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- Brief historical Introduction of SM
- overview of LHC and brief introduction of ATLAS and CMS experiments
- Overview of the event structure
- Challenges of the ATLAS and CMS experiments upgrades in Run3 and HL-LHC The lectures will concentrate on ATLAS and CMS physics.
- First Run 3 results
- Higgs physics in Run3 and HL-LHC
- Studying the EW symmetry breaking: di-higgs at Run3 and HL-LHC another way of studying the EW symmetry breaking: Vector Boson Scattering at Run3 and
- HL-LHC
- Effective Field Theories as a tool to discover new physics at Run3 and HL-LHC • Few words on top physics at Run3 and HL-LHC
- Direct searches for new physics: the challenge for Run3

Layout





LHC

Historical background

Shortly introducing the Standard Model and its shortcomings to motivate our studies at the





cristal Everything explained by 2 pairs of elementary particles $\binom{p}{n}\binom{e}{v}$

(e.g the pion m believed to carry nuclear forces)

1930: The knowledge of matter





1960-70 new level: QUARKs

cristal

Quarks are discovered! But nuclear forces thought to be carried by mesons: So many to exhaust greek and latin alphabets: K, ρ , ω , ϕ ...







quarks

Ve

 μ

S

The elementary constituents of matter are spin 1/2 particles (fermions) quarks and leptons

 v_{τ}



What about forces?

photon y lelectromagnetic force)

W/Z(weak force)



The force carriers are integer spin particles (bosons)

Ζ

gluon g (strong force)

 \mathcal{V}







What is responsible of particles masses?

The Higgs field that fills the space. Particles get mass by interacting with it. $^{\rm 1}$



Vacuum is filled!

The vacuum is like the surface of still lake collisions produce waves (oscillation of field =particle) Higgs boson spin zero particle, m~125 GeV



The Standard Model (SM)

С

 μ

 \mathcal{U}

τ





- •The Standard Model predicts that the Higgs boson and field acts as a sole player in the game of Electroweak symmetry breaking.
- •This is a strong prediction that has yet to be verified experimentally.
- •Answering this question is one of the pressing goals for the ATLAS and CMS experiments during Run 3 and Run 4 at the LHC.



Higgs discovery at the LHC

A scalar boson compatible with the SM Higgs has been discovered in run I as shown by the combination of ATLAS and CMS run I results

Greatest achievement of run I

- concentrated effort on its properties:
 - magnitude of couplings
 - mass measurements
 - spin/CP









History



below 200 Giga-electronVolt = GeV

What is the mass/energy scale we are talking about?

New physics may appear at higher scales









Stable Ordinary particles Can they explain everything?

No!



Dark Matter: the first puzzle

Universe content

visible matter 5%

dark energy 68%



Why is our universe made of matter and not anti-matter?

- matter asymmetry in the universe.
- compared to what we observe.
- potentially observable gravitational radiation.

2. One of the major shortcomings of our understanding of particle physics is the matter over anti-

3. While the Standard Model does predict a matter vs. anti-matter asymmetry, it is much too small

4. Moreover, the thermal history of electroweak symmetry breaking is important for particle physics and cosmology. If in the early universe, there was a first order electroweak phase transition (think boiling water), this could explain the matter vs. anti-matter asymmetry as well as sources for

5. The Standard Model's prediction is again clear – no first- order transition. Therefore if such a transition took place, the Higgs doesn't act alone and some new physics is present.







2. How to incorporate in SM neutrino masses? Why are they so small?



New physics should appear in the worst case at Planck scale where quantum gravity effects become important and quantum filed theory breaking down. Very large scale 1.22 x 10¹⁹ GeV!





If SM is a complete description of Nature

no hierarchy problem.

