

An Artificial Intelligence with IoT Messaging Protocol for Precision Farming

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Abstract: The development of Web of-Things (IoT) innovation had enlarged the utilization of existing advances we have been utilizing. This paper then involves the IoT innovation as remote sensor organization (WSN) explicitly planned and created for brilliant cultivating applications. The progression of not set in stone to be profoundly by computerized reasoning (computer based intelligence). By and by, informing conventions should be considered to deflect misleading hub area and limit repetitive information. This paper proposes a mixture of two novel calculations to be specific, Multi-objective Message Line Telemetry Transport (MMQTT) and Profound Brain Organization based steering calculation (DNNRA) and pack their exhibition with the Gauge. The exploratory results show that the proposed strategy is viewed as fit for further developing the energy effectiveness of remote sensor organization, sensor group hub choice and sending, identification ability, jitter/delay at genuine shrewd aquaponic arrangement approval.

Keywords — Internet of Things (IOT), Colony Optimization, smart farming, Artificial Intelligence, wireless sensor network, Deep Neural Network based routing algorithm, precision farming.

I. INTRODUCTION

This examination is represented by two predominant ideas of enhancement of remote sensor organization (WSN) in accuracy cultivating. As characterized, remote sensor network is an interconnection of sensor hubs which get detecting information and convey remotely with one another as well as to a hub beyond its inclusion region [1]. These center points are oftentimes furnished with something like one sensors for assessing regular limits, and inside or outside factors. The sensors are then supervised by a computer chip which orders, stores, processes, and sends these data at whatever point needed [2]. In various plans, the taking care of capacities of the sensor center points are limited for them to be more energy useful. In this application, the sensor hubs send the procured information in foreordained time spans or in conditionbased occasions to a far off hub with further developed handling power and bigger stockpiling. In addition, the sensor hubs send or get information through at least one sorts of remote correspondences conventions, for example, however isn't restricted to IEEE 802.11, Zigbee, radio recurrence (RF), and long-range tweak (LoRa) [3].

In cultivating applications, it tends to be intuited that WSN gives an additional effective information observing arrangement contrasted with the conventional work escalated methods of manual information gathering utilizing handheld sensors, for instance [4]. A bigger area of sensor sending may likewise be utilized. The sensor hubs capability as crucial signs screens and may give a

continuous representation of the gained information. In addition, the sensor hubs may likewise control actuators when certain circumstances have been met, for example, defeating limit values, abrupt spikes in the obtained sensor information, time spans, and some other circumstances characterized or depending on the situation by the client.

Planning a WSNs network in view of its viability, cost is exactness and а mindboggling task. Execution/organization is its starter concern. It gives monstrous effect on power the board, inactivity, blockage recognition and transmission precision. As such various procedures and innovation has recently drawn in the consideration of the examination [5]. To address unique nature of optimization wireless sensor network parameter's optimization for precision farming, multiple methods of Artificial Intelligence (AI) for optimizing more than one parameter were developed [6]. As the rise of cloud based IoT execution in agribusiness creates, research endeavors attempt to possess its field holes like benefits of the innovation to a few factors influencing its activity and furthermore the difficulties to confront when it is completely obliged as a standard methodology in cultivating. Various conventions, engineering, and shows for shrewd cultivating/horticulture zeroing in on unambiguous tactile boundaries, information capacity (nearby based and cloud-based) and equipment are likewise thought of. Seeing that the rise of its high level and foster framework, there are no investigations with respect to the



use of IoT informing convention (first-layer message conventions) [7].

In this paper, we consider informing layer conventions to tackle the issue connecting with sensor bunch hub determination and arrangement, notwithstanding the Manmade reasoning based directing calculation to address the identification ability, correspondence deferral and energy proficiency related issues. The target of this issue is to plan a crossover information obtaining model that assumes a critical part in WSN improvement uniquely in brilliant cultivating applications. In both artificial intelligence based enhancement and Informing Layer Convention (MLP) working separately. Though, in proposed crossover information obtaining model various targets are at the same time advanced.

