ORIGINAL ARTICLE

Combination of Formononetin and Sulforaphane Natural Drug Repress the Proliferation of Cervical Cancer Cells via Impeding PI3K/AKT/mTOR Pathway

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Abstract

Natural substances have been demonstrated to be an unrivalled source of anticancer drugs in the present era of pharmacological development. Plant-based substances, together with their derivatives through analogues, play a signifcant character in the treatment of cancer by altering the tumor microenvironment and several signaling pathways. In this study, it was investigated whether the natural drugs, formononetin (FN) and sulforaphane (SFN), when combined, assess the efficacy of inhibiting cervical cancer cell proliferation by impeding the PI3K/Akt/mTOR signaling pathway in HeLa cells. The cells were treated with the combination of FN and SFN (FN+SFN) in various concentrations (0–50 μ M) for 24 h and then analyzed for various experiments. The combination of FN+SFN-mediated cytotoxicity was analyzed by MTT assay. DCFH-DA staining was used to assess the ROS measurement, and apoptotic changes were studied by dual (AO/EtBr) staining assays. Protein expressions of cell survival, cell cycle, proliferation, and apoptosis protein were evaluated by fow cytometry and western blotting. Results showed that the cytotoxicity of FN and SFN was determined to be around 23.7 µM and 26.92 µM, respectively. Combining FN and SFN causes considerable cytotoxicity in HeLa cells, with an IC₅₀ of 21.6 μ M after 24-h incubation. Additionally, HeLa cells treated with FN and SFN together showed increased apoptotic signals and considerable ROS generation. Consequently, by preventing the production of PI3K, AKT, and mToR-mediated regulation of proliferation and cell cycle-regulating proteins, the combined use of $FN + SFN$ has been regarded as a chemotherapeutic medication. Further research will need to be done shortly to determine how efectively the co-treatment promotes apoptosis to employ them economically.

Keywords Formononetin · Sulforaphane · PI3K/AKT/mTOR · Apoptosis · Cervical cancer

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Introduction

 Cancer is the second most powerful cause of death, based on the report from GLOBO-CAN 2020, which predicted that, globally, cancer-related cases and deaths will be approximately 19.3 million annually and 10 million in the year 2020 correspondingly. Cervical cancer is the third most general factor in death in women globally out of all cancers. As one of the most common gynecological malignancies, cervical cancer will afect over six million women in 2020 and cause 342,000 deaths [\[1\]](#page-15-0). Cervical cancer begins to develop earlier in life. Unavoidable attention must be paid to it [\[2](#page-15-1), [3\]](#page-15-2).

Human papillomavirus (HPV) infection that persists is a contributing factor of cervical cancer, which infects the cervix's epithelial cells. High-risk HPV causes uncontrollably multiplying infected cells by interfering with the processes of cell division, replication, and communication once it infects cervical cells [[4](#page-16-0)]. Viral oncoproteins E6 and E7 suppress TP53 and RB1 proteins, changing DNA repair processes, apoptosis, and the cell cycle. Eventually, an HPV infection with oncogenic HPV types can persist and transform healthy cells into abnormal cells, if the body's immune system is unable to eradicate the virus, ultimately leading to cancer [[5\]](#page-16-1). Further, multiple investigations have revealed that extremely dangerous HPV infection, particularly HPV16 and HPV18, which are responsible for above 70% of metastatic cervical malignancies, is linked to about 90% of cervical carcinomas. The main reasons and optimal environment for HPV infection are dysfunction of the cervical-vaginal microbiota and an infammatory reaction [[6\]](#page-16-2). Additionally, as studies progress, bacteria might also have a role in cervical cancer. They also enhance the likelihood of chronic HPV infection and they cause local infammatory responses [[7,](#page-16-3) [8](#page-16-4)].

According to Small et al. [\[9](#page-16-5)], cisplatin-based therapy, brachytherapy, and surgical excision are frequently used techniques to treat those diagnosed with cervical carcinoma. Development of neoadjuvant therapies is needed [\[9\]](#page-16-5). Due to the dismal prognosis, however, treatment resistance and high toxicity are equally concerning [\[10\]](#page-16-6). Therefore, it is necessary to discover novel treatment molecules that suppress carcinogenesis to improve chemotherapy results and upsurge the general survival probability of people with cervical cancer.

