



A novel approach for studying receptor-ligand interactions on living cells surface by using NUS/T1ρ-NMR methodologies combined with computational techniques: The RGDechi15D- $\alpha_v\beta_5$ integrin complex



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ABSTRACT

Structural investigations of receptor-ligand interactions on living cells surface by high-resolution Nuclear Magnetic Resonance (NMR) are problematic due to their short lifetime, which often prevents the acquisition of experiments longer than few hours. To overcome these limitations, we developed an on-cell NMR-based approach for exploring the molecular determinants driving the receptor-ligand recognition mechanism under native conditions. Our method relies on the combination of high-resolution structural and dynamics NMR data with Molecular Dynamics simulations and Molecular Docking studies. The key point of our strategy is the use of Non Uniform Sampling (NUS) and T1ρ-NMR techniques to collect atomic-resolution structural and dynamics information on the receptor-ligand interactions with living cells, that can be used as conformational constraints in computational studies. In fact, the application of these two NMR methodologies allows to record spectra with high S/N ratio and resolution within the lifetime of cells. In particular, 2D NUS [¹H-¹H] trNOESY spectra are used to explore the ligand conformational changes induced by receptor binding; whereas T1ρ-based experiments are applied to characterize the ligand binding epitope by defining two parameters: T1ρ Attenuation factor and T1ρ Binding Effect. This approach has been tested to characterize the molecular determinants regulating the recognition mechanism of $\alpha_v\beta_5$ -integrin by a selective cyclic binder peptide named RGDechi15D. Our data demonstrate that the developed strategy represents an alternative in-cell NMR tool for studying, at atomic resolution, receptor-ligand recognition mechanism on living cells surface. Additionally, our application may be extremely useful for screening of the interaction profiling of drugs with their therapeutic targets in their native cellular environment.

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1. Introduction

The discovery of ligands able to discriminate among different receptor subtypes presenting high sequence and structure homology, but different biological effects, is a challenge in the biomedical

field to gain drugs, without the side effects due to interactions with 'off-target' proteins [1,2]. An approach to obtain highly target-selective ligands is the identification of novel scaffolds designed to bind to more than one site of the target receptor, thus providing therapeutic/diagnostic benefits. So far, the development of membrane receptor-binding ligands has relied on data from *in vitro* biophysical characterizations, *in vivo* or *in cellulo* biological assays or *in silico* structure-based receptor-ligand targeting approaches [3]. Of note, both *in vitro* and *in silico* techniques provide information

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on the receptor-ligand interactions under non-native conditions. Consequently, ligand properties characterized in absence of cellular environment may not reflect the efficacy that the ligand shows *in vivo*, where the presence of various cellular environmental factors can influence the receptor-ligand recognition mechanism.

Therefore, to identify binding epitopes or to decipher the mechanism of action of a particular ligand, it is extremely important to describe the structural, dynamics and functional features driving receptor-ligand interactions within a cellular environment. In this scenario, in-cell and on-cell Nuclear Magnetic Resonance Spectroscopy (in-cell/on-cell NMR) represents a powerful technique for studying, at atomic resolution, protein-protein and protein-ligand interactions, directly in the intracellular environment or on the membrane surface of living cells [4–8]. In particular, in- and on-cell NMR methods based on the observations of ligands, including transfer NOESY (trNOESY) and saturation transfer difference (STD), are widely used to characterize binding of ligands to membrane receptors on the cell surface [9–11].

trNOESY NMR experiment is used to explore the ligand conformational changes induced by receptor binding; whereas STD NMR method is applied to characterize the ligand binding epitope revealing the closest bound moieties to the receptor. However, the application of both NMR techniques is strongly limited by the short lifetime of cells in an NMR sample tube, that does not allow to record spectra with high S/N ratio and resolution. For these reasons, the use of trNOESY and STD experiments for direct evaluation of receptor-ligand interactions under complex conditions with living cells is challenging. Therefore, in order to overcome these drawbacks, we developed an alternative NMR-based strategy that combines high-resolution structural and dynamics NMR data with Molecular Dynamics (MD) simulations and Molecular Docking studies. In details, our approach relies on the acquisition of 2D trNOESY spectra, using NUS in combination with spectral reconstruction by non-Fourier transform methods, for studying the ligand conformational changes, upon binding and on the measurement of 1D T1ρ experiments, as alternative tool to the STD NMR method, for defining the ligand binding epitope.

We applied this on-cell NMR approach to describe, at atomic resolution, the molecular determinants regulating the recognition mechanism of $\alpha_v\beta_5$ integrin by a selective cyclic binder peptide. Integrins are a family of transmembrane receptors composed of many subtypes, all arranged as heterodimers, generated by the combination of 18 α and 8 β different subunits that act as key receptors for cell adhesion to the extracellular matrix providing support for cells, regulating cell migration and reaction to the microenvironment. Genetic alteration or dysregulation of integrin expression are correlated with the onset of many human diseases [12]. Within integrins, the RGD-binding receptors $\alpha_v\beta_3$, $\alpha_v\beta_5$, and $\alpha_5\beta_1$ constitute the key members of the family involved in all stages of cancer progression, including tumor cell proliferation, angiogenesis, invasion, and metastasis [13]. Over the last decade, we designed and characterized a bi-functional peptide (RGDechi) including a cyclic RGD pentapeptide for integrins binding, covalently linked by a spacer at a C-terminal echistatin fragment to confer a high selectivity for the β_3 receptor [14]. *In vitro* and *in vivo* studies [15–23] proved the selective interaction of this peptide with $\alpha_v\beta_3$ integrin, and structural analysis, based on a combination of NMR and computational studies, using $\alpha_v\beta_3$ embedded in cancer cell membranes, highlighted the molecular details of the binding [19]. To validate the recognition model and the pivotal role of the hCit¹⁵ in the binding to the β_3 chain, we designed a derivative named RGDechi15D, where hCit¹⁵ was replaced by an Asp residue. This substitution shifted the selectivity from $\alpha_v\beta_3$ to $\alpha_v\beta_5$, in accordance with the different amino acid composition of the two integrin subunits, and provided a novel $\alpha_v\beta_5$ antagonist as confirmed by *in vitro* studies [24].

Here, we report the first application of an alternative approach to investigate the structural details driving the formation of the $\alpha_v\beta_5$ -RGDechi15D complex. Our strategy can be considered a general approach for the investigation of ligand-receptor interactions on living cells surface and can be eventually applied to a variety of other cellular interactions.

2. Materials and methods

2.1. Peptide synthesis

RGDechi15D was synthesized as previously reported [19]. The amino-acid sequence of the peptide is: K-R-G-D-e-M-D-D-P-G-R-N-P-H-D-G-P-A-T. The residues of the RGD cycle are underlined.

2.2. Cells preparation

Human adenocarcinoma cells line (HeLa) and human hepatocarcinoma (HepG2) from ATCC, were grown in DMEM supplemented with 10% fetal bovine serum (FBS), 2 mM glutamine, 100 U/mL penicillin and 100 mg/mL streptomycin (Euroclone, Italy). The cells at 80% confluence were detached with EDTA 0.1 mM in PBS to maintain the receptor integrity then were collected and re-suspended in PBS (1×10^7 cells/mL) to perform NMR analyses.

2.3. Analysis of Caspase-3 activity

Determination of caspase-3 activity was performed by a fluorometric assay as described elsewhere [25].

2.4. Invasion assay

Cell invasion was assayed using transwell chambers coated with ECL Cell Attachment matrix (Millipore Corporation) as reported in a previous publication [20].

2.5. Cells viability and plating colony tests.

Cell viability was measured by Trypan blue exclusion test performed before and after NMR analysis. Briefly, cells were harvested and resuspended in 1 ml of HBSS. 0.2 ml of cell suspension were added to 0.5 ml of PBS and 0.3 ml of 0.4% of Trypan blue solution (Lonza, Walkersville, MD USA). After 5 min at room temperature, cells were counted in a Burker's chamber. Cell number was measured with a Zen 3.1 software. Cell viability was measured as % of live cells on total cells. Experiments have been performed in triplicate and five counts have been made for every sample. Results have been reported as mean % of live cells \pm SEM. Afterwards, cell suspension was centrifuged, pellet was resuspended in the culture medium described above and plated in culture dish at 37 °C 5% CO₂ for 24 h. Cells were observed with an AxioVert 25 Microscope (Zeiss) and imaged by a Zen 3.1 software

2.6. Natural-abundance nuclear Magnetic resonance (NMR) spectroscopy

NMR natural-abundance experiments of RGDechi15D were performed by using a Bruker AVIII HD 600 MHz spectrometer equipped with a triple resonance Prodigy N2 cryoprobe having z-axis pulse field gradient. NMR samples were prepared by dissolving the peptide in 200 μ L of Hank's balanced (HBSS) buffer pH 7.4 and 10% ²H₂O in a 3-mm NMR tube. ¹H, ¹⁵N and ¹³C chemical shift assignments were performed by using the optimized protocol

reported in a previous publication[23]. Briefly, the following spectra were acquired and analyzed:

- 2D [^1H - ^1H] Total Correlation Spectroscopy (TOCSY)[26], 2D [^1H - ^1H] Nuclear Overhauser Effect Spectroscopy (NOESY)[27] and 2D [^1H - ^1H] Rotating frame Overhauser Effect Spectroscopy (ROESY)[28] were acquired using 32 scans per t1 increment, a spectral width (SW) of 6001.33 Hz along both dimensions, a 3.0 s relaxation delay and 2048×256 complex points in t2 and t1, respectively. The 2D [^1H - ^1H] TOCSY spectrum was measured using a homonuclear Hartmann-Hahn transfer through a MLEV17 sequence using a mixing time of 70 ms and 10 KHz spin-lock field strength. The 2D [^1H - ^1H] NOESY experiment was acquired with a mixing time of 250 ms. The 2D [^1H - ^1H] ROESY was carried out with a CW spin-lock field strength of 4 kHz, a mixing time of 250 ms and 5.0 s relaxation delay. In all bi-dimensional [^1H - ^1H] experiments, water suppression was achieved by means of Watergate pulse sequence with gradients using double echo. All 2D spectra were apodized with a square cosine window function and zero fill to a matrix of size 4096×1024 before Fourier transform and baseline correction.

- 2D [^1H - ^{15}N] Hetero-nuclear Single Quantum Coherence Spectroscopy (HSQC) experiment was recorded with 880 scans per t1 increment, a spectral width of 1581.26 Hz along t1 and 6001.33 Hz along t2, 2048×256 complex points in t2 and t1, respectively, and 1.0 s relaxation delay. The [^1H - ^{15}N] HSQC was apodized with a square cosine window function and a zero filling to a matrix of size 4096×1024 before Fourier transform and baseline correction.

