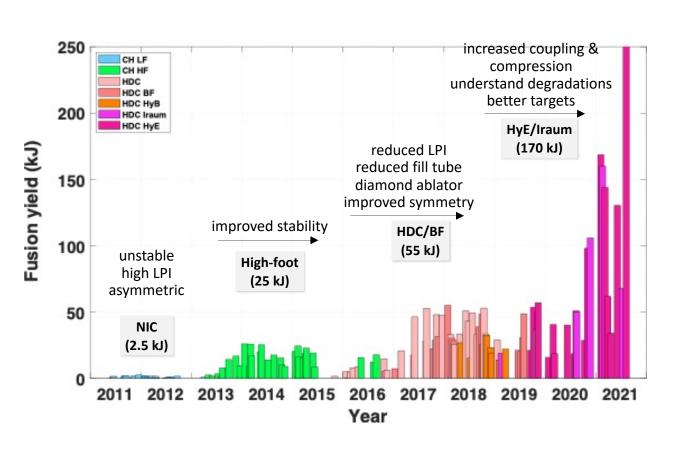


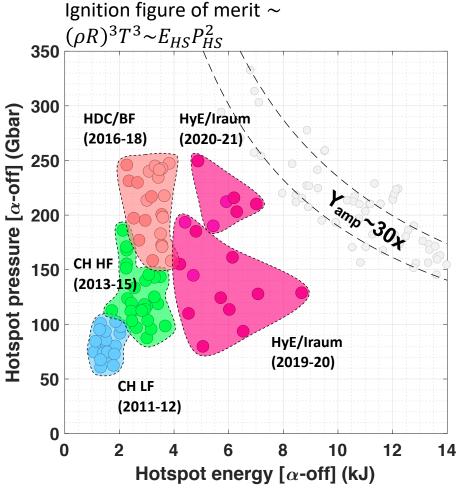


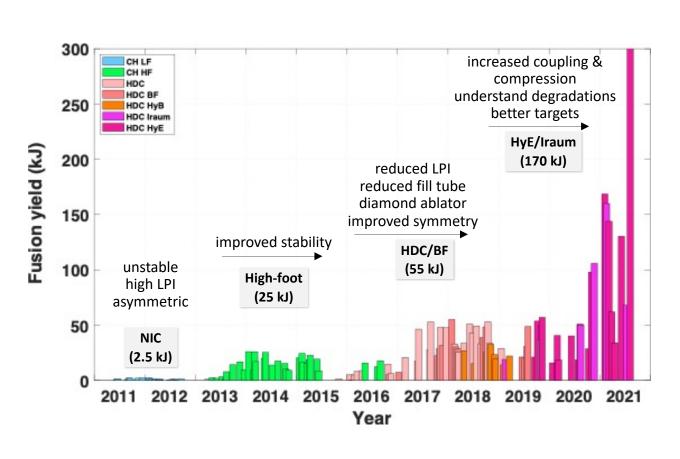


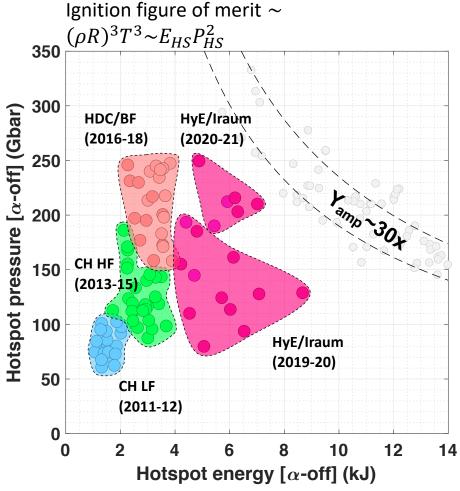


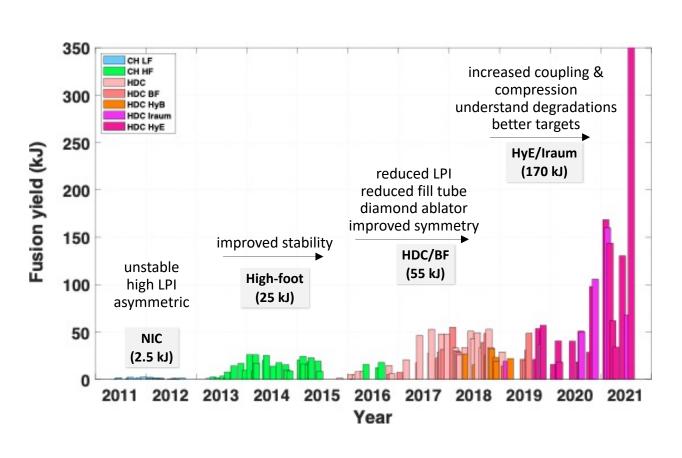


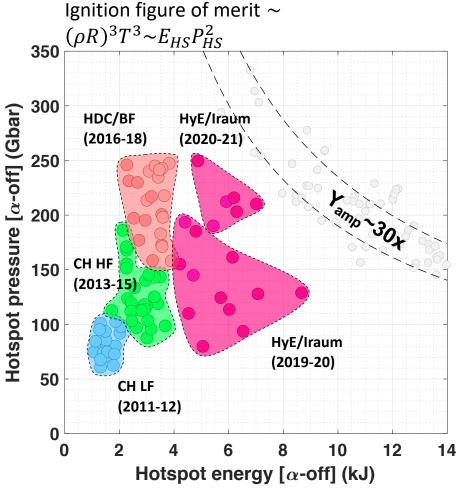


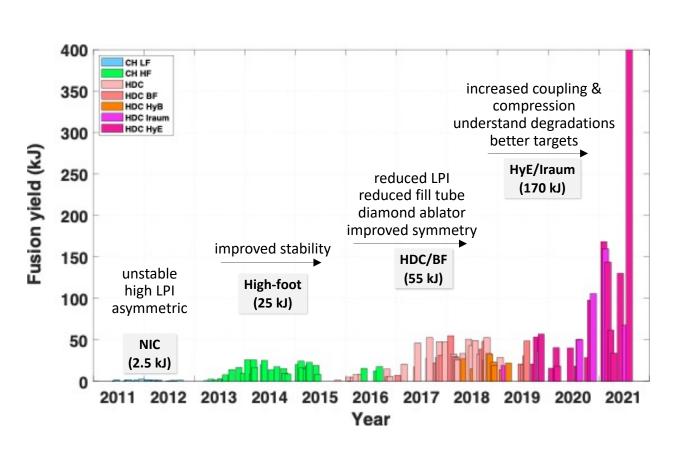


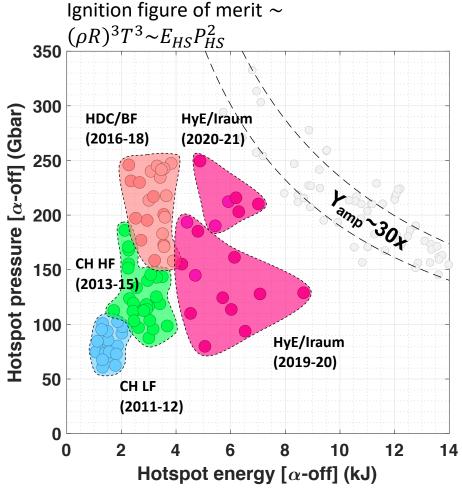


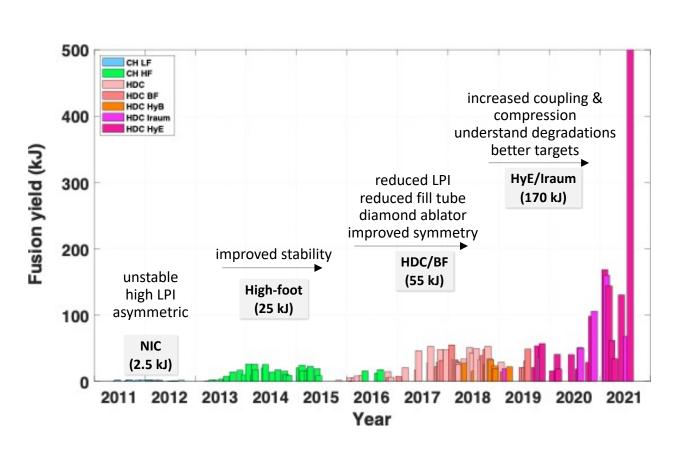


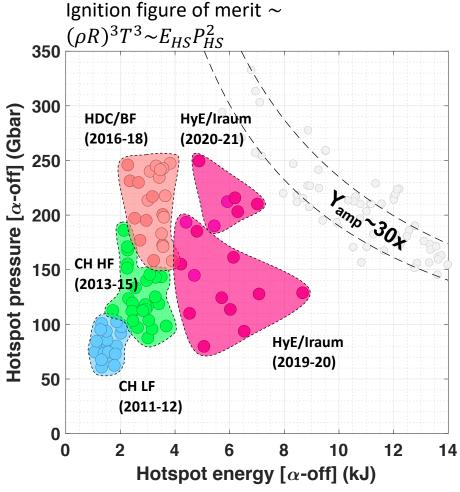


