

Characterization and Optimization on The Tribological Properties of NiP-Tin-GC₃N₄ Electro Less Coatings

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Abstract: *This research focuses on the comprehensive characterization and optimization of Tribological properties exhibited by NiP-TiN-gC₃N₄ electro less coatings. The study delves into the microstructural analysis, compositional examination, and mechanical behavior of these composite coatings through advanced techniques such as SEM, TEM, XRD, EDX, and mechanical testing methodologies. Tribological evaluations were conducted to scrutinize the coatings' frictional performance, wear resistance, and hardness under varying operational conditions. Furthermore, an iterative optimization process will be employed to find the influencing factors on Tribological properties including deposition conditions and component ratios, aiming to enhance specific Tribological characteristics. It is expected that the findings elucidate the intricate correlation between coating composition, deposition parameters, and resultant Tribological properties.*

Keywords: Tribological.

I. INTRODUCTION

1.1 Tribology:

The term tribo means Rubbing and logy means Heavy in a motion. It is invented in 1966. It is defined as "The science and technology of interacting surfaces in relative motion."

1.1.1 Friction:

Friction is a force that resists the sliding or rolling of one solid object over another. Friction is the resistance to sliding of a solid when a contacting body to produce the resistance. It is vital factor in the operation of most mechanisms. The main source of friction in rolling appears to be dissipation of energy involved in deformation of the object.

Types of friction: Friction types which depend on the type of motion. They are 4 types

Static Friction:

In static friction, the frictional force resists force that is applied to an object, and the object remains at rest until the force of static friction is overcome. In kinetic friction, the frictional force resists the motion of an object.

Sliding Friction:

Sliding friction is defined as the resistance that is created between any two objects when they are sliding against each other.

Rolling Friction:

Rolling friction is defined as the force which resists the motion of a ball or wheel and is the weakest types of friction.

Fluid Friction:

Fluid friction is defined as the friction that exists between the layers of the fluid when they are moving relative to each other.

1.2 Wear:

Wear is a process of interaction between surfaces, which causes the deformation and removal of material on the surfaces due to the effect of mechanical action between the sliding faces. It is such a universal phenomenon that rarely

two solid bodies slide over each other or touch each other without measurable material transfer or material loss. In order to increase and decrease the friction, wear lubricant plays a crucial role for reducing friction and wear.

1.1.3 Lubrication:

Lubrication is a process which aims at reducing friction between two moving pieces. When two surfaces come in contact with one another, a fluid must be injected to separate them. Many different substances can be used to lubricate a surface. Oil and grease are the most common. Grease is composed of oil and a thickening agent to obtain its consistency, while the oil is what actually lubricates. Oils can be synthetic, vegetable or mineral-based as well as a combination of these.

Electroless Coatings :



Fig 1: Large scale setup for Electroless coatings

History of electroless coatings:

The story of electroless coating begins in 1946 at the 34th annual AES meeting, when abnerberner& grace riddell of the National Bureau of standards disclose results of their studies on experimental nickel electroplating baths. They attempted to prevent undesirable oxidation of bath constituents at the inert anode by making additions of reducing agents to the bath. As luck would have it, one of the reducing agent that explored was sodium hypo phosphate.

Electroless plating is an autocatalytic process where the substrate develops a potential when it is dipped in electroless solution called bath that contains a source of metallic ions, reducing agent, complexing agent, stabilizer and other components. Due to the developed potential, both positive and negative ions are attracted towards the substrate surface and release their energy through charge transfer process. The advantages of modifying the properties of electroless nickel coatings by suitable surface treatments (heat treatment, laser treatment, etc.) and the incorporation of various elements (copper, tungsten, etc.) and particles (SiC, TiO₂, g-C₃N₄, etc.) have been utilized by various researchers to evaluate the suitability of these coatings for various applications.

Terms Used In Ni-P:

Reducing agent:

Sodium hypo phosphate is used as reducing agent. A reducing agent is typically in one of its lower possible oxidation states& is known as the electron donor. A reducing agent is oxidized, because it loses its elements in redox reaction.

Surfactants:

SLS & SDS are used as surfactants. It lowers the surface tension between 2liquids or between liquid and gas or liquid and solid or solid and solid. Surfactants make the TiN nano particles to distribute uniformly throughout the solution.

Neutralizing agent:

A neutralizer is a substance or material used in the neutralization of acidic water. It is a common designation for alkaline materials such as calcite (calcium carbonate) or magnesia (magnesium oxide) used in the neutralization of acid waters. Neutralizers help prevent: Acidic well water from creating blue-green stains.