- 2D [^1H - ^{13}C] Hetero-nuclear Single Quantum Coherence Spectroscopy (HSQC) spectrum was acquired with 800 scans per t1 increment, a spectral width of 5131.08 Hz along t1 and 6001.33 Hz along t2, 2048×200 complex points in t2 and t1, respectively, and 1.0 s relaxation delay. The [^1H - ^{13}C] HSQC constant time version ([^1H - ^{13}C] CT HSQC) pulse sequence was acquired with a coupling constant $J_{\text{XH}} = 145$ Hz, constant time period of 13.3 ms. The [^1H - ^{13}C] CT HSQC was apodized with a square cosine window function and zero fill to a matrix of size 4096×4096 before Fourier transform and baseline correction.

Natural-abundance NMR measurements for characterizing the RGDechi15D backbone dynamics were performed at 600 MHz and $T = 298$ K. The acquisition parameters of the NMR experiments used to describe the backbone motions are described below:

- 2D T2-filter [^1H - ^{15}N] Hetero-nuclear Single Quantum Coherence Spectroscopy (HSQC) experiment was recorded with 880 scans per t1 increment, a spectral width of 1581.26 Hz along t1 and 6001.33 Hz along t2, 2048×128 complex points in t2 and t1, respectively, and 1.0 s relaxation delay. The [^1H - ^{15}N] T₂-filter HSQC experiments were measured by using two different relaxation-compensated CPMG periods (125 ms and 250 ms). The T₂ filter [^1H - ^{15}N] HSQC was apodized with a square cosine window function and a zero filling to a matrix of size 4096×1024 before Fourier transform and baseline correction.

Amide temperature coefficients and $^3J_{\text{HNH}\alpha}$ couplings constants were obtained by measuring one-dimensional (1D) ^1H spectra with the following acquisition parameters: spectral width of 7211.54 Hz, relaxation delay 1.0 s, 7 K data points for acquisition and 16 K for transformation.

All 2D NMR spectra were processed by using NMRPipe[29] and analyzed using SPARKY[30] and CARA[31] software.

2.7. NMR measurements with living cells

NMR experiments for studying integrin-RGDechi15D interactions within a cellular environment were acquired in the presence of HeLa and HepG2 living cancer cells. In order to avoid the internalization of the peptide all measurements in the presence and absence of cells were performed at 278 K. NMR cell samples were prepared dissolving 0.5 mg of RGDechi15D or RGDechi^{Linear} in 200 μL of Hank's balanced (HBSS) buffer pH 7.4 and 10% $^2\text{H}_2\text{O}$ containing 1×10^7 cells/ mL (HeLa or HepG2). In both cellular environments 2D [^1H - ^1H] TOCSY spectra were carried out using 16 scans per t1 increment, a spectral width (SW) of 7201.56 Hz along both dimensions, a 1.0 s relaxation delay and 2048×128 complex points in t2 and t1, respectively. The 2D [^1H - ^1H] TOCSY spectrum was measured using a homonuclear Hartmann-Hahn transfer through a MLEV17 sequence using a mixing time of 70 ms and 10 KHz spin-lock field strength. The 2D [^1H - ^1H] TOCSY spectra were apodized with a square cosine window function and zero fill to a matrix of size 4096×1024 before Fourier transform and baseline correction. The bi-dimensional NOESY spectra were acquired using Uniform (US) and Non Uniform Sampling (NUS) (50% random sampling). The spectral width along both direct and indirect dimensions was 7201.56 Hz. The 2D [^1H - ^1H] NOESY spectra were acquired by using a mixing time of 250 ms and 64 number of scans (32 for the uniform sampling version). The number of complex points was 2048 and 100 (50% NUS) for direct and indirect dimension, respectively. NUS data were reconstructed using two different protocols: IST (Iterative Soft Threshold) and IRLS (Iterative Reweighted Least Squares) [32] implemented in Bruker Topspin 4.0.1. The reconstructed NUS data were then processed with NMRPipe [29]. NUS data were zero-filled to a matrix of size 2048×2048 .

T1 ρ NMR experiments were measured for the RGDechi15D peptide before (free form) and after addition of HeLa and HepG2 living cancer cells. All spectra were recorded with a spectral width of 7201.56 Hz and 28 844 data points. For each sample a couple of spectra were measured by changing the duration of the T1 ρ spinlock from 10 ms (reference spectrum) to 400 ms. A total number of 512 scans were recorded reaching a measurement time of 22 min and 25 min for the shorter (10 ms) and longer (400 ms) spinlock time, respectively. All T1 ρ NMR experiments were acquired by using a Rf field strength for the T1 ρ spinlock of 7000 Hz.

^1H Saturated Transfer Difference (STD) experiments were acquired on the NMR cell samples with 3 000 and 1 000 scans for the long and short version, respectively. STD spectra were acquired with on-resonance irradiation at 0.2 ppm to selectively saturate (total saturation time of 2 s) protein resonances and off-resonance irradiation at 30 ppm for reference spectra by using the standard Bruker pulse sequence. STD spectra were acquired with a spectral width of 7201.56 Hz, 1.0 relaxation delay, 16 k acquisition points for acquisition

All T1 ρ and STD NMR spectra were processed and analyzed using MestRe Nova (Mnova) software (Mestrelab Research S.L., Santiago de Compostela, Spain).

2.8. Chemical shifts evaluation and T1 ρ data elaboration

^1H , ^{13}C and ^{15}N chemical shifts at 298 K were calibrated indirectly by external DSS reference.

Secondary chemical shifts for C α , H α , H_N and C β were calculated by using as random coil shifts the values defined by Kjaergaard et al.[33], De Simone et al.[34] and Tamiola et al.[35]. The statistical probability of a trans or cis Xaa-Pro peptide bond was obtained by Promega[36] software using the following information: amino acid sequence of the peptide, proline chemical shifts and backbone chemical shifts of neighbouring residues. The per-residue

model-free order parameters (S^2) for the backbone amide groups were predicted from the backbone and C β chemical shifts using the Random Coil Index approach[37,38]. The structural rearrangements of RGDechi15D induced by mutation were estimated by applying combined ^1H ($\Delta\delta_{\text{H}}$), ^{15}N ($\Delta\delta_{\text{N}}$) and ^{13}C ($\Delta\delta_{\text{C}}$) Chemical Shift Perturbations (CSPs) based on the equation reported below:

$$\Delta_{(\text{H,N,C})} = ((\Delta\delta_{\text{H}}W_{\text{H}})^2 + ((\Delta\delta_{\text{N}}W_{\text{N}})^2 + ((\Delta\delta_{\text{C}}W_{\text{C}})^2)^{1/2}$$

in which W_{H} , W_{N} and W_{C} are weighing factor for ^1H , ^{15}N and ^{13}C shifts defined as $W_{\text{H}}=|\gamma_{\text{H}}|/\gamma_{\text{H}}=1$; $W_{\text{N}}=|\gamma_{\text{N}}|/\gamma_{\text{H}}=0.101$ and $W_{\text{C}}=|\gamma_{\text{C}}|/\gamma_{\text{H}}=0.251$. $\Delta\delta_{\text{H}}$, $\Delta\delta_{\text{N}}$ and $\Delta\delta_{\text{C}}$ are the chemical shift differences in ppm between the compared peptide state for ^1H , ^{15}N and ^{13}C , respectively; γ_{H} , γ_{N} and γ_{C} are the gyromagnetic ratios. The chemical shifts for the wild-type RGDechi peptide were obtained from a previous publication[23]. For the on-cell NMR characterization the chemical shifts evaluation was performed by using ^1H shifts observed for the RGDechi15D peptide in the absence and in the presence of HeLa and HepG2 living cancer cells at 278 K.

The T1 ρ attenuation factor (T1 ρ AF) for each well resolved resonance of RGDechi15D peptide in the free form and upon addition of HeLa and HepG2 living cells were calculated by evaluating the reduction of the height of ^1H NMR signals in the two T1 ρ experiments acquired with short (10 ms) and long (400 ms) spin-lock pulse. The intensity ratios were calculated for the peptide with and without living cells in according to the following equations:

$$\text{T1}\rho\text{-AF}^{\text{free}} (\%) = (I_0^{\text{free}} - I^{\text{free}})/I_0^{\text{free}} \times 100$$

$$\text{T1}\rho\text{-AF}^{\text{cells}} (\%) = (I_0^{\text{cells}} - I^{\text{cells}})/I_0^{\text{cells}} \times 100$$

in which for the free RGDechi15D peptide, I_0^{free} defines the peak intensity in the reference (10 ms) spectrum and I^{free} the peak intensity in the spectrum acquired with a longer spin-lock time (400 ms); whereas for the peptide in the presence of cells I_0^{cells} defines the peak intensity in the reference (10 ms) spectrum and I^{cells} the peak intensity in the spectrum acquire with a longer spin-lock time (400 ms). Successively, the T1 ρ ligand epitope mapping was obtained by defining the T1 ρ binding effect (T1 ρ -BE) according to the formula:

$$\text{T1}\rho\text{-BE} (\%) = \text{T1}\rho\text{-AF}^{\text{cells}} - \text{T1}\rho\text{-AF}^{\text{free}}$$

Only well-resolved resonances were considered in the analysis.

2.9. Molecular dynamics simulations

RGDechi15D peptide parameters were obtained using the Antechamber suite[39] and visually inspected and refined by the Leap module. MD simulation package Amber v18[40] was used to perform computer simulations by applying the Amber-ff14SB force field[41]. RGDechi15D peptide was centered in a triclinic box and solvated by a 10 Å shell (1896 molecules) of explicit TIP3P water[42] and one counter ion (Na⁺) was added to neutralize the system. After energy minimization by the steepest descent method followed by a 1 ns equilibration phase where heavy atoms were position restrained by a harmonic potential, unrestrained systems were simulated in a NPT ensemble using the Langevin equilibration scheme to keep constant temperature (278 K, 298 K) and pressure (1 atm). Electrostatic forces were evaluated by the Particle Mesh Ewald method[43] and Lennard-Jones forces by a cutoff of 10 Å. All bonds involving hydrogen atoms were constrained using the SHAKE algorithm[44]. Periodic boundary conditions were imposed in all three dimensions and the time step was set to 2 fs. Production runs of 10 ns were obtained at constant temperature of 278 K and 298 K, respectively, and structures were recorded every 2500 steps (5 ps) collecting a total of 2000 snapshots along the simulation time. Moreover, to enhance conformational sampling of RGDechi15D peptide mimicking experimental conditions,

we run five independent replicas of 10 ns each at 278 K with different initial velocities. The obtained conformational ensemble was clustered using the protocol defined by Kelley et al.[45] generating 421 structural families. Successively, the representative cluster structures were analyzed by using experimental chemical shifts. In this case the chemical shifts were predicted from each representative structure by using the software PPM_ONE[46]. The representative structure was selected in according with the Global RMSD (experimental vs back-calculated) of C α , C β , H α , N, H $_{\text{side-chain}}$ chemical shifts. All selected MD models were visualized and analyzed using the programs PyMOL[47], CHIMERA[48] and PROCHECK-NMR[49].