Tumor suppressor p16INK4a is up-regulated by HPVs, and this is linked to the PI3K/ Akt/mTOR pathway. When there is a strong chance that HPVs will inactivate the pRb protein, cervical cancer frequently expresses p16INK4a at high levels [[11](#page-16-7)]. Cervical cancer HPV16 infection is linked to S6K phosphorylation. Moreover, the regulation of cell survival, growth, and proliferation is signifcantly infuenced by the phosphatidylinositol 3-kinase (PI3K)/AKT/mammalian target of the rapamycin (mTOR) signaling pathway. Human malignancies frequently include abnormalities in the main PI3K/AKT/mTOR signaling pathway modules. The PI3K/Akt/mTOR circuit is one of many signaling cascades that control numerous cellular and molecular processes that are essential during the initiation, invasion, as well as metastasis of tumors [\[12\]](#page-16-8). Elevation of the signaling pathway consisting of PI3K and Akt has been interconnected to an assortment of human tumors, including cancers of the breast, ovary, endometrial, and malignant glioma, according to some research. Additionally, activation of the PI3K/Akt pathway is associated with a subpar response in cervical cancer [[13](#page-16-9)]. According to this study, cervical cancers could be treated by targeting the PI3K/Akt/mTOR signaling system using a combination of dual natural drugs. Natural compounds originating from plants may be exploited as potential novel therapies for cancer. Phytochemicals can combine with a variety of molecular targets in tumor tissues and increase the efectiveness of conventional anticancer medications.

As indicators for cancer diagnosis, combinatorial epigenetic markings are becoming more signifcant [\[14\]](#page-16-10). To synergistically activate tumor suppressors, the best dietary combination that can lower the level of DNA methylation and deacetylation levels could be chosen [\[15](#page-16-11)]. As a result of their success in treating as well as avoiding cancer, combination strategies are growing in prominence in the feld of cancer research. A quantifable metric known as the Combination Index (CI) has been used to demonstrate that, in many situations, the combination of two or more drugs is better than the combination of chemicals operating alone [\[16,](#page-16-12) [17](#page-16-13)]. The Combination Index evaluates the extent of drug synergism or antagonistic interactions for a certain endpoint of impact assessment [[18\]](#page-16-14). Too frequently, very large dosages of one compound are used to test for efficiency, which may result in side effects. Combining lower doses of the individual drugs may improve their chemopreventive capability and translational effects.

More and more natural compounds are being researched as potential novel medications [\[19](#page-16-15), [20](#page-16-16)]. The isoflavone compound formononetin $(C_{16}H_{12}O_4)$ is mostly found in red clovers and the Chinese plant *Astragalus membranaceus*. The substance goes into a category of 4-position methoxy-substituted 7-hydroisofavones. By modifying several signaling channels, formononetin induces cell death and the cell cycle, inhibits cell invasion, and suppresses tumor-promoting qualities both in vitro and in vivo. Through a synergistic efect, the use of formononetin in combination with other chemotherapeutic medications (such as bortezomib, sunitinib, epirubicin, doxorubicin, temozolomide, and metformin) increases its anticancer potency. Before this study, it showed that the bulk of the trials investigating formononetin's anticancer properties used concentrations between 0.3 and 53.7 μ g/ml (or 1–200 μ M). Formononetin displays an IC₅₀ between 10 and 300 μ M, demonstrating its effectiveness in suppressing a variety of cancer cells [\[21](#page-16-17)]. Formononetin has an anticancer efect; however, the exact mechanism is still unknown. So, the structural alteration of formononetin was crucial in the search for stronger anti-tumor drugs based on the natural substance.

An isothiocyanate (ITC) molecule called sulforaphane is generated from cruciferous plants. Its efectiveness against a variety of cancer types has been demonstrated in several trials. Sulforaphane acts therapeutically in an assortment of ways, including cell cycle arrest in the G2/M and G1 phases to reduce cell growth and detoxify oxidants and carcinogens by blocking phase I metabolic enzymes [\[22](#page-16-18)]. The stimulation of apoptosis, cell cycle arrest, and inhibition of angiogenesis and metastasis are only a few of the anticancer properties that SFN has been related to [\[23,](#page-16-19) [24](#page-16-20)]. According to multiple studies, adding SFN to a common chemotherapeutic drug (such as paclitaxel, docetaxel, or gemcitabine) boosts apoptosis. The fact that numerous articles have addressed how sulforaphane works to prevent cancer [\[25](#page-16-21)[–27](#page-17-0)]. Even thorough, evaluation of sulforaphane's synergistic efects and delivery methods is absent. However, there is no scientifc proof that a combination of FN and SFN has an anticancer efect on cervical cancer especially in target-specifc pathways. In order to investigate their potential synergistic chemopreventive efect against cervical cancer cells, FN and SFN were employed simultaneously in the current investigation. This work focused on molecular processes involved in the PI3K/AKT pathways, which may refect the suppression at the initial phase of cervical cancer development.