Parameters

Table 1: Typical electroless bath parameters

Bath parameters	Name
Reducing agent	Sodium Hypophosphite
Absorbing agent	Nickel chloride
Neutralizing agent	Tri sodium citrate
Acidifying agent	Ammonium chloride
Surfactant	Sodium Dodecyl Sulphate
Temperature and pH	88°C and 7-8

Factors Affecting Electroless Coatings:

Temperature:

The rate of the coating process is found to increase with increase in temperature and reaches a maximum at about 92°C. Above this temperature, pH of the solution becomes unstable and, the quality of the coating deteriorates.

Bath composition:

Mainly two types of baths are used for depositing alloys. These include acidic and alkaline baths. Electroless nickel plating starts with the immersion of substrates in bath containing nickel ions and a suitable reduction, at around 90°C. To maintain a stable reaction mechanism, some organic complex agents for nickel ions, buffers, stabilizers, etc. are added in the bath. Bath composition is one of the important factor affecting coating process. Increase in pH of solution results in both increases in deposition rate as well as decrease of phosphorus content.

Phosphorous content:

The hardness and corrosion resistance of the coatings are determined by the phosphorus content of the coating. Electroless NiP coatings increase in phosphorus concentration improves the corrosion resistance and reduces the micro hardness.

1.4 Properties of Electroless Coatings:

Corrosion:

Corrosion is a natural process that converts a refined metal into a more chemically stable oxide. It is the gradual destruction of materials (usually a metal) by chemical or electro chemical reaction with their environment. Electrochemicaloxidation of metal in reaction with an oxidant such as oxygen, hydrogen or hydroxide. Rusting, the formation of iron oxides, is a wellknown example of electro chemical corrosion. This type of damage typically produces oxide(s) or salt(s) of the original metal and results in a distinctive orange coloration. Corrosion can also occur in materials other than metals, such as ceramics or polymers, although in this context, the term "degradation" is more common. Corrosion degrades the useful properties of materials and structures including strength, appearance and permeability to liquids and gases.

Wear:

Wear is a process of interaction between surfaces, which causes the deformation and removal of material on the surface due to the effect of mechanical action between the sliding faces. It is such a universal phenomenon that rarely two solid bodies slide over each other or touch each other without measurable material transfer or material loss. In order to increase or decrease the friction wear and lubrication plays a crucial role. Wear can be minimized by modifying the surface properties of solids by one or more of surface finishing processes or by use of lubricants.

Hardness:

Hardness is the resistance of a material to localized plastic deformation. Hardness ranges from super hard materials such as diamond, boron-carbide to other ceramics and hard metals to soft metals and down to plastics and soft tissues. Hardness is just one mechanical measurement and properties such as toughness and strength need to be considered, as hard materials tend to have low toughness and can easily fracture. Macroscopic hardness is generally characterized by strong inter molecular bonds but the behaviour of solid materials under force is complex.

Porosity:

Porosity is defined as the ratio of the pore volume to the whole nominal value of the porous body, and it is generally expressed as either a percentage or a decimal.

The porosity of electroless nickel coatings depends not only upon their surface roughness but also on their surface morphology which can, in turn, be influenced by any mechanical and chemical pre-treatment i.e. sand blasting, grinding, rolling, electro chemical polishing or etching of the substrate prior to coating.

Electrical resistivity:

Electrical resistivity is also called specific electrical resistance or volume resistivity. It is a fundamental property of a material that measures how strongly it resists electric current. A low resistivity indicates a material that readily allows electric current. Resistivity is commonly represented by the Greek letter ρ (rho). The SI unit of electrical resistivity is the ohm-meter ($\Omega \cdot m$).

Adhesion properties:

Adhesion is the tendency of dissimilar particles or surfaces to cling to one another. The inter-molecular forces responsible for the function of various kinds of stickers and sticky tape fall into the categories of chemical adhesion, dispersive adhesion, and diffusive adhesion. In addition to the cumulative magnitudes of these inter molecular forces, there are also certain emergent mechanical effects. For the adhesion assessment, scratch testing was applied, using CSMREVETEST scratch tester. Chromium coating was found to possess the best adhesion properties followed by zinc and nickel.

Thermal properties:

Thermal properties are those properties of a material which is related to its conductivity of heat. In other words, these are the properties that are exhibited by a material when the heat is passed through it. Thermal properties come under the broader topic of the physical properties of materials.

Thermal properties of material decide how it reacts when it is subjected to heat fluctuation (excessive heat or very low heat, for example). The major components of thermal properties are:

- Heat capacity
- Thermal Expansion
- Thermal conductivity
- Thermal stress

The thermal conductive property of the coated material will decrease monotonously with increasing thickness of the coatings, and this dependence is due obviously to the fact that thermal conductive properties of Electroless coatings are in general inferior to the uncoated materials.

Internal stresses:

Stresses that occur within the material itself, i.e. without the influence of any external force.

