# How To Organize A Challenge

Jake Albrecht Director of Challenges and Benchmarking, Sage Bionetworks jake.albrecht@sagebionetworks.org



# Why Organize a Challenge?

- A. Identify novel methods
- B. Analyze novel data
- C. Build community around an event
- D. Provide an opportunity for learning
- E. All of the above!

# Organizing a Challenge can be... challenging

Most importantly, Challenge organization requires preparation

Risks exist in many areas of Challenge execution:

Data Question Metrics Engagement Infrastructure Post Challenge Analysis

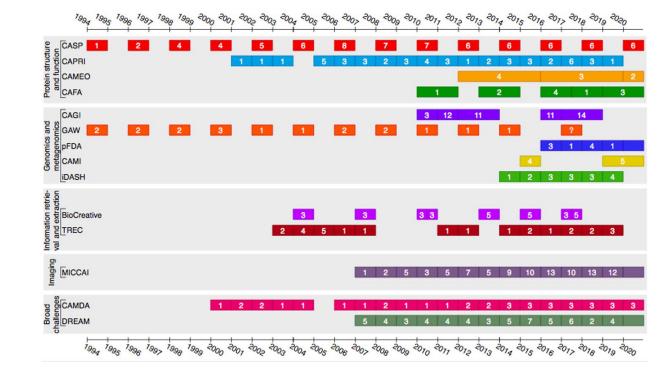


#### Increasing number of Challenges = more reward, risk

More domains are adding challenges

Normalization of challenges means more participants, more effort

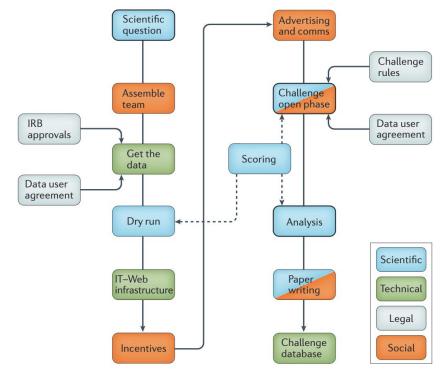
Unsuccessful challenges undermine future participation



#### Organizing the Challenge process:

Challenge execution is a process with Scientific, Technical, Legal and Social requirements.

Utilizing established processes can prevent problems with your challenge



Julio Saez-Rodriguez et al Crowdsourcing biomedical research: leveraging communities as innovation engines Nature Reviews Genetics, 2016, Vol 17 (8), 470-486 DOI: <u>10.1038/nrg.2016.69</u>

#### **Drivers of a Challenge**

For organizers:

💽 Data. High quality, original data

**?** Question. A meaningful question in your field

**§** Funding. Funds for preparing the challenge, including computing and incentives

For participants:

**Magnetic Provides and Provide Anticipants and Organizers come from all career stages and backgrounds** 

**Data.** High quality data is a huge attractor for Challenge participants

**Q** Growth. Personal growth opportunities are also motivators for Challenge engagement

**Trust.** Credibility and consistent communication help foster trust with all stakeholders

#### Include minimal information

About the organizers: Name, Summary, URLs

About the challenge: Title, Summary, Sponsors, Organizer, Year, # Participants

About the data: Type, Description, Governance, Post challenge access

About the tasks: Description, Start, End, Status, Incentives, Metrics, Methods

About the results: Publication, Status, URL, Summary, Top performers, # Submissions

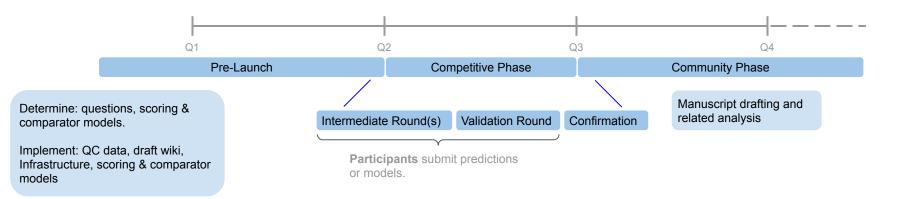
See also BIAS reporting standard for biomedical image analysis challenges

Lena Maier-Hein et al *BIAS: Transparent reporting of biomedical image analysis challenges* Med Image Anal. 2020 Dec; 66: 101796. DOI: 10.1016/j.media.2020.101796