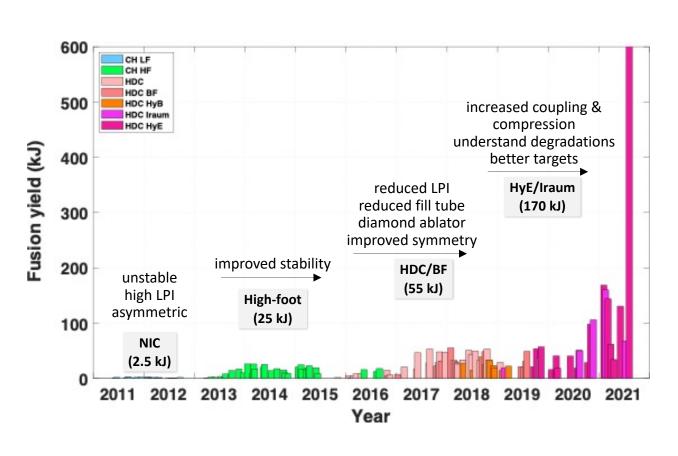


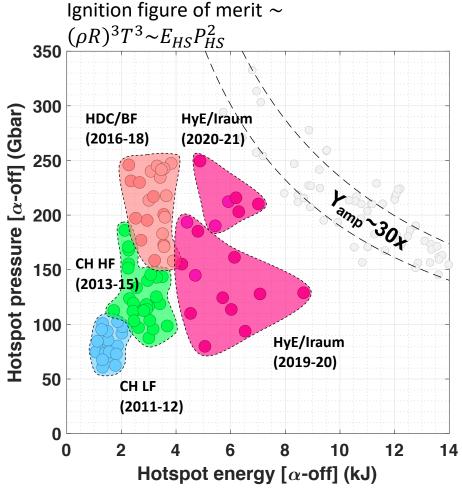


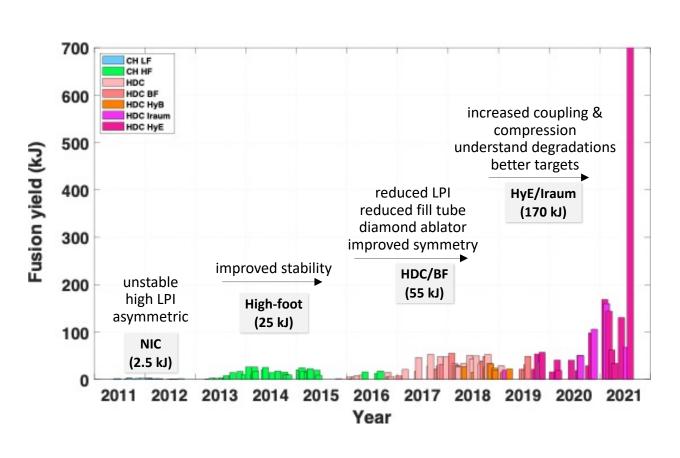


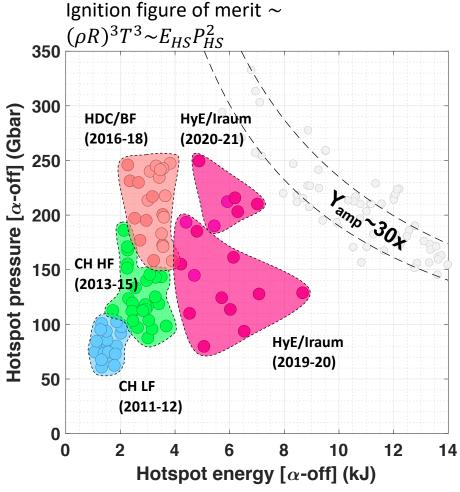


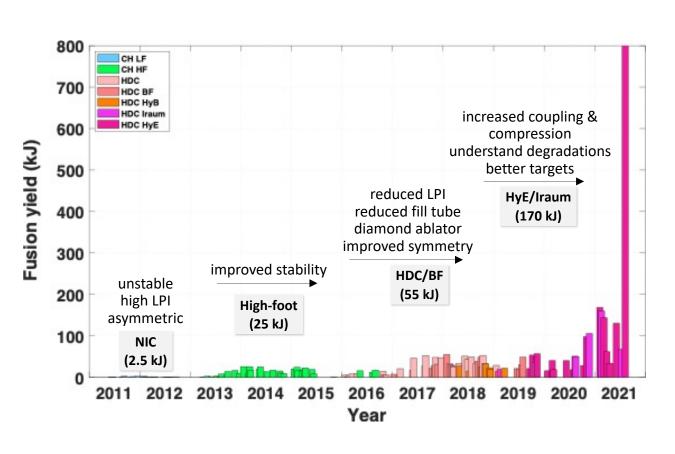


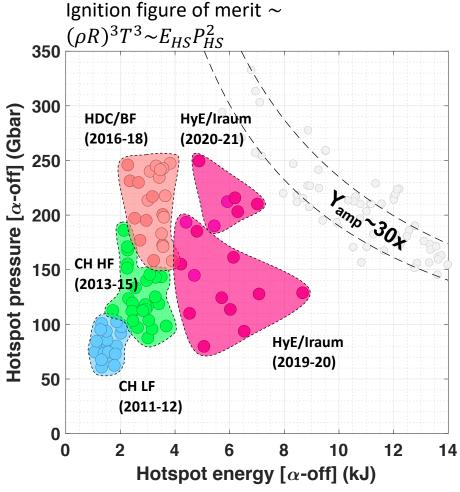


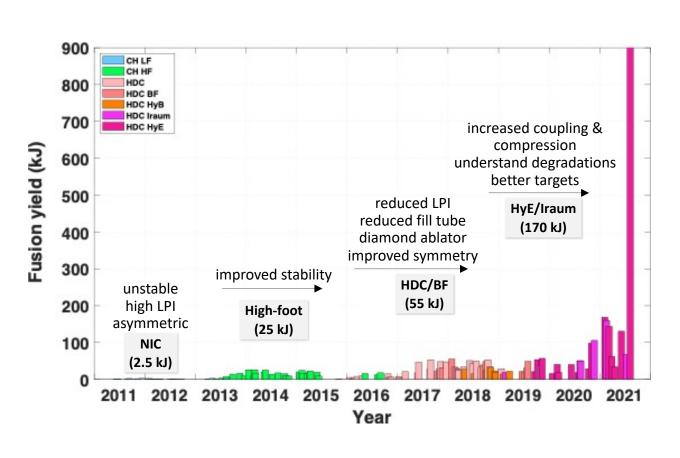


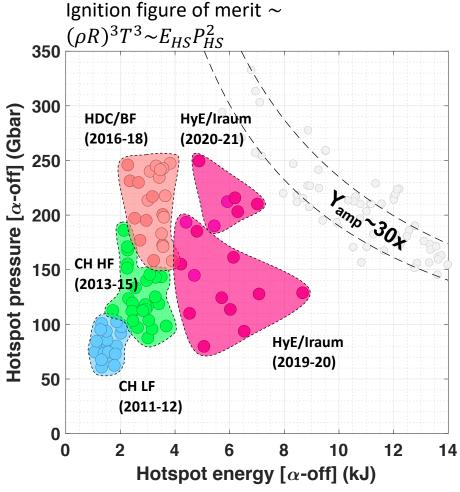


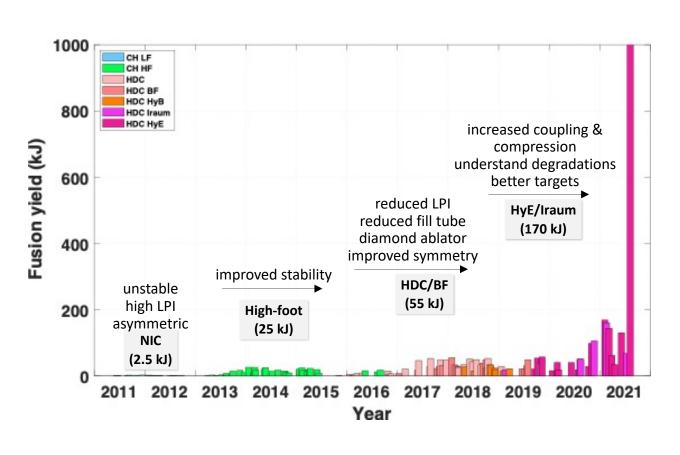


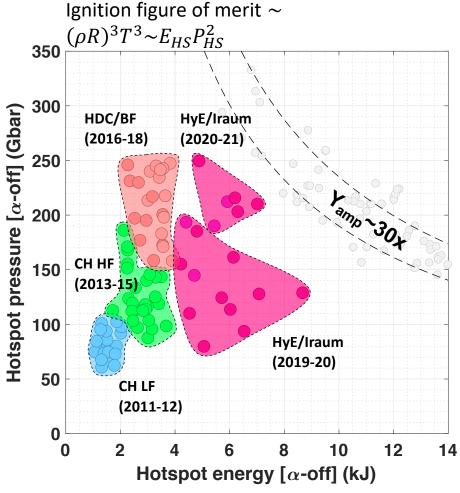