Self-lubrication:

Self-lubricating tribological coatings feature material composition or structural architecture that intrinsically reduces surface friction and wear. This is done using a self-contained inherent self-lubricant system such as graphite and Molybdenum Di sulfide. Self-lubricating coatings offer advantages such as good shear strength between the lubricant and the base material, low frictional disintegration, and low resistance to friction.

1.5 Electroless Ni-P Composite Coatings:

Electroless nickel processes are grouped as Ni-P, Ni-B and pure Ni, based, respectively, on the reducing agents used (i.e., hypophosphite, borohydride or dialkyl amino borane and hydrazine) in the plating bath. The idea of co depositing various second phase particles in electroless nickel deposits and thereby taking advantage of their inherent uniformity, hardenability, wear resistance and corrosion resistance, has led to the development of electroless nickel composite coatings. The advantage of preparing composite coatings by electroless deposition compared to electro co deposition is that the former allows accurate reproduction of the base geometry and eliminates the need for subsequent mechanical finishing.

1.6 Applications of Electroless Coatings:

Electroless coatings are widely used in:

- Automotive
- Aerospace
- Electronics
- Marine
- Chemical
- Rotors
- Drive shafts
- Paper handling equipment
- Fuel rails
- Door knobs & bathroom fixtures
- Textile industries due to their uniform deposition



Fig 2: Applications of Electroless Ni-P coatings

II. LITERATURE SURVEY

A nickel sulfate, cobalt sulfate, sodium hypophosphite, trisodium citrate, and ammonium sulfate-containing acidic bath was used to deposit an electroless Ni-Co-P coating on a copper substrate. The coating has a high percentage of phosphorus (14.63 weight percent), 12.67 weight percent cobalt, and 72.70 weight percent nickel. XRD reveals the covering is amorphous as it is deposited. Ni₃P phase forms at 400°C after annealing, indicating crystallization. Phases like CoP and CoP₃ become visible at higher temperatures. The coating contains small, rounded particles in its as-deposited state, according to SEM photographs. Grains become denser and more homogeneous after annealing at temperatures as high as 400°C. The grains start to expand quickly and become uneven at 600°C. The coating's surface roughness as-deposited is 0.4442 μm. After annealing over the 400°C recrystallization temperature, it becomes irregular because of Ni₃P precipitation hardening, hardness increases with annealing temperature and reaches a maximum of 1154.6 VHN at 400°C. Grain growth causes hardness to diminish at higher temperatures.

The amorphous, high phosphorus coating exhibits the onset of crystallinity as it is deposited. Up to 400°C is the recrystallization temperature at which annealing improves crystallinity. Compared to earlier publications on coatings with lower phosphorus concentrations, the hardness attained after annealing is higher[1]

A study of several electroless deposition formulas for palladium films on copper substrates. Displacement plating produces ultrathin palladium films (6-22 nm thick) that serve as cost-effective catalytic substrates. Chemical plating, particularly in an ammonia-based solution, is employed to create micrometer-thick palladium sheets. Palladium displacement pre-treatment was used to avoid copper corrosion caused by ammonia. The resulting films had high adhesion, compact morphology, and thicknesses over 1.5 μm. The two-step strategy provides a long-term solution for micrometer-sized palladium coatings. Potential for substituting electroplated palladium in decorative galvanic sector applications.[2]

Corrosion is a huge problem that costs the economy trillions of dollars each year. Corrosion can take several forms, such as galvanic, uniform, pitting, and erosion. Corrosion prevention techniques include material selection, surface

coating, inhibitors, system design, and electrical protection. Surface coating methods include inorganic (oxidation, phosphating), organic (painting), and metallic (electroplating, hot dipping). Electroless coating is an autocatalytic chemical method that deposits metal alloy sheets without the need for external electricity. The most often used coating is Ni-P alloy. Electroless coatings offer a uniform thickness, excellent corrosion resistance, and high hardness. Typically used for nonconductors such as plastics.

Mechanisms explain hydrogen evolution and nickel reduction, although the total process is not completely understood. The setup includes a heater, a bath, and a stirrer, but no power supply. Applications include printed circuit boards, valves, flow control, and food processing equipment. Provides corrosion protection for non-stainless steels. Composite coatings like Ni-P-ZrB₂ improve high temperature oxidation resistance. Ni-P-B₄C coatings are susceptible to magnetic fields. Compared to electroplating, electroless coatings have better quality but lower deposition rate and economic viability. Useful for precision applications.[3]

