



# Astrophysical Tau Neutrinos

The first high-significance measurement of the most energetic tau neutrino candidates ever observed

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Imperial College April 2024

### **Neutrinos: The Basics**

- Fundamental
- Light
- Ubiquitous
- Apparently stable
- Tri-flavored
- Penetrating

graphic: wikipedia

The large  $m_{\tau}$  suppresses direct  $\nu_{\tau}$  production.  $\nu_{\tau}$  are even harder to see than your average super-shy neutrino.  $\nu_{\tau}$  mainly arise through neutrino oscillations.



https://www.particlezoo.net/collections/leptons



### **Detecting Neutrinos: Cherenkov Light**

When a charged particle moves faster than light in a medium, it emits Cherenkov light.

Electromagnetic equivalent of a sonic boom.



This is the operating principle of many real-time neutrino detectors.

### The IceCube Detector



### (Yes, I have been to the South Pole.)



### Neutrinos in IceCube

#### Many possible neutrino sources:

![](_page_5_Figure_2.jpeg)

### Neutrinos in IceCube: Sources

- Atmospheric neutrinos
  - cosmic rays (e.g., protons) interact in the earth's atmosphere
  - $\bullet$  resulting particle showers include  $\nu$ 's
  - See at ~1 GeV <  $E_{\nu}$  < ~1 TeV in IceCube ( $E_{\nu} \approx 10^{9-12}$  eV)

![](_page_6_Picture_5.jpeg)

- Astrophysical high energy neutrinos
  - created in cosmic accelerators, e.g., in particle jets created by black holes
  - Evident at  $E_{\nu} > \sim 50 \,\, {\rm TeV}$  in IceCube
    - Also seen: PeV-scale ( $10^{15}$  eV)  $\nu$ 's (incl. Glashow Resonance)

![](_page_6_Picture_10.jpeg)

# $\nu^{\rm astro}$ in IceCube

#### • Motivations:

- Study  $\nu$  properties at highest  $E_{\nu}$  and longest baselines
- Uncover source production mechanism(s)
- Gain sensitivity to new physics

![](_page_7_Figure_5.jpeg)

#### **Event morphologies**

Late

Color shows time information:

Early

### $\nu^{\rm astro}$ in IceCube

![](_page_8_Figure_1.jpeg)

 $\nu_e^{\rm cc}? \ \nu_\tau^{\rm cc}? \ \nu^{\rm nc}?$ 

![](_page_9_Picture_1.jpeg)

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### **IceCube Discovery Timeline**

![](_page_10_Figure_1.jpeg)

### IceCube and $\nu^{astro}$

- Standard  $\nu$  oscillations:
  - Predict ~1:1:1 flavor ratio for  $\nu^{\text{astro}}$  at Earth
    - Numerous  $\nu_{\tau}$  should be in IceCube data
- Flavor ratio can be *somewhat* altered by production mechanism
- Flavor ratio can be *dramatically* altered by new physics (e.g., quantum gravity)

# Importance of Flavor ID for $\nu^{astro}$

#### At Earth, $\nu_e$ : $\nu_\mu$ : $\nu_\tau$ could tell us about the source...

![](_page_12_Figure_2.jpeg)

# Importance of Flavor ID for $\nu^{astro}$

#### At Earth, $\nu_e$ : $\nu_\mu$ : $\nu_\tau$ could tell us about the source...

![](_page_13_Figure_2.jpeg)

#### ...while strong deviations from 1:1:1 could mean new physics

![](_page_13_Figure_4.jpeg)

Example: Effect of quantum gravity.

# Importance of Flavor ID for $\nu^{astro}$

#### Status quo (2020):

![](_page_14_Figure_2.jpeg)

Measured flavor composition of IceCube HESE events.  $\star$  is best fit point, consistent with presence of all 3 flavors, but  $\nu_{\tau}$ flux only weakly constrained. Better identification of  $\nu_{\tau}$  would help to shrink the contour and maybe signpost new physics.

#### Also:

- -Study  $\nu_{\tau}$  (and  $\tau$ ) behavior at ultrahigh energies;
- Leverage their very high astrophysical purity;
- Get bragging rights with the largest exclusive sample of  $\nu_{\tau}$ .

