



Journalistic best practices for Integrating IV&V into a Generative AI Enterprise Work Culture

IV&V and GenAl

Jason Blevins CSEP#00161



/Imagine Prompt: Cliffs of Moher in Ireland, at sunset, golden hour, soft lighting, hyper photo realistic widescreen format 4k resolution --ar 4:3

Field Expertise & Secondary Sources

North Atlantic Ocean

/Imagine Prompt: Cliffs of Moher in Ireland, at sunset, golden hour, soft lighting, hyper photo realistic widescreen format 4k resolution --ar 4:3

Field Expertise & Secondary Sources

Time/General

Weather ~



/Imagine Prompt: Cliffs of Mo photo realistic widescreen fo

Sun & Moon Today	Sunrise & Sunset	Moonrise & Moo	nset	Moon Phases	Eclipses	Night Sky
\frown		Current Time:	3 Jul	2024, 20:24:48		
Dayligh 05:12 – 21:59 16 hours, 47 minut		Sun Direction:	293.3	o° WNW ∽		
		Sun Altitude:	11.27	0		
	light	Sun Distance:	152.0	99 million km		
	•	Next Equinox:	22 Se	ep 2024 13:43 (Autu	umnal)	
	17 minutes	Sunrise Today:	05:12	48° Northeast		

Ireland, Ireland — Sunrise, Sunset, and Daylength, July 2024

DST Changes

Time Zone

Sunset Today: 21:59 5 312° Northwest

Sun & Moon ~

0 0.125 0.25 mi



Search for city or place ..

North Atlantic Ocean

2024 Sun Graph for Ireland

Overview

- GenAl Opportunities & Challenges
- Models & Hallucinations
- Translation Example
- Inaccuracy Tolerance
- Calculation Example
- Increasing Reliability with Diversity
- Lessons from Journalism
- Journalistic Best Practices

Is Our Culture Ready for Generative AI?

Gen AI Opportunities

- Rapid Probabilistic Information Access
- Automatic "Accurate" Summarization
- Good at Rough Draft Exposition
- Excellent Translation of Language and Code
- Amplify the Experts with Human AI Alignment

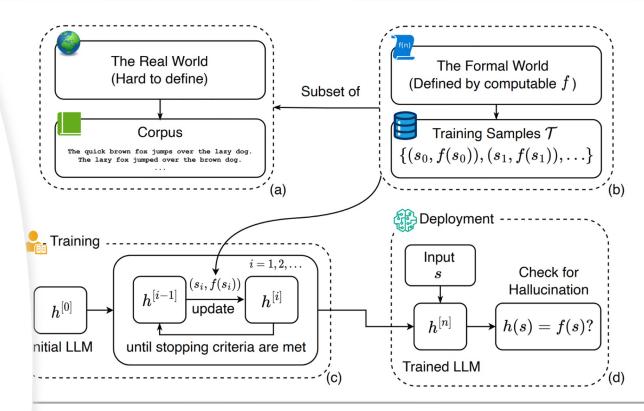
Challenges

- Potential for Atrophy
- Probably Right, Possibly Very Wrong
- Guesses Mistaken for Insight
- Training Data May Become Poisoned
- Requires Subject Matter Expertise to Validate and Verify



"All models are wrong, but some are useful". George E. P. Box

Hallucination is Inevitable: An Innate Limitation of Large Language Models



Cornell University	We gratefully acknowled <u>member</u> i
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Computer Science > Computation and Language	
[Submitted on 22 Jan 2024]	

Hallucination is Inevitable: An Innate Limitation of Large Language Models

Ziwei Xu, Sanjay Jain, Mohan Kankanhalli

Hallucination has been widely recognized to be a significant drawback for large language models (LLMs). There have been many works that attempt to reduce the extent of hallucination. These efforts have mostly been empirical so far, which cannot answer the fundamental question whether it can be completely eliminated. In this paper, we formalize the problem and show that it is impossible to eliminate hallucination in LLMs. Specifically, we define a formal world keen thallucination is defined as inconsistencies between a computable LLM and a computable ground truth function. By employing results from learning theory, we show that LLMs. Specifically, and effort and a computable LLMs computable functions and will therefore always hallucinate. Since the formal world is a part of the real world which is much more complicated, hallucinations are also inevitable for real world LLMs. Furthermore, for real world LLMs constrained by provable time complexity, we describe the hallucination- prote tasks and empirically validate our claims. Finally, using the formal world framework, we discuss the possible mechanisms and efficacies of existing hallucination mitigators as well as the practical implications on the safe deeloyment of LLMs.