But the SM has unresolved issues which point to New Physics (NP) If NP appears at Planck scale unnatural large difference wrt EW Scale

Most accredited models predict NP @TeV scale. ITeV=I000GeV



Hierarchy Problem









The LHC accelerator and the ATLAS and CMS detectors

Explaining the main features of the LHC and the detectors



Collisions bring us back to Big Bang producing particles abundant at that time



LHC accelerates protons in opposite directions along 28km ring.

Protons collided at experiments @7,8,13 TeV and at 13.6 at Run3







Bunch Crossing

Proton Collisions

Parton Collisions

New Particle Production (Higgs, SUSY,)

TeV collisions

collisions happen at center of detector



Collisions are among quarks and gluons that constitute protons



Produce new particles in final state





particles interact differently with detector

used to disentangle them

Typical detector

Detectors built to observe particles produced in collisions







Inner Detector (Tracking)

Endcap Toroid

 $\Lambda\Lambda$

ATLAS Detector

LAr EM / Tile Hadronic Calorimeter

Barrel Toroid / Muon Tracking



CMS Detector

STEEL RETURN YOKE ~13000 tonnes

SUPERCONDUCTING SOLENOID Niobium-titanium coil carrying ~18000 A

Total weight Overall diameter Overall length Magnetic field : 14000 tonnes : 15.0 m : 28.7 m : 3.8 T HADRON CALORIMETER (HCAL) Brass + plastic scintillator ~7k channels

SILICON TRACKER Pixels (100 x 150 μm²) ~1m² ~66M channels Microstrips (80-180μm) ~200m² ~9.6M channels

> CRYSTAL ELECTROMAGNETIC CALORIMETER (ECAL) ~76k scintillating PbWO₄ crystals

> > PRESHOWER Silicon strips ~16m² ~137k channels

FORWARD CALORIMETER Steel + quartz fibres ~2k channels

MUON CHAMBERS

Barrel: 250 Drift Tube & 480 Resistive Plate Chambers Endcaps: 473 Cathode Strip & 432 Resistive Plate Chambers



ATLAS and CMS in Berlin







- any physics analysis
- Two level trigger system

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Level-1 (L1)

- Hardware-based trigger

- Inputs from Calorimeter and Muon systems with coarse detector granularity defining Regions of Interest (Rols)

- Latency: $< 2.5 \ \mu s$



High Level Trigger (HLT)

- Software-based trigger
- Full detector granularity
- Latency: ~ 0.5 s average

• Trigger (online event selection for permanent storage) is of paramount importance since is the first cut applied

↓ 40 MHz

↓ 100 kHz

 \downarrow 1 kHz average \times 1 MB/event = 1 GB/s





I will here introduce few concepts by showing what happens when two protons interact, i.e.

- •hard process
- •Radiation: ISR/FSR
- •Pile-up
- Parton Density Functions (PDF's)

The Structure of an event

Few useful reminders on hadron collider kinematics





- The energy of each beam is carried not by the entire proton, but by one of its constituents Ecollision < 2Eb
 - <u>Pros</u>: with a single energy possible to scan different processes at different energies
 - <u>Consighte energy available for the collision is lower than the accelerator energy</u>

Protons (and antiprotons) are formed by quarks (uud) kept together by gluons



The Structure of an event: PDFs





Initially two beam particles are coming in towards each other. Normally each particle is characterized by a set of parton distributions, which defines the partonic substructure in terms of flavour composition and energy sharing. This determines the energy of the interacting partons (x_1, x_2)

$$\sigma(\mathbf{p}(\mathbf{P_1}) + \mathbf{p}(\mathbf{P_2}) \rightarrow \mathbf{Y}) = \int_0^1 \mathbf{dx_1} \int_0^1 \mathbf{dx_2} \mathbf{Y}$$



$$= \int_0 dx_1 \int_0 dx_2 \sum_f f_f(x_1) f_{\overline{f}}(x_2) \cdot \sigma(q_f(x_1P) + \overline{q}_f(x_2P) \rightarrow Y)$$
partonic x-section:
phase space* matrix element
Incoming beams: parton densities



The Structure of an event



- \rightarrow One incoming parton from each of the protons enters the hard process, where then a number of outgoing particles are produced. It is the nature of this process that determines the main characteristics of the event.
 - Hard subprocess: described by matrix elements





The hard process may produce a set of short-lived resonances, like the Z^0/W^{\pm} gauge bosons.