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# Searching for Astrophysical $\nu_{\tau}$

- • $\nu_{\tau}$  identification
  - Exclusive channel: "Double Bang"
    - $L_{\tau} > \sim 50 \text{m}$  to distinguish two showers (*X* and  $\tau \rightarrow (e, h)$ )
      - But  $L_{\tau} \simeq 50 \text{m} \cdot (E_{\tau} / \text{PeV})$ :
        - So need high energy. And favorable interaction vertex. And direction. Etc.
      - Upshot: Very limited phase space. None found yet.

![](_page_15_Figure_8.jpeg)

![](_page_15_Figure_9.jpeg)

At lower energies, the two  $\nu_{\tau}$  cascades are closer together. Here's a spiffy custom animation to help visualize, made by yours truly in collaboration with Dr. Chat G.P.T. IV:

![](_page_16_Figure_2.jpeg)

At lower energies, the two  $\nu_{\tau}$  cascades are closer together. Here's a spiffy custom animation to help visualize, made by yours truly in collaboration with Dr. Chat G.P.T. IV:

![](_page_17_Figure_2.jpeg)

- • $\nu_{\tau}$  identification
  - Inclusive channel: "Double Cascade"
    - 60 well-contained HESE\* events
    - Classified as
      41 single cascades,
      2 double cascades,
      17 tracks
      - "Double-double"  $\rightarrow$
    - 2.8 $\sigma$  exclusion of no  $\nu_{\tau}^{\rm astro}$

![](_page_18_Figure_7.jpeg)

\*HESE: High-Energy Starting Event

- Challenge: Grow  $N_{\nu_{\tau}}$ , reduce  $N_{bkgd}$ Leverage:  $(\phi_{\nu}^{\text{astro.}} \cdot \sigma_{\nu N}) \propto E_{\nu}^{-1}$ 
  - Exclusive channel: "Double Pulse"
    - • $L_{\tau} \sim 10-50$  m to distinguish two showers in DOM waveform(s)
      - Identify DPs in one or more DOMs
    - Previous IceCube analyses
      - Looked for 1–2 modules with waveforms having clean DP signatures
      - $\bullet$  Candidate  $\nu_{\tau}$  seen, but at low S/N

![](_page_19_Figure_9.jpeg)

- Challenge: Grow  $N_{\nu_{\tau}}$ , reduce  $N_{bkgd}$ Leverage:  $(\phi_{\nu}^{\text{astro.}} \cdot \sigma_{\nu N}) \propto E_{\nu}^{-1}$ 
  - Exclusive channel: "Double Pulse"
    - • $L_{\tau} \sim 10-50$  m to distinguish two showers in DOM waveform(s)
      - Identify DPs in one or more DOMs
    - Current analysis
      - Look for signature across 180 DOMs on 3 strings w/neural networks (spoiler alert: "Double Pulse" a bit of a misnomer)
      - High S/N achieved...

![](_page_20_Figure_9.jpeg)

![](_page_21_Figure_1.jpeg)

### Searching for Astrophysical $\nu_{\tau}$ : $Q_{\mathrm{str}}^{\mathrm{max}}$

- Initial  $\nu_{\tau}$  DP selection criteria
  - Require  $\geq 2000$  p.e. on highestcharge string and  $\geq 10$  p.e. on two neighbors
  - Require cascade topology

 After initial criteria, have ~300x more background than signal

![](_page_22_Figure_5.jpeg)

- Trained 3 independent CNNs
  - $C_1 \ge 0.99$ :  $\nu_{\tau}^{\text{CC}}$  vs.  $\nu_e^{\text{CC}}, \nu_x^{\text{NC}}$
  - $C_2 \ge 0.98$ :  $\nu_{\tau}^{\rm CC}$  vs.  $\mu_{\downarrow}$
  - $C_3 \ge 0.85$ :  $\nu_{\tau}^{\text{CC}}$  vs.  $\nu_{\mu}^{\text{CC}}$
- Gives S/N  $\sim$  14.
- Backgrounds
  - $\nu_{\rm astro.}$  and  $\nu_{\rm atm.}$ 
    - Sub-dominant:  $\mu_{\downarrow}$
- Off-signal region Data-MC agreement is good for  $C_{1,2,3}$

![](_page_23_Figure_10.jpeg)

### Searching for Astrophysical $\nu_{\tau}$ : $E_{\nu_{\tau}}^{\text{true}}$

![](_page_24_Figure_1.jpeg)

