How To Organize A Challenge

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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

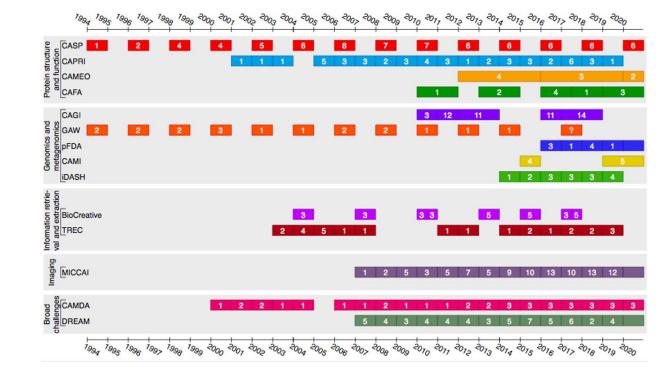


Increasing number of Challenges = more reward, risk

More domains are adding challenges

Normalization of challenges means more participants, more effort

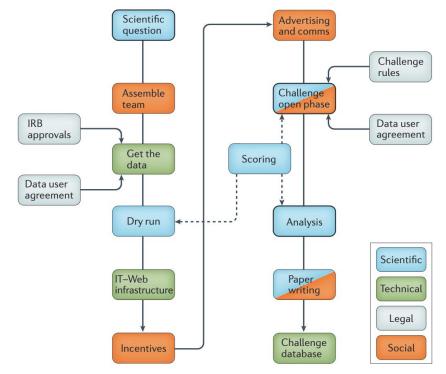
Unsuccessful challenges undermine future participation



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

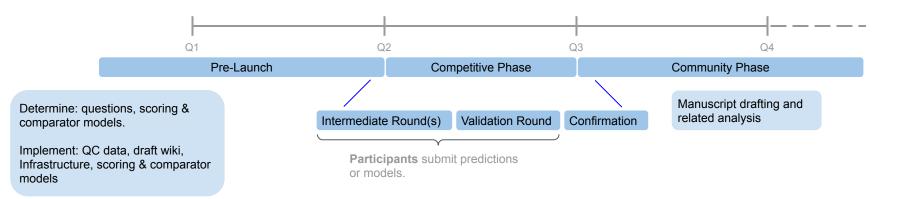
See also BIAS reporting standard for biomedical image analysis challenges

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

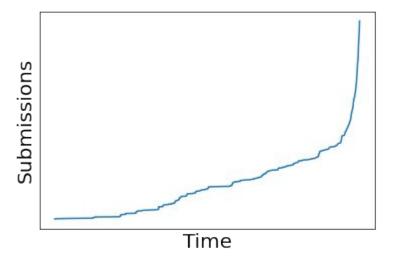
- Annotations (ground truth / gold standard) for Training and Validation
- Ensure that the metrics for validation set can discriminate between submissions
 - Probabilistic classification metrics are best AUC > F1
 - >100s of predictions
- Details on evaluation infrastructure
- Starter kit / reference 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

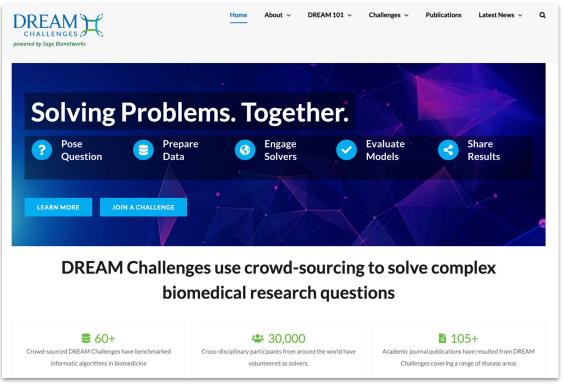
(B_{10})	Evidence against H_0
1 to 3	Not worth more than a bare mention
3 to 20	Positive
20 to 150	Strong
>150	Very strong

Value from DREAM

Through DREAM Challenge experts can review proposals offer advice, oversight

Promote through DREAM channels and conference

Uses standard rules

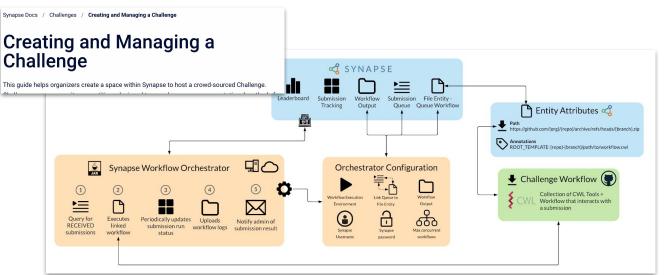


dreamchallenges.org

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!