The study explored electroless nickel plating to protect binder-jetted composite materials made of stainless steel and bronze for potential use in hazardous environments. Different surface preparation methods (organic cleaning, plasma cleaning, chempolishing), nickel plating solution chemistries (varying phosphorus levels), temperatures, and deposition times were investigated using a Taguchi design of experiments approach. Surface roughness and nickel coating thickness were evaluated as the main responses. Surface morphologies based on the process parameters. Chempolishing resulted in very rough surfaces, while organic cleaning produced the smoothest nickel coatings. Medium phosphorus levels in the plating solution gave the most consistent and homogeneous nickel deposits. Statistical analysis showed surface preparation had the biggest impact (50%) on the final roughness, followed by phosphorus level (18%). For coating thickness, temperature (41%) and phosphorus level (35%) were most influential. The optimal parameters projected for minimum roughness (7.76 μm) were medium phosphorus, high temperature, organic cleaning, and low deposition time. For maximum thickness (149 μm), the optimal parameters were low phosphorus, high temperature, chempolished surface, and high deposition time. The study provides insights into tailoring the surface finishing and electroless nickel plating process for achieving desired roughness and coating thickness on additively manufactured metal-metal composites for enhancing their performance in challenging environments.[4]

This work describes a revolutionary process for constructing flexible and water-resistant RF circuits that combines additive manufacturing with electroless copper plating. The main steps are:

1. An 868 MHz RFID antenna is pen-written using silver nanoparticle (Ag NP) ink on a waterproof inkjet film with a microporous layer. The ink has Ag NPs averaging ~ 35 nm in size.
2. After curing the pen-written Ag NP pattern, the sample is electroless copper plated for approximately 30 minutes. The plating process deposits copper on the Ag NP surface, enhancing conductivity.
3. Copper fills the spaces between the pen-written Ag lines, resulting in a more uniform conductive surface.
4. The plated RFID antennas had a read range of up to 0.85 m, which was much greater than the 0.32 m range for a single Ag layer antenna and 0.8 m for a three-layer Ag antenna without plating.
5. Copper plating wraps the inner Ag layer, making it water resistant while remaining flexible. After 24 hours of immersion in water, there was no noticeable performance reduction.

The main benefits include low-cost additive manufacturing and increased conductivity through electroless plating.

- Suitable for flexible substrates across large areas and at low temperatures ($<100^\circ\text{C}$)

- Pen-writing and plating for easy fabrication - Waterproof and flexible RF devices outperform printed Ag.

This technology takes use of the customizability and low cost of additive pen-writing while addressing the conductivity constraints of simply printed Ag NP inks via electroless copper plating. It offers high-performance yet low-cost flexible RF devices manufacture.[5]

This research presents the manufacture and characterisation of electroless nickel-phosphorus (NiP) composite coatings using SiC and Si₃N₄ particles ranging in size from 30 nm to 2 μm . The main results are:

1. Micron-sized particles (0.6-2 μm) incorporated similarly into the NiP matrix using SiC and Si₃N₄. The number of integrated particles rose with particle size.
2. For nanoparticles (30 nm), particle type was more relevant than size. SiC nanoparticles were quite well integrated, but Si₃N₄ nanoparticles were poorly incorporated.

3. The addition of SiC nanoparticles somewhat lowered the deposition rate and altered the coating morphology, resulting in a nodular surface structure. This suggests that nanoparticles impacted the NiP matrix growth more than micron-sized particles
4. Surface analysis revealed that the variations in SiC and Si₃N₄ nanoparticle incorporation could be attributed to their surface oxidation state and subsequent surface charge in the plating solution.
5. The incorporation of particles, particularly SiC, increased the coatings' hardness and wear resistance when compared to pure NiP. Following heat treatment, a small number of SiC nanoparticles gave the same hardness increase as a larger amount of micron-sized SiC particles.

In conclusion, the study thoroughly explored how particle size and nature (SiC vs Si₃N₄) affected integration into NiP coatings and the consequent coating attributes such as shape, hardness, and wear resistance for both micron and nanoparticle composites.[6]

Electroless coatings are a type of coating applied to various materials using a chemical deposition procedure that does not require an external power source. These coatings have several advantages, including uniformity, corrosion resistance, and the ability to coat complex objects equally. Here are some popular electroless coating combinations:

1. Nickel and Phosphorus (Ni-P):

Nickel-phosphorus is one of the most popular electroless coatings due to its high corrosion resistance, wear resistance, and hardness. This coating is widely utilized in the automotive, electronics, and aerospace industries for engine components, electronic connectors, and molds.

2. Copper and Phosphorus (Cu-P):

Copper-phosphorus coatings have strong corrosion resistance and are commonly employed as a barrier layer before additional coatings or as a decorative finish. Applications include printed circuit boards (PCBs). Connectors and decorative elements.

3. Cobalt-Phosphorus (Co-P)

Cobalt-phosphorus coatings offer superior hardness, wear resistance, and magnetic characteristics. They are used in the automobile industry (for parts such as gears and shafts), oil and gas (for wear protection), and electronics.

4. Ni-B coatings provide superior wear, hardness, low friction qualities. They are utilized in applications where lubrication is difficult or not possible, such as cutting tools, molds, and automotive components.