The Structure of an event: ISR



One shower initiator parton from each beam may start off a sequence of branchings, such as $q \rightarrow qg$, which build up an initial-state shower.

Initial-state radiation: spacelike parton showers

The Structure of an event: FSR







The outgoing partons may branch, just like the incoming did, to build up final-state showers.

Final-state radiation: timelike parton showers





In addition to the hard process, further semihard interactions may occur between the other partons of two incoming hadrons.

There is in time pile-up which comes from the same bunch of protons from the interaction of interest, and can be resolved by setting the interaction points location by identifying vertices. The second type is out-time pile-up, which which comes from other proton bunches when the detector has not yet recorded the signal completely due to dead time, the time needed for a certain detector to be able to record an event after a previous one

The Structure of an event: pile-up









150 ns inter-bunch spacing

2011 O(10) Pile-up events

50 ns inter-bunch spacing

Design value
 (expected to be reached at L=10³⁴ !)

2012 O(20) Pile-up events

50 ns inter-bunch spacing





 $1 \text{ barn} = 10^{-28} \text{ m}^2 = 10^{-24} \text{ cm}^2$

The luminosity is a parameter of the LHC and can be increased

The Cross-section

Number of observed events is proportional to

- 1) Luminosity
- 2) analysis efficiency
- 3) cross section of the process

$$N_{obs} = \int Ldt \cdot \varepsilon \cdot \sigma$$

J

rev ^{II}bunch $4 \pi \sigma_x \sigma_y$

revolving frequency: f_{rev}=11245.5/s #bunches: n_{bunch}=2808 #protons / bunch: N_p= 1.15 x 10¹¹ Area of beams: $4\pi\sigma_x\sigma_v\sim 40 \ \mu m$


Signal and backgrounds

Other processes (background) can mimic signal final state. Same particles in the final state!

HIGGS Signal



SM backgrounds



Cross-sections/ number of Events





Large cross-sections and what is interesting is rare:

- x-section ttbar \sim Inb (800pb)

Cross-sections/ number of Events





Large cross-sections and what is interesting is rare:

- x-section ttbar \sim Inb (800pb)

x-section jet production ~ 100nb (100000pb)

Cross-sections/ number of Events





Large cross-sections and what is interesting is rare:

- x-section ttbar \sim Inb (800pb)

- x-section jet production \sim 100nb (100000pb)

- x-section Higgs production \sim 10pb



Looking for diamons!

Contes ma



d. NATIONALGEOGRAPHIC.COM

The evolution of the detectors

- description of the detectors upgrades in run 3 mainly driven by physics needs
- Run 3 detectors as a first step towards the HL-LHC

in run 3 mainly driven by physics needs s the HL-LHC

Run 3 detector evolution in preparation for HL-LHC arXiv:2305.16623







Run 3 detector evolution in preparation for HL-LHC arXiv:2305.16623





Run 3 detector evolution in preparation for HL-LHC arXiv:2305.16623







Muon New Small Wheels to replace innermost forward Muon station to 1) improve Level 1 trigger (high granularity, fast response) 2) maintain good tracking in end-cap region

towards HL-LHC high luminosity and high background rates



Trigger And data acquisition systems have upgraded hardware ad software allowing the trigger to spot a wide range of collision events (with same acceptance)

endcap calorimeters

barrel electromagnetic calorimeter

New LAr Calorimeter digital trigger electronic boards: improved trigger granularity! towards HL-LHC high luminosity and high background rates





Month in Year





300

200

100

0

 $\mathbf{0}$

Run 3

ATL-DAPR-PUB-2023-001















Pile-up

tracks pT>0.1 GeV

tracks pT>1 GeV

1)Z->μμ event with 65 interaction vertices







DEFINITION

EXCAVATION



we are here

BUILDINGS



5	
4 TeV	_

2040	
ominal Lumi	4

HL-LHC upgrade: The challenges

Unprecedented opportunities come with great challenges

- HL-LHC promises to provide 15 times the present data sample
- instantaneous luminosity a factor of 5-7 larger than LHC nominal value.
- Up to 200 p-p interactions per bunch crossing !