Subjects: Computation and Language (cs.CL); Artificial Intelligence (cs.Al); Machine Learning (cs.LG) Cite as: arXiv:2401.118171 [cs.CL] (or arXiv:2401.11817v1 [cs.CL] for this version) https://doi.org/10.48550/arXiv.2401.11817

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Journalism: A Short History Lesson



"Le mieux est l'ennemi du bien" – Voltaire 1764

About 8,990,000,000 results (0.25 seconds)						
French	→ →	English			~	
Le mieux est l'ennemi du bien	×			is the f good		
		G	- D	6	⊘ Verified	
			Open ir	n Google Translate	Feedback	

ChatGPT 4: The exact quote "The Perfect is the enemy of the good" in the original French is "Le mieux est l'ennemi du bien." This quote is often attributed to Voltaire, comin from his poem, "La Bégueule," which appeared in his "Dictionnaire philosophique" (Philosophical Dictionary). The English translation of this quote is indeed "Perfect is the enemy of the good," conveying the idea that insisting on perfection often prevents the completion or achievement of good things.

Midjourney Bot /imagine prompt: hyper photo realistic portrait of voltaire in rococo style

Generative Code + Translation

Python

Function to capture user information
def capture_user_info():

- print("Please enter the following information:")
- # Capture namename = input("Name: ")

Capture addressaddress = input("Address: ")

Capture email addressemail = input("Email Address: ")

Capture time zonetime_zone = input("Time Zone: ")

•return name, address, email, time_zone

•# Example usage

•if __name__ == "__main__":
•user_name, user_address, user_email,
 user_time_zone = capture_user_info()

Print captured information
print("\nUser Information:")
print(f"Name: {user_name}")
print(f"Address: {user_address}")
print(f"Email Address: {user_email}")
print(f"Time Zone: {user_time_zone}")

Powershell

Function to capture user information
function Capture-UserInfo {
Write-Host "Please enter the following information:"

• # Capture name • \$name = Read-Host "Name"

Capture address\$address = Read-Host "Address"

•# Capture email address •\$email = Read-Host "Email Address"

• # Capture time zone • \$timeZone = Read-Host "Time Zone"

Create a hashtable to store the captured information
\$userInfo = @{
Name = \$name
Address = \$address
Email = \$email
TimeZone = \$timeZone
}

• return \$userInfo

•}

- # Example usage\$userInfo = Capture-UserInfo
- # Print captured information
- Write-Host "`nUser Information:"
- Write-Host "Name: \$(\$userInfo.Name)"
- Write-Host "Address: \$(\$userInfo.Address)"
- Write-Host "Email Address: \$(\$userInfo.Email)"
- Write-Host "Time Zone: \$(\$userInfo.TimeZone)"

Java

• import java.util.Scanner;

public class CaptureUserInfo {
public static void main(String[] args) {
Scanner scanner = new Scanner(System.in);

• System.out.println("Please enter the following information:");

// Capture name
System.out.print("Name: ");
String name = scanner.nextLine();

// Capture address
System.out.print("Address: ");
String address = scanner.nextLine();

// Capture email address
System.out.print("Email Address: ");
String email = scanner.nextLine();

// Capture time zone
System.out.print("Time Zone: ");
String timeZone = scanner.nextLine();

// Close the scannerscanner.close();

// Print captured information
System.out.println("\nUser Information:");
System.out.println("Name: " + name);
System.out.println("Address: " + address);
System.out.println("Email Address: " + email);
System.out.println("Time Zone: " + timeZone);
}

•}

Cobol

•IDENTIFICATION DIVISION. •PROGRAM-ID. CaptureUserInfo.

•DATA DIVISION.
•WORKING-STORAGE SECTION.
•01 NAME PIC X(50).
•01 ADDRESS PIC X(100).
•01 EMAIL PIC X(50).
•01 TIME-ZONE PIC X(50).

PROCEDURE DIVISION.DISPLAY "Please enter the following information:".

ACCEPT NAME PROMPT "Name: ".
ACCEPT ADDRESS PROMPT "Address: ".
ACCEPT EMAIL PROMPT "Email Address: ".