2.10. Homology modeling

The three-dimensional model of the $\alpha_{\text{v}}\beta_5$ -integrin was obtained through a two-steps structural modeling. First, the 3D model of the β_5 -subunit was predicted on the basis of their amino acid sequence by using two different approaches implemented in the I-TASSER [50] and ROBETTA[51] software. In particular, by using I-TASSER algorithm five models were predicted with C-scores ranging from -2.77 to 0.38. The C-score is a confidence score for estimating the quality of the predicted model and ranges from -5 to 2, with higher score representing higher confident in the model. Instead, by using ROBETTA five models were produced and the representative structure was selected by analyzing the Ramachandran plot obtained for each conformer by PROCHECK-NMR[49]. Considering the high structural similarity between the two models obtained by the two different approaches, the 3D structure predicted for the β_5 -subunit by ROBETTA was selected as reference 3D structural model on the bases of the structure quality factors. In particular, the Ramachandran plot analysis indicates that the ROBETTA structure is of a better quality than the model predicted by I-TASSER with over 98% residues in most favoured and additional allowed regions.

Second, to build the 3D structure of $\alpha_{\text{v}}\beta_5$ -integrin we used as template the X-ray structure of the $\alpha_{\text{v}}\beta_3$ in complex with cyclo(-RGDf[NM]eV), "cilencitide (PDB code: 1L5G)[52,53]. The obtained model for the $\alpha_{\text{v}}\beta_5$ -integrin was refined using energy minimization/geometry optimization and was used as reference conformation in the Molecular docking studies.

2.11. Molecular docking

All docking processes were performed using AutoDock 4.0 program[54]. The molecular docking calculation involved the following steps: 1) preparing starting coordinate files for the ligand and the receptor in order to include in the protocol the information needed (spatial charges, polar hydrogen atoms, atom types and torsional degrees of freedom). For the RGDechi15D peptide we used as representative structure the conformation selected from the MD clusters by using NMR chemical shifts. In particular, we defined as starting structure the model proving the best description of the experimental chemical shifts. Instead, for the $\alpha_{\text{v}}\beta_5$ integrin we used the structure obtained, as reported in the previous paragraph, by structural modeling. Polar hydrogen atoms were added to the reference structures and the RGDechi15D rotatable bonds were automatically selected. 2) AutoGrid routine: the software AutoDock requires pre-calculated grid maps that are define by AutoGrid. The grid map consists of a 3D lattice of regularly spaced points, entirely or partly surrounding and centered on a specific region of the receptor ($\alpha_{\text{v}}\beta_5$ integrin). In our docking protocol, the grid size was set to be 70 × 70 × 70 and the grid space was 0.375 Å. 3) Docking procedure by AutoDock routine: a docking file, containing the input parameters for the docking calculation, was created by using the AutoDockTools. In details, we used as searching method the Lamarckian Generic Algorithm (LGA).

Minimized ligands were randomly positioned inside the grid box and the docking process initiated with a quaternion and torsion steps of 58 torsional degrees of freedom, number of energy evaluations of 25 000 000 and run number of 100. After docking simulation, the RGDechi15D/ $\alpha_v\beta_5$ structures were clustered by using a backbone RMSD cutoff of 2 Å. Moreover, the complex conformations were further evaluated against the experimental NMR data obtained by CSP, trNOESY and T1 ρ analysis. The structures were analyzed and visualized by PyMol[47] and Chimera[48]

3. Results and discussion

3.1. Structural characterization of the free RGDechi15D peptide

To gain insight into the structural features driving the receptor-peptide recognition mechanism between the RGDechi15D and $\alpha_v\beta_5$ integrin, we firstly investigated the peptide in the free form by natural-abundance NMR spectroscopy. A nearly complete assignment of ^1H , ^{13}C , and ^{15}N resonances at 298 K (Tables S11,S12) has been obtained using the previously[23] reported strategy, in which, by exploring the natural isotopic abundance, homonuclear 2D [^1H - ^1H] TOCSY (Figure S11A), 2D [^1H - ^1H] ROESY (Figure S11), heteronuclear 2D [^1H - ^{15}N] HSQC and [^1H - ^{13}C] HSQC spectra were simultaneously analysed. Then, to deeply describe the conformational properties of the RGDechi15D, we examined the backbone chemical shifts (CSs) that are sensitive probe of protein/peptide secondary structure. In particular, to identify the secondary structure elements we analysed the $\text{H}\alpha$, $\text{C}\alpha$, HN secondary chemical shifts (Fig. 1 A,B,C) obtained as a difference between the observed chemical shift (δ^{obs}) and the residue specific random coil value (δ^{obs}). This latter value was estimated for the RGDechi15D peptide by using three different methodologies, as defined by Kjaergaard et al.[33], De Simone et al.[34] Tamiola et al.[35], respectively. Additionally, we also calculated the differences between $\text{C}\alpha$ and $\text{C}\beta$ secondary shifts ($\Delta\delta\text{C}\alpha$ - $\Delta\delta\text{C}\beta$) (Fig. 1D), that represents a common procedure of reporting secondary chemical shifts. Independently of the random coil data set used, for the residues located in the RGD cycle (Lys¹, Arg², Gly³, Asp⁴ and D-Glu⁵) $\text{H}\alpha$ and $\text{C}\alpha$ significantly deviate from the random coil chemical shifts with the $\Delta\delta$ values alternating from positive to negative along the cycle. Differently, for the residues located in the region comprising from Met⁶ to Thr¹⁹, $\text{H}\alpha$, $\text{C}\alpha$ and HN chemical shifts only slightly deviate from the random coil, suggesting that in this region the peptide does not adopt any preferential conformation. These structural findings were further confirmed by the analysis of the $\Delta\delta\text{C}\alpha$ - $\Delta\delta\text{C}\beta$ values that for whole peptide sequence are within ± 2 ppm range (Fig. 1D). We also explored the information obtained by the two-dimensional NOESY and ROESY experiments, providing an upper limit (ca. 5 Å) on the distance between protons that produce cross peaks. In our experimental conditions, no intra-molecular NOE connectivities were detected in the NOESY spectrum, while only intra-residue and short range ROEs were observed in the 2D-ROESY spectrum (Fig. 1E and Figures S11B,S12A). These results can be explained in terms of RGDechi15D dynamics, which modulate the evolution and the sign of the NOE. In details, a strong ROE cross peaks between the HN Lys¹ and $\text{H}\alpha$ D-Glu⁵ indicate their proximity (Fig. 1E); for the residue pairs Asp⁸/Pro⁹, Asn¹²/Pro¹³ and Gly¹⁶/Pro¹⁷, relative strong ROE cross-peaks between the $\text{H}\alpha$ of the previous residue and one or both of the prolyl H δ 2 and H δ 3 indicate that for the three proline residues (Pro⁹, Pro¹³ and Pro¹⁷) (Figure S12A) the Xaa-Pro peptide bonds are principally in *trans* configuration (Figure S12B). These latter results were further confirmed by analysing the $\text{C}\beta$ and $\text{C}\gamma$ chemical shifts of the proline residues. As reported in the Table S13, the difference $\Delta\beta\gamma$ of ~ 5 ppm indicates, confirming the ROE connectivities, that all three proline residues present a *trans* Xaa-Pro peptide bond

configuration. In addition, the chemical shifts analysis, performed by Promega[36], demonstrates the Xaa-Pro peptide bond is mainly in *trans* configuration with a probability of more than 90% (Table S13). To fully address this finding, we estimated the population of the Xaa-Pro peptide bonds by analysing in the 2D [^1H - ^{13}C] HSQC spectrum the resonances related to the *cis* and *trans* forms (Figure S12C). The intensity analysis of the $\text{C}\beta$ and $\text{C}\gamma$ NMR signals, in agreement with the results reported above, shows that all Xaa-Pro peptide bonds present an average *cis* population less than 10%. Overall, in agreement with the chemical shifts analysis, the inspection of the 2D-ROESY spectrum (Figure S11B), as well as $^3\text{J}_{\text{HN-H}\alpha}$ coupling constants (Table S14), indicate that the peptide adopts an unstructured conformation lacking ordered secondary structure elements as α -helix and β -strand. Interestingly, as indicated by the proton NMR chemical shifts temperature coefficients ($\Delta\delta\text{HN}/\Delta\text{T}$) (Table S14), despite the high structural heterogeneity, the conformational space sampled by the RGDechi15D is locally restricted by weak hydrogen bonding or a mixture of hydrogen-bonded and solvent-exposed amide protons in the region flanking the Arg¹¹- ($\Delta\delta\text{HN}/\Delta\text{T} = -4.00$ ppb/K) and D-Glu⁵ ($\Delta\delta\text{HN}/\Delta\text{T} = -3.90$ ppb/K).

3.2. RGDechi15D backbone dynamics

To describe the RGDechi15D conformational motions, we explored ^{15}N backbone dynamics on the picosecond (ps) to millisecond (ms) timescale of the peptide by natural-abundance NMR techniques, and we probed the nanosecond conformational flexibility of the peptide, by using MD simulations. In fact, this latter technique provides a detailed picture of the dynamics process occurring in peptides/proteins on different timescales, and thus represents a valuable tool that is complementary to the experimental data obtained by NMR spectroscopy[55–57]. First, we generated, as reported in the materials and methods section, the conformational ensemble reproducing the ns RGDechi15D intrinsic motions (Fig. 2A). Then, we investigated the conformational dynamics of the peptide by calculating the per-residue backbone atoms root mean square fluctuation (RMSF) (Fig. 2B) from the generated 10 ns MD ensemble. The analysis of the RMSF values of RGDechi15D shows that the N-terminal region, containing the RGD cycle, exhibits a less conformational mobility than the C-terminal tail (Gly¹⁶-Thr¹⁹) in the ns timescale. Successively, we combined the dynamics information contained in the backbone chemical shifts (Fig. 2C) with the data obtained by measuring a couple of filtered [^1H - ^{15}N] HSQC spectra, using two different relaxation-compensated CPMG periods (125 and 250 ms) (Fig. 2D, E). In this T_2 -filter HSQC experiment only the ^1H - ^{15}N peaks of the residues, for which the ^{15}N transversal relaxation time (T_2) is longer than the applied filter, are detectable. As reported in the Fig. 2D, E, both T_2 -filter HSQC experiments acquired with the two filter delays report the 16 expected ^1H - ^{15}N cross-peaks for the RGDechi15D peptide, indicating that all the residues are characterized by a ^{15}N R_2 ($1/\text{T}_2$) auto-relaxation rate constant slower than 4 s^{-1} . Therefore, the T_2 -filter HSQC data clearly indicate that the RGDechi15D presents, in the μs -to- ms time scale, a remarkable conformational flexibility with the RGD cycle resulting to be slightly more rigid than the C-terminal. Then, to provide a complete picture of the backbone dynamics of the RGDechi15D, we investigated the internal flexibility on the ps time scale by estimating the model-free order parameter (S^2) for the backbone amide groups (Fig. 2C), which reports the amplitude of ^{15}NH vector motions. S^2 values reported in the Table S14 indicate that the residues located in the cycle region (Lys¹, Arg², Gly³, Asp⁴ and D-Glu⁵) ($S^2_{\text{avg}} = 0.65 \pm 0.02$) are characterized by a lower degree of flexibility than the C-terminal tail from Met⁶ to Thr¹⁹ ($S^2_{\text{avg}} = 0.50 \pm 0.09$) in the ps time scale. Notably, these findings are in excellent agreement