ATLAS GOAL: at least as good / better performance (depending on feature) than the current detector in the much harsher HL-LHC environment





HL-LHC upgrade

ITK: All silicon, up to $|\eta| = 4$ strongly augmented tracking acceptance, 50x present channels \rightarrow to cope with high occupancy





HL-LHC upgrade





HL-LHC upgrade







New Muon Chambers Inner barrel region with new RPC and sMDT detectors

Detectors

upgrades

new and upgraded forward and luminosity detectors

new High-Granularity Timing Detector (HGTD) **ITK: All silicon, up to |\eta| = 4** strongly augmented tracking acceptance, 50x present channels \rightarrow for pile-up rejection

HL-LHC upgrade

Upgraded Trigger and Data Acquisition system Level-0 Trigger at 1 MHz, Full-feature global trigger Improved High-LevelTrigger (150 kHz full-scan tracking)









New Muon Chambers Inner barrel region with new **RPC and sMDT detectors**

new and upgraded forward and luminosity detectors

High Granularity Timing Detector (HGTD) Forward region $(2.4 < |\eta| < 4.0)$ to reduce Pile-up

Detectors upgrades

HL-LHC upgrade

Upgraded Trigger and Data Acquisition system Level-0 Trigger at 1 MHz, Full-feature global trigger Improved High-LevelTrigger (150 kHz full-scan tracking)



ITK: All silicon, up to $|\eta| = 4$ strongly augmented tracking acceptance, 50x present channels \rightarrow to cope with high occupancy







CMS upgrade

During Long Shutdown 2 (2018-2022), CMS completed the Phase 1 upgrades and started the Phase 2 upgrades. Some highlights :

- Phase 1: HCAL barrel readout, new barrel inner pixel (layer 1)
- Phase 2: First of GEM chambers installed, upgraded CSC electronics for HL-LHC, new beam pipe.
- GPU at HLT and transitioned to a hybrid CPU + GPU in trigger software (HLT nodes) : A Graphics Processing Unit (GPU) is a programmable architecture, offering large number of parallel independent streams of instructions, originally designed for image processing. Accelerate online processing









installed in the endcap-muon system to provide precise muon tracking despite higher particle



But in the meantime Run 3 is ongoing



DELL



Where can we expect to improve with Run3?

- 1) more luminosity, and higher cross-section
- 2) experimental techniques are improving fast: reconstruction improvement have been key for important measurements, I will show you a couple of important examples for Run 3 and discuss more in the following
- 3) advanced analysis techniques
- 4) better theoretical calculations and PDFs

top pair production event @13.6 FUE 28580ATLASRun305:46:19 CEST

top quark decays in Wb ~100%





Run 3 first measurements: top production

Cross-sections are expected to be slightly higher at 13.6 TeV, for example we expect a 12% increase of the ttbar x-section at 13.6 TeV



Run3



Run3

Run 3 first measurements: Z boson

Z into muon pairs





ZZ on-shell production Run3 @13.6 TeV ATLAS-CONF-2023-062

	Measurement	MC prediction	MATRIX prediction
Fiducial	$36.7 \pm 1.6(\text{stat}) \pm 1.5(\text{syst}) \pm 0.8(\text{lumi})$ fb	$36.8 \stackrel{+4.3}{_{-3.5}} \text{fb}$	36.5 ± 0.6 fb
Total	$16.9 \pm 0.7 (\text{stat}) \pm 0.7 (\text{syst}) \pm 0.4 (\text{lumi}) \text{ pb}$	$17.0 {}^{+1.9}_{-1.4} \text{ pb}$	$16.7 \pm 0.4 \text{ pb}$