•ACCEPT TIME-ZONE PROMPT "Time Zone: ".

•DISPLAY "User Information:".
•DISPLAY "Name: " NAME.
•DISPLAY "Address: " ADDRESS.
•DISPLAY "Email Address: " EMAIL.
•DISPLAY "Time Zone: " TIME-ZONE.

•STOP RUN.

Understand Your Inaccuracy Tolerance



- Summarization
- Exposition
- Tone/Sentiment
- Graphics
- Internal communications
- Include:Human Validation





- Public Facing Models
- M/L Models
- Generative Code
- Include:
- Expert Verification
- Rigorous Testing





- Flight controls
- Safety Systems
- Autonomous
 Systems
- Include:
- Full Testing

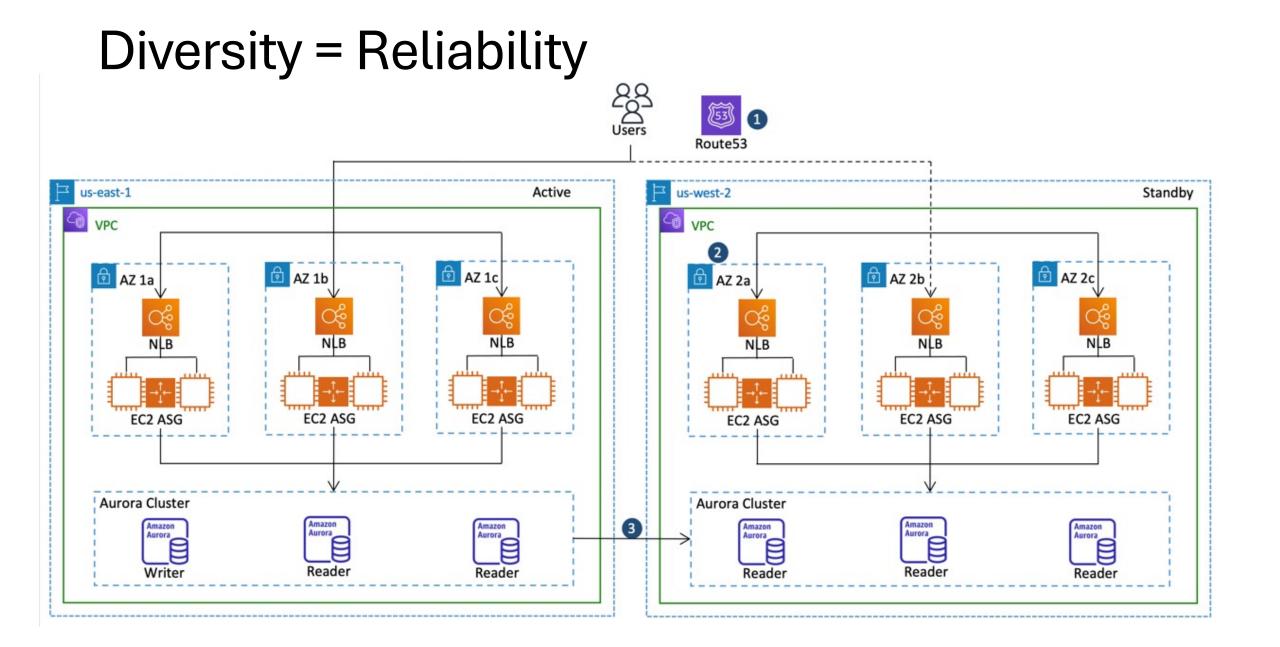
Airline chatbot story

https://www.bbc.com/travel/article/20240222-air-canada-chatbot-misinformation-what-travellers-should-know

Perfect or Good?