- After final (CNN) cuts, peaks at ~200 TeV
  - Lower  $E_{\nu_{\tau}}$  threshold  $\rightarrow$  higher  $N_{\nu_{\tau}}$
  - Peak signal efficiency at several PeV, but flux there is v. low

- Expected 4–8  $\nu_{\tau}$  on a bkgd. of ~0.5 with 9.7 years of data
  - (S,B) levels depend on assumed astrophys. flux
  - Flavor ratio at Earth assumed to be 1:1:1
- Contributors to the  $\sim$ 0.5 background events:
  - $\nu^{\text{astro}}$ : IceCube has 4 flux measurements
    - Use flux giving least-significant exclusion of null hypothesis
    - (Conservative: Typically, we use most-significant exclusion & trials-correct)
  - • $\nu^{atm}$ : Conventional flux (Honda et al.; IceCube msmts.); possible prompt\* flux (Bhattacharya et al.; IceCube exclusion)
  - $\mu_{\downarrow}$ : <u>Only</u> conventional (prompt\* not yet definitively measured)
  - Other:  $\nu^{\text{astro}}$ -induced charm; on-shell W; Earth-crossing  $(\nu_e, \nu_\mu) \rightarrow \nu_\tau$

\*From atmospheric charm decays.

![](_page_26_Figure_1.jpeg)

#### Backgrounds

	$\nu_{\rm other}^{\rm astro}$	$ u^{ m atm}_{ m conventional} $	$ u_{ m prompt}^{ m atm}$	$\mu^{ m atm}$	all background
initial	$400 \pm 0.7 \; (490 \pm 0.8)$	$580\pm7$	$72\pm0.1$	$8400\pm110$	$9450 \pm 110 \ (9540 \pm 110)$
final	$0.3 \pm 0.02 (0.2 \pm 0.01)$	$0.1\pm0.008$	$0.1\pm0.001$	$0.005\pm0.004$	$0.5\pm 0.02~(0.4\pm 0.02)$

IceCube's *GlobalFit* (*HESE*) flux assumed.

Note:  $\nu^{\text{atm}}$  can be rejected by accompanying  $\mu_{\downarrow}$ .

This "self-veto" effect was *not* included in background estimates above.

- Backgrounds/Systematics in more detail: Charm
  - Charm:  $\nu_e^{\text{astro}} \rightarrow eW$ ;  $W \rightarrow cs \text{ (and } \nu_{\text{NC}}^{\text{astro}}; Z \rightarrow c\bar{c}$ )
    - • $\lambda_{\text{charm}} \simeq \mathcal{O}(\text{m}), \ E_{\text{dep.}} \simeq 10^{12-14} \text{ eV}$
    - Double pulse from first shower of *e* and second shower due to large ( $\lambda_{charm}$ ,  $E_{dep.}$ )
    - Full charm MC: ~20% increase in  $\nu^{\text{astro}}$  bkgd.
      - Plus small correction to account for newest PDFs
    - Added to estimated background *after unblinding* 
      - (Future improvement: Charm event morphology may be sufficiently different from  $\nu_{\tau}$  that new CNN could reject.)

### Searching for Astrophysical $\nu_{\tau}$ : Other Bkgds.

- Backgrounds/Systematics, cont'd:
  - • $\mu_{\downarrow}$ ,  $\mu_{\text{DIS}}$  ( $\mu + X \rightarrow \nu_{\mu} + X'$ ): considerably smaller than  $\nu^{\text{astro}}$
  - Impact of detector-related systematics all found to be small. Uncertainties in the following items were modeled via randomly fluctuating non- $\nu_{\tau}$  fluxes within their expected range:
    - bulk ice scattering & absorption
    - hole ice scattering & absorption
    - DOM efficiencies
  - Other physics processes determined to be sub-dominant:
    - On-shell *W* production  $(\nu_e \to eW; W \to \tau \nu_{\tau}; \tau \to (e, h))^*$
    - High-energy Earth-crossing  $\nu_e, \nu_\mu \rightarrow {\nu_\tau}^{**}$

\*B. Zhou and J.F. Beacom, PRD 101, 036010 (2020) \*\*A. G. Soto et al., PRL 128, 171101 (2022)

### Astrophysical $\nu_{\tau}$ : Results

- Confidence intervals calculation (Feldman & Cousins)
  - Test statistic  $TS(\lambda_{\tau}) = \ln L(\hat{\lambda}_{\tau}) \ln L(\lambda_{\tau})$

• where 
$$\lambda_{\tau} = \frac{\phi_{\nu_{\tau}, \text{ astro.}}}{\phi_{\nu_{\tau}, \text{ astro.}}}$$
 and  $\hat{\lambda}_{\tau}$  maximizes Poisson-based LLH

across 16 bins in  $(C_3, C_1)$  space:

![](_page_29_Figure_5.jpeg)

# Astrophysical $\nu_{\tau}$ : Results

### Opening the box, we saw 7 events!

![](_page_30_Figure_2.jpeg)

4 events are brand new.