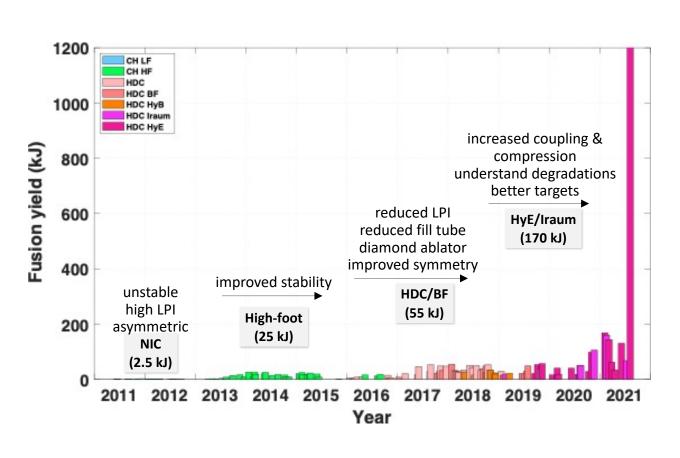


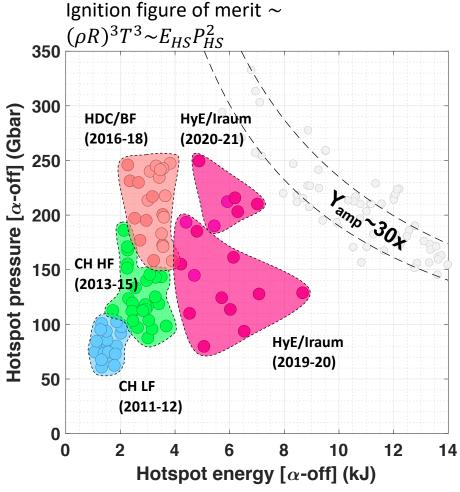


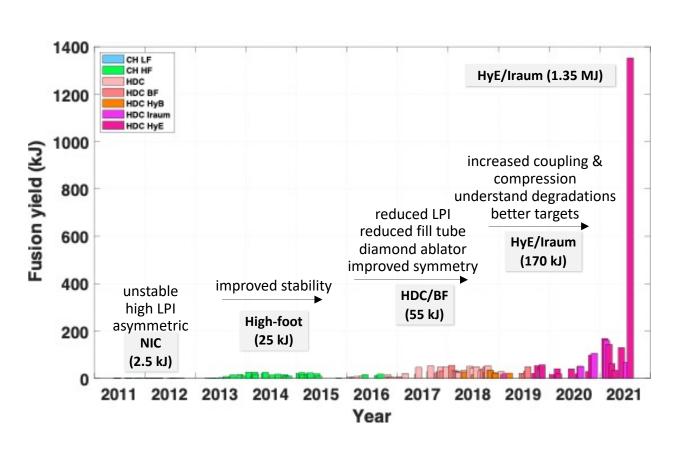


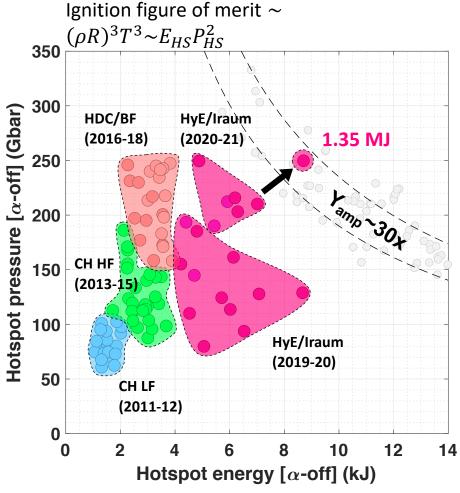


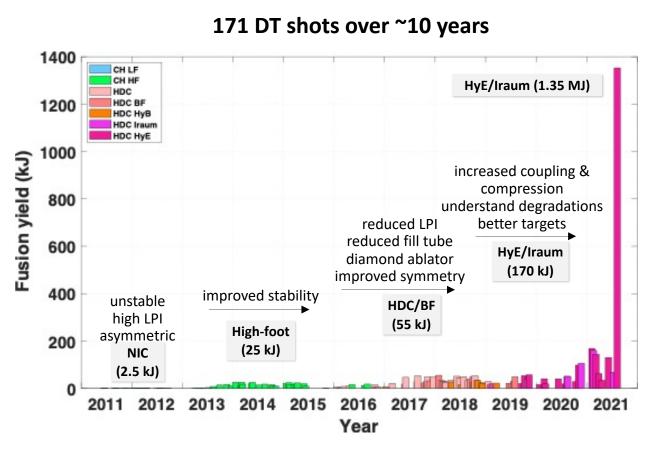


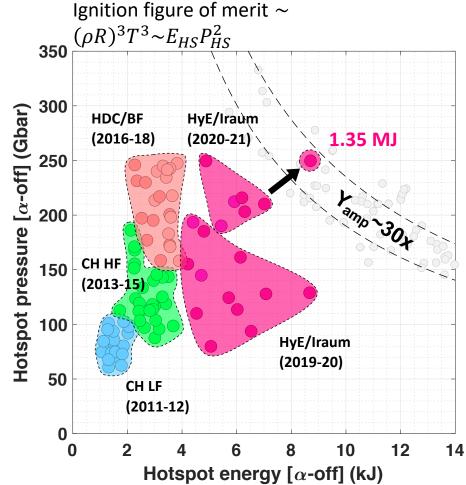








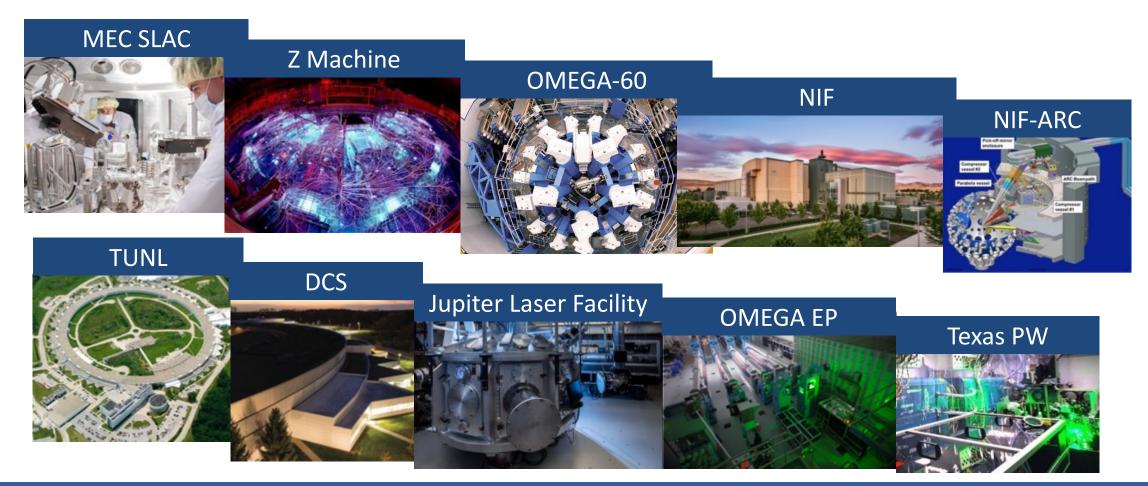




Built on a decade+ of research on the NIF, N210808 demonstrated burn propagation and a gain of 0.7