Materials and Methods

Reagents

The RPMI 1640 medium, tetrazolium bromide (MTT), fetal bovine serum (FBS), and phosphate-bufered saline (PBS) were obtained from Lonza Pvt Ltd. in China, along with other cell culture ingredients. Dimethyl sulfoxide (DMSO), formononetin (FN), and sulforaphane were purchased from Merck Sigma Aldrich Co. Ltd., St. Louis, USA. We obtained anti-PI3K, AKT, mTOR, cyclin-D1, PCNA, and CDK6 antibodies from Santa Cruz Biotechnology in the USA. The remaining scientifc reagents and solutions had all molecular and sterile grades.

Cell Culture and Maintenance

HeLa, a cell line from a patient with cervical cancer, normal cervical cell line H8 were grown in Dulbecco's modifed Eagle's medium (DMEM) media supplemented with L-glutamine and balanced salt solution (BSS) adjusted to contain glucose, 0.1 mm nonessential amino acids, 1 mm sodium pyruvate, and 1% penicillin/streptomycin/amphotericin B at 37 °C in a humid incubator with 5% $CO₂$.

Cell Viability

After treatment with diferent concentrations of FN and SFN as well as chosen concentrations of the combination drugs, cell viability was assessed using the MTT test [[28\]](#page-17-1). HeLa and H8 cells $(1 \times 10^4$ / well) were trypsinized, placed in a 96-well plate, and given the night to adhere. They were subsequently given treatment for 24 h with specifc chemicals. Following that, $10 \mu L$ of MTT was added to all wells, and the plates underwent another 4 h of incubation at 37 °C. The formazan crystals were removed from the MTT-containing medium, liquefed in 100 µL of DMSO, and added to every well, and the plates were then stirred at 37 \degree C for 10 min. A microplate reader was then used to detect the absorbance of the colored solution at 550 nm. The following formula was used to compute the cell viability:

% viability = (OD value of experimental sample/OD value of experimental control) \times 100

Drug Combinations Assay

The efectiveness of combinatorial therapies and their interactions were evaluated using CompuSyn software [[18](#page-16-14)]. Combination Index (CI) values under 1 indicate drug synergism, over 1 indicates drug additive activity, and more than 1 indicates drug antagonistic behavior.

Morphological Analysis

The morphological changes of HeLa cells were examined using a combination of FN and SFN. The 6-well culture plates with seeded cells were incubated for 24 h. A trinocular inverted phase contrast microscope (Lawrence $\&$ Mayo) was used to examine the cells after incubation to check for alterations in their morphological changes.

Dual Staining with Ethidium Bromide and Acridine Orange (AO/EB)

The proportion of cell apoptosis in HeLa cells treated with FN and SFN was assessed using AO/EtBr staining [[29](#page-17-2)]. In a nutshell, HeLa cells $(1 \times 10^4$ per well) were planted, and the cells were incubated at 37 °C for 24 h. Cells were then treated with FN and SFN and permissible to incubate for 24 h at 37° C. The treated cells were then stained for 10 min with 100 µg/mL of AO/EtBr stain at a 1:1 ratio as part of the treatment step. The amount of apoptotic cell death in the treated cells was quantifed using a fuorescence microscope (3501, Lawrence and Mayo India Pvt, Ltd).

DAPI Staining

To analyze the HeLa cells treated with FN and SFN, the nuclei were stained with DAPI (4,6-diamidino-2-phenylindole), and then fuorescence image analysis (blue fuorescence in living cells) was performed. After 24 h of incubation, the HeLa cells were seeded at a density of 1×10^4 cells/mL on a sample that had been sterilized. The cell morphology was then stained with DAPI and examined under a fuorescence microscope (3501, Lawrence and Mayo India Pvt, Ltd).

Intracellular Generation of ROS

By using DCFH-DA staining on HeLa cells treated with FN and SFN, the level of reac-tive oxygen species (ROS) production in the control group was determined [\[30,](#page-17-3) [31\]](#page-17-4). In a nutshell, DMEM was used to seed HeLa cells (1×10^4) , which were subsequently exposed to FN and SFN for 24 h at 37 °C. After the treatment period, 10 µL of DCFH-DA dye was added to each well and left to stain the cells for 1 h. A fuorescence microscope (3501, Lawrence and Mayo India Pvt, Ltd) was then used to assess the level of ROS formation in control and treated cells.