3 events are old; 1 of which had been identified as a  $\nu_{\tau}$  candidate. Tau-ness:  $P_{\tau}(i) = n_s(i)/(n_s(i) + n_b(i)) \rightarrow (0.90 - 0.92, 0.94 - 0.95)$ 

### Astrophysical $\nu_{\tau}$ : Results

- For IceCube's *GlobalFit* flux, exclude  $\phi(\nu_{\tau}^{\text{astro}}) = 0$ at  $5.1\sigma$ 
  - Other fluxes:  $5.2\sigma$ ,  $5.2\sigma$ ,  $5.5\sigma$  (Inelasticity, Diffuse, HESE)
- Also a 40%-level confirmation of the standard oscillation picture

•
$$\left(7 \pm \sqrt{7}\right) \nu_{\tau}$$
's

- $\bullet$  Powerful confirmation of IceCube's 2013  $\nu^{\rm astro}$  discovery
  - $u_{\tau}^{\rm atm}$  negligible at these  $E_{\nu}$

# **Post-Unblinding Checks**

- Event displays
- Saliency maps
- Reconstructed data vs. MC:  $E_{\nu_{\tau}}$ ,  $\cos(\theta_{\text{zen}})$ , vertex
- Data-driven tests
  - $\mathscr{P}(S \leftrightarrow B)$  under forced lightlevel variations

- CNN scores' robustness
  - With 7  $\nu_{\tau}$  candidates:
    - Adversarial attacks
    - Manually smooth DP waveforms
    - Forced arrival time shifts
      - Randomly
      - Dust band focused
  - With backgrounds:
    - Adversarial attacks on data
    - Adversarial attacks on  $\nu_e^{\rm astro}$ MC

Summary  $\rightarrow$ 

### **Post-Unblinding Checks: Summary**

- CNNs sensitive to overall event structure, not just to a few DP waveforms
- Reconstructed distributions look fine
- Induced  $S \leftrightarrow B$  migration probabilities small & consistent with MC estimates
- CNN scores very robust
  - Only alterations (e.g., using *DeepFool*) outside expected ranges produce noticeable change

### Event Pics: Clear Double Pulse Signature

Here's "Double Double," an old event & prior  $\nu_{\tau}$  candidate:

![](_page_34_Figure_2.jpeg)

#### time/ns

#### Gratifying to find this event again.

### Event Pic: <u>Un</u>clear DP Signature

#### Here's "Barn Owl," another new event:

![](_page_35_Figure_2.jpeg)

makes it a  $\nu_{\tau}^{\text{astro}}$  candidate.

# Saliency Maps

Saliency maps "rank the pixels in an image based on their contribution to the final score from a CNN." Saliency = gradient of CNN score vs. pixel content.

![](_page_36_Figure_2.jpeg)

https://usmanr149.github.io/urmlblog/cnn/2020/05/01/Salincy-Maps.html

# Saliency Maps

Saliency maps "rank the pixels in an image based on their contribution to the final score from a CNN." Saliency = gradient of CNN score vs. pixel content.

![](_page_37_Figure_2.jpeg)

https://usmanr149.github.io/urmlblog/cnn/2020/05/01/Salincy-Maps.html

### "BarnOwl," with log $Q_{\rm str}$ and saliency maps:

![](_page_38_Figure_2.jpeg)

Large  $S(C_1)$ : where/when  $\Delta(\text{light}) \rightarrow \Delta C_1$ . (Bright pixels can have small  $S(C_1)$ .) Generally,  $S(C_1)$  shows  $C_1$  sensitive to overall event shape.

#### DoubleDouble, with $\log Q_{\rm str}$ and saliency maps:

![](_page_39_Figure_2.jpeg)

All event pics in backup.