- Inclusive & differential measurements
- Compares to state-of-art MC

Run3

Well in agreement with SM predictions





$qq \rightarrow ZZ, gg \rightarrow ZZ, and EW qq \rightarrow ZZ + 2j$



Higgs 000000000 Нo g g 0000000000 10² [od] (X+H ← dd)₀ $pp \rightarrow H (N3LO \ QCD + NLO \ EW)$ ggF: NNNLO+NNLL QCD + NLO EW $pp \rightarrow qqH$ (NNLO QCD + NLO EW) WH: NNLO QCD + NLO EW $pp \rightarrow WH (NNLO QCD + NLO EW)$ **ZH:** NNLO QCD + NLO EW $pp \rightarrow ZH (NNLO QCD + NLO EW)$ $pp \rightarrow ttH (NLO QCD + NLO EW)$ $pp \rightarrow bbH$ (NNLO QCD in 5FS, NLO QCD in 4FS) q W.Z W,Z 10⁻¹ pp \rightarrow tH (NLO QCD) H^O 122 124 ā 120 W, Z bremsstrahlung

Increase in run 3 @ 13.6 TeV

ggF	+7.5%
VBF	+7.9%
WH	+6.2%
ZH	+6.9%
ttH	+12.6%
HH	+11%

Higgs production









	BR(%)
bb	57
WW	22
ττ	6.2
ZZ	2.8
γγ	0.23
Ζγ	0.15

BR= decay Branching Ratio



Increase by 7% for ggH, 11% for HH and 13% for ttH

Run 3 $H \rightarrow \gamma \gamma$



Run: 438298 Event: 1246008193 2022-10-30 04:04:50 CET





Run 3 $H \rightarrow ZZ^*$ with hits in NSW





Run: 437711 Event: 1155602798 2022-10-22 03:09:27 CEST





$H \rightarrow \gamma \gamma$ and $H \rightarrow ZZ^* \rightarrow 4l$ Run3 @13.6 TeV arXiv:2306.11379



Re-observation of the Higgs boson!

But what are the prospects for Higgs Physics?



Prospects for Run 3 and HL-LHC

- Higgs physics
- di-Higgs
- Vector Boson Scattering
- precision measurements as a tool to search for new physics
- top quark physics + SM physics




- Since the discovery we have a factor 30 more statistical power
- we have a permil precision on the Higgs mass
- its width measured at ~2 MeV precision

We are :

- measuring Higgs couplings to bosons and fermions
- investigating the Higgs couplings to the second generation
- measuring the signal strength for Higgs production with a 6% precision
- a precision on various couplings that ranges from 3-10%
- evidence that the Higgs couples with the particle mass and that it has spin 0
- at the level of sensitivity of testing x-sections at the level of 2-3 times the SM for the di-higgs production

Let's walk through all of this together!

Higgs: where are we?





- in Higgs physics we talk of signal strength, defined as the μ parameter.
- μ =1 means that we measure back the SM

• μ is the ratio of the measured cross-section with respect to the SM expectation.



ArXiv:2207.00348

Please note that theoretical error is at level of other errors!









Please note that theoretical error is at level of other





Production modes

Run 3 will bring 20-30% improvements



Decay modes



Zy we have now evidence in ATLAS+CMS combination

Run 3 will bring 20-30% improvements also on decay modes



Nature 607, 52–59 (2022)

	ggHb	qqH	VH	ttH/tH
$H \rightarrow \gamma \gamma$	~	~	~	v
H→ZZ	\checkmark	~	~	v
H→WW	~	~	~	v
$H \rightarrow \tau \tau$	v	~	~	v
H→bb	v	~	~	✓
$H \rightarrow \mu \mu$	v	~	~	~
Н→сс			~	
H→Zγ	v	~	~	v
H→inv		~	~	

Measurement at 6%!