Measurement of Apoptosis by Flow Cytometry

HeLa cells (1×10^4) were sown in every well and incubated for 24 h at 37 °C in the groups receiving treatment FN and SFN that received medium supplements. HeLa cells were separated using three times diluted trypsin before being twice-washed in PBS and resuspended in the binding bufer in an icy setting. A commercial apoptosis detection kit (Ebioscience, USA) was used to detect the addition of FITC and PI, which completed the technique.

Cell Cycle Arrest Analysis

HeLa cells (1×10^4) were seeded in each well, and after 24 h of treatment with FN and SFN, the cells were trypsinized, recovered, and washed twice in ice-cold PBS. The cells were then fixed by adding 70% ice-cold ethanol and were then incubated at 4 °C overnight. Cells were then exposed to PI and ribonuclease A for 30 min. To count the number of cells at each step of the cell cycle, a fow cytometer was employed.

Western Blot Analysis

Western blotting was employed to examine the effects of the FN and SFN combination on the apoptotic and anti-apoptotic proteins in the treated and control cells [[32](#page-17-5)]. HeLa cells were given 24 h of treatment with the selected drug combinations of FN and SFN in a 100-mm culture dish. After removing the medium, PBS was used to repeatedly wash the cells. After that, lysis buffer was applied to the cells for more than 20 min. The supernatant was then centrifuged and utilized to extract the proteins from the cells. The same quantity of protein was electrophoretically separated on a 12% SDS-polyacrylamide gel from each concentration of the sample. Following each transfer, the proteins were blocked for an hour with 10% skim milk in water before being released. After washing with PBS containing 0.1% Tween-20, the primary antibodies against PI3K, AKT, mTOR, cyclin-D1, PCNA, and CDK6 as well as β-actin were added at a v/v ratio of 1:1000. After overnight incubation at 4 °C, the primary antibodies were removed by washing, and the secondary antibodies were added. The protein bands were visible after 1 h of incubation at room temperature.

Analysis of Statistics

The mean and standard deviation are used to represent the results from three distinct experiments. To assess the signifcance of the diference between the untreated and treated groups, the GraphPad Prism program V6.0 (GraphPad Software 215 Inc., San Diego, CA, USA) was used using the *t*-test $(p < 0.05)$.

Results

Efects of Treatment with FN and SFN on the Viability of HeLa Cell Line

The efects of the combination of FN and SFN on the viability of cervical cancer and normal cervical cells were assessed using the MTT (3-(4,5-Dimethylthiazol-2-yl)-2,5-Diphenyltetrazolium Bromide) test. The efects of various doses of the therapy combination on HeLa cancer cell and normal H8 cell lines are depicted in Fig. [1a](#page-6-0). The impact of FN and SFN on cervical cancer cells was investigated in both solo therapy and combo. We detected a dose-related diminution in the proliferation of treated cancer cells when compared to the standard and independent therapies; this efect was also found to be stronger when drug combinations were administered. Table [1](#page-6-1) and Fig. [1](#page-6-0) display the viability of cells at the chosen as well as treated dosages, whereas the combination of FN and SFN did not exhibit any appreciable alteration in the viability of normal H8 cells (Fig. [1b](#page-6-0)). Furthermore, the crystal

Fig. 1 a Cytotoxicity study of FN and SFN against **a** HeLa cells and **b** H8 cells. Cell viability was examined using the MTT assay; subsequently, the cells had been treated for 24 h. The presented data were the means \pm SD. Compared to the untreated group, **P* < 0.05. **c** The combination of FN and SF-treated HeLa cells were stained with crystal violet. The studies were done in triplicate

violet assay, which is illustrated in Fig. [1c](#page-6-0), was used to study the combination treatment of FN- and SFN-related cell proliferation. Crystal violet staining is more pronounced in control cells, indicating a high level of cell proliferation. However, cervical cancer cell's rate of multiplication was dramatically reduced by the combination of FN and SFN treatment.