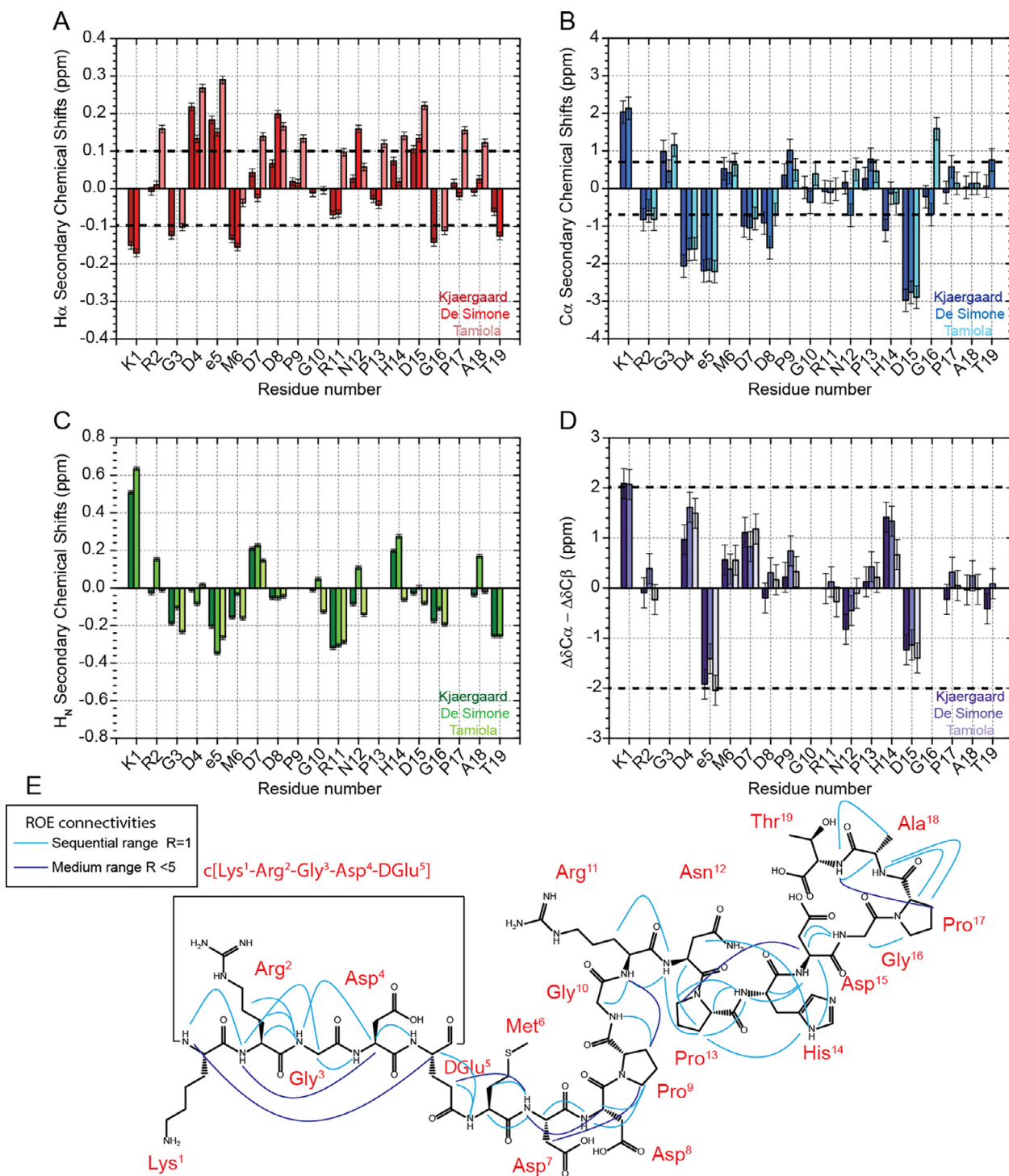


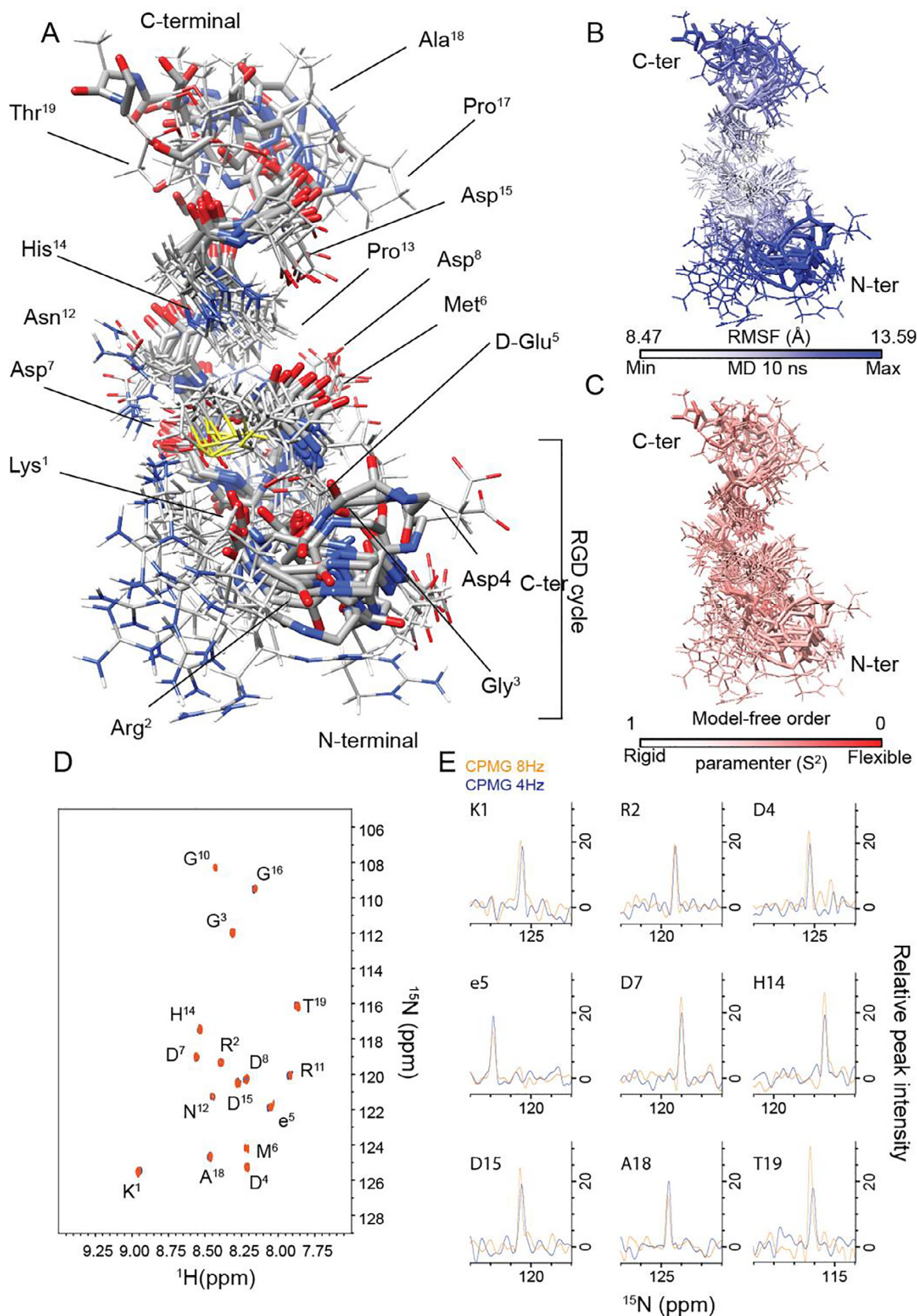
Fig. 1. Conformational characterization of RGDechi15D in the free form. Secondary chemical shifts of H_{α} (A), C_{α} (B), H_N (C) plotted versus the residue numbers. The per-residue difference between C_{α} and C_{β} ($\Delta\delta C_{\alpha} - \Delta\delta C_{\beta}$) secondary chemical shifts is also reported (D). The chemical shifts analysis was performed, as reported in the materials and methods, by using the random coil values defined by Kjaergaard et al., De Simone et al. and Tamiola et al., respectively. (E) ROEs mapping on the RGDechi15D primary sequence. Sequential- ($R = 1$) and medium-range (R less than 5) connectivities are reported as light blue and blue lines, respectively. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

with the description of the ns conformational mobility obtained by 10 ns MD simulation.

Overall, the RGDechi15D structural and dynamical characterization demonstrates that the peptide, lacking well-defined secondary structure elements, presents elevate conformational heterogeneity, with the C-terminal region showing higher degree of flexibility than the RGD cycle in both ns-to-ps and μ s-to-ms time scales.

3.3. Structural comparison of the RGDechi15D mutant versus RGDechi

To describe the structural rearrangements induced by the mutation of the h-Cit¹⁵ to Asp, we compared the backbone (1H , ^{13}C and ^{15}N) chemical shifts assigned for the RGDechi15D mutant with those reported for the RGDechi in a previous publication [23]. Insertion of the Asp¹⁵ results in significant changes in the [1H - ^{15}N] HSQC and [1H - ^{13}C] HSQC correlation spectra (Fig. 3A).



Larger chemical shift perturbations ($\Delta_{H,N,C}$) were observed for Lys¹, Asp⁴, Asp⁸ and His¹⁴, whereas significant small differences were observed for Asp⁷, Arg¹¹ and Thr¹⁹ (Fig. 3B upper). Notably, residues

located inside the RGD cycle that are far beyond the mutation site show substantial structural variations, indicating that the RGD χ 15D is characterized by long-range conformational

rearrangements induced by mutation (Fig. 3B lower). These findings were further confirmed by comparison of $^3J_{\text{HNH}\alpha}$ coupling constants (Fig. 3C left) and amide proton coefficients ($\Delta\delta\text{HN}/\Delta T$) (Fig. 3C middle) observed for the RGDechi15D with those previously published for the RGDechi peptide [23]. In particular, $^3J_{\text{HNH}\alpha}$ coupling constants analysis indicates that the main differences in terms of torsion angles φ and ψ , induced by the mutation, are principally localized in the region flanking the mutation site. On the other hand, the amide NMR chemical shift temperature coefficients indicate that the long-range structural changes induced by the mutation are correlated to the loss of the hydrogen bond between the amide proton of the Lys¹ and the side-chain carbonyl oxygen of the D-Glu⁵. As indicated by the comparison of the model-free order parameter S^2 (Fig. 3C right), these structural findings are also associated with the higher conformational flexibility observed for the residues of the RGD cycle upon mutation. Overall, data show that the RGDechi peptide upon mutation undergoes significant structural rearrangements coupled with an increase in conformational flexibility in the region containing the RGD cycle.