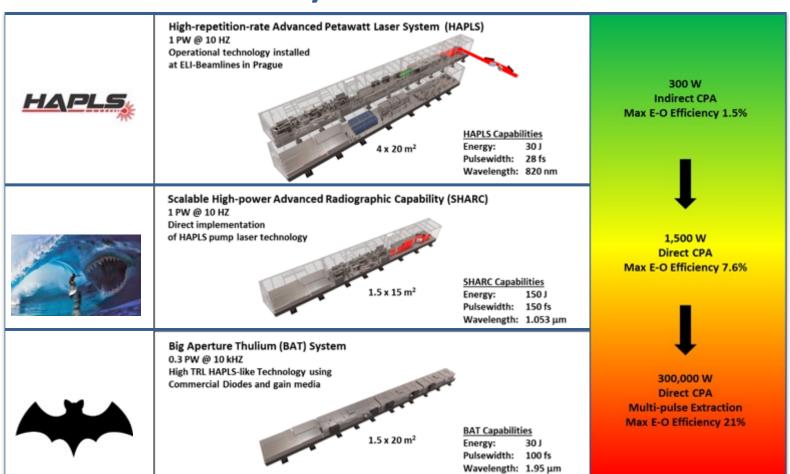


#### Currently we make use of a number of premier facilities around the US & the world to conduct forefront HED science



Until recently, much of HED has focused on large, energetic drivers that are mostly single-shot. However, next-gen lasers coming online are already rep-rated (>10 Hz)

#### Numerous rep-rate-capable laser facilities have recently come online, and more are on the way





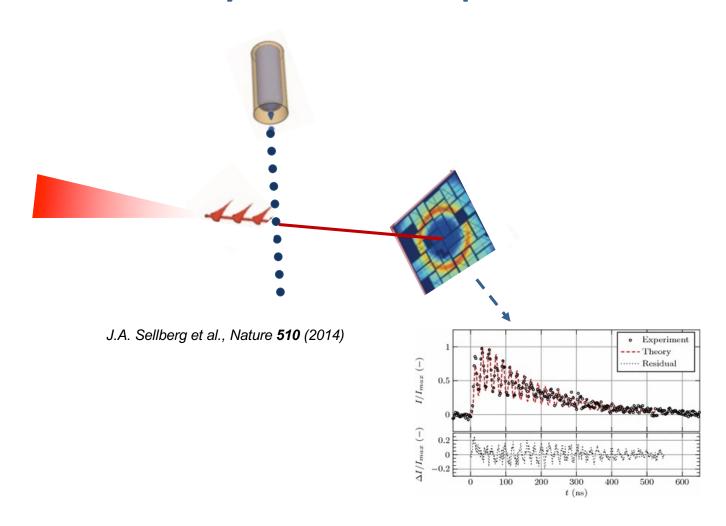


- ZEUS will be the highest power U.S. laser system to allow exploration of fundamental physics
  - 3 PW, shot/min
  - <0.5 PW, 4 Hz

The US leads in laser technology development; pursuing new and very innovative laser technologies which will enable additional science opportunities



### High-rep-rate laser science represents a radical paradigm shift in the way we do HED experiments

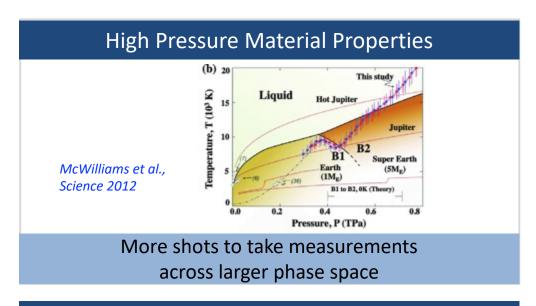


#### **High-rep-rate means:**

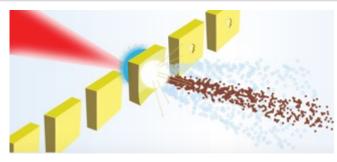
- More shots
- More data
- More statistics
- More precision
- More phase space
- More experiments
- More exploration
- Faster response to close mission need gaps

Scientific knowledge = (**Drive** + **Probe**) x Repetition rate x time

#### Many HED experiments will benefit from high throughput science enabled by high repetition rate lasers

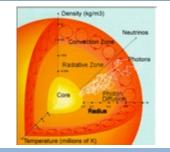


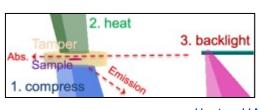
#### Secondary Source Particle + Radiation Beams



High brightness, tuned, reproducible beams for probing, heating, radiography

#### Opacities and Radiative Properties

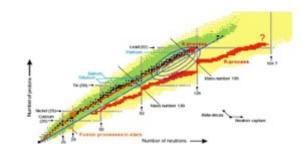




Heeter, LLNL

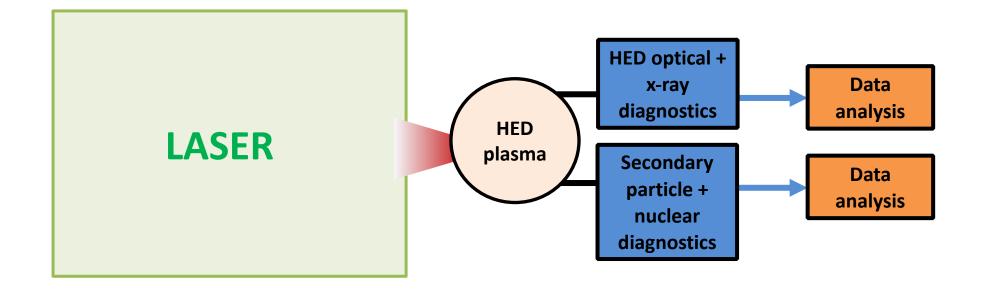
Increase measurement confidence through high statistics and constrain complex models used for stockpile assessments

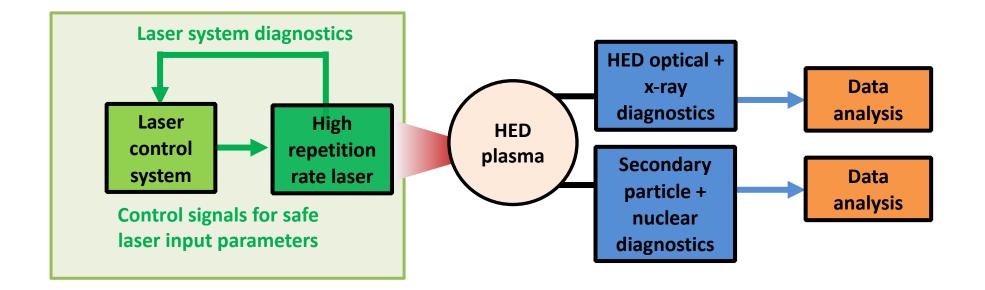
#### Plasma Nuclear Physics

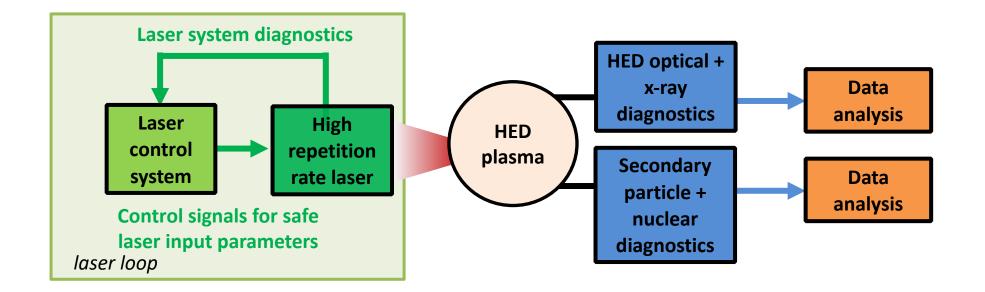


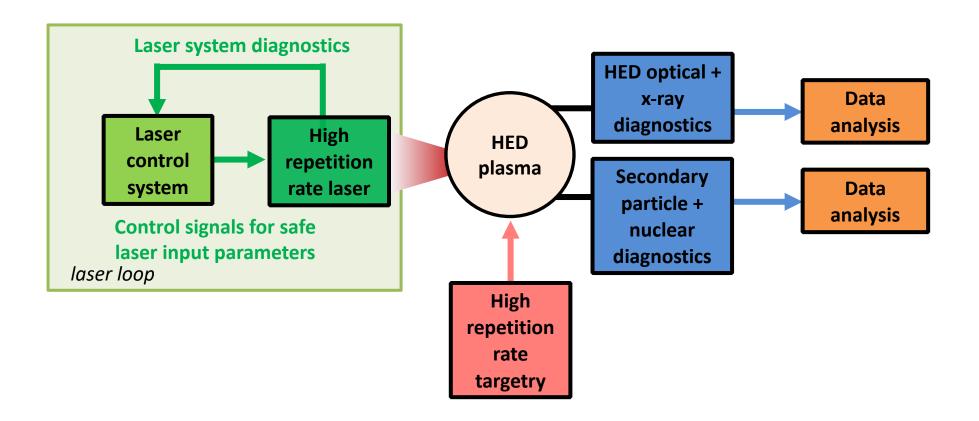
D. Habs et al., Appl Phys B 103: 471 (2011)