Availability (%)	Downtime per Year	Downtime per Month	Downtime per Week	Downtime per Day
99% (Two Nines)	3.65 days	7.20 hours	1.68 hours	14.4 minutes
99.9% (Three Nines)	8.76 hours	43.8 minutes	10.1 minutes	1.44 minutes
99.99% (Four Nines)	52.56 minutes	4.32 minutes	1.01 minutes	8.64 seconds
99.999% (Five Nines)	5.26 minutes	25.9 seconds	6.05 seconds	864
99.9999% (Six Nines)	31.5 seconds	2.59 sf 98%	O Accuracy on GPT 1	
99.99999% (Seven Nines)	3.15 seconds	262.97 milliseconds	60.48 milliseconds	8.64 milliseconds

Perfect or Good?			99% Availability •Redundancy, monitoring, backups, failover, SLAs.		
Availability (%)	Downtime per Year	Downtime per Month	 99.9% Availability •Load balancing, geo-redundancy, auto-scaling, disaster recovery, high-quality hardware. 99.99% Availability 		
99% (Two Nines)	3.65 days	1.20110013	•Microservices, immutable infrastructure, hot - swapping, enhanced monitoring, zero-		
99.9% (Three Nines)	8.76 hours	43.8 minutes	downtime deployments.		
99.99% (Four Nines)	52.56 minutes	4.32 minutes99.999% Availability •Fault tolerance, predictive maintenar			
99.999% (Five Nines)	5.26 minutes		healing, advanced load balancing, synchronou replication.		
99.9999% (Six Nines)	31.5 seconds	2.59 sf 98%	Accuracy on GPT 1	Text summarization	
99.99999% (Seven Nines)	3.15 seconds	262.97 milliseconds	60.48 milliseconds	8.64 milliseconds	



Perfect is the Enemy of the Good

To estimate the amount of jet fuel required to fly a Boeing 747 from Newark Liberty International Airport (EWR) to Dublin Airport (DUB), we'll consider the following factors:

- **1.Flight Distance (D):** 3180mi/5115 kilometers
- 2.Average Ground Speed (V): 560mph/901.2kmh }
- 3.Flight Time (T): T=5.68 hours
- 4.Fuel Flow Rate (FFR):10.5 tons/hour
- 5.Base Fuel Consumption (BFC): 59.64 tons

6.Adjust for Takeoff, Climb, and Descent: Additional Fuel=5.96 tons

7.Reserve Fuel: 2.98 tons

8.Total Fuel Burn (TFB): 68.58 tons

• The estimated fuel burn for the flight from Newark to Dublin, is approximately 68.58 tons.



HOW MUCH FUEL DOES A JUMBO JET (BOEING 747-400) BURN? What fuel does a jumbo jet use between London and New York?

HOW MUCH FUEL DOES A JUMBO JET BURN?

The four engines of the Boeing 747 Jumbo Jet burn approximately 10 to 11 tonnes of fuel an hour when in the cruise. This equates to roughly 1 gallon (approximately 4 litres) of fuel every second. It can carry a maximum of 238,604 liters of fuel and it has a range of about 7,790 nautical miles. A Jumbo Jet (Boeing 747-400) flying from London to New York burns approximately 70,000 kilograms of fuel. Jet fuel has an approximate specific gravity of 0.85, which therefore equates to 82,353 litres. Therefore, the cost of the fuel (based on 1 litre costing 31 pence) required to fly from London to New York is approximately £18,500 (€23,600). The cost of fuel for a a jumbo jet carrying 450 passengers, would work out as about £41 (€52) per person.

The equation used to calculate fuel burn in aviation is often referred to as the **Breguet Range Equation**. This equation is particularly useful for determining the range of an aircraft based on its fuel consumption and efficiency. Here is the Breguet Range Equation in its general form:

Breguet Range Equation

$$R = rac{V}{C} imes \ln \left(rac{W_i}{W_f}
ight)$$

Where:

- R = Range of the aircraft (distance it can fly)
- V = Velocity or average ground speed of the aircraft
- *C* = Specific fuel consumption (fuel flow rate per unit thrust, often in units of fuel per unit distance or time)
- W_i = Initial weight of the aircraft (including fuel)
- W_f = Final weight of the aircraft (after fuel has been consumed)
- $\ln =$ Natural logarithm

This equation provides a theoretical basis for understanding how factors like speed, fuel efficiency, and weight affect the distance an aircraft can travel.

Lessons from Journalism



Pre-Digital Era Journalism

Reliance on Primary Sources
Limited Public Fact-Checking
Ample Time for Verification
Public Trust

Digital Transformation

- Access to Online Databases: A wealth of digital archives, databases, & resources allowing for quicker verification of facts.
- verify digital content, including reverse image searches, video analysis tools, & social media monitoring platforms.
- Increased Speed and Pressure: The 24/7 news cycle & immediacy of online publishing have increased pressure on journalists to report quickly, often at the expense of thorough verification.