Evaluation of Drug Interactions

The Combination Index (CI) was calculated using the CompuSyn program. In cervical cancer cell lines, it was discovered that the doses of 10 μ M, 20 μ M, and 30 μ M FN and SFN simultaneously decreased cellular viability. The CI indices in certain of the combinations are displayed in Table [2](#page-6-2). The value of $CI > 1$ indicates that there is antagonism between the two compounds. The values of $CI = 1$ and $\lt 1$ suggest that there is synergy among the two components. The CI value in HeLa cells is in the region of synergism at 10 µM FN and 10 μ M SFN (CI 0.5), whereas at 30 μ M FN and 20 μ M SFN, the CI values indicate significant synergism (CI 0.57). We consequently reached the decision to continue using based on the IC_{50} values for our additional studies to investigate their impact at the molecular level.

Morphological Analysis

Using a phase contrast microscope, the morphological examination of HeLa cells was evaluated, and the efectiveness of delivering compounds at various concentrations was examined. As can be observed in Fig. [2,](#page-7-0) the control cells have morphological

SFN

Control

FN+SFN

Fig. 2 The morphological alterations seen in phase contrast microscopy from the control, FN, SFN, and the combination of FN and SF-treated HeLa cervical cancer cells. White arrows indicate viable cells, dashed arrows show cell death. Scale bar, 50 μm

appearances which are regular, whereas those receiving treatment have undergone considerable morphological alterations that include cell contraction, blebbing, as well as separation from the exterior. In the treatment groups with larger concentrations, or in a concentration-reliant way of combinatorial treatment, these alterations were found to be more substantial. As a result, it has been demonstrated that the combination of FN and SFN had a dose-dependent ameliorative effect on cervical cancer.

Activation of Apoptosis by Combination of FN and SFN

Here, we used AO/EtBr staining to show how the interaction of FN and SFN afects the capacity of cervical cancer cells to undergo apoptosis. AO/EtBr labelling is a popular method for viewing chromatin abridgement during apoptosis under a fuorescent microscope. The apoptotic cells in HeLa cells received treatments with FN, SFN, and a combination of FN and SFN for 24 h, according to fuorescence microscopy (Fig. [3\)](#page-8-0). The nucleus of the control cell fuoresced consistently green. Fluorescent microscopy, on the other hand, demonstrated that the treated HeLa's nucleus structure was irregular as a result of a loss of membrane integrity. In formulations where cells received both FN and SFN treatment, apoptosis bodies, involving nuclear constriction and bulging, were observed as red-orange bodies. Therefore, the results of the current investigation showed that the combination of FN and SFN treatment had superior anti-tumor efects on cervical carcinoma cells in a concentration-based manner. The ratio of apoptotic cells was 74.45, 76.23, and 87.46% respectively at the various concentrations (10, 20, and [3](#page-8-0)0 μ M/mL) of the FN- and SFN-treated groups (Fig. 3b).

Fig. 3 a The cells were stained with AO/EtBr to check the apoptosis stage with a combination of FN and SFN. **b** The bar diagram represents the % apoptosis in control, FN, SFN, and combination uses of FN+SFN-treated cells. White arrows indicate live cells, dashed arrows show apoptosis. Magnifcation bar, 50 μm

Fig. 4 HeLa cells treated with FN and SFN at various doses and control nuclei stained with DAPI. Untreated control cells display less strong blue coloration and spherical nuclei. Cells that had been exposed to both FN and SFN exhibited nuclear fragmentation and signifcantly stronger blue emission light in apoptotic cells (indicated by arrow). Scale bar, 50 μm

DAPI Staining

Additionally, DAPI staining was used to examine nuclear fragmentation as a marker of FN and SFN combination therapy (Fig. [4\)](#page-9-0). The outcome shown in Fig. [4](#page-9-0) illustrates how the combination treatment of FN and SFN caused nuclear disintegration and condensation. DAPI staining in control cells had decreased intensity at an excitation wavelength of 488 nm, whereas combination therapy cells displayed greater intensity, indicating the infuence of FN and SFN in breaking down DNA in a dose-dependent way. Therefore, it has been demonstrated that these responses have simultaneously increased with the combination treatment of FN and SFN, as shown in Fig. [4](#page-9-0).