#### Organizers should also provide

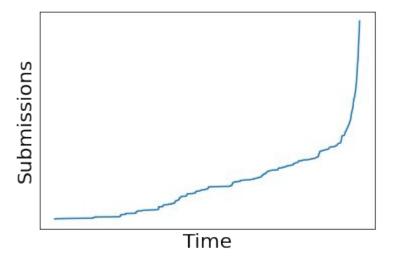
- Annotations (ground truth / gold standard) for Training and Validation
- Ensure that the metrics for validation set can discriminate between submissions
  - Probabilistic classification metrics are best AUC > F1
  - >100s of predictions
- Details on evaluation infrastructure
- Starter kit / reference method
- Incentive for participation
  - Monetary (prize, travel)
  - Publication
  - Presentation
  - Access to new data
  - Other value you can provide- announcements, introductions
- Support through a discussion forum: anticipate FAQs
- Judging of submission writeups

## Simplified Challenge Timeline



#### **Common Problems During Submission Phase**

- Data quality
  - Class imbalance
  - Noisy, missing data
  - Information leaks through leaderboard
- Participant support, cheating
- Infrastructure for evaluation  $\rightarrow$
- Rules on publication
- Other details:
  - Deadlines using global time UTC or AOE (UTC-12)
  - Specifics on ranking with multiple metrics
  - $\circ \quad \ \ {\rm Consider \ holidays \ and \ school \ schedules}$
  - $\circ \qquad {\sf Multiple\ rounds\ encourage\ participation\ throughout\ the\ submission\ phase}$
  - Recognize not just top teams, but first time participants and novel approaches



## Post Challenge Analysis

- Teams submit written descriptions of methods
- Test models with new datasets
- Identify top performers, invite to coauthor manuscript
  - Bayes Factor to find equivalent methods (BF<3)
- Collaboration phase
  - Ensemble models
  - Meta analysis of solutions

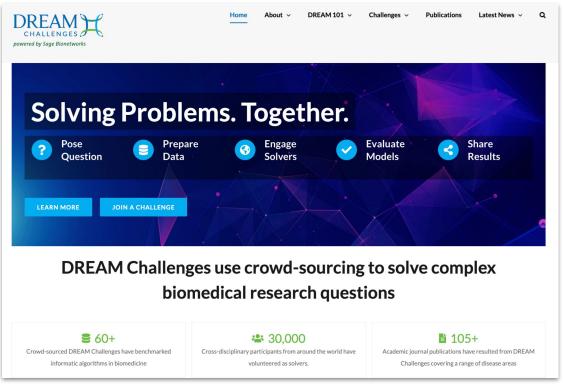
$(B_{10})$	Evidence against $H_0$
1 to 3	Not worth more than a bare mention
3 to 20	Positive
20 to 150	Strong
>150	Very strong

## Value from DREAM

Through DREAM Challenge experts can review proposals offer advice, oversight

Promote through DREAM channels and conference

Uses standard rules

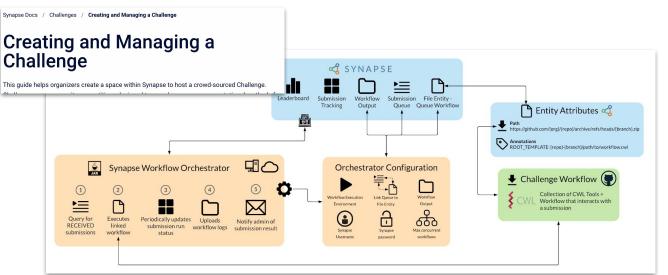


dreamchallenges.org

# Synapse.org supports general challenge execution

#### Synapse projects offer challenge capabilities

- Wiki pages
- Discussion forums
- File storage
- Evaluation queues
- Docker submissions



Registered synapse users can create challenges on their own, some CLI required

#### Takeaways

- Consider Challenges to
  - O Identify novel methods
  - O Analyze novel data
  - O Build community around an event
  - O Provide an opportunity for learning
- Challenges are time consuming to organize plan ahead!
- Don't repeat mistakes: read reviews of past challenges in your domain
- Platforms exist to support challenge infrastructure needs- reach out for more information!