5. Nickel-Tungsten (Ni-W) coatings offer exceptional hardness, wear resistance, and corrosion resistance. These coatings are widely employed in applications such as chemical processing equipment, aircraft components, and molds.

6. Cobalt-Tungsten (Co-W): - Cobalt-tungsten coatings provide exceptional hardness, wear resistance, and high temperature qualities.

They are utilized in a variety of applications, including cutting tools, wear-resistant surfaces, and oil drilling equipment.

7. Nickel-PTFE (Polytetrafluoroethylene): - Nickel-PTFE coatings offer low friction and good release properties, making them ideal for non-stick surfaces. - Common applications include mold release coatings, food processing equipment, and automotive parts.

8. Composite Coatings: - Some electroless coatings use composite materials, in which particles such as silicon carbide, diamond, or ceramics are integrated into the coating matrix to improve qualities like as hardness, wear resistance, and thermal conductivity.[7]

The electroless coating combination, factors such as the substrate material, desired properties (e.g., corrosion resistance, hardness, lubricity), environmental conditions, and cost considerations should be taken into account. Each coating combination has advantages and limitations, so it is critical to select the most appropriate option for the intended application.[8]

The qualities required for the substrate material, the particular application needs, the budgetary limits, and any regulatory concerns all play a role in determining the "BEST" coating combination. The following factors should be taken into account when choosing the right coating mix for various situations:

1. Corrosion Resistance: If corrosion protection is the major concern, nickel-phosphorus (Ni-P) or nickel-boron (Ni-B) coatings may be appropriate due to their high corrosion resistance.
2. Wear Resistance: Coatings with high wear resistance, such as nickel-tungsten (Ni-W) or cobalt-tungsten (Co-W), may be favored due to their hardness and wear resistance.

3. Temperature Resistance: If the coated component will be subjected to high temperatures, cobalt-phosphorus (Co-P) or cobalt-tungsten (Co-W) coatings may be more suited than other choices due to their higher temperature stability.
4. Low Friction: Nickel-PTFE (Polytetrafluoroethylene) coatings are widely employed in applications requiring low friction due to their outstanding lubricity and non-stick qualities.
5. Electrical Properties: In applications requiring electrical conductivity, copper-phosphorus (Cu-P) coatings may be favored over other choices.
6. Cost Considerations: Nickel-phosphorus (Ni-P) coatings are frequently selected for their combination of performance and cost-effectiveness. They provide high corrosion resistance and hardness at a lesser cost than certain other coatings.
7. Environmental rules: Take into account any environmental rules or limits governing the materials used in the coating process. Some materials may face regulatory limits owing to their toxicity or environmental effect.
8. Substrate Compatibility: Make sure that the coating combination you choose is suitable with the substrate material to guarantee good adherence and performance.[9]

Electroless coatings offer a diverse range of combinations, each catering to specific needs in various industrial applications. This review explores the current state of research on popular combinations and their unique properties.

1. Nickel-Phosphorus (Ni-P):

Ni-P coatings are the most widely studied and utilized due to their versatility. Research by [Kwok et al., 2018] explores the optimization of Ni-P bath composition and deposition parameters to achieve desired properties like wear resistance and corrosion protection. Their findings highlight the crucial role of bath temperature, pH, and phosphorus content in tailoring the coating's performance.

Furthermore, [Zhu et al., 2019] delve into the development of Ni-P composite coatings with embedded nanoparticles like SiC or TiO₂. Their study demonstrates significant improvement in wear resistance and microhardness compared to pure Ni-P coatings, showcasing the potential of composites for enhanced functionality.

2. Nickel-Boron (Ni-B):

Ni-B coatings offer superior hardness and wear resistance compared to Ni-P, making them suitable for high-wear applications. A study by [Zhang et al., 2017] investigates the electroless co-deposition of Ni-B with nano-sized SiC particles. Their results showcase a synergistic effect between the matrix and particles, leading to improved wear resistance and excellent tribological properties.

Additionally, [Cao et al., 2018] explore the influence of different boron sources on the corrosion resistance of Ni-B coatings. Their findings reveal that the type of boron compound used in the plating bath significantly affects the coating's passivity and corrosion behavior, highlighting the importance of bath composition selection for specific applications.

3. Nickel-Tungsten (Ni-W):

Ni-W coatings boast exceptional hardness and wear resistance, making them ideal for tools and machine components. However, their brittleness and lower corrosion resistance compared to other options pose limitations. Research by [Wang et al., 2019] investigates the effect of co-deposition with nano-diamond particles on the mechanical properties of Ni-W coatings. The study demonstrates significant improvement in hardness and wear resistance while maintaining acceptable levels of brittleness, suggesting potential for overcoming limitations of traditional Ni-W coatings.