3.4. Development of the NUS/T1 ρ -NMR based methodology

To get structural insights into the binding of RGDechi15D to $\alpha_v\beta_5$ integrin within a cellular environment we performed a high-resolution NMR investigation of receptor-peptide interactions with living cancer cells. To this aim, we first selected two cell lines, HeLa and HepG2, with different histological origin and morphology, but showing the same $\alpha_v\beta_5$ and $\alpha_v\beta_3$ integrin expression level. In details, both HeLa and HepG2 cell lines showed $1.7 \pm 0.1 \times 10^4$ $\alpha_v\beta_5$ integrin and undetectable amounts of $\alpha_v\beta_3$, estimated by quantitative flow cytometry, as previously reported [5,24]. In our strategy, HeLa cells were firstly used to get NMR data for building a model of the RGDechi15D/ $\alpha_v\beta_5$ complex, whereas HepG2 cells were later used as positive control in the validation procedure (see next paragraph). Additionally, to inhibit the peptide internalization in both cell lines, the NMR structural investigation was performed at low temperature (278 K).

First, we assigned the ^1H , ^{13}C , and ^{15}N chemical shifts of RGDechi15D at 278 K by inspection of 2D [^1H - ^1H] TOCSY, 2D [^1H - ^1H] ROESY and natural abundance NMR experiments as [^1H - ^{15}N] HSQC and [^1H - ^{13}C] HSQC experiments (Table SI5,6). Then, to explore the RGDechi15D binding to $\alpha_v\beta_5$ integrin with living HeLa cells, we applied the conventional strategy in which the chemical shift assignments at 278 K (Table SI7) was performed by 2D [^1H - ^1H] TOCSY spectrum; whereas STD and trNOESY experiments were analysed to describe the structural determinants governing the recognition mechanism of $\alpha_v\beta_5$ integrin by RGDechi15D-formation.

With this method, to acquire whole set of NMR spectra with a reasonable S/N ratio and resolution a total experimental time of 16 h was required. In order to verify the impact of NMR analysis on cell viability, we performed Trypan Blue exclusion test before and after the NMR measurements. Trypan blue is a dye used to distinguish between live and dead cells. In particular, it is not absorbed by viable cells, but stains cells with a damaged cell membrane so that under light microscopy only death cells have a blue color. Then, cells were plated and observed for 24 h. As reported

in the Fig. 4A the HeLa cells viability after 16 h in the NMR tube was reduced of more than 25%; however, when observed 24 h after plating, only few cells attached the plate surface forming cells cluster. These data suggest that, even if the 75% of cells have intact membrane-Trypan blue is excluded- cell homeostasis and functionality of the alive cells was seriously compromised.

Previous studies also reported that the lifetime of HeLa cells inside the NMR tube was 85–90% after 3 h [58,59]. Then, in order to acquire the complete NMR data set within 3 h on the same in-cell NMR sample we tried to shorten the duration of the NMR experiments by reducing the number of scans (NS) of the 2D US [^1H - ^1H] trNOESY and the STD experiments (Figure SI3) (total duration = 5 h and 35 min). Unfortunately, this optimization procedure failed because the reduction of number of scans drastically decrease of the Signal to Noise Ratio (SNR) of the NMR spectra with several peaks around or barely above the noise level (Figure SI3A, B). In particular, for the STD experiment the reduction of the NS from 3000 to 1000 produces a substantial lowering of the average SNR of about 50% (Figure SI3C).

Therefore, to overcome these limitations, we developed an alternative NMR-based strategy for investigating, at an atomic level, the molecular determinants driving the RGDechi15D/ $\alpha_v\beta_5$ complex formation on living cells surface. In particular, taking advantage of the sensitivity enhancement of NMR-cryoprobe over room temperature probe, we combined NUS and T1 ρ methodologies (Fig. 4) to reduce the duration of the NMR experiments and collect, within the HeLa cells lifetime, the whole data set required for an accurate structural investigation. On one hand, considering the short living time of the cell sample due to cells sedimentation and peptide internalization, the application of NUS methodology allowed us to speed up the acquisition of the 2D NUS [^1H - ^1H] trNOESY spectra. In fact, NUS offers potential solution by collecting in the indirect dimension fewer increments than uniform sampling (US) and then reconstructing the full spectrum [32,60–63]. In this regard, it is possible to either decrease the overall experiment time or increase the SNR by using more NS. On the other hand, in order to further reduce the NMR acquisition time we used T1 ρ relaxation based NMR experiments as alternative tool to the STD [19] technique which is characterized by low sensitivity and then, it requires long experimental times to collect spectra with an appropriate SNR. In this scenario, we developed and optimized a protocol based on the acquisition of a pair of T1 ρ relaxation-based experiments acquired with a short (reference spectrum) and long spinlock pulse with and without living cells. In fact, for a peptide bound to a large target receptor located on the cell surface (i.e. $\alpha_v\beta_5$ integrin MW 204 kDa), a long spinlock pulse produces significant line broadening of its resonances because the peptide adopts the enhanced transfer R1 ρ relaxation rate of the receptor, and thus the intensity of the acquired spectrum will be reduced with respect to that observed in the absence of living cells. Therefore, after measuring T1 ρ relaxation-based experiments, we defined the T1 ρ Attenuation Factor (T1 ρ -AF) by evaluating the difference between the peak intensities of the reference spectrum (acquired with a shorter spin-lock time of 10 ms) with those of the spectrum acquired with a longer spin-lock time (400 ms) for the RGDechi15D peptide without (T1 ρ -AF^{free}) and with HeLa cells (T1 ρ -AF^{cells}), respectively. Successively, we delineated the T1 ρ Binding Effect

Fig. 2. RGDechi15D dynamics as revealed by NMR and MD. (A) RGDechi15D conformational ensemble obtained after clustering analysis of the 10 ns molecular dynamics simulation trajectories. The ensemble reports the representative structure of the 10 most populated clusters. RGDechi15D backbone is shown as stick model; whereas side-chains are reported as thin sticks. (B) Mapping of backbone Root Mean Square Fluctuation (RMSF) (\AA) values onto a representative MD (10 ns) conformational ensemble. (C) Mapping of H-N model-free order parameters (S^2) predicted, as reported in the materials and methods, from backbone and C β chemical shifts. (D) Overlay of the filtered ^1H - ^{15}N HSQC spectra of RGDechi15D acquired using a relaxation-compensated CPMG period of 125 ms (8 s^{-1}) (orange) and 250 ms (4 s^{-1}), respectively. (E) Extracted 1D slices of 2D T $_2$ -filter ^1H - ^{15}N HSQC NMR data of select backbone amide groups. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

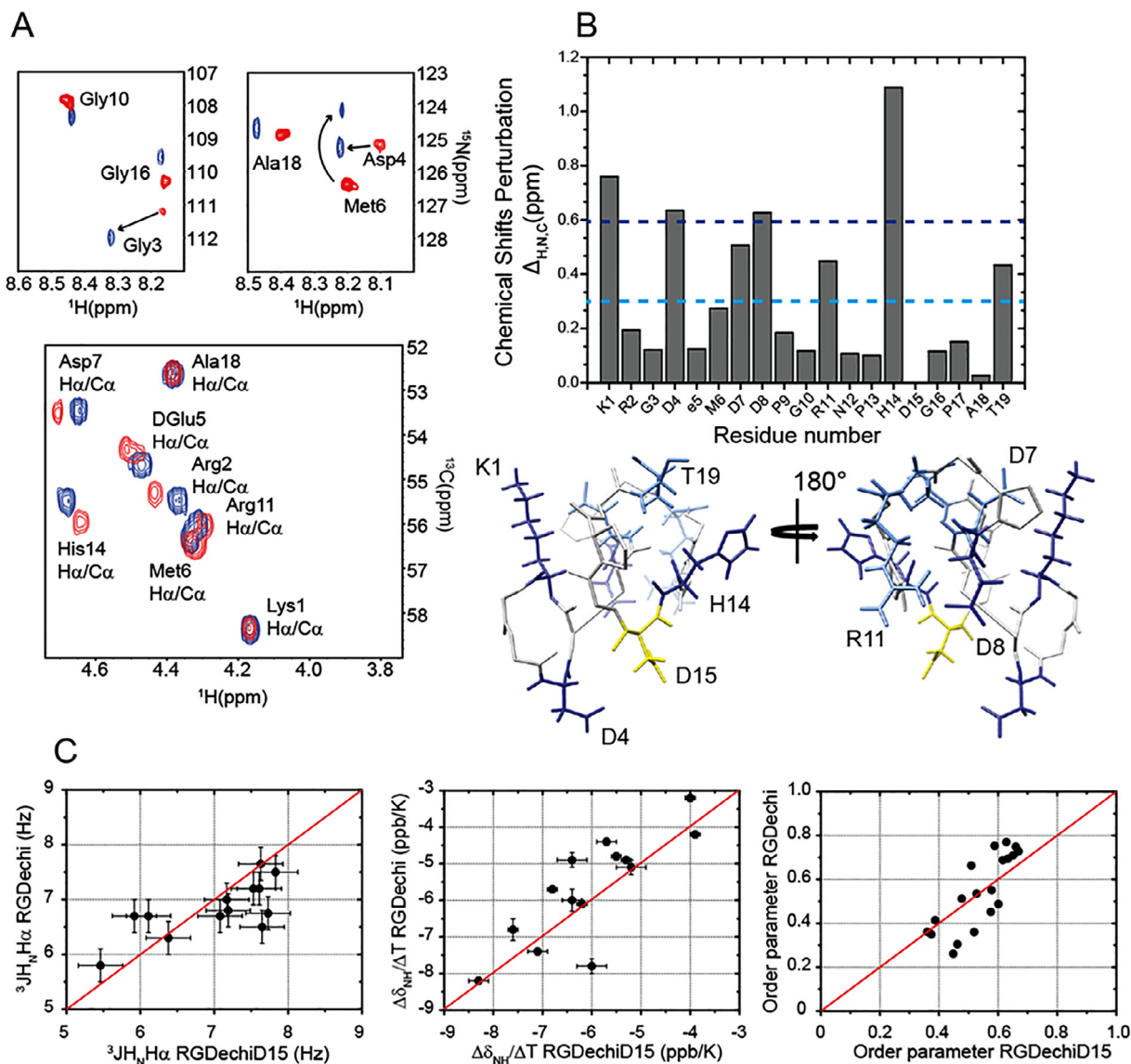


Fig. 3. Structural and dynamics effects of hCit15D mutation. (A) Selected region of the assigned ^1H - ^{15}N HSQC (Upper) and ^1H - ^{13}C HSQC (Lower) spectra of RGDechi15D (blue) and RGDechi (red) peptide acquired, by exploring natural isotopic abundance, on a 600 MHz NMR spectrometer at 298 K. (B) Upper Plot of combined ^1H , ^{13}C and ^{15}N chemical shifts perturbation (CSP $\Delta_{\text{H,N,C}}$) as a function of the residue numbers. Lower Mapping of the CSP values onto the structural model of the RGDechi15D mutant. Residues with weighted ^1H , ^{13}C and ^{15}N CSP higher than the average CSP_{avg} and $\text{CSP}_{\text{avg}} + \text{SD}$ are shown in light blue and blue, respectively. The side-chain of the residue Asp¹⁵ is depicted in yellow. (C) Correlation plots of $^3\text{J}_{\text{H}_\text{N}\text{H}\alpha}$ (left), $\Delta\delta_{\text{NH}}/\Delta\text{T}$ (center) and H-N order-parameter (S^2) (right) NMR parameters measured for RGDechi15D with respect to those observed for the RGDechi peptide. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