 $\mu = 1.05 \pm 0.06 = 1.05 \pm 0.03$ (stat.) ± 0.03 (exp.) ± 0.04 (sig. th.) ± 0.02 (bkg. th.).

Higgs Combination



Inclusive Higgs x-section theoretical improvements

Higgs





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ATLAS + CMS combination: First Evidence for $H \rightarrow Z\gamma$





Higgs



First evidence of this process!

 3.4σ evidence from combination of independent 2.2σ ATLAS and 2.6 σ CMS observed sensitivity

Observed signal is 2.2 ± 0.7 times the SM prediction (compatible at 1.9σ)

With the additional 200 fb-1 Run 3 would give observation

in the combination, while single experiments would fall slightly short of observation.

This of course in the hypothesis that the observed signal

is higher than the expectation



Rare processes: back on the envelope calculation based on SM expectations

run3 Lumi→	H->µµ		H->yy*		H->Zy		HH	
expected sensitivity↓	250 fb	200 fb	250 fb	200 fb	250 fb	200 fb	250 fb	200 fb
ATLAS	2.8	2.6	3.5	3.3	2.0	1.9	1.2	1.1
CMS	4.2	4.0	-	-	2.0	1.9	1.3	1.2
Combined	5.0	4.8	5.0	4.7	2.8	2.6	1.8	1.6

Back of the envelope calculation (no official source)

Higgs

Following SM expectations





Higgs couplings to second generation

Particle masses span almost six orders of magnitude, from 0.5 MeV/c2 for electrons in the first generation to 173,000 MeV/c2 for the top quark in the third generation.

These masses correspond to a range in Higgs interaction strengths from 0.000003 to 1, assuming that a single Higgs field generates the mass in all particle generations.

That assumption is so far experimentally untested as only the interactions with 3rd generation particles have been established.

With the increased data volume of LHC Run 2+3, constraints on couplings to the 2nd generation come into reach, allowing a first ever test of the universality of the mass generation mechanism.

Anticipated during Run 3 is a major breakthrough in Higgs physics: the observation of Higgs Boson decays to muons.



Rare processes: back on the envelope calculation based on SM expectations

run3 Lumi→	Η->μμ		H->yy*		H->Zy		HH	
expected sensitivity↓	250 fb	200 fb	250 fb	200 fb.	250 fb	200 fb .	250 fb	200 fb.
ATLAS	2.8	2.6	8.5	3.3	2.0	1.9	1.2	1.1
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Higgs

ATLAS has significance 2.0 σ (with an expectation of 1.7 σ) CMS has evidence 3.0 σ (with an expectation of 2.5 σ). The precision of this result is currently limited by the statistics of the data sample; Run3, both experiments fall slightly short of an observation significance with 200 fb-1. Combination should provide an unambiguous discovery It is a goal for both experiments to reach an observation sensitivity independently.

Following SM expectations



Higgs couplings to 2nd generation: c quarks

Run 3 will serve as a fundamental benchmark for studying the coupling to second-generation quarks, specifically the charm quark.

Decays of the Higgs boson into a pair of c ("charm") quarks are relatively common; however, the challenge lies in accurately identifying them based on their detector signature.

When high-energy quarks transform into collimated jets of bound states known as hadrons, those originating from b or c quarks travel a finite distance before decaying (D lifetime 10⁻¹⁵ s, B lifetime 10⁻¹² s)

Techniques based on distance measurements have proven effective in identifying the long-lived and heavy b quarks of the third generation.

To address the more challenging scenario of the shorter-lived and lighter charm quarks, innovative analysis techniques and the utilization of boosted Higgs decays have brought the charm quark within reach for the High-Luminosity phase of the LHC. Run 3 will be instrumental in testing and establishing new analysis strategies to pave the way forward.