4. Electroless Composite Coatings:

These coatings offer immense potential for tailoring properties for specific applications. A study by [Patil et al., 2017] explores the development of Ni-P-TiO₂ composite coatings with varying TiO₂ content. Their findings demonstrate a significant increase in hardness and wear resistance with increasing TiO₂ content, highlighting the ability to fine-tune properties through composite design.

Furthermore, [Lahmann et al., 2018] investigate the tribological behavior of Ni-B-SiC composite coatings. Their research reveals superior wear resistance and self-lubricating properties due to the synergistic effect of the matrix and embedded SiC particles. This study exemplifies the potential of composite coatings for achieving advanced functionalities beyond just wear resistance.[10]

The importance of consolidation parameters in geotechnical engineering and the methods used for their prediction are highlighted in the literature review on the prediction of consolidation parameters using multiple regression analysis. The consolidation behavior of soil under loading circumstances is greatly influenced by consolidation parameters, such

as the compression index (C_c) and coefficient of consolidation (c_v). Prior research has mostly used conventional techniques to forecast these factors, such as empirical correlations and laboratory testing. However, because of their potential to improve prediction accuracy, recent developments in statistical techniques—multiple regression analysis, in particular—have drawn attention.

Numerous investigators have investigated the use of multiple regression analysis to forecast consolidation parameters by integrating diverse soil characteristics and test outcomes as independent variables. These findings emphasize how crucial it is to choose suitable.

Furthermore, developments in computational techniques have made it easier to create increasingly complicated models that can capture intricate interactions between consolidation parameters and soil qualities. Notwithstanding these developments, there are still issues in this subject, such as a lack of data and the requirement for additional validation. Therefore, to improve prediction models and their usefulness in geotechnical practice, ongoing research efforts are crucial.

The significance of precisely evaluating soil consolidation behavior and the approaches used for its assessment are covered in the literature review on calculating the coefficient of consolidation (c_v) using a least squares approach. A crucial figure in geotechnical engineering, the coefficient of consolidation indicates how quickly soil combines with applied stresses. Extensive research has been conducted on C_V since it is essential for forecasting soil structure deformation and settlement. [11]

Conventional techniques for calculating C_V need laborious laboratory procedures, such oedometer tests, which aren't necessarily useful or economical. In order to estimate C_V more effectively, researchers have looked into different strategies, such as analytical and numerical techniques.

By reducing the sum of squared residuals, the least squares method—which is frequently employed in regression analysis—provides a methodical way to fit

mathematical model to observable data. Researchers have analyzed consolidation test data and derived empirical connections between soil qualities and consolidation parameters in the context of determining C_V by using the least squares method. [13]

The literature lists numerous research that have fitted data from oedometer tests or field observations to mathematical models in order to estimate C_V using the least squares method. Numerous soil characteristics, including void ratio, effective stress, and hydraulic conductivity, are frequently included in these investigations as independent variables in the regression analysis. Through the examination of an extensive dataset that spans many soil types and circumstances, scientists hope to establish strong empirical links.

Additionally, the least squares method may now be used to handle massive datasets and solve intricate mathematical models because to advances in computer technology. Researchers have looked into numerical methods and optimization algorithms to increase the precision and effectiveness of the least squares method for determining C_V . [14]

Notwithstanding its benefits, there are still issues to be resolved, such as the requirement for rigorous independent variable selection, validation of the model, and assessment of data uncertainties. To ensure the validity and reliability of empirical correlations derived by the least squares method and their application in geotechnical practice, further study is required to refine and validate them.

The relevance of the coefficient of consolidation (C_v) in geotechnical engineering and the methods used for its determination are the main topics of the literature review of the debate on calculating the coefficient of consolidation using a least squares approach. C_v is a critical metric that influences settlement behavior and stability evaluations of engineering structures by characterizing the rate at which soil consolidates under applied loads. [15] In the past, several techniques have been used to calculate C_v , such as analytical solutions based on soil parameters and laboratory consolidation studies. But the least squares approach has drawn notice for its more accurate and economical way of estimating C_V from consolidation test data.

Through the fitting of theoretical consolidation curves to experimental data and the minimization of the sum of squared errors between observed and anticipated settlements, previous research have investigated the application of the least squares approach in calculating C_v . These studies emphasize how crucial it is to choose the right mathematical models and optimization strategies in order to improve the precision and dependability of C_v determination. [16] Improvements in computing techniques have made it possible to create automated systems for C_V estimation, which

simplify analysis and lower human error rates. Even with these developments, the least squares method for determining C_v still faces difficulties due to model assumptions and data variability. To overcome these issues and improve the method's usefulness in geotechnical practice, more study is necessary.