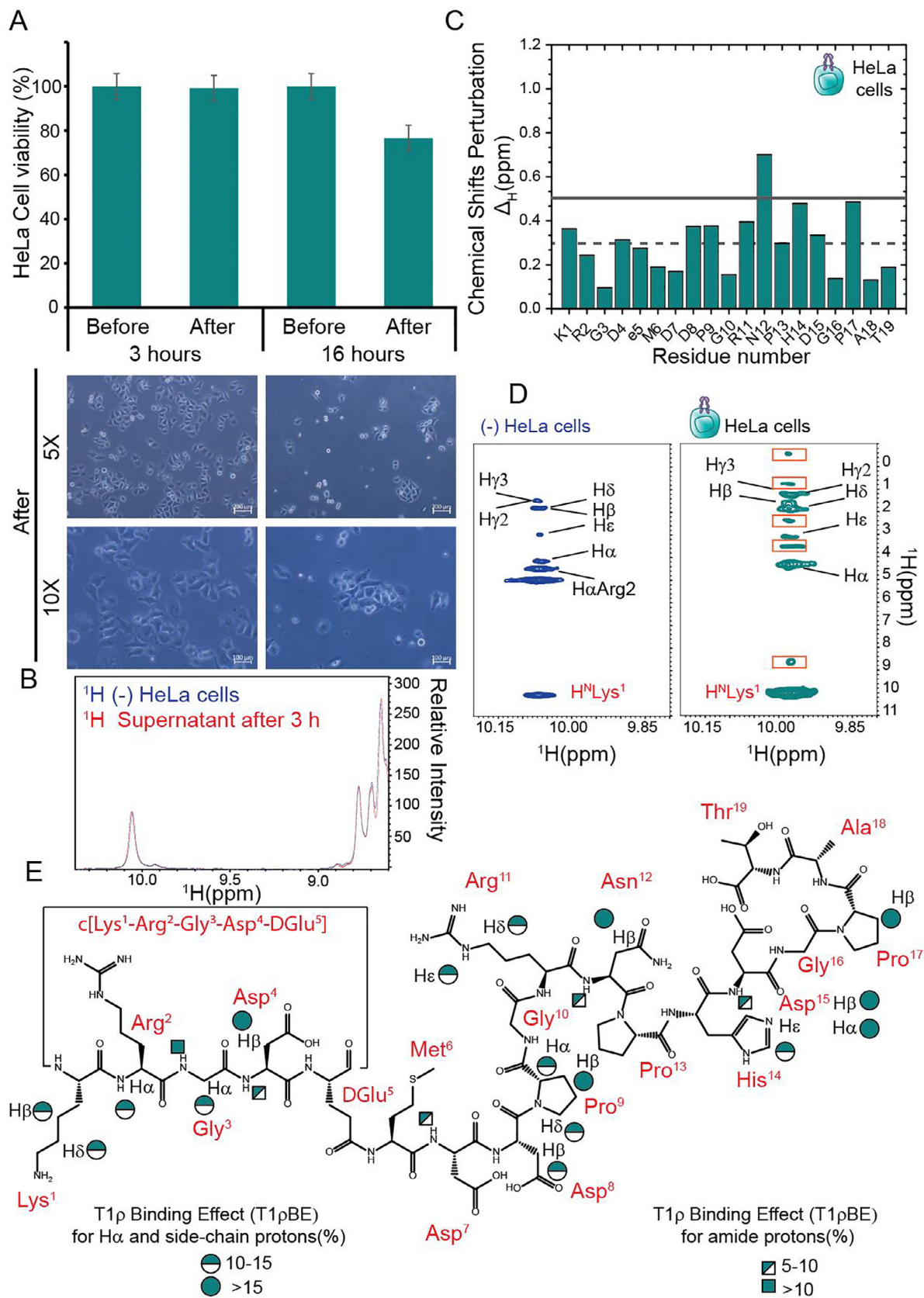
(T1 ρ -BE) by subtracting the T1 ρ -AF obtained for each well-resolved proton of RGDechi15D in the free form to the value calculated for the same resonance upon addition of living HeLa cells. Interestingly, the combination of NUS and T1 ρ NMR techniques allowed the acquisition of the complete NMR data set (2 h and 46 min) within the HeLa cells lifetime (3 h), ensuring that only data of intact cells were acquired. This latter crucial aspect was further confirmed by evaluating the HeLa cell viability of the NMR sample. Indeed, the cells viability and plating data indicate that, after NMR measurements (~3 h), HeLa cells viability is intact (100%) and, more importantly, the alive cells kept their ability to attach plate surface and to assume their typical morphology suggesting that cell homeostasis is preserved (Fig. 4A). Notably, the comparison of the ^1H NMR spectrum of RGDechi15D acquired in the absence of HeLa cells at the beginning of the NMR data set with that of the supernatant of the cells sample measured at the end of the experiments indicates that at 278 K the peptide internalization

process was completely inhibited during the 3 h of NMR measurements (Fig. 4B).

3.5. Application of the NUS/T1 ρ -NMR based strategy for defining the binding mode of RGDechi15D to $\alpha_v\beta_5$ integrin on living cells surface

In agreement with our approach we firstly collected the structural information of the RGDechi15D-binding epitope to $\alpha_v\beta_5$ by acquiring 2D [^1H - ^1H] TOCSY, 2D NUS [^1H - ^1H] trNOESY and T1 ρ NMR experiments in the absence and in the presence of $\alpha_v\beta_5$ integrin expressing HeLa cells at 278 K (Fig. 4C-E). Then, the obtained high-resolution structural data were used as conformational constraints to perform a series of Molecular Dynamics and Molecular Docking studies (see next paragraph).

To start, we analyzed the ^1H chemical shift changes (Tables S15 and S17) for all protons (backbone and side chains) (Δ_{H}) of RGDechi15D upon addition of HeLa living cancers cells. Interestingly, as



illustrated in the Figure 4C, a subset of resonances the RGDechi15D showed significant changes in the presence of HeLa cells suggesting that the $\alpha_v\beta_5$ -integrin binding process is modulated by several residues. In details, remarkable chemical shift perturbation (CSP > CSPavg + SD) was observed for the Asn¹² located in the C-terminal region of the peptide; whereas significant smaller differences were observed for Lys¹ and Asp⁴ located inside the RGD cycle and for Asp⁸, Pro⁹, Arg¹¹, His¹⁴, Asp¹⁵ and Pro¹⁷ situated in the C-terminal region. Then, to determine the conformation that the RGDechi15D peptide adopts upon binding to $\alpha_v\beta_5$ integrin in HeLa living cells we exploited the structural information provided by the two-dimensional trNOESY experiments reordered using NUS acquisition mode (Fig. 4D). A detailed analysis of 2D NUS [¹H-¹H] trNOESY spectra acquired in the presence of HeLa cells indicates that Lys¹ and Arg² as well as the Asp⁴, located inside the RGD cycle, showed either new or stronger cross-peaks. New tr-NOE correlations were also observed for Asp⁸, Asn¹², His¹⁴ and Asp¹⁵ upon addition of HeLa cells (Fig. 4, SI4). Interestingly, strong NOE cross-peaks between H α of the residue Asp⁸, Asn¹² and Gly¹⁶ and the H δ of Pro⁹, Pro¹³ and Pro¹⁷, respectively, indicate that the higher population of the Xaa-Pro *trans*-arrangement observed for the three prolines in the free RGDechi15D is preserved upon binding to the $\alpha_v\beta_5$ integrin on living cells surface. Successively, to further characterize the RGDechi15D-binding epitope to $\alpha_v\beta_5$ in the cellular environment, in accordance with our approach, we analysed a pair of T1 ρ relaxation-based experiments acquired on the peptide in the presence and absence of HeLa cancer cells (Fig. 4E, SI3B). In particular, the RGDechi15D hydrogens that are closer to the $\alpha_v\beta_5$ receptor upon binding were identified by analysing T1 ρ -AF and T1 ρ -BE parameters obtained as reported above (see also the materials and methods). We classified the T1 ρ -BE for HeLa living cells as medium (10% \leq T1 ρ -BE \leq 15%) and strong (T1 ρ -BE greater than 15%) depending on the reduction of the RGDechi15D signal intensities upon interaction to the $\alpha_v\beta_5$ integrin. In details, in the amide proton region, strong T1 ρ -BE was observed for Gly³ located inside the RGD cycle, whereas medium effects were observed for Asp⁴, Asp⁷, Asn¹², Asp¹⁵ backbone amides and for His¹⁴ side-chain protons (Fig. 4E). In the aliphatic region, strong T1 ρ -BE were ascribed to H β 2/H β 3 Asp⁴, H β 2/H β 3 Pro⁹, H β 2/H β 3 Asn¹² (only in the case HeLa cells), H α and H β 2/H β 3 Asp¹⁵ and H β 2/H β 3 Pro¹⁷. A medium T1 ρ BE was observed for H β 2/H β 3 and H δ Lys¹, H α Arg² and H α Gly³ situated within the RGD cycle, for H β Asp⁸, H α (only in the case of HeLa cells) and H δ Pro⁹, H δ and H ϵ Arg¹¹, H β Asn¹² (only in the case HepG2 cells), H ϵ 2 His¹⁴, H α and H β Asp¹⁵, H β Prp¹⁷. Overall, trNOESY and T1 ρ data, in agreement with the chemical shift perturbations analysis, indicate that the binding mechanism of $\alpha_v\beta_5$ integrin by RGDechi15D is principally mediated by Lys¹, Arg² and Gly³ located inside the RGD cycle. Moreover, the NMR structural data clearly demonstrate that the formation of the RGDechi15D/ $\alpha_v\beta_5$ complex is further stabilized by additional residues (Arg¹¹-Thr¹⁹) of the C-terminal echistatin moiety.

3.6. Validation of the NUS/T1 ρ -NMR methodology

Since in our approach the structural information collected by the combination of NUS and T1 ρ techniques are essential for

providing a high-resolution description of protein-peptide interactions with living cells, we validated the integrated NMR strategy utilizing a proper positive and negative control. As positive control, we used the HepG2 cells that, as already mentioned, share with the HeLa cells the same $\alpha_v\beta_5/\alpha_v\beta_3$ integrin pattern. In the presence of HepG2 cells RGDechi15D shows chemical shifts variations (Figure SI4A, Table SI8), as well as tr-NOE correlations and T1 ρ -BE values (Fig. SI4B,C), similar to those observed upon addition of the HeLa cells demonstrating that the $\alpha_v\beta_5$ -integrin binding interaction occurs with a similar recognition mechanism.