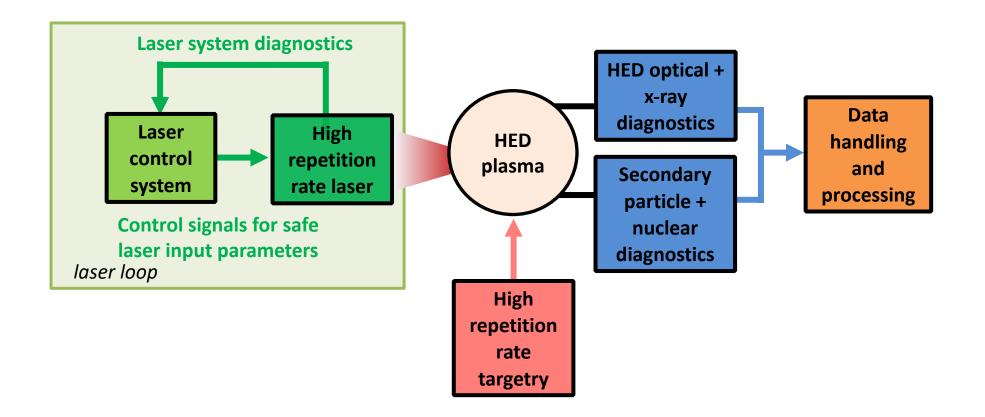
High average numbers to probe subtle, rare nuclear reactions