The soft-computing literature review on soil consolidation coefficient prediction covers a wide range of approaches and geotechnical engineering applications. Artificial neural networks (ANNs), fuzzy logic, evolutionary algorithms, and machine learning algorithms are examples of soft-computing techniques that have become extremely effective for simulating intricate interactions in soil mechanics. The effectiveness of these methods in predicting the soil consolidation coefficient (c_v) has been shown in earlier research that integrated a range of soil qualities and environmental conditions as input parameters.[17]

Studies conducted in this field demonstrate the benefits of soft-computing methods, including their capacity to manage nonlinear interactions and the inherent uncertainty in geotechnical data. ANNs in particular have gained a lot of traction because of their adaptability and capacity to identify complex patterns in datasets. Additionally, fuzzy logic techniques have been appreciated for their capacity to add linguistic factors and expert knowledge to the modeling process. Furthermore, genetic algorithms provide optimization tools for enhancing prediction accuracy and fine-tuning model parameters.[18]

Even with the encouraging outcomes that soft-computing techniques have shown, there are still issues to be resolved, such as choosing the right input variables, validating the model, and applying it to a variety of soil types and situations. To improve the resilience and accuracy of these methods for estimating the soil consolidation coefficient in geotechnical practice, more study is required.

The literature review highlights the distinct geotechnical properties of Addis Ababa's red clay soils and the difficulties in precisely estimating consolidation parameters. It also discusses the conceptualization of consolidation parameters using regression analysis and genetic programming. Because of their high plasticity and sensitivity to changes in moisture content, Addis Ababa's red clay soils display complex behavior that makes traditional prediction techniques less useful.[19]

Alternative methods, like genetic programming and regression analysis, have been explored in earlier research to create predictive models that are specific to the red clay soils of Addis Ababa. In order to capture the complex mechanisms influencing soil behavior under consolidation loading, regression analysis has been used to determine connections between various soil variables and consolidation parameters.

Simultaneously, the application of genetic programming, a computer method influenced by genetics and natural selection, has been investigated to develop predictive models straight from empirical data without the need for predetermined associations. With its ability to capture nonlinear correlations and interactions among input variables, this technique has the potential to improve forecast accuracy for complex soil systems such as the red clay soils of Addis Ababa.[20]

The issues with choosing the right input variables, validating the model, and making it generalizable to different soil types in Addis Ababa. In order to ensure that these methods are appropriate for real-world engineering applications in the area, more study is required to improve and validate them.

The examination of the literature on the use of polynomial regression analysis to model the Awka soil's coefficient of consolidation highlights how important it is to comprehend soil consolidation behavior for applications in geotechnical engineering. As an example of a cohesive soil, awka soil has intricate consolidation properties that are impacted by soil structure, void ratio, and moisture content.[21]

Several mathematical models, such as linear regression, have been used in earlier research to forecast the coefficient of consolidation. However, researchers began looking at polynomial regression analysis because of the shortcomings of linear models in capturing nonlinear interactions. The nonlinear behavior of soil parameters and their link to the coefficient of consolidation can be captured with flexibility using polynomial regression.

The literature emphasizes how crucial it is to choose the right degree of polynomial and use model validation methods to guarantee forecast accuracy and dependability. Research has indicated that polynomial regression is a useful tool for predicting the Awka soil's coefficient of consolidation, and that it can yield better forecast accuracy than more conventional linear models.[22]

The creation and application of polynomial regression models has also been made easier by developments in computational techniques and the availability of sophisticated software. Even with these developments, there are still issues that need to be looked upon, like the accessibility of data and the interpretability of models. Therefore, more research is required to improve polynomial regression models and increase their suitability for estimating the Awka soil's coefficient of consolidation for geotechnical engineering procedures.

The significance of precisely estimating settlement behavior in geotechnical engineering and the advancement of prediction approaches is emphasized in the literature evaluation of the new observational method for forecasting one-dimensional consolidation settlement. For evaluating the performance and stability of structures constructed on compressible soil deposits, settlement prediction is essential. Conventional techniques rely on empirical correlations derived from laboratory test results as well as theoretical models, such as Terzaghi's consolidation theory. However, because of their assumptions and oversimplifications, these methods frequently fall short of accurately capturing the settlement behavior in practice.

The goal of recent research has been to create observational techniques that employ field measurements to more precisely forecast consolidation settlement. By using new developments in instrumentation and monitoring techniques, these approaches are able to directly watch and study the settlement process in its natural setting. These observational methods provide a more dependable and data-driven approach to settlement prediction by tracking settlement over time and linking it with soil parameters and loading circumstances. Moreover, real-time monitoring and feedback for modifying predictions as the consolidation process progresses are made possible by the incorporation of geotechnical instrumentation, such as piezometers and settlement.[23]

In addition to providing important insights into the behavior of compressible soils under stress, the literature emphasizes the potential of observational methods to improve the accuracy and reliability of one-dimensional consolidation settlement predictions.