As negative control, we used a linear RGDechi peptide (named RGDechi^{linear}) lacking the RGD cyclic motif. At first we tested the ability of the linear peptide to bind $\alpha_v\beta_5$ -integrin by apoptosis and invasion assay experiments (Figure SI5). In detail, after treating HepG2 with 50 μ M linear peptide for 6 h, as shown in the Figure SI5A, RGDechi^{linear} does not induce apoptosis, differently RGDechi15D induces a remarkable increase in caspase activity as described in Capasso et al.[24]. Moreover, as previously demonstrated[24], RGDechi15D peptide shows significant decrease in tumor cell invasiveness with respect to untreated cells (control), differently linear peptide does not affect HepG2 invasion (Figure SI5B). Data were quantified in the graph (Figure SI5C). Therefore, we tested the efficacy of the NUS/T1 ρ -NMR methodology by applying this combined strategy to the living cell sample containing the linear peptide (Figure SI6A-E). As reported in the figure SI6D, the 2D NUS [¹H-¹H] trNOESY acquired for the linear RGDechi peptide upon addition of the living cells does not show any new inter-molecule NOE correlations indicating, in agreement with the chemical shifts analysis (Figure SI6B-C, Table SI9,10), that the peptide does not bind the integrin. These findings were further confirmed by the structural information obtained using the T1 ρ experiments. As illustrated in the figure SI6E, the T1 ρ -BE values, calculated for the well resolved proton resonances of RGDechi^{linear}, indicates that the presence of cells having the $\alpha_v\beta_5$ -integrin on the membrane surface does not significantly reduce the NMR signal intensities demonstrating that RGDechi^{linear} retains the same conformational features observed in solution. Overall, in accordance with apoptosis and invasion assay results, the structural data here obtained demonstrate that the linear peptide RGDechi^{linear} does not interact with the $\alpha_v\beta_5$ integrin highlighting the crucial role of the RGD cyclic motif in the $\alpha_v\beta_5$ recognition mechanism.

3.7. Molecular docking studies of RGDechi15D/ $\alpha_v\beta_5$ complex

To provide a more rigorous description of the molecular determinants driving the $\alpha_v\beta_5$ binding mechanism by RGDechi15D, we performed a series of Molecular Docking studies by including in the docking protocol the structural dynamics information collected through NMR methods (i.e. Secondary Chemical shifts analysis, CSPs, trNOESY and T1 ρ) and Molecular Dynamics simulations for RGDechi15D in the free and bound forms. Therefore, in order to consider the RGDechi15D conformational flexibility and include this piece of information in the Molecular Docking of RGDechi15D/ $\alpha_v\beta_5$ interaction, we performed a series of Molecular Dynamics simulations at 278 K of 10 ns each, collecting up to

Fig. 4. Mapping of the binding interface between RGDechi15D and $\alpha_v\beta_5$ integrin on living HeLa cancer cells surface. (A) HeLa TB exclusion tests of the cell samples before and after 3 and 16 h NMR measurements; high power micrographs of HeLa cells plated after NMR experiments at 5X (scale bar 200 μ m) and 10X (scale bar 100 μ m) magnification (B) Overlay of the ¹H spectrum of RGDechi15D acquired before adding HeLa cells (blue) with that of the supernatant of the cell sample collected after NMR measurements (red). (C) Chemical shifts perturbations of RGDechi15D ¹H resonances (ppm) upon addition of HeLa living cells. The dark grey line indicates the average chemical shift perturbation value (CSPavg) and the dark grey dashed line reports the CSPavg + SD. (D) Comparison of the 2D NUS [¹H,¹H] tr-NOESY spectrum of RGDechi15D acquired upon addition of HeLa intact cells with the 2D US [¹H,¹H] ROESY measured in solution (blue) and (teal). The intermolecular trNOEs are indicated as orange box. (E) Binding epitope map defined by comparison of the T1 ρ -NMR experiments of RGDechi15D acquired without and with HeLa cells. RGDechi15D protons with T1 ρ -BE (x) upon addition of living cells *x* greater than 15% and 10 \leq *x* \leq 15% are reported as full and half circles, respectively. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

50 ns of simulation time. Then, we analysed the ensemble (5×1000 conformers) (Figure S17A) obtained from 50 ns MD simulation through cluster analysis and by using the experimental chemical shifts observed for the peptide at 278 K. In particular, we used the PPM approach[46] as chemical shifts prediction tool to back-calculate the backbone and side-chains CSs from the representative conformations of each cluster. Then, we compared the observed chemical shifts with those predicted for each single representative structure. As reflected by the RMSD values (Figure S17B), this CSs-based selection procedure allowed the identification of the RGDechi15D conformer that provides a reasonable description of the experimental CSs NMR data (Global RMSD = 4.55 ppm). Subsequently, we used this selected structural model as reference structure for the RGDechi15D peptide in the docking protocol (see below). For the $\alpha_v\beta_5$ receptor, since the high-resolution 3D structure is not yet available in the Protein Data Bank (PDB), we built a three-dimensional model by using a multi-step homology modelling process based on the crystal structure of $\alpha_v\beta_3$ integrin in complex with cyclo(-RGDf[NM]V, “cilengitide” (PDB code: 1L5G) [52,53]. In fact, since $\alpha_v\beta_5$ and $\alpha_v\beta_3$ show high percentage of sequence identity at the α and β interface and bind common small

compounds, it has been plausible to assume that in the $\alpha_v\beta_5$ -bound conformation the two subunits assemble in a similar manner as observed in $\alpha_v\beta_3$. First, we computationally predicted the 3D structure of the β_5 subunit from the amino-acid sequence by using two different approaches implemented in ROBETTA[51] and I-TASSER [50] software. Interestingly, as reflected by the RMSD values (Figure S18A-D), the two approaches predicted a very similar structural organization for the region (Ser⁸⁴-Thr⁴⁰⁰) of the β_5 subunit involved in the recognition of the RGD motif (Figure S18 C-D). Although the structural similarities the Ramachandran plot statistics indicate that the 3D model predicted by ROBETTA is of a better quality than I-TASSER model with over 98% residues in most favoured and additional allowed regions (Table S11 Figure S18A, B). Second, we assembled the β_5 subunit 3D model predicted by ROBETTA with the α_v subunit using as structural template the $\alpha_v\beta_3$ /cilengitide complex. Third, the generated 3D model of the $\alpha_v\beta_3$ integrin was energetically minimized, as reported in the materials and methods section, and it was used as reference structure for the receptor in the docking studies (Figure S18E).

As a result, the molecular docking calculations generated 100 solutions and were subsequently sorted into clusters using a

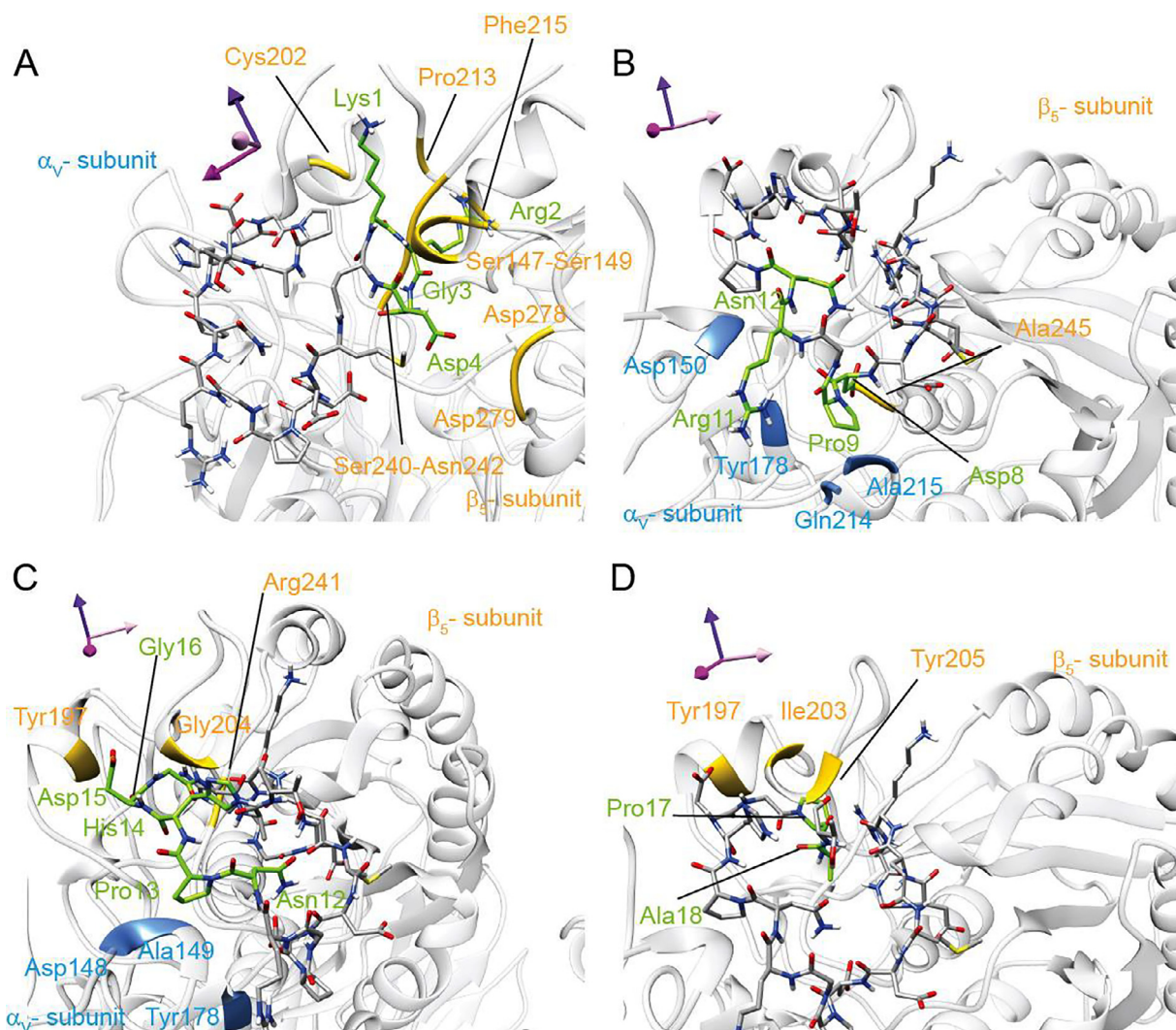


Fig. 5. Structural model of the RGDechi15D- $\alpha_v\beta_5$ complex. A-D Close-view up of the representative model of the RGDechi15D/ $\alpha_v\beta_5$ complex obtained by molecular docking and validated by using the experimental NMR data. Residues of α_v and β_5 subunits depicted in light blue and gold, respectively. The RGDechi15D peptide is reported in dark grey; whereas the side chains of the residues involved in the complex formation are depicted in light green. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