II. RELATED STUDIES

A. Wireless Sensor Networks

As WSNs are utilized in further developed applications, new steering calculations and data set coordination have been carried out [8]. Besides, the utilization of gadgets like ZigBee (IEEE 802.15.4), Arduino microcontroller, radio handset modules, and Raspberry Pi have additionally been actually utilized in a few executions. ZigBee (IEEE 802.15.4) have been generally used in low information rate applications, for example, in home robotization and brilliant lighting [9]. The Arduino microcontroller combined with an ethernet safeguard upheld web availability. Besides, a framework mix of Raspberry Pi and Arduino ended up being helpful for cell phone associations for checking gear, climate, and environment conditions. Moreover, this framework likewise has an additional warning element for a constant frame caution subsystem [10]. arch in En

A radio connection module can likewise be coordinated to mimic various ecological circumstances. In addition, a spectator module is associated with the structure which permits the examination of casings and identification of infringement [14]. Difficulties might emerge in the synchronization of information between cell phones, machines, and cloud administrations. Subsequently, there is a need to foster a framework with disconnected capacities and synchronization calculation that can work in any event, when not associated in the web. These disconnected abilities have choice drivers that give compromise that expands the productivity and viability of the framework.

B. Smart Farming

Savvy Cultivating has extraordinarily helped in the progressive innovation of the Web of things (IoT) and cloud based information capacity and handling. IoT

empowers correspondences between a client to a machine, a machine to a machine and computational frameworks that guides in the shrewd ranch's tasks. It further develops yield and asset the board, and checking. An illustration of a savvy ranch that uses IoT innovation includes the utilization of air temperature, soil pH, soil dampness, moistness, and water volume sensor. These sensors gather data and sends them over the Wi-Fi network then to the server for controlling [15]. The utilization of IoT has additionally beaten the issues of wired correspondences. One more illustration of such framework are LPWAN and low energy Bluetooth correspondences.

A WSN for a constant frame checking of energy, water, and harvest improvement has been laid out for dissecting scopes of temperature and soil dampness sensor values to control water system time. Additionally, this framework likewise examines food creation profile in light of energy and water utilization [16]. Computerization of force the executives is a fundamental subsystem for WSN. This has been carried out through fluffy rationale regulators and gave a precise outcomes between the information correspondence and natural information procurement. Likewise in the particular innovation utilized, a WSN water system framework associated with a cell phone is given by Kaewmard which accomplished a high level of 95.36% in information correspondence and order reaction control and 97.42% precision in ecological information securing. To additionally work on the general reaction and productivity of the water system framework, smart frameworks like fake brain networks calculation (ANN) and hereditary calculation (GA) could be used [17-22].

C. Message Layer Protocol

the development of IoT and progression In of correspondences. Much examination foster the correspondence conventions of an organization, some relies upon every hub and the others rely upon groups. There are additionally constructions on solitary hubs and ordinary gathering of hubs. This part is liable for contrasting the conventional and standard IoT application layer conventions and engineering. It likewise finishes up the overwhelming perspectives the structures and conventions. At the last part, burdens, and issues particularly in the field of horticultural not entirely set in stone.

A learn about convention in view of UDP (client information convention) has been displayed to have circuitous extent of enhancement targets. As the convention increment the leftover energy of the organization and information bundle transfer speed, the framework accomplishes least idleness in information transmission [18]. The Obliged Application Convention



(CoAP) convention is the best illustration of this convention [19]. MMQTT, AMQP, XMPP, REST HTTP likewise accomplishes the capacity of UDP-based convention. While organization's dependability, proficiency and accuracy in sending information from the source to the objective is an alternate methodology.

Solid moved data, and high QoS throughput are of overwhelming boundaries of brilliant cultivating since inconsistent tactile information can result to off base choices and improper computerized techniques. An enormous changeability of obtained data is demonstrated to be a consequence of colossal assortment of tactile information (model ecological data from natural sensors). What's more, this is additionally confounded by the way that a colossal assortment of information, going from low periodicity to continuous interactive media. Thus, there is a desperate need to address the referenced difficulties.