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### Post-Unblinding Checks: $E_{\nu}^{\text{reco.}}$ , $\cos \theta_{\text{zen.}}^{\text{reco.}}$

- Single-pulse reco.
- Good data–MC agreement...
  - ...but take
     numbers w/
     grain of salt

![](_page_40_Figure_6.jpeg)

(IceCube's "GlobalFit" flux assumed above.)

### Conclusions: What's Next?

- Used just 3 (of 86) strings. Using more strings would:
  - Improve bkgd rejection  $\Rightarrow$  relax cuts, more signal
    - Improve our  $\Phi(
      u_{ au}^{
      m astro})$  measurement (see backup)
    - Update "triangle plot" with  $u_{ au}$  information
      - Search for new physics (e.g., quantum gravity)

![](_page_41_Figure_6.jpeg)

- Identify likely astrophysical-source acceleration scenarios; start excluding some
- Apply a dedicated reco. for direction, E,...
  - $\bullet$  Study parameters of the  $\nu_{\tau}$  and  $\tau$  themselves
    - Inelasticity,  $L_{\tau}$ , energy asymmetry, ...
  - Look for  $u_{ au}^{\mathrm{astro}}$  point sources
- • $\lambda_s^{\text{sea}} > \lambda_s^{\text{ice}}$ :
  - KM3NeT, P-ONE,... should have larger effective volume per string

### **IceCube Collaboration**

![](_page_42_Picture_1.jpeg)

Spring 2022 Collaboration Meeting, Brussels, Belgium

![](_page_43_Picture_0.jpeg)

### Data-Driven Systematic Checks

- Starting point: 8,188 events
  - Use 8,175 at slight distance signal box edge
- Vary waveforms to estimate migration probability
  - Procedure:
    - Apply variation randomly to each event,
    - evaluate CNN scores,
    - calculate migration probabilities.
    - Repeat 750 times/event. ~6M trials for bkgd; ~5k for signal.

![](_page_44_Figure_9.jpeg)

### Data-Driven Systematic Checks

- Variations studied:
  - DOMEff: scale waveforms w/  $\sigma=\pm$  10 %
  - Ice absorption and scattering: scale in groupings in z: every 3, 4, 5 DOMs (every 51m, 68m, 85m) w/  $\sigma=\pm$  20 %
  - Ice scattering: shift times in groups of 4 DOMs with  $\sigma = \pm 10$  ns
  - Ice birefringence: scale all 120 DOMs in 2nd and 3rd strings w/ central value dependent on azimuth w/  $\sigma = \pm 20 \%$ 
    - Note: scaling inverted from expectation: MC did not have full birefringence but data does

![](_page_45_Figure_7.jpeg)

### Data-Driven Systematic Checks

- Outcomes:
  - Migration out of signal box:
    - Very unlikely:  $< 0.3\% \pm 0.08\%$  in all cases (< 0.02 signal events)
  - Migration into signal box:
    - Also very unlikely:  $< 0.002\% \pm 0.002\%$  (<0.2 background events)
      - Adding in 0.2 background events would modestly reduce our significance.
      - Current analysis already includes these systematics, estimated from MC
        - Replacing one estimate with the other (so as not to double count) would not impact the final result.

# **Other CNN Robustness Studies**

#### • For 7 candidate events:

- Smoothed prominent double pulse waveforms: 0 migrated.
- Shift pixel arrival times by up to 100 ns: scores unaffected (estimated timing unc.: 20 ns)
- All DOMs in dust layer:  $\pm 300$  ns shifts, or outright from event, did not change CNN response
- "Adversarial Attack" (DeepFool): Find closest decision boundary and compute the perturbation required to cross it
  - Only one event could be forced to migrate, provided average change across all pixels was  $\geq 2.5~\%$  , well outside our uncertainties
  - With random  $\pm 10\%$  pixel variations,  $10^4$  trials/event, one candidate event had  $(2.1 \pm 0.14)\%$  migration probability

#### • For background events:

- Attacks did not reveal any exceptionally susceptible region, and changes required to get
- $B \rightarrow S$  migration were outside uncertainties
- Attacked 634 simulated  $\nu_e$ , allowing pixels to change ±10 % , and only 1  $\nu_e \rightarrow \nu_\tau$

![](_page_47_Picture_12.jpeg)

### **Post-Unblinding Checks**

- The event vertex distribution did not look as uniform as expected
  - Several events' highest charge string was near detector's edge
  - More clustered in z above and below the "dust band"