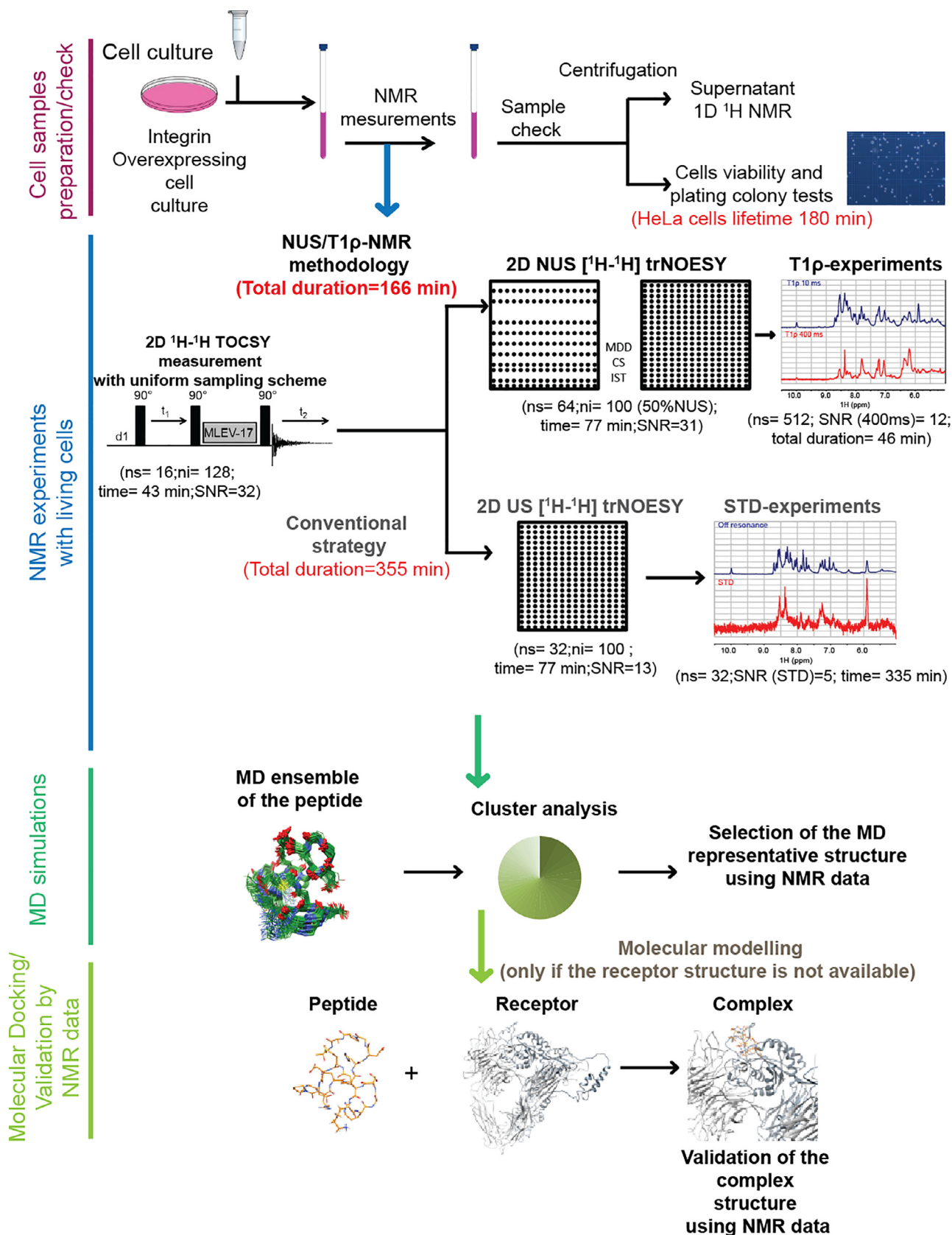


Fig. 6. Flow chart of our approach for high resolution investigation of receptor-ligand interactions based on on-cell NMR structural data. The comparison of the NUS/T1 ρ methodology with the previous STD-based strategy with the strategy is also reported.

backbone RMSD cutoff of 2 Å. This procedure resulted in three most populated clusters (Cluster1, Cluster2 and Cluster3) characterized by substantial structural differences in the binding modality to $\alpha_v\beta_5$ integrin by RGDechi15D peptide (Figure S19A). Since the first cluster better agrees with the structural NMR data (Figure S19B), we selected the representative model of this cluster as reference structure of the RGDechi15D/ $\alpha_v\beta_5$ complex.

3.8. RGDechi15D - $\alpha_v\beta_5$ recognition mechanism

The selected structural model of the RGDechi15D/ $\alpha_v\beta_5$ complex, as derived by experimental and computational data, is shown in Fig. 5. The RGDechi15D binding epitope is constituted by a rather extended surface defined by Lys¹, Arg², Gly³, Asp⁴ located inside the RGD cycle and by Pro⁹, Arg¹¹, Asn¹², Pro¹³, His¹⁴, Asp¹⁵ and Pro¹⁷ of the C-terminal echistatin moiety (Table S112). Notably, all residues of the RGDechi15D peptide involved in the interaction with $\alpha_v\beta_5$ show T1 ρ binding effect and intermolecular NOEs, upon addition of HeLa and HepG2 living cells. In details, the RGD-containing cycle mainly interacts with the β_5 subunit (Fig. 5 A-C) (Table S112); especially, Lys¹ interacts by ionic interactions with β_5 -Arg²⁴¹ and β_5 -Cys²⁰² (Fig. 5A), Arg² makes contact with several residues of the β_5 subunit (Ser¹⁴⁷, Leu¹⁴⁸, Ser²⁴⁰, Pro²³¹, Phe²¹⁵) (Fig. 5A); Gly³ interacts with β_5 -Asn²⁴² whereas Asp⁴ makes contact with β_5 -Ser¹⁴⁹, β_5 -Asp²⁷⁸ and β_5 -Asp²⁷⁹ (Fig. 5A). Regarding the region preceding, the C-terminal echistatin moiety Asp⁸ and Pro⁹ mainly interact with α_v -subunit (Fig. 5B). Moreover, the interaction between $\alpha_v\beta_5$ and RGDechi15D is further stabilized by residues of the C-terminal echistatin moiety (Arg¹¹-Thr¹⁹), that contacts both α_v and β_5 subunits. In particular, Arg¹¹ is involved in hydrogen bonds with α_v -Asp¹⁵⁰ (Fig. 5B); whereas Asn¹² is hydrogen bonded with α_v -Tyr¹⁷⁸ (Fig. 5B,C). Pro¹³ interacts with Asp¹⁴⁸, Ala¹⁴⁹, Tyr¹⁷⁸ of the α_v -subunit (Fig. 5C); whereas the side-chain of His¹⁴ is involved in ionic interaction with α_v -Asp¹⁴⁸ (Fig. 5C). Finally, Asp¹⁵, Gly¹⁶ and Pro¹⁷ residues play a crucial role in the stabilization of the RGDechi15D/ $\alpha_v\beta_5$ complex by selectively interacting with the β_5 -subunit (Fig. 5D). Notably, Asp¹⁵ Gly¹⁶ and Pro¹⁷ of RGDechi15D peptide exclusively interacts with residues located inside the specificity determining loop (SDL) (Figure S110 and S111A, B) that is extremely important for the natural ligand selectivity between $\alpha_v\beta_3$ and $\alpha_v\beta_5$ integrins [64,65]. This observation, together with the fact that, in the amino-acid sequence of the β_3 , the β_5 -Lys²⁰⁶ is replaced with an Asp residue (β_3 -Asp²⁰⁵) (Figure S111B) clearly indicate that in RGDechi15D the Asp¹⁵ plays a crucial role in shifting the selectivity of the peptide from $\alpha_v\beta_3$ to $\alpha_v\beta_5$.

4. Conclusions

Herein, we developed and applied an alternative methodology for studying receptor-ligand interactions with living cells at atomic resolution. Our application combines high-resolution structural and dynamics NMR data with Molecular Dynamics simulations and Molecular Docking studies. In particular, the methodology relies on the following steps (Fig. 6): i) after preparation of the sample containing living cells overexpressing the receptor and the unlabeled ligand (i.e peptide, protein, small compound) the chemical shifts assignment is achieved by the acquisition of the 2D [¹H-¹H] TOCSY spectrum (time ~ 43 min); ii) inspection of 2D NUS [¹H-¹H] trNOESY spectra to investigate the preferred conformation of bound ligand. NUS techniques allow to reduce the acquisition time (from 163 to 77 min using for both 64 number of scans) considering the short living time of the cells (3 h); iii) acquisition of a pair of T1 ρ relaxation-based experiments instead of STD experiments to define the binding epitope. The acquisition time was significantly reduced (from 335 to 46 min), obtaining the same essential structural details with increas-

ing S/N ratio (more than 50%) and resolution of NMR spectra. Two novel parameters, T1 ρ -AF (T1 ρ Attenuation factor) and T1 ρ -BE (T1 ρ Binding Effect), were defined to get more quantitative conformational information from T1 ρ NMR experiments; iv) description of the conformational space sampled by the ligand in solution by performing a series of Molecular Dynamics simulations; v) identification of the reference conformation for the ligand by analysing the MD ensemble with the experimental ¹H, ¹⁵N and ¹³C chemical shifts; whereas for the receptor, if the high-resolution structure resolved by X-Ray, NMR or CryoEM, is not available, a series of molecular modelling calculations are required; vi) investigation of the structural determinants governing the receptor-ligand complex formation by performing molecular docking studies; vii) cluster analysis of the Molecular docking conformations and selection of the representative model of the receptor-ligand complex by using the experimental NMR data.

We tested the developed a methodology to investigate the structural details driving the formation of the RGDechi15D/ $\alpha_v\beta_5$ complex. The results indicate that the recognition mechanism of $\alpha_v\beta_5$ integrin by RGDechi15D is principally mediated by the residues located inside the RGD cycle and it is further stabilized by additional residues (Arg¹¹-Thr¹⁹) of the C-terminal echistatin moiety. Overall, the RGDechi15D- $\alpha_v\beta_5$ structural model provides a detailed description of the molecular determinants responsible for the peptide selectivity for $\alpha_v\beta_5$, demonstrating that the Asp¹⁵ residue plays an essential role in shifting the selectivity of the peptide from $\alpha_v\beta_3$ to $\alpha_v\beta_5$.

In conclusion, our developed methodology was successfully applied in the investigation of the direct binding of the RGDechi15D peptide with the $\alpha_v\beta_5$ integrin with living human cancer cells. This approach represents an alternative NMR tool for studying, at atomic resolution, receptor-ligand recognition mechanism on living cells surface and for screening of the interaction profiling of drugs with their therapeutic targets in their native cellular environment.

5. Author contributions

BF, AC, CA and LR acquired and analyzed the NMR data; ADG, DC and LZ synthesized the peptide; SDG, DC and MTG prepared the cell culture and monitored cell viability; LR conceived and supervised the project, designed the NMR experiments; AP performed Molecular Dynamics simulations; LR and CA Molecular docking calculations. All authors contributed to the analysis and interpretation of the data, as well as the preparation of the manuscript.

Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.csbj.2021.05.047>.

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