Moreover, the different and frequently inconsistent organization transmission and engendering situations having a degree from nothing (practically free space) to extreme variety of bending, blurring, and constriction are basic variables for information validity and precision. Regardless of the reality of high computational expense in the physical/Macintosh/network layer correspondence innovation there are a few downsides like: expanded in cost and decline in the activity inclusion region. Inside this edge of reference, the picked technique for MQTT (which utilizes TCP, as opposed to CoAP UDP) is by all accounts the best working calculation and extraordinarily manages benefits among the thought about conventions. By and large, the MMQTT is considered to be the most appropriate and most secure choice with regards to convention development, alongside the current squeezing correspondence issues and difficulties as examined previously.

D. AI based optimization

Multi-objective improvement was created from the particular objective streamlining. Explicit goal works just on a solitary way. There are holes between every goals and not the issues are all addressed using this sort of calculation. The chief framework generally select only one of the tradeoff arrangements [13]. Yet, with the development of the development innovation of remote sensor organizations (Wsn's) improvement related issues in plan, cycle and execution of it is some way or another restricted to a solitary methodology. Numerous helpful goal stay aware of one another and hands down the best is chosen ignoring the other issue holes, taking into account that, it is likewise a significant part of a correspondence interface.

Via delineation, enhancing the information bundle rate

clashes numerous angles like region inclusion of association, lingering power, dormancy, cost and so forth. Though with the utilized of Multi-objective advancement, various goals will be covered. There are a few targets having no correspondence with one another, most plausible explanation is they are planned conditionally. Sound model is augmentation of force/energy likewise upholds the energy productivity yet int contrast minimization of the expense of the framework [17].

A review survey of the multi-objective improvement shows that range of calculations under the method tackles numerous targets of enhancement issues connecting with configuration, cycle and execution of WSN's all the while. In case of execution, limit of asset of WSN's makes the cycle to require less in computational intricacy and memory yet at the same time produce OK outcomes.

In any case, those strategies have specific limits, and it isn't totally tackled by the numerical optimization system. Be that as it may, the picked calculation (DNNRA) for the proposed mixture technique for enhancement contrasts from the others in the accompanying principal perspectives. Profound Brain Organization based directing calculation (DNNRA) centers principally around the essential issues of WSN, which is low inclusion cost and equilibrium stacking of information, it additionally considers the energy hole issue that isn't handled in different calculations. Also, in conclusion, it further advanced the inclusion into its base necessity.

III. METHODOLOGY

The review is partitioned into 2 stages in particular: plan and execution stage. Figure 1 shows the examination stages like the plan, execution, and information investigation stage. First and foremost, the plan stage includes the demonstrating of the remote sensor network engineering.



Fig. 1 Research Phases

Besides, the execution stage incorporates the real testing and execution of the WSN. At long last, the information examination stage pictures the obtained sensor information throughout some stretch of time. The following segments will talk about exhaustively the previously mentioned stages.



A. System Design

The frameworks configuration stage covers the organization and the equipment plan. The organization configuration presents the organization engineering, geography, boundaries, and necessities. The equipment configuration incorporates the particulars of the remote hub including every one of the gadgets, modules, and remote conventions. Every sensor hub can be contained a detecting module. A handling unit deals with every one of the tasks in every sensor hub and stores guidelines in an inward memory. The inner memory is coordinated to the handling unit and has restricted memory limit. The interchanges unit is liable for sending information to a focal hub or different hubs inside the organization. The sensor hub may likewise contain an activating unit associated with it which controls ranch boundaries. A focal hub contains correspondences units, handling unit, and power source. The focal hub gets sensor information from all sensor hubs situated in its inclusion region through a first correspondences unit. The information procured from the sensor is then moved to the information obtaining server by means of a second correspondences unit. The information procured from the source sensor hubs is likewise handled, put away and saved in a handling unit. The handling unit performs calculations to keep up with satisfactory ranch boundary values.



Fig 2. Example of a network design of a mote

B. Implementation Phase

The execution stage includes the trial phase of the review. This covers the application interaction of the proposed convention and steering calculation.

After the organization plan and design has been arrangement. Information Procurement will handle inside the blackbox control of the information sending hardware prevalently on the primer layers, so transmission was made more straightforward. Notwithstanding, in genuine use, higher layer conventions are of basic significance. These sorts of conventions are the one liable for precision and productivity of the information being moved. Information procurement, moving and sharing is likewise reliant to these conventions. In any case, the arrangement of Web of Things (IoT) is dependent to the application layer conventions alluding to the starter part/segment of TCP/IP model. Application layer harmonize in with informing transmission conventions is the primary focal point of this paper.