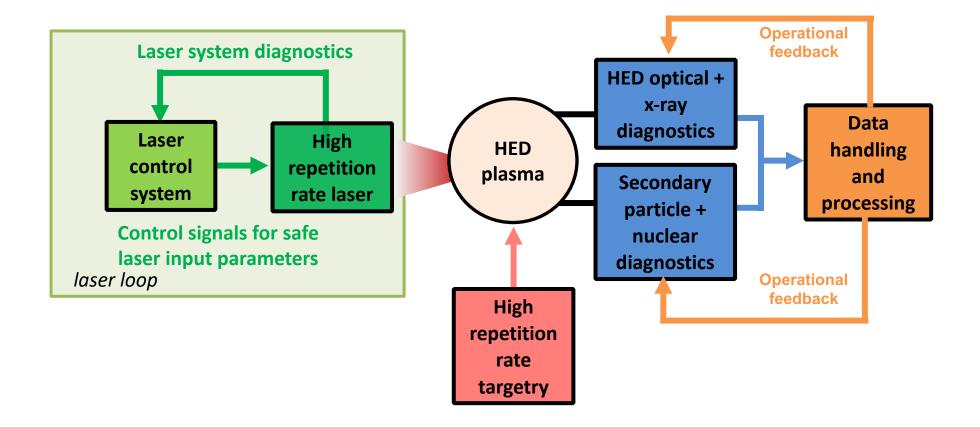


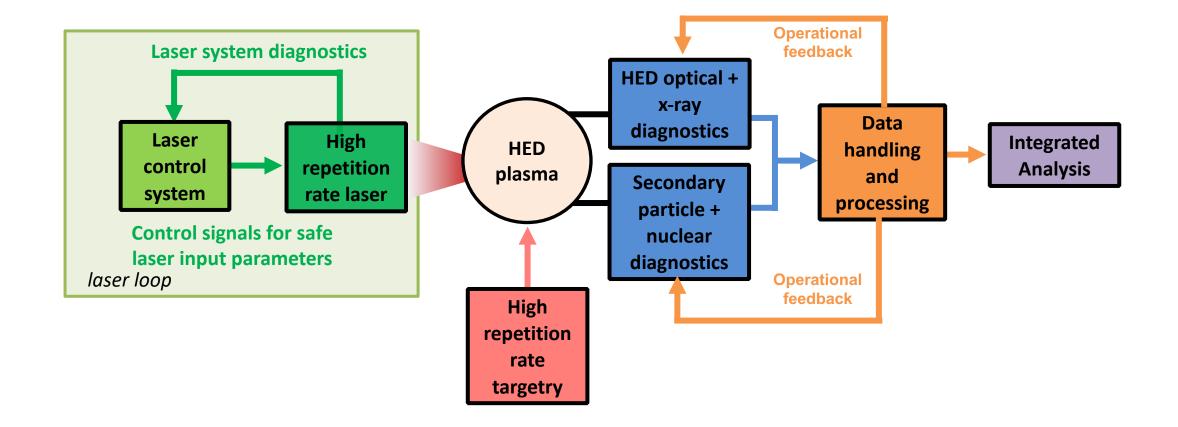


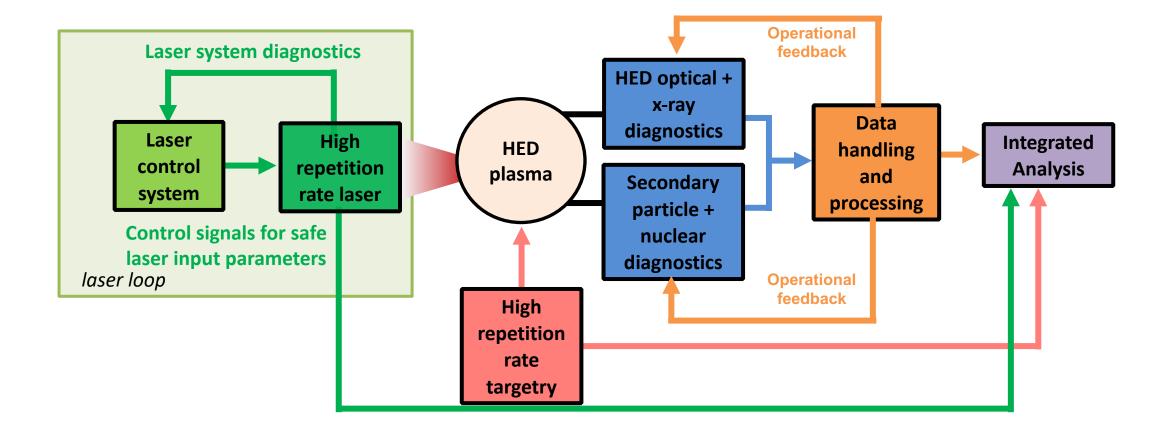


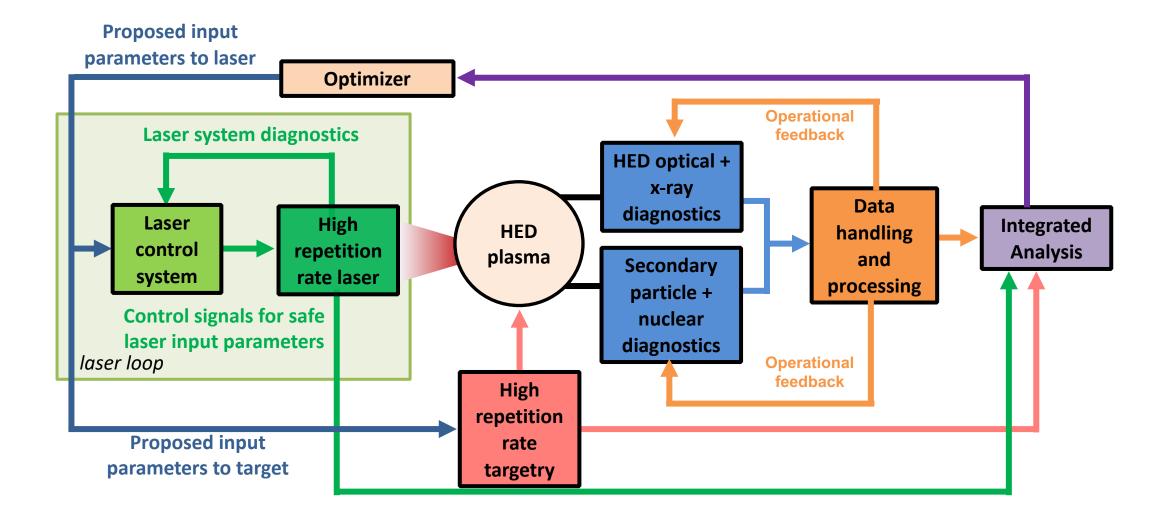


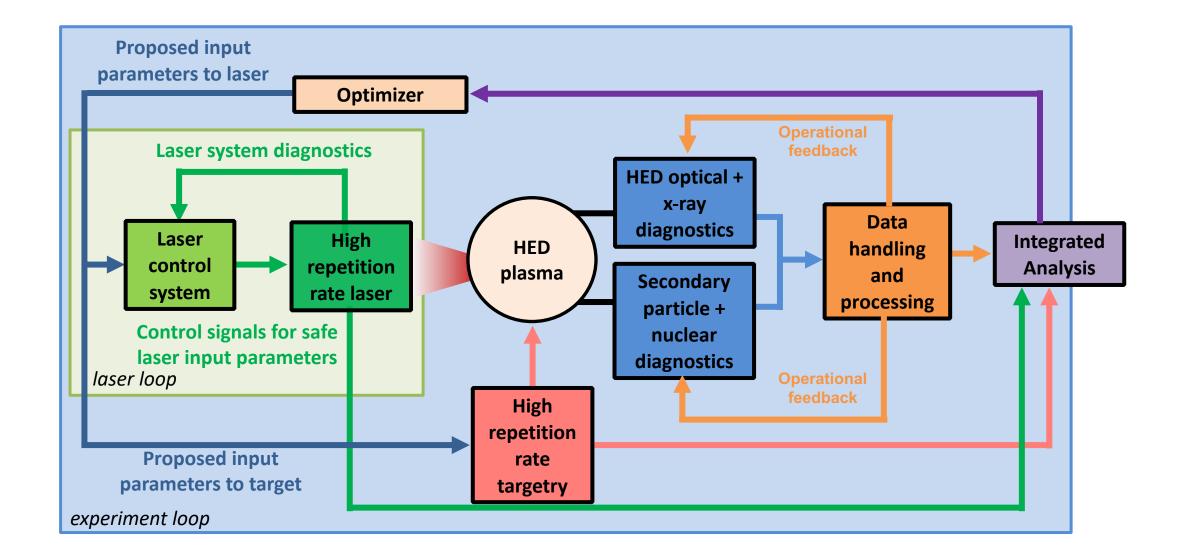


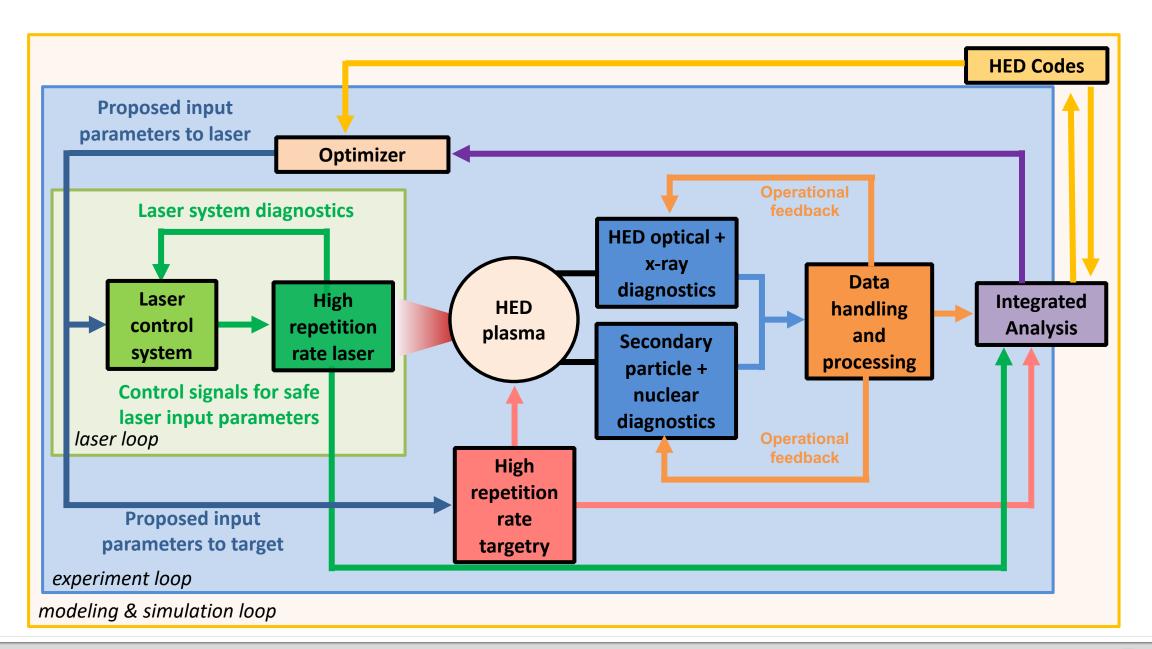




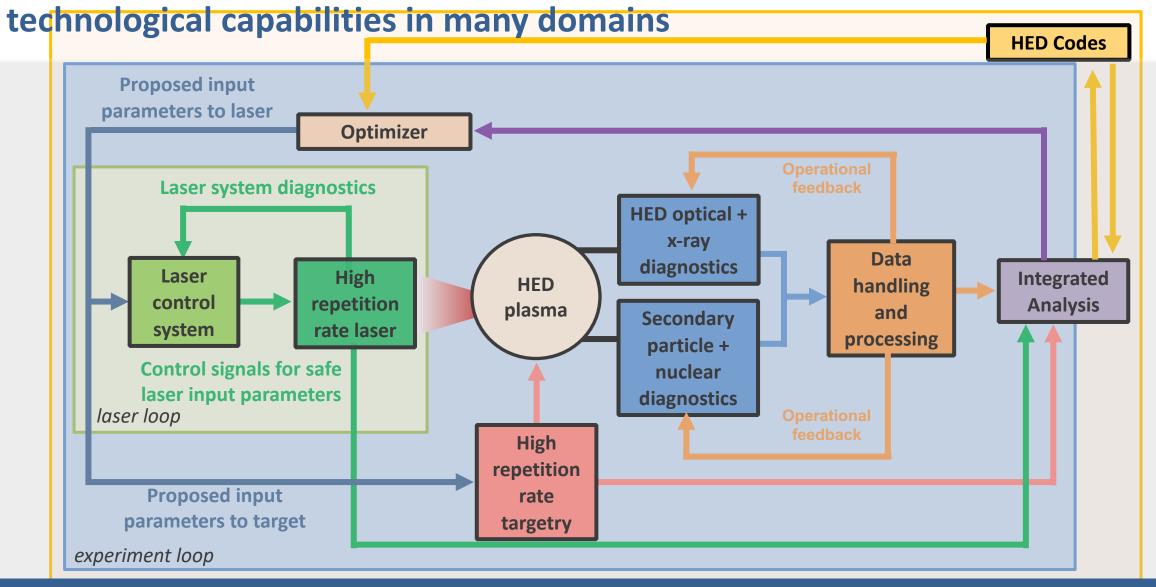








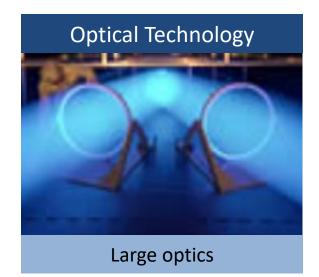
## High-rep-rate laser science means a fully integrated system that leverages

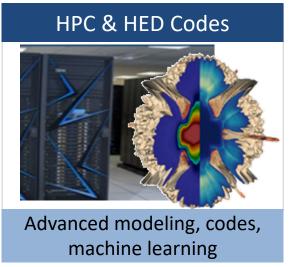


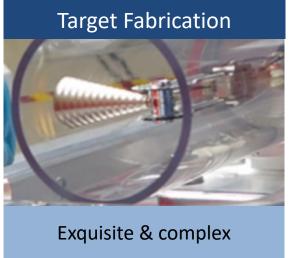
Challenges that stem from high-rep-rate experiments are starting to be addressed

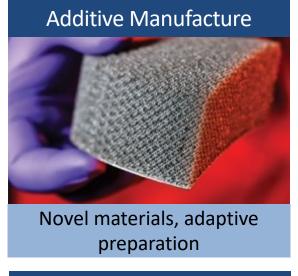


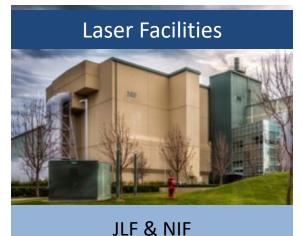
# A number of emerging technologies and capabilities can be leveraged to complement and enhance high-throughput HED experiments