Fig. 5 Using 2,7-dichlorofuorescein diacetate labelling, it was possible to study in HeLa cells the efects of both FN and SFN on the formation of intracellular ROS. **a** Fluorescence microscopic image demonstrating the efect of FN, SFN, and FN+SFN on the generation of intracellular ROS (indicated by arrow). **b** The percentage of reactive oxygen species (ROS) generation was found using a spectrofuorometer. For comparison to the control group, the statistics are the mean and standard deviation of triplicates with a $p < 0.05$ signifcance level. Scale bar, 50 μm

Production of Signifcant ROS by the Combination of FN and SFN

DCFH-DA staining was used to measure the generation of ROS by HeLa cells following FN and SFN therapy. Over 24 h, HeLa cells were detectable by FN and SFN in combination in a dose-dependent manner. HeLa signifcantly increased ROS production and fuorescence intensity (Fig. [5](#page-10-0)a). The amount of green fuorescence signifcantly increased after being exposed to FN and SFN for 24 h, as shown in (Fig. [5a](#page-10-0)); the ROS levels in these cells were calculated to be 50 (control), 190, 210, and 270, respectively (Fig. [5b](#page-10-0)). After receiving treatment with both FN and SFN, HeLa cells produced more ROS, and this increase was dose-dependent. These fndings demonstrated the HeLa cells' innate apoptotic signaling pathways.

Combination of FN‑ and SFN‑Induced Apoptosis Along with Cell Cycle Arrest in HeLa Cancer Cells

The percentage of apoptotic and necrotic cells shown in Fig. [6](#page-11-0) was calculated using an apoptosis kit that included FITC-labelled annexin V and PI Staining. The comparison of the HeLa cells treated with control and combination FN and SFN and the results showed substantial diferences. FN, SFN, and FN with SFN showed apoptotic cell percentages of 14.26 ± 2.3 and $24.49 \pm 1.6\%$, and 30.41 ± 1.8 , respectively. Our research showed that combination therapy of FN and SFN improved the number of cells in the Q2 phase of apoptosis. It was found that when HeLa cells were treated with a mixture of FN and SFN, the proportion of apoptotic cells increased in respective concentration manner. This investigation

ANNEXIN V-FITC

Fig. 6 Analysis of the apoptosis using flow cytometry. * There is a significant difference (* $p < 0.05$) from the control group

was conducted to fnd out the efectiveness of composites FN and SFN in cell cycle inhibition. The fndings of the cell cycle analysis performed on the treated cells are displayed in Fig. [7](#page-12-0). The cells were dispersed across the untreated control in the S and G1 phases of the cell cycle. Because of this, at higher concentrations (55.48%), the proportion of cells in the G0/G1 phase had suggestively decreased subsequently co-treating with FN and SFN at diferent concentrations. These fndings show how the FN and SFN interfere with the cell cycle's S-phase, perhaps causing cancer cell death.

Combination of FN and SFN Impede PI3K/AKT/mTOR Phosphorylation in HeLa Cells

To comprehend the impact of FN and SFN combination therapy on the phosphorylation of PI3K/AKT/mTOR in HeLa cells, western blot analysis was performed (Fig. [8\)](#page-13-0). HeLa cells severely decreased the phosphorylation of cell survival indicators (PI3K, AKT, and mTOR) when exposed to the combination of FN and SFN (10, 20, 30 μ M) for 24 h. These fndings showed that FN and SFN together suppress PI3K/AKT/mTOR signaling in HeLa cells (Fig. [8](#page-13-0)a, b). Furthermore, when FN and SFN were used in conjunction, the overexpression of cell cycle-directing proteins such as cyclin-D1, PCNA, and CDK6 in

Fig. 7 Analysis of the cell cycle using fow cytometry. **a** FITC and Annexin V-stained fow cytometry were used to assess the apoptotic cells connected to FN and SFN therapy. **b** The proportion of cells in the G0/ G1 phase is shown on a histogram; the information is from three associated investigations. Employing the Student's *t*-test, $(*p < 0.05 **p < 0.01)$ was compared to the control

HeLa cells was severely suppressed (Fig. [8](#page-13-0)c, d). Thus, by inhibiting or down-regulating the PI3K/AKT/mTOR signaling pathway, the co-treatment of FN and SFN on HeLa cells has synergistically inhibited cell propagation and promoted apoptosis, suggesting that this novel combination could be a promising potential therapeutic tactic for the management of cervical cancer.