1. MMQT

TCP convention inside the limits of transport layer/level of correspondence is used by the proposed MMQTT strategy. Regarding the capacity of the hubs to work either endorsers (subs) or distributers (bars) or both. Merchant (for our situation keepalive was utilized) fills in as the wholesaler of the framework, messages are obtained and sent through the intermediary. At the point when a distributer (bars) posts a particular subject each sensor hubs will be naturally bought into the particular subject getting every one of the updates, orders or even messages.

In this framework explicit key messages/orders areused: to interface a subs/client to a dealer the framework utilized CONNACK/Associate, to buy in or withdraw a explicit client to or from a particular point use SUBACK/SUBSCRIBE and UNSUBACK/Withdraw.

To send tactile information or messages from a distributer to the dealer or from the merchant straightforwardly to the subs/client use [PUBCOMP, PUBREC, PUBACK/Distribute, PUBREL].

In this situation, it is viewed as that the subs/client has been bought in it the particular point picked by the distributer with the related check/verification, as per the (QoS) nature of administration gave.

See figure 3 for the graphical portrayal of the MMQTT between 2 correspondence hubs under TCP convention.



In an impeccable situation of Subs/client to distribute or the other way around, there is a postpone between the server and still up in the air as, distribute to-buy in delay.



AS an answer examination of postponement is performed by the MQTT-SN client procedure. Presenting the limitation of the framework nearby client is assessed to have a start to finish delay, which quickly make an association/membership with the specific point delivered by the merchant/distributer. At various degrees of QoS, the framework gauges bar to-sub deferral of transmission. Transmission association from sources up to the customer/subs end for a situation of primer QoS (QoS-1), there is an all out six occasions. To outline, the occasions are displayed in Fig 4.

0	1	2	3	4	5	6	7
	Message Type			DUP	QoS level		Retain
		Ren	naining le	ngth (1-4 byl	tes)		
		Variat	ole length	header (opti	ional)		
	1	Variable le	ngth mes	sage payloa	d (optional))	

Fig 4. Pub to Sub format considering the delays

2. Proposed DNN routing protocol

The framework's bits of feedbacks are addressed as; N as the amount of hubs, Ei as the underlying energy level of every sensor hubs, LQi as the underlying correspondence's connection nature of various information ways of the framework, Li for introductory areas of every sensor hubs, Ii as the underlying correspondence obstruction per connection of hubs, Wde Need as the need weight proportion of the correspondence impedance, Wi as the basic load of connection quality and Wni as the need weight of the correspondence impedance.

In this sort of framework need weight of correspondence impedance (Wni) is viewed as more prominent than the need weight of energy to separate proportion (Wde) and starting/crucial load of connection quality (Wi). The streamlining boundaries are likewise set in light of the primer idea of organization's lifetime, idleness (highlight point or P2P correspondence delay. IPv6 Engineering was used to set the area of the hubs and its association/correspondence joins.

$$LC_{TH} = \frac{\frac{N_{s}}{i=L}M_{i}}{N_{s}} \times l_{c}$$

The framework's result is addressed as Dro (information paces of a solitary hub harmonizes with the information way), that compares to the correspondence way went by the transmission between the source hubs and target objective hubs. The numerical recipe belows shows the choice of source hubs and target objective hubs subject to the briefest transmission way.

$$D_{ref} = (X_{src} - X_{dst})^2 + (Y_{src} - Y_{dst})^2$$

The condition outlines the Euclidean distance as Dref. It is characterized as the distance of the correspondence way from the source sensors up to the objective hub.

The reach set by the Euclidean distance is assessed by its reference distances, as displayed underneath:

In this situation there is a change of the distance set by the Euclidean distance, addressed numerically beneath:

where the ongoing Euclidean distance is addressed as DED.

AI is then set for the framework. Every sensor hubs are resolved utilizing the numerical condition

$$D_{NS}$$
 and $D_{ND} < Dref$

The most extreme number of hubs addressed in every arrangement is displayed as Nmax. In the wake of planning the ML model and assigning the necessary boundaries, Nmax sensor hubs will be created in an irregular way and afterward, the learning metric (LM) will be assessed utilizing the condition underneath.