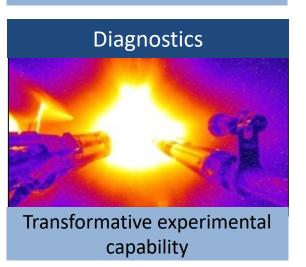








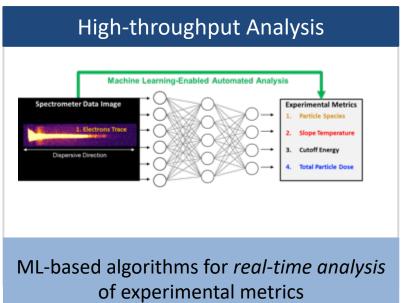
**Group Meetings** 

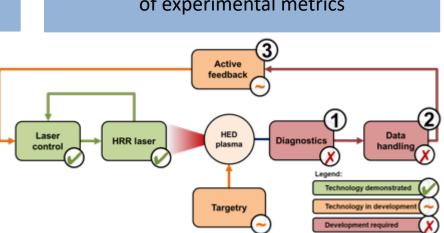


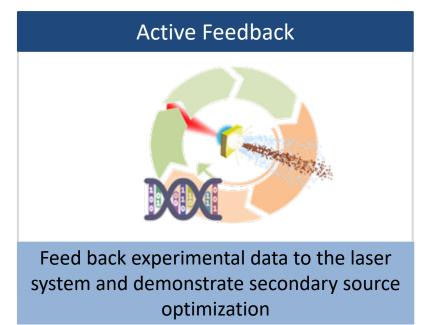


# Currently, the lack of appropriate diagnostics is a major bottleneck to making HRR HED science a reality

# Rep-rate-capable diagnostics for x-ray and particle beams that are robust to HED environments



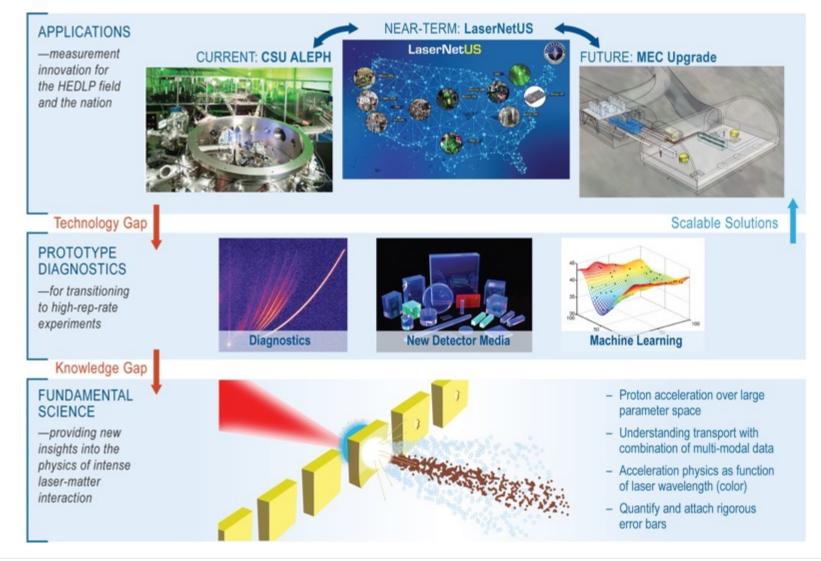




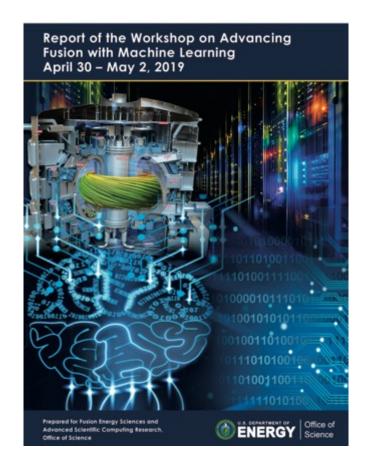
We are developing a suite of high repetition rate diagnostics coupled to high-throughput analysis and active feedback

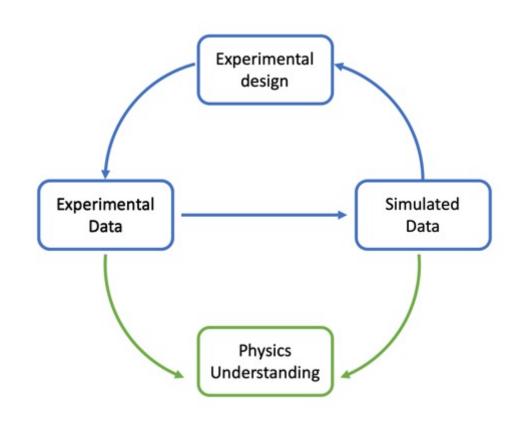


# These new HRR diagnostics will be deployed at CSU ALEPH (3.3 Hz) laser as a blueprint for scaling these capabilities to other LaserNetUS facilities



# The application of Cognitive Simulation to HED means an integrated modeling tool that both learns from and guides experiments

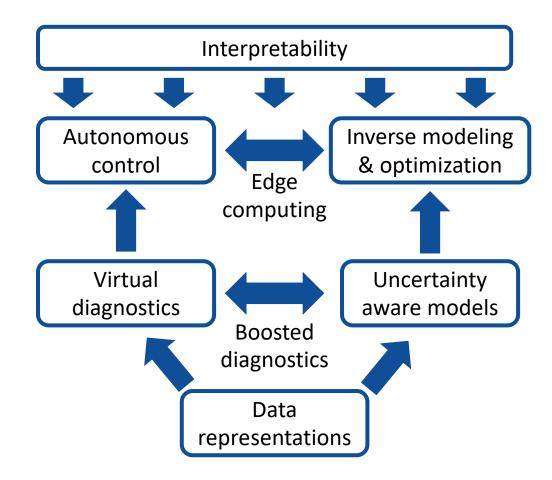




The revolution in computational power and machine learning techniques paves the way for new approaches in cognitive simulation

# HED is ripe for the application of novel machine learning and AI techniques

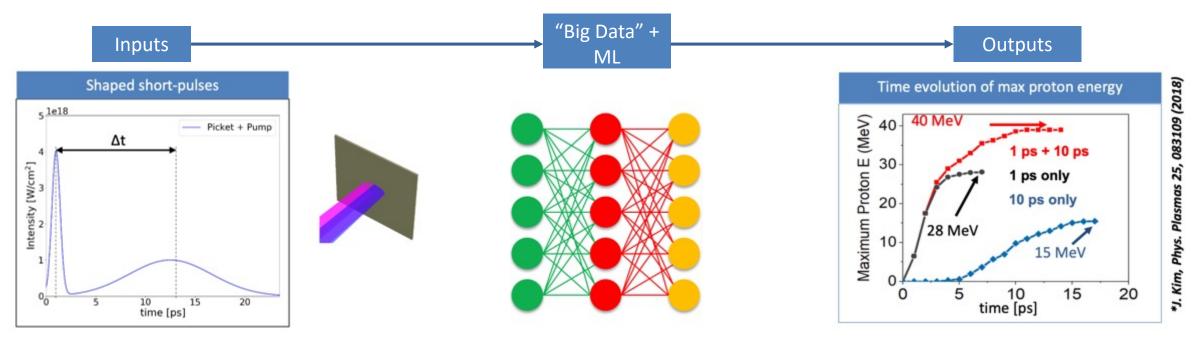
- Multimodal data representations:
  - Representation learning & holistic treatment of diagnostics
- Enhanced diagnostics:
  - Transfer learning & virtual diagnostics
- Modeling and optimization under uncertainties:
  - UQ for ML & reliable control loop
- Advanced architectures at the edge:
  - System integration & autonomous control
- On-the-fly model elevation
  - ML interpretability & accelerated insights by assimilating live experimental data



We are combining cutting-edge machine learning with operations to demonstrate a real-time feedback HRR integrated experimental and simulation HED capability



# We are exploring the manipulation of particle acceleration at fs-ps timescales for precise control over secondary source characteristics



- High data throughput modeling/experimental methods enable rapid exploration of massive parameter space
- Shaped short pulses could be used to enhance efficiency and fluence of particle & X-ray sources → probing/driving experiments and interesting fundamental physics

New techniques/tools to modulate laser pulse shapes with ps resolution + predictive capability + ML to explore huge phase space = very cool new fundamental science in laser-matter interaction, and direct applications