• A  $\sim$  3 $\sigma$ -ish effect, depending on assumptions

![](_page_48_Figure_5.jpeg)

### **Event Vertex Distribution**

- Geometry: There's a lot of physical volume near the edge
- Loosening CNN scores  $C_{2,3} (\nu_{\tau}^{CC} vs. (\nu_{\mu}^{CC}, \mu))$ adds new events mostly at top of detector
  - Very unlikely all 4 edge events are  $\mu$ :  $p_{\text{KS}}(C_3 > 0.75) = 0.1$  $[p_{\text{KS}}(C_3 > 0.85) = 0.004]$

![](_page_49_Figure_4.jpeg)

- One of the four events reconstructs as outward-going
  - Must be  $\nu$ : absence of light on ~0.5 km path toward vertex

### **Event Vertex Distribution**

- Loosening  $C_1$  score  $(\nu_{\tau}^{\text{CC}} \text{ vs. } (\nu_e^{\text{CC}}, \nu_x^{\text{NC}}))$ 
  - Expected 9.4  $u_{\tau}$  and 2.9 bkgd events
  - Saw 12 (see figure)
- New events more evenly distributed in  $(\rho, z)$
- Note: The 12 events would also exclude null hypothesis of  $\phi(\nu_{\tau}^{\text{astro}}) = 0$  at high significance.

![](_page_50_Figure_6.jpeg)

Conclusions: The 7 candidates' vertex distribution is an unfortunate statistical fluctuation, and the edge events are inconsistent with cosmic ray muons.

### **Event Vertex & Direction Distribution**

![](_page_51_Figure_1.jpeg)

### Conclusions: Fitted $\nu_{\tau}$ Fluxes

![](_page_52_Figure_1.jpeg)

![](_page_52_Figure_2.jpeg)

Excellent agreement with all four IceCube (non- $\nu_{\tau}$ ) measured fluxes.

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### Self-Veto Effect

If included, would reduce est.  $\nu^{\text{atm}}$  bkgd. by ~1.5-2x.

![](_page_53_Figure_2.jpeg)

FIG. 3. Passing fractions: effect of approximations on the energy of the shower giving rise to uncorrelated muons. Results are shown for three values of  $\cos \theta_z$  (from top to bottom): 0.25 (blue), 0.45 (green), and 0.85 (orange); with the approach of this work (solid), Eq. (9), where the energy carried by the neutrino parent is subtracted from the rest of the shower which produces the muons to be triggered (i.e.,  $E_{\rm CR} - E_p$ ), and without this subtraction (dashed), Eq. (5), considering the cumulative muon yield from a shower with energy  $E_{\rm CR}$ . Results from the CORSIKA simulation are shown as crosses, with statistical error bars only. In all cases, the H3a primary cosmic-ray spectrum [22], the SIBYLL 2.3 hadronic-interaction model [27, 28] and the MSIS-90-E atmosphere-density model at the South Pole on July 1, 1997 [25, 26] are used, and  $d_{\rm det} = 1.95$  km in ice and  $\mathcal{P}_{\rm light}(E^{\rm f}_{\mu}) = \Theta(E^{\rm f}_{\mu} - 1 \,\mathrm{TeV})$  are assumed. Left panel: Conventional  $\nu_e$  passing fraction. Right panel: Prompt  $\nu_e$  passing fraction. A 2x decrease in  $\nu^{\text{atm}}$  would increase significances by about  $0.3\sigma$ 

#### ScarletMacaw, with log $Q_{ m str}$ and saliency maps:

![](_page_54_Figure_2.jpeg)

#### AtlanticPuffin, with $\log Q_{\rm str}$ and saliency maps:

![](_page_55_Figure_2.jpeg)

#### Estragon, with log $Q_{\rm str}$ and saliency maps:

![](_page_56_Figure_2.jpeg)

#### MacaroniPenguin, with $\log Q_{\rm str}$ and saliency maps:

![](_page_57_Figure_2.jpeg)

#### Ernie, with $\log Q_{\rm str}$ and saliency maps:

![](_page_58_Figure_2.jpeg)

### **CNN Scores vs. Charge**

#### • High charge is neither sufficient nor necessary

![](_page_59_Figure_2.jpeg)

![](_page_59_Figure_3.jpeg)

 $L_{\tau}$  vs.  $E_{\tau}$ 

# Analysis prefers events with $\tau$ 's with above-average lifetimes:

![](_page_60_Figure_2.jpeg)