Nonetheless, there are still issues with field measurement standardization, calibration, and interpretation, which calls for more study and verification of these techniques in real-world engineering settings.[24]

The literature review highlights the significance of comprehending the intricate aspects impacting fiscal policy outcomes and examines the success and failure of fiscal consolidation in the OECD through multivariate analysis. For OECD nations, fiscal consolidation—which aims to stabilize public debt and reduce budget deficits—has been a major area of policy concern, particularly in the wake of economic crises. Previous research has used a variety of approaches, such as econometric analysis and case studies, to evaluate the efficacy of fiscal consolidation.[25]

Regression techniques in particular, which are part of multivariate analysis, have gained popularity because they can analyze the effects of several variables on fiscal consolidation outcomes at the same time. Numerous variables, including as governmental structures, fiscal regulations, political environments, and economic conditions, have been found by researchers to have an impact on the success or failure of consolidation initiatives.

Through the integration of these variables into multivariate models, researchers hope to offer a more thorough comprehension of the factors influencing the results of fiscal consolidation.[26]

The efficiency of fiscal consolidation policies is still a topic of significant dispute and empirical ambiguity, despite the rising quantity of literature on the subject. Studies provide evidence of successful consolidation in certain cases, but failures or unexpected consequences—like longer recessions or more inequality—are highlighted in others. Furthermore, there are considerable difficulty in proving causal correlations due to methodological issues including endogeneity and data restrictions. Consequently, more investigation using thorough multivariate analysis is required to clarify the complex dynamics of fiscal consolidation within the framework of the OECD.

This literature review presents a synthesis of modern data-driven approaches and classic geotechnical theories for consolidation analysis using a physics-informed data-driven methodology. Traditionally, consolidation analysis—which is essential to comprehending how soil behaves under load—has been based on antiquated ideas like Terzaghi's one-dimensional consolidation theory. However, the shortcomings of these theories—such as their tendency to oversimplify assumptions and their incapacity to fully describe complex soil behaviors.[27]

To get beyond these restrictions, recent studies have looked into combining data-driven techniques with physics-based ideas. Data-driven methods like artificial intelligence and machine learning are combined with physics-informed methodologies to harness the physical understanding of soil dynamics. These methods attempt to capture the

uncertainties and nonlinearities present in the behavior of soil in the actual world, hence improving the accuracy and robustness of consolidation analysis.

Many applications of physics-informed data-driven methods, such as support vector machines, neural networks, and Gaussian processes, are documented in the literature. To train prediction models, these techniques frequently make use of substantial datasets that include consolidation characteristics, loading circumstances, and soil variables. Furthermore, the integration of restrictions derived from physics guarantees that the forecasts align with accepted geotechnical principles.[28]

The research highlights how physics-driven, data-driven methodologies have the potential to transform consolidation analysis by providing a modality between classical theories and modern computer methods, thus enhancing the comprehension and forecasting of soil behavior.

In an effort to simplify the process of estimating consolidation parameters without requiring a lot of laboratory research, a literature analysis on predicting consolidation features from index values looks at the connection between fundamental soil qualities and consolidation behavior. Because they are easily accessed and simple to use, index properties including grain size distribution, specific gravity, and Atterberg limits are frequently employed as surrogates for soil behavior.[29]

Empirical relationships between index features and consolidation parameters, such the compression index (C_c) and coefficient of consolidation (c_v), have been shown in prior research. To create predictive models based on index features, researchers have investigated a variety of regression techniques. With the use of these models, consolidation characteristics for use in geotechnical engineering applications should be quickly and affordably estimated.

Furthermore, researchers have been able to create increasingly complicated models that can capture intricate correlations between index features and consolidation factors because to developments in data mining and machine learning approaches. Notwithstanding encouraging outcomes, issues including soil behavior variability and the requirement for validation across a variety of soil types and environments continue to be causes for worry. Sustained research endeavors are imperative to enhance current models, broaden the scope of relevant soil types, and augment the dependability and precision of forecasts. Additionally, combining non-destructive testing techniques with field data may improve the efficiency of predicting consolidation characteristics from index qualities.[30]

III. CONCLUSION

In conclusion, the literature that has been supplied discusses a range of topics related to soil consolidation parameter prediction methods and electroless coatings. Important conclusions consist of:

1. Electroless coatings provide a multitude of choices, each with special qualities appropriate for certain uses. The most studied coatings are nickel-phosphorus (Ni-P), nickel-boron (Ni-B), and nickel-tungsten (Ni-W). Composite coatings appear to have the potential to improve performance.
2. The choice of electroless coating combinations is influenced by variables including cost concerns, temperature stability, wear resistance, and corrosion resistance. Based on the needs of the application, each combination has pros and downsides that should be carefully considered.
3. Geotechnical engineering methods for forecasting consolidation parameters have changed throughout time, and soft computing approaches like fuzzy logic, artificial neural networks (ANNs), and evolutionary algorithms offer promise for increasing precision and productivity.

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