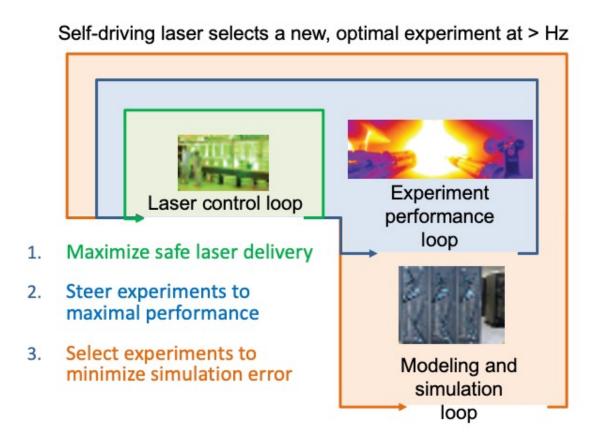


## The challenges are many, and we are looking to learn from others

- A commonly voiced concern is that AI will remove expert judgement. How do we mitigate this?
  - Domain-aware, interpretable, and robust scientific machine learning needed to support progress
  - Constant iterative cycle with tight coupling and validation between experiments and modeling
  - Work across-facilities + scale between them
- Some of the biggest challenges we see in applying AI solutions to this work:
  - Machine and data interfaces + Communication across different tools/control systems
  - Standardization
  - Data volume
  - Reliability/robustness
  - Distributed debugging
  - Data provenance

The goal is to develop a high-throughput capability that is demonstrated to rapidly respond to HED questions

## We are seeking to revolutionize the way that HED science data is captured and consumed



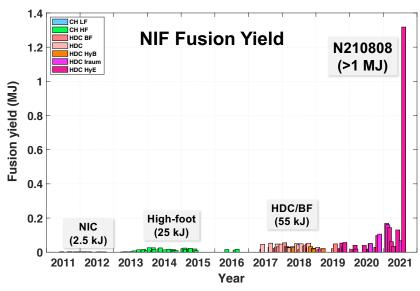
#### **Key Technical Opportunities**

- Ability to use all the data
- Quantify uncertainty in predictions
- Detect and remove bias between simulation and experiment
- Compute on time scales commensurate with experiment
- Optimization strategies to seek out desired performance

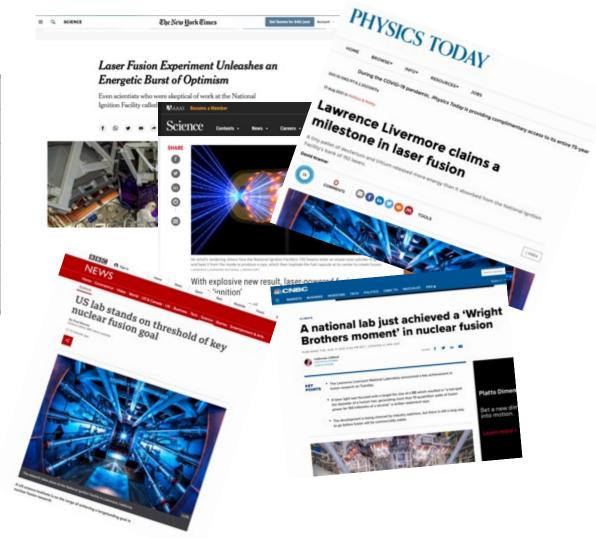
Tightly coupled advanced laser technology with state-of-the-art experiments and cognitive simulation leads to intelligent experimentation and faster learning



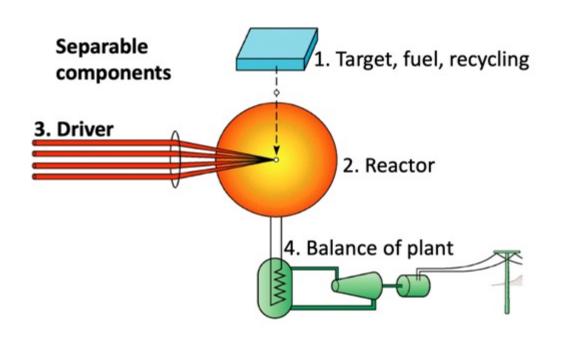
## The recent NIF results establish the basic scientific feasibility of laserdriven inertial fusion energy (IFE)



The excitement around the world (and immediate extrapolation to energy) was invigorating to see!



## Realizing IFE will require new advances in science and technology



Key components of an IFE system that need to be addressed:

- Drivers
- Target fabrication
- Target injection
- Engagement
- Chamber technologies
- Final optics
- Tritium processing
- Economics

Because IFE is a pulsed energy source, it is envisioned a power plant would require a reaction ~10 Hz

Both large-scale and smaller-scale facilities have a role to play: current ICF research on NIF offers the opportunity to experiment at "fusion scale," while we can push other technologies (high avg power lasers, rep rate technologies, AI, targets, etc) to advance the science and technology of IFE

# High repetition rate HED experimental physics coupled to cognitive simulation will accelerate the rate of knowledge acquisition

- ICF experiments on the NIF are demonstrating very exciting progress
  - The scale and complexity of these experiments means progress is slow
- Next-gen, high-rep-rate (HRR) laser facilities will provide a different paradigm for HED experiments
- An integrated HED experimental capability means feedback control loops within the laser, experiment, and simulation to simultaneously optimize the entire system in real-time
- Many emerging technologies are being leveraged to make this vision a reality
  - Suite of HRR diagnostics, automated analysis, and active feedback being developed
  - Novel cognitive simulation techniques will push the forefronts of scientific machine learning
  - Building on the recent great NIF results, we are pushing the technologies for IFE, with HRR playing a role

#### This is a very exciting time for fusion and plasma research!

## LLNL postdoc program

#### Professional development

- Research that is complementary to funded project
- Maintain university collaborations
- Travel and professional training activities

#### LLNL culture

- Networking and team building
- Postdocs allowed to PI grants
- Publishing is a priority

#### Emphasis on mentoring

 One-on-one meetings to help postdocs succeed













## Short Pulse HEDP- Postdoctoral Experimental Physicist





#### **Company Description**

#### Join us and make YOUR mark on the World!

Are you interested in joining some of the brightest talent in the world to strengthen the United States' security? Come join Lawrence Livermore National Laboratory (LLNL) where our employees apply their expertise to create solutions for BIG ideas that make our world a better place.

We are looking for individuals that demonstrate an understanding of working in partnership with team peers, who engage, advocate, and contribute to building an inclusive culture, and provide expertise to solve challenging problems.

#### Job Description

We have an opening for a **Postdoctoral Experimental Physicist-Short Pulse HEDP** to execute experiments, develop unique diagnostics and diagnostic techniques, and lead frontier research in the area of high-intensity short-pulse laser science and applications and high-energy-density plasmas (HEDP). Areas of active research are high-intensity laser interactions with matter, laser-driven secondary sources, plasma optics, future light sources, and the development of high-repetition-rate diagnostics, targetry, modeling, and machine learning. This position is in the HED (high energy density) S&T (science and technology) organization in the Short-Pulse Laser Science & Applications Group in the National Ignition Facility and Photon Science Principal

Contact ma8@llnl.gov

https://www.llnl. gov/join-ourteam/careers

Reference # REF2644R

## In 2019, more than 1,150 students engaged in research at LLNL that focused on our core mission areas

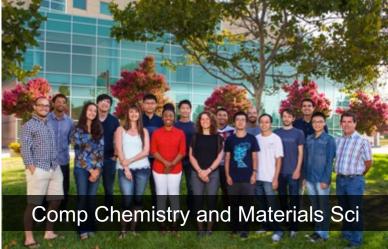
- Nuclear Forensics Summer Program
- Data Science Summer Institute
- Computational Chemistry and Materials
  Science Summer School
- Computation Scholar Program

- HED Science and WCI Summer Programs
- DHS Global Security Summer Program
- DOE Science Undergraduate Laboratory Internship (SULI)
- Science undergraduate lab interns









For more information email kersting1@Ilnl.gov or visit https://st.llnl.gov/opportunities/student-opportunities

#### **New pilot Faculty Mini-Sabbatical Program**

- Designed to increase the number of faculty—staff research partnerships and strengthen our S&T by bringing in top academic talent
  - Faculty hired 1-3 months
  - Hosted by staff scientist and approved by committee
  - Paid a monthly salary and travel costs
  - Faculty learns new research capabilities and gains greater knowledge set
- LLNL has an existing sabbatical program for staff
  - Salary paid for up to 1 year to visit universities





For more information visit https://st.llnl.gov/about-us/university-relations/faculty-sabbatical-program