Discussion

Globally, cervical carcinoma continues to be one of the main causes of signifcant morbidity and mortality in women. Chemotherapy can help cervical cancer patients live longer, but it also increases drug resistance and has harmful side efects and consequences that put patients through a lot of pain. The use of natural substances produced by plants, such as alkaloids, favonoids, phenols, and terpenoids, as a novel anticancer therapy for cervical cancer has garnered interest. The natural favonoids found in FN and SFN are shown to have therapeutic benefts on the growth and spread of several malignancies. Increasing evidence suggests that dysregulation of numerous signaling pathways that encourage proliferating, prevent apoptosis, and trigger metastasis is linked to the development and spread of many malignancies, including cervical cancer [\[33\]](#page-17-6). Identifcation of prognostic and predictive biomarkers is required for risk categorization. The PI3K/Akt/mTOR (phosphatidylinositol 3-kinase/protein kinase B/mammalian target of rapamycin) pathway is frequently abnormal in cervical carcinoma, suggesting that it can be a possible target for therapy for the cure of this malignancy. It could also be used as an innovative biomarker in the evaluation of the risk of creating cervical carcinoma [[12](#page-16-8), [34](#page-17-7)]. In this work, we discovered that combinations of natural medications, such as FN and SFN, reduced cell development and caused cell death in cervical cancer, helping to establish a realistic therapy efficacy against the disease.

Fig. 8 Efect of FN+SFN on HeLa cells' PI3K/AKT/mTOR pathway. **a** Western blotting tests on the combination FN+SFN therapy caused the expression of p-PI3K, p-AKT, and p-mTOR in HeLa cells. **b** PI3K/ AKT/mTOR densitometric measurements were evaluated using the Image Studio software. β-actin expression is regarded as a housekeeping gene to ensure that proteins are loaded equally. The mean \pm SD of three separate sets of data was used as a representation for the variables. ***p* <0.01 and **p* <0.05 compared to the untreated group. **c** Western blotting tests on the effects of FN+SFN treatment on the expression of the proteins cyclin-D1, PCNA, and CDK6 in HeLa cells. **d** The image Studio program evaluated the densitometric study of the proteins mentioned previously. The equal loading of proteins was confrmed by the production of the housekeeping gene—actin. Three diferent experiments' mean and standard deviation data were evaluated. $\frac{k}{p}$ < 0.05 and $\frac{k}{p}$ < 0.05 after associated to the control group

Therapy with an individual agent is not recommended over combination therapy including multiple therapeutic agents, each of which has a unique mechanism of action [\[35\]](#page-17-8). The numerous processes for cell survival are targeted by combination therapy, which promotes synergism and offers a viable remedy for tumor heterogeneity and drug resistance [\[36,](#page-17-9) [37](#page-17-10)]. According to numerous researches, sulforaphane boosts the efectiveness of medications and has a synergistic impact when given along with other drugs [[36](#page-17-9), [38](#page-17-11)–[41](#page-17-12)]. Further, formononetin acts as an isofavone derived from *A. membranaceus* which can promote tumor metastasis, inhibit cell cycle progression, and anti-angiogenesis. Additionally, it has been indicated to possess tumor-suppressive qualities in instances involving breast, colorectal, and lung cancer [\[42\]](#page-17-13). The above outcomes were shown to be associated with our results when given as a single therapy. Our fndings further show that although FN and SFN each exhibit anti-carcinogenic characteristics on their own [[41](#page-17-12), [43,](#page-17-14) [21,](#page-16-17) [44](#page-17-15)], when delivered together, their efficacy is marginally stronger with a lower concentration. In the current investigation, it was shown that FN and SFN co-treatment, when compared to a single treatment, synergistically boosted the induction of apoptosis and inhibited growth in HeLa cells in vitro.

Inhibiting apoptosis is necessary for tumor development. Researcher's interest in the mechanisms driving apoptosis-mediated cell death, which is linked to a number of human illnesses, has increased recently [[45](#page-18-0)]. According to DAPI staining, cervical cancer cells exposed to a combination of FN and SFN showed a signifcant amount of blue fuorescence, but control calls exhibited a very low level of blue fuorescence. These fndings demonstrated that the combination of FN and SFN signifcantly worsened nuclear damage in HeLa cells. Employing the AO/EtBr dye and a dual staining method, the apoptotic response of the combination of FN and SFN against HeLa was investigated. The AO stain could be accessible to live cells (green), in contrast to EtBr, which leaves cell debris stained with a reddish-orange color. The combined use of FN and SFN promoted apoptosis in the cervical cancer cell line, as evidenced by the red intensity fuorescence of the combination-treated cells being greater than that of control cells. Genistein and sulforaphane are efective in preventing breast cancer cells in previous studies [[43](#page-17-14)], while formononetin signifcantly inhibits cervical cancer cells by reducing the expression of the MYC protein and inhibiting STAT3 activation via the JAK1/STAT3 pathway [[44](#page-17-15)].