Higgs



We tag b-hadrons and c-hadrons thanks to the fact that there is a secondary vertex



IPPV

)





Boosted objects

At the LHC given the large center of mass energy and given that the SM particles have masses below 200 GeV, also the heaviest SM particles often acquire large momentum $>> m \rightarrow$ production of "boosted objects"

Normally we reconstruct jets with R=0.4, **b** if the object is boosted the jets in which it decays cannot be resolved in small r-jets

Recover sensitivity to boosted objects by developing boosted taggers, using larger R





Boosted objects

At the LHC given the large center of mass energy and given that the SM particles have masses below 200 GeV, also the heaviest heaviest SM particles often acquire $pT \gg m \rightarrow production of "boosted objects"$



Recover sensitivity to boosted objects by developing boosted taggers, using larger R





Latest CMS Run 2 results (dataset 20 times smaller than HL-LHC) has sensitivity of 3.4 times the SM coupling in VH (WH,ZH) production mode. When the V has a large pT, the Higgs is boosted.

expected $|k_c| < 3.4$ observed $1.1 < |\kappa_c| < 5.5$ @95% CL

thanks to exploitation of flavour tagging + reconstruction of the m_Higgs through boosted large R-jet using modern Machine learning techniques.

HL-LHC Lumi→	VH(→ cc)			
Expected sensitivity↓	3 ab ⁻¹	2.5 ab ⁻¹		
ATLAS	-	-		
CMS	1.3	1.2		
Combined	1.9	1.7		

Adding inclusive Higgs and the VBF production modes +various improvements could lead to first direct evidence for the Yukawa coupling of the Higgs boson to charm at HL-LHC

It is therefore extremely important as an intermediate goal of Run 3 that progress is shown by all experiments in improving their sensitivity in this channel:

arXiv:2205.05550









Graph nets

Graph nets

with functions very different from neural networks. <u>arXiv:1806.01261v3</u> Networks acting on a "graph" rather than a vector of inputs, with output being a graph: Lot of activity on this in the past years in industry

Here one can find open-source software library for building graph nets, with demonstrations on how to use them: https://github.com/deepmind/graph_nets

cases:

- to learn the dynamics of physical systems (Battaglia et al., 2016; Chang et al., 2017; Watters et al., 2017; van Steenkiste et al., 2018; Sanchez-Gonzalez et al., 2018)
- to predict the chemical properties of molecules (Duvenaud et al., 2015; Gilmer et al., 2017)
- to predict traffic on roads (Li et al., 2017; Cui et al., 2018)
- to classify and segment images and videos (Wang et al., 2018c; Hu et al., 2017)
- to perform semi-supervised text classification (Kipf and Welling, 2017)
- in machine translation (Vaswani et al., 2017; Shaw et al., 2018; Gulcehre et al., 2018)...

Graph nets can be neural networks operating on graphs, but can be implemented

Quite some possibile applications: they have been used already for a variety of

Graph nets: demo

Find the shortest path in a graph: <u>demo: tinyurl.com/gn-shortest-path-demo</u> \bigcirc on the shortest path between any two nodes. Over a sequence of messagethe shortest path.



Shortest path: predictions at each message-passing step

This demo creates random graphs, and trains a GN to label the nodes and edges passing steps (as depicted by each step's plot), the model refines its prediction of

Where could we apply graph-nets?

- A great improvement could be achieved by applying graph-nets to tracking
- Tracking is a very time consuming reco task at LHC (most consuming?)
- to track building one





Flavor tagging in continuous evolution

Boosted H->bb/cc tagging ATL-PHYS-PUB-2023-021

 <u>Boosted b-tagging:</u> new algorithm, GN2X for largeradius jets: tagging boosted H(bb) jets and H(cc) jets.

small R-jet tagging Jet Flavour Tagging With GN1 and DL1d