 Real-Time Verification Tools: Tools
 A lie can travel halfway & software have been developed to verify digital content, including around the world before the truth has a chance to get its boots on."

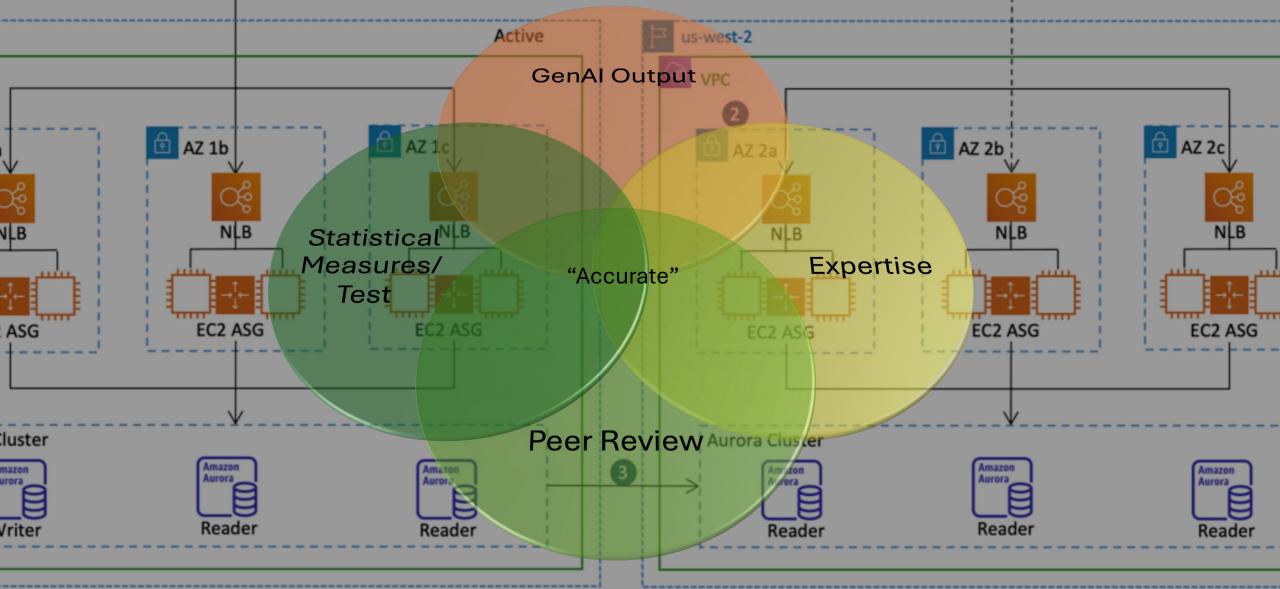
VEE SYSTEMS ENGINEERING MODEL Current Best Practices

- Multi-Source Verification: Journalists are encouraged to verify information with multiple sources, especially when covering breaking news or controversial topics.
- Transparency with Audiences: Show the work behind the reporting including citing sources, explaining the verification process, & acknowledging uncertainties.
- Collaboration & Fact-Checking Networks: News organizations collaborate with factchecking organizations & share resources for verifying information.
- Adapting to Misinformation: Training in recognizing & debunking misinformation has become crucial. Journalists now play a key role in fact-checking claims made on social media & in viral content.
 - **Ethical Considerations:** There's an increased focus on the ethics of reporting in the digital age, including considerations about the potential harm of spreading unverified information.



VALIDATIE VALIFATE VALIFRY

Validation via Multiple Sources



Key Takeaways

LLM's are good, not perfect



Understand inaccuracy tolerance (perfect or good?)



Math and Language skills will improve



Human Expertise is amplified, not replaced



IV&V has never been more important



Embrace a culture of verification & Validation, consider using journalistic best practices

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Discussion

Future Trends

- Al and Automation in Verification: The use of artificial intelligence to assist in verifying content and detecting deepfakes is on the rise, though it comes with its own set of challenges and ethical considerations.
- Audience Participation: Crowdsourcing and audience engagement in the factchecking process are becoming more common, leveraging the collective knowledge and resources of the public.
- Global Fact-Checking Initiatives: As misinformation becomes a global issue, international collaborations and initiatives are becoming more important in developing standards and sharing best practices.