One of the most important organelles for controlling cell death is the mitochondria, which also includes other apoptosis-related markers. ROS, sometimes referred to as free radicals, are extremely active molecules with unattached valence shell electrons that cause a lot of oxidative damage to the cell [[46](#page-18-1), [47\]](#page-18-2). Elevated ROS concentrations are thought to be the primary cause of cell death. Additionally, the production of ROS in cancer cells is one of the ways through which the combination of FN and SFN has an anticancer impact. To calculate the quantities of intracellular ROS, fuorescence intensities of FN and SFN might be combined. According to the results of the ROS experiment, HeLa cells co-treated with FN and SFN are known to create more ROS when compared to the control group.

Many diferent proteins have been suggested to play a signifcant part in metastatic malignancies. The current work discovered an innovative compound that serves as a signifcant anticancer target by preferentially destroying cancer cells in HeLa cells by blocking the PI3K/AKT/mTOR signaling pathway [\[48\]](#page-18-3). Furthermore, because distinct PI3K isoforms play distinctly diferent roles in cellular signaling, proliferation, and neoplastic transformation, targeting one isoform through removal will impact downstream signaling in its own right [\[49\]](#page-18-4). In this instance, FN and SFN together dramatically reduced the expression of p-PI3K, p-AKT, and p-mTOR in the HeLa cancer cell line in comparison to the control. AKT contains multiple downstream targets which could play a role in transforming tumors and is the main modulator of PI3K-initiated signaling [[50](#page-18-5)]. Once Akt is phosphorylated, mTOR is activated. Moreover, p-AKT and p-mTOR were found in 50% and 53% of adenocarcinomas, accordingly, based on expression evaluation of activating AKT and mTOR in patients who had cervix cancer [[51](#page-18-6)]. Therefore, the combination of FN and SFN signifcantly reduced the expression of p-AKT in all HeLa cancer cell lines in a dose-responsive manner. This additionally clarifes why considerable inhibition of PI3K/ AKT/mTOR boosted apoptosis promoted by the combination of FN and SFN in the cervical cancer cell line. Inhibition of p-AKT induced by the combination of FN+SFN on HeLa was noticeable.

Given that the PI3K/AKT/mTOR pathway is known to promote cell cycle progression [[52](#page-18-7)]. Many diferent proteins, such as cyclins, CDKs, and CDKis, control the cell cycle [[53](#page-18-8)]. It inspired us to investigate the cyclin expression defned in the current work, which ultimately found that $FN + SFN$ caused cell cycle arrest by inhibiting the levels of cyclins D1 and CDK6 in HeLa cells, indicating that these kinds of proteins have been implicated in the development of the cell cycle in the cervical cancer cell line used. All things considered, these fndings suggest that cyclin expression reductions have a role in the PI3K/ AKT-mediated G0/G1 arrest. Crucially, suppression of cyclins and PCNA mediates the combination of FN- and SFN-induced cell cycle arrest, which could therefore lead to a reduction in CDK enzyme activity. We demonstrated the fact that strong repression of the PI3K/AKT/mTOR pathway can encourage apoptosis and impede the growth of tumors by controlling the expression of cell cycle regulatory proteins. This suggests that the combined use of FN and SFN may be a valuable cancer prevention therapeutic prospective applicant.

Conclusion

FN and SFN together form an efective combinatorial regimen that can improve cervical cancer's translational chemopreventive capacity, according to the current study's result. The combination of FN and SFN therapy had an anticancer impact on cervical cancer in vitro for the frst time owing to our work. By inhibiting the cell cycle and triggering caspase-mediated intrinsic apoptosis, the combination of FN and SFN signifcantly decreased the viability of cervical cancer cells. After reducing the expression of cyclin-D1, PCNA, and CDK6 proteins, FN and SFN therapy down regulated the PI3K, AKT, and mTOR signaling pathways, which had an anticancer impact on cervical cancer. Therefore, by inducing cell death, the combination of FN and SFN ofers promise as an efective chemopreventive strategy for preventing cervical carcinogenesis. Indeed, FN and SFN combination treatment might be used in clinical medicine with more studies to create regulated doses.

Author Contribution P.J.: conceptualization, methodology, original draft preparation; W.J.: writting and data curation; X.L.: review and editing; Q.Z.: supervision. Overall, all authors read and approved the final version of the manuscript.

Data Availability The data generated and the materials used in the study are available with the corresponding author and available on reasonable request.

Declarations

Ethical Approval Not applicable.

Consent to Participate Not applicable.

Consent for Publication All authors agreed to publish this paper in this journal.

Competing Interests The authors declare no competing interests.

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