Cycles of age of arbitrary way with Nmax hubs and assessment of LM (learning measurements) will be performed to accomplish the exact model and enhanced boundaries. Last advances depend upon the mathematical condition framed under. The system follows specific limitation is the condition like: in the event that the LMi shows surpasses LCth, dispose of the set qualities and supplant the arrangement in the following emphasess. However, id the frameworks follows a limitation, that LMi ought to constantly be not exactly or equivalent to LCth then acceptit and continue to the following emphasis. Repeat the cycle up to Ni emphasess. Lastly, when the Ni cycles end, choose the littlest incentive for LM. Select the main three (3) arrangements having the base upsides of LM/learning metric and analyze on the off chance that the hubs having those values are all working. If of the hubs are all functioning utilize the arrangement with least incentive for steering. In the event that any of the hub isn't working actually take a look at the main 2 least arrangement with least qualities. Table 1 shows the default boundaries' worth and application used by the proposed steering convention.

WSN's Parameter	Value/Application
Addressing Protocol	IPv6
Node Quantity (Range)	10-100
WSN's Area	300mx300m
Routing Protocols	DNNRA RPL DNRPL
Data Packet	1kb/1000 bits
Link Quantity	1 to 10

Table 1. Default Parameters used for simulation and training



COAP		Applica- tion Layer			
		UDP			Transport Layer
	NDP	-	RPL		Network Layer
IPv6	NS Type 135	NS NA Type Type 135 136		ML Routing/ Deepnets Routing	
		ICMPve			
6LoWP	Adaptation				
Adapta tion	Header Compression		Frag. and Reassembly		Layer
	Data Link Layer				
	Physical Layer				

Fig 5. Modified WSN Network Mote Stack

The organization framework use a managed AI based directing calculation and prepared with a predefined set of info and result correspondence boundaries. The model is prepared under the boundaries:WSN's region, Information/data Bundle, Connection quality, steering conventions, hub amount in range and tending to

are the amount of sensor hubs (counting the information securing sensors) and the amount of dynamic connection of correspondences between the source sensors and the objective hubs. The reach/degree of the note is set 10 to 100 hubs to change the outcomes with respect to impac of force the board and Nature of Administration (QoS) boundaries for the proposed calculation. Observe the The steering measurements that is recently introduced isn't obstruction mindful. The DN-RPL remembers the impact of the obstruction for its (LM) learning metric and can address its hindrances. Correlation examination of DNNRA with standard the standard procedures like: RPL and DNRPL controls momentous development trendy the network communication.

IV. RESULTS AND DISCUSSION

This areas shows the assessment and approval of the presentation measurements of the proposed cross breed technique like: QoS streamlining, Obligation Cycle Advancement and Qoe Improvement.



convention. Though in the test model, the sources of info

Fig 6. Performance evaluation the proposed method, (a) QoE optimization, (b) duty-cycle optimization



Fig 7. Performance evaluation the proposed method, (c) Power optimization, (d) Quality of Service optimization.



One of the significant issues in WSN execution is the lingering force of every sensors. Power improvement and the board are required. As an answer limit esteem is foreordained in the strategy. They are grouped relying upon their leftover powers during dynamic mode. Each bunch has a sensor having the most lingering power, it gathers the information from each neighboring hub under its comparing group and sends information/information to the information procurement gadget. The transmission effectiveness in light of energy and execution has been shown in Fig. 7.

V. CONCLUSION

This paper proposed the Crossover Information Procurement Model involving Man-made consciousness and IoT Informing Convention for Accuracy Cultivating. The Bunch head determination hub convention through MMQTT and multi-objective worldview calculation of DNNRA have been used to further develop energy effectiveness, sensor group hub choice and sending, location capacity, jitter/deferral of energy productivity of conventional remote sensor organization. The Macintosh and PHY layers of the correspondence organization/design is performed and assessed in light of proposed technique. The strategy is exceptionally conventional and can be taken on for the few IoT, WSN and checking applications. The proposed technique accomplished low support costs, advanced energy utilization, versatile on ecological effects and simplify sensor the executives